# Digital Signal Processing: An Introduction

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June 16, 2009



Advantages and disadvantages

Summary

# Outline

## Introduction to DSP

- Defining the Terms
- Sampling and Quantization
- Z-transform
- Digital Filtering
- Efficient Filter Structures

## 2 Real-time digital signal processing

- Definition and applications
- Available solutions

## 3 Advantages and disadvantages

- General-purpose Processors
- Special-purpose DSP chips
- Field Programmable Gate Arrays



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# **Digital Signal Processing: Domains**

- Digital signal processing involves three important mathematical processes:
  - Time quantization going from continuous to discrete time;
  - Amplitude quantization going from continuous to discrete signal amplitudes;
  - Digital to analog conversion going back to continuous time and amplitude.



## **Discrete Amplitude and Noise**

- Conceptually, continuous amplitude signal can take any value.
- In practice, there is some minimal voltage step  $\Delta V$  that we can resolve.
- Why is that?
- Signal is useful information  $V_c$  plus noise  $V_n$ .
- At increments comparable to noise RMS we can no longer distinguish signal values.
- Important point amplitude quantization has certain dynamic range, but input signal must have higher SNR.



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# Time Sampling

#### Continuous to Discrete Time

$$V_n = V_c(nT_s)$$
$$V_s = V_c(t) \sum_{n=-\infty}^{\infty} \delta(t - nT_s) = \sum_{n=-\infty}^{\infty} V_n \delta(t - nT_s)$$

- Multiply the signal by a train of delta functions.
- Multiplication in time domain means convolution in frequency domain.
- Information is lost in this conversion.
- Sampling period  $T_s$ , sampling frequency  $f_s = 1/T_s$ .
- Nyquist frequency.



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# Amplitude Quantization

#### **Quantizer Definition**

The quantizer is a nonlinear system whose purpose is to transform the input sample  $V_n$  into one of a finite set of prescribed values ( $\hat{V}_n$ ).

- Uniform quantization with step size  $\Delta$ .
- Quantizing to a given number of bits N<sub>b</sub> in the digital representation.
- $\Delta = 2X_m/2^{N_b} = X_m/2^{N_b-1}$  where  $X_m$  is the full-scale range of the quantizer.
- Example: in an 8-bit system there are 256 discrete levels. Signal quantization step is  $X_m/128$ .



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# **Quantization Errors**

# • Consider error $e_n = \hat{V}_n - V_n$

- $-\Delta/2 < e_n \leq \Delta/2$
- Assumptions:
  - The error sequence *e<sub>n</sub>* is a sample sequence of a stationary random process.
  - The error sequence is uncorrelated with the sequence  $V_n$ .
  - The error is a white-noise process.
  - The probability distribution of the error process is uniform over the range of quantization error.
- Then we get for variance of  $e_n$ :  $\sigma_e^2 = \Delta^2/12$
- SNR of a quantizer in dB:  $SNR = 6.02N_b + 4.78 - 20 \log_{10}(X_m/\sigma_N)$



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# Digital to Analog Conversion

#### • Use samples to reconstruct continuous-time signal.

• Different ways to perform reconstruction:

- Hold sample value for each period (zero-order hold);
- Linearly interpolate between samples (first-order hold);
- Many other methods.
- Typically D/A converters use zero-order hold.
- Frequency response of a zero-order hold is  $H_0(j\omega) = \frac{2sin(\omega T_s/2)}{\omega T_s} e^{-i\omega T_s/2}$



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## Z-transform

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# Z-transform

#### Z-transform Definition

# Z-transform of sequence $x_n$ is defined as $X(z) = \sum_{n=-\infty}^{\infty} x_n z^{-n}$

- Discrete-time Fourier transform of sequence  $x_n$  is  $X(e^{i\omega}) = \sum_{n=-\infty}^{\infty} x_n e^{-i\omega n}$
- Similar to Laplace and Fourier transforms in continuous time we have z-transform and discrete-time Fourier transform.
- Delay operator  $z^{-1}$ :  $x_{n-1} = x_n z^{-1}$



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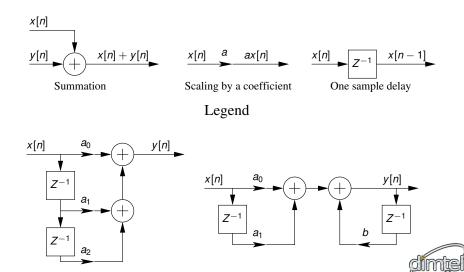


Advantages and disadvantages

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Summary

# **Digital Filtering Basics**



# Two Classes of Filters

# • All linear time-invariant digital filters can be split into two classes:

- Finite Impulse Response (FIR): filter output depends only on a finite number of past input samples;
- Infinite Impulse Response (IIR): filter has internal memory, output theoretically persists to infinity.
- Internal memory feedback.
- Feedback can be unstable IIR filter designer has to worry about stability.
- FIR filters are unconditionally stable.



