

# LECTURE 1, Digital Filters

## Introduction

### On the White Board

#### Basic Concepts, Definitions, and Notations

Continuous-time signals and systems

Discrete-time signals and systems

LTI-systems

Difference equation, Impulse response

Frequency response, Transfer function

Realization/structure/algorithm

#### Digital Filters

Frequency selective LTI digital filters

Digital filtering of analog signals  
(sampling, filtering, reconstruction)

#### Applications

Frequency division multiplexing/demultiplexing

Noise suppression

Subband coding

#### Design process

Synthesis, realization, implementation

#### Specification

Magnitude response, attenuation function

Phase response, group delay, phase delay

# **LECTURE 2, Digital Filters**

## **DSP Algorithms**

Difference equation

Realization/structure/algorithm

Signal flow graph (SFG) in precedence form

Computation graph - SFG plus execution times

Iterative processing

## **SFGs in Precedence Form**

Four-step systematic procedure

## **Difference Equations in Computable Order**

Obtained from SFG in precedence form

## **Computer Program**

Obtained from difference equations in computable order

## **Maximal sample frequency (maximal data rate)**

Recursive algorithms - upper bound

Nonrecursive algorithms - no upper bound

Critical path - longest path in computation graph

Pipelining

# On the White Board

Iterative processing

SFGs in precedence form

Difference equations in computable order

Computer program

Maximal sample frequency

- Recursive algorithms - upper bound

- Critical path

- Pipelining

# LECTURE 3, Digital Filters

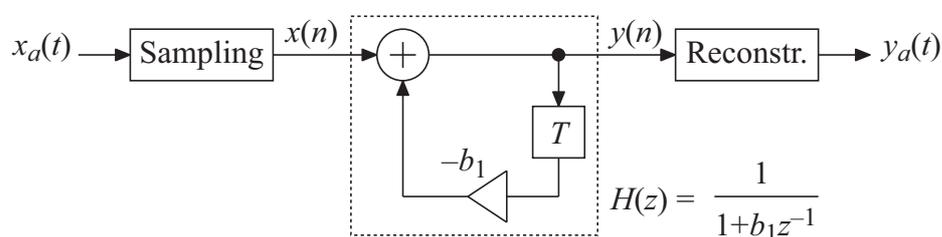
## Finite Wordlength Effects

Ideal linear systems - real numbers

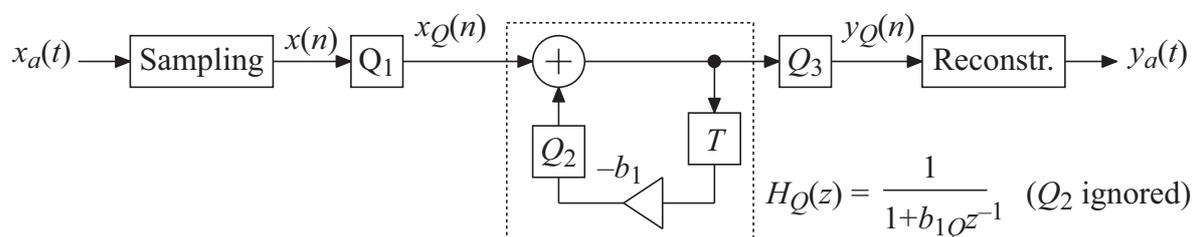
Actual digital systems - quantized numbers  $\Leftrightarrow$

Weakly nonlinear systems

(a) Ideal linear system



(b) Actual nonlinear system



Fixed-point arithmetic - cheaper implementation

Two's-complement representation common

Quantization errors

Overflow errors (large errors) - number range exceeded

Rounding/truncation errors (small errors) - least significant bits

## **Errors in Digital Systems due to Quantization**

- 1) Errors in the A/D and D/A conversions
- 2) Overflow errors - signal scaling required
- 3) Round-off errors - SNR at output common measure
- 4) Coefficient errors - change of filter function  $H(z)$

## **Design Choices**

Errors due to 2), 3), and 4) affected by the filter structure

Important to choose structures with good numerical properties

Nonrecursive structures - FIR

Wave digital filters - IIR

(Certain state-space structures, special recursive FIR filters with cancelling zeros and poles at  $z = \pm 1$ , not in focus in this course)

## On the White Board

Fixed-point two's complement arithmetic

Overflow errors

Parasitic overflow (large-scale) oscillations

Forced-response stable filters

Scaling of signal levels - to avoid (reduce the risk of) overflow

Safe scaling,  $L_p$ -norm scaling

Round-off errors

Parasitic granularity (small-scale) oscillations - limit cycles

Round-off noise - linear model of quantizer, white noise assumption

Coefficient errors

Low-sensitivity structures

## Conclusion

Use digital filter structures that

1) are stable under finite arithmetic (nonlinear) conditions

2) have low round-off noise - short data wordlength

3) have low sensitivity - short coefficient wordlength

=> robust and low implementation cost

Nonrecursive FIR

Wave digital filters

# LECTURE 4, Digital Filters

## FIR Filters

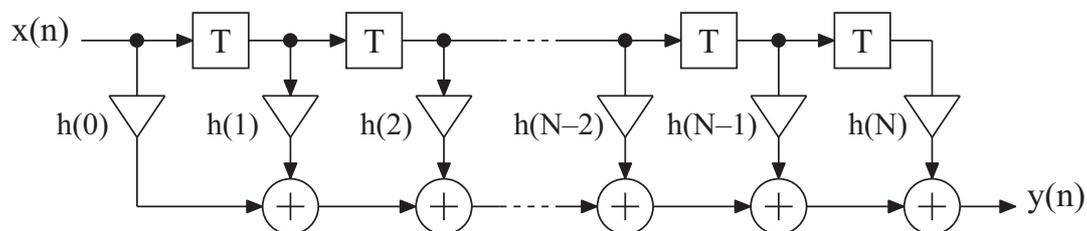
Transfer function: 
$$H(z) = \sum_{n=0}^N h(n)z^{-n}, \quad N\text{th-order causal filter}$$

Frequency response: 
$$H(e^{j\omega T}) = \sum_{n=0}^N h(n)e^{-j\omega T n}$$

+ Linear phase possible - (anti)symmetric impulse response

+ Can be realized with nonrecursive structures

Direct form: 
$$y(n) = \sum_{k=0}^N x(n-k)h(k)$$



- High order and complexity, and long delay, for stringent specifications

# On the White Board

Linear-Phase FIR filters - Types I, II, III, IV

Zero locations

Frequency response

Delay term and zero-phase frequency response

Synthesis (process of specification -> filter order and coefficients)

Specification

Synthesis methods (windowing, optimization)

Approximation problem

Minimax design

Least-squares design

# LECTURE 5, Digital Filters

## Synthesis of Analog Filters

$$\text{Specification } \rightarrow H_a(s) = \frac{\sum_{k=0}^N a_k s^k}{\sum_{k=0}^N b_k s^k} = G \frac{\prod_{k=1}^N (s - z_k)}{\prod_{k=1}^N (s - p_k)}$$

$z_k$  zeros,  $p_k$  poles,  $G$  gain constant (numerically preferred repres.)

## Used in the Design of Digital IIR Filters

- 1) Spec.  $\rightarrow H_a(s) \rightarrow$  (transformation)  $H(z) \rightarrow$  realization
- 2) Spec.  $\rightarrow H_a(s)$  and realization  $\rightarrow H(z)$  and realization - WDF

## Synthesis Methods for Analog Filters

Analytical - closed form solutions - standard approximations

Requirements only on the magnitude response  $|H_a(j\omega)|$

Optimal lowpass and highpass filters. Suboptimal bandpass, bandstop, and multiband filters

Optimization - iterative methods

Optimal filters for all types (potentially, local minima possible)

More flexible - can handle requirements on the magnitude response, phase response, group delay response, etc.

## **On the White Board**

Synthesis of lowpass filters

Standard approximations

Synthesis procedure

Synthesis of highpass, bandpass, and bandstop filters

Synthesis procedure

Frequency transformations

## **Focus in the Course**

Basic principles and properties of the filter approximations  
(not the whole underlying mathematical theory)

Parts from the analog filter design world needed for the synthesis  
of digital IIR filters

# LECTURE 6, Digital Filters

## Synthesis of Digital IIR Filters

$$\text{Specification } \rightarrow H(z) = \frac{\sum_{k=0}^N a_k z^{-k}}{\sum_{k=0}^N b_k z^{-k}} = G \frac{\prod_{k=1}^N (z - z_k)}{\prod_{k=1}^N (z - p_k)}$$

$z_k$  zeros,  $p_k$  poles,  $G$  gain constant (numerically preferred repres.)

## Synthesis Methods

Analytical - closed form solutions - standard approximations

Requirements only on the magnitude response  $|H(e^{j\omega T})|$

Optimal lowpass and highpass filters. Suboptimal bandpass, bandstop, and multiband filters

Common to transform analog filter into digital IIR filter

Bilinear transformation - for requirements on  $|H(e^{j\omega T})|$  only

Optimization - iterative methods

Optimal filters for all types (potentially, local minimum possible)

More flexible - can handle requirements on the magnitude response, phase response, group delay response, etc.

Nonlinear optimization - local minimum is a problem

a) Optimize  $H_a(s)$   $\rightarrow$  (transformation)  $\rightarrow H(z)$

b) Optimize  $H(z)$  directly

## **On the White Board**

Bilinear transformation

Synthesis procedure

Deterioration of the phase response

# LECTURE 7, Digital Filters

## Multirate Systems

Systems that work with several different sampling frequencies

## Two Approaches

Reconstruction to analog signal followed by resampling

Requires analog signal processing (ADC, filter, DAC)

Digital interpolation and decimation - preferred

## Applications

Interconnection of systems with different sampling frequencies

Oversampling techniques - relax requirements on the analog parts

Reduction of computational complexity

## Frequency Masking Techniques

Single-rate structures

Make use of interpolated impulse responses  $\Leftrightarrow$  periodic subfilters

$\Rightarrow$  sparse subfilters  $\Rightarrow$  few non-zero impulse response values

$\Rightarrow$  computationally efficient

## **On the White Board**

Interpolation (sampling rate increase)

Decimation (sampling rate decrease)

Transmultiplexers

    Transmit information in different frequency bands

Polyphase decomposition

    Efficient interpolation and decimation structures

Frequency masking techniques

# LECTURE 8, Digital Filters

## Wave Digital Filters (WDFs)

Obtained from a transmission line filter  $H_a(s)$  via  $z = e^{sT}$  or,  
equivalently, from a lumped reference filter  $H_{ar}(\Psi)$  via  $\Psi = \frac{z-1}{z+1}$

Inherit the good properties of the analog reference filters

Spec.  $\rightarrow H_{ar}(\Psi)$  and realization  $\rightarrow H(z)$  and realization - WDF

## Doubly Resistively Terminated Reference Filters

Inductors, capacitors

Unit elements

## Filter Structures

Ladder structures  $\Rightarrow$  ladder WDFs, low-sensitivity

Lattice structures  $\Rightarrow$  lattice WDFs, low sensitivity in the passband  
high sensitivity in the stopband

Richards' structures - restricted to certain filter types

Basic principles and properties of the filter structures  
(not the whole underlying mathematical theory)

Parts from the analog filter structure world needed for the  
realization of WDFs

# On the White Board

## Wave Digital Filters

Relations between the WDF, transmission-line filter, and  $\Psi$ -domain reference filter

## Doubly resistively terminated filters

## Filter structures

Ladder, Lattice, Richard's

## Ladder structures

LP T-net and  $\pi$ -net with and without finite zeros

Computation of element values

HP, BP, and BS - frequency transformations

# LECTURE 9, Digital Filters

## Wave Digital Filters (WDFs)- Design Procedure

Three-step procedure

Specification mapping from the WDF to the  $\Psi$ -domain reference filter

Realization of the reference filter

Transformation of the reference filter into the WDF - voltage waves

Transformation of reference filter into WDF

1) Transformation of elements and sources

2) Interconnection of elements and sources - requires adaptors

Parallel connections - parallel adaptors

Series connections - series adaptors

# **On the White Board**

Wave digital filters

Design procedure

Transformation of reference filter into WDF

Parallel and series adaptors

# **LECTURE 10, Digital Filters**

## **Wave Digital Filters (WDFs) - Filter Realizations**

### **Delay-Free Loops Must be Avoided**

Three methods

- 1) Cascaded unit elements
- 2) Separating unit elements between inductors and capacitors
- 3) Reflection-free ports

### **WDF Structures**

Richards WDFs - cascaded unit elements

Ladder WDFs - reflection-free ports or separating unit elements

Lattice WDFs - realize reactance

Foster, Cauer, Richards, Circulators

### **On the White Board**

Richards WDFs

Ladder WDFs

Lattice WDFs