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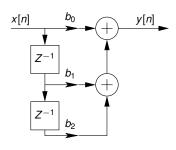
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# **FIR Filter**



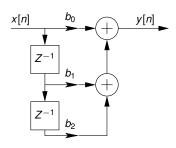
- Response of an FIR:  $y[n] = \sum_{i=0}^{N-1} b_i x[N-1-i]$
- Each term in the sum is called "tap".
- *N*-tap filter requires *N* multiplies and *N* adds.
- Z-transform of FIR response:  $H(z) = \sum_{i=0}^{N-1} b_i z^{-i}$



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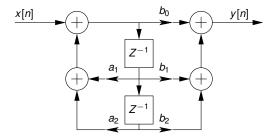
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# **IIR Filter: Biquad Structure**



#### Direct Form II realization

Second-order transfer function

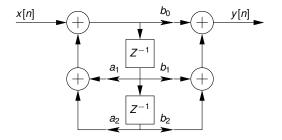
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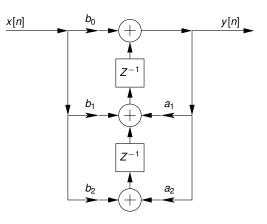
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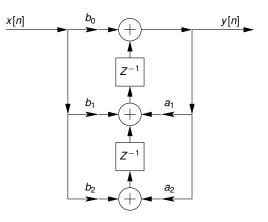
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## **IIR Filter Stability**

- Z-domain transfer function is stable if the poles (roots of the denominator polynomial) are within a unit circle.
- |p| < 1</p>
- Critically stable for |p| = 1.
- Integrator is critically stable:  $y_n = y_{n-1} + x_n$ .



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# **Good Filters**

#### • Structures for efficient filter implementation:

- Resource usage no multiplies;
- Resource usage many zero coefficients;
- Resource usage symmetric structures;
- Improving quantization effects.
- A few examples
- Cascaded Integrator Comb (CIC)
- Half-band filters
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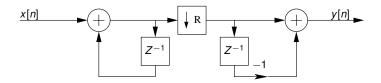


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### **Cascaded Integrator Comb**



• Sampling rate reduced by R.

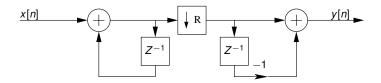
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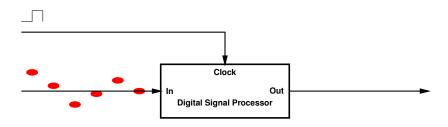
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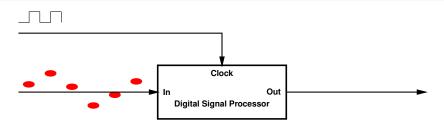


- Continuous input stream of samples.
- Output (processed) samples generated every clock cycle.
- Fixed delay (latency) between input and output.
- Sampling clock defines available per-sample processing time.
- System defining elements: sampling rate, latency, algorithm complexity.



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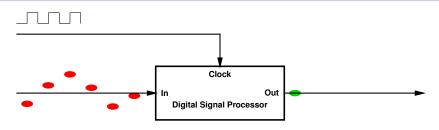


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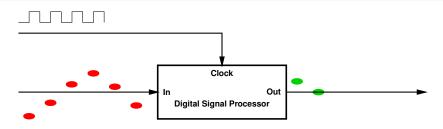


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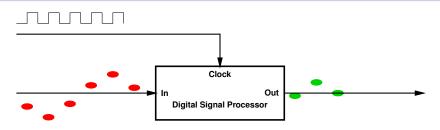


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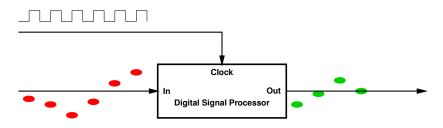
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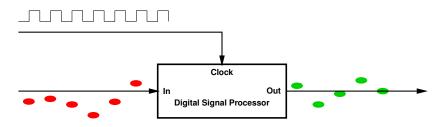
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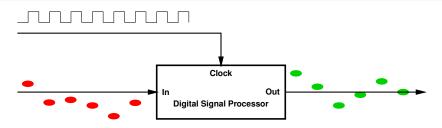
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## **Accelerator Applications**

- Low-level RF;
- Orbit feedback;
- Collision point feedback;
- Coupled-bunch instabilities control;
- BPMs
- There are also non real-time needs:
  - Off-line diagnostics ...
  - ... and configuration
  - These are often easier to satisfy with the off-the-shelf hardware.



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Advantages and disadvantages

## Outline

#### Introduction to DSF

- Defining the Terms
- Sampling and Quantization
- Z-transform
- Digital Filtering
- Efficient Filter Structures

### 2 Real-time digital signal processing

- Definition and applications
- Available solutions
- 3 Advantages and disadvantages
  - General-purpose Processors
  - Special-purpose DSP chips
  - Field Programmable Gate Arrays



# Real-time Signal Processing Solutions: Sampling Rate



- Sampling rates of interest from 100 kHz to 1000+ MHz.
- Options range from general-purpose CPUs to dedicated hardware.
- Special-purpose DSP chips fall somewhere in the middle.
- Are DSPs really faster than GP CPUs?

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• Dedicated hardware solutions have mostly converged on FPGA devices.



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# Real-time Signal Processing Solutions: Latency



- Finishing order quite similar to the previous slide.
- For latency DSPs do have an edge on the general-purpose CPUs.



## Three Choices

#### • General-purpose processors:

- Basically a plain-vanilla Intel-architecture PC.
- Instruction rates in the multi-GHz range.
- Hierarchical memory structure complicates algorithm timing.
- Special-purpose DSPs.
  - Off-the-shelf or custom design.
  - Slower clocks than GP CPUs.
  - Multiple execution units.
  - Architectural features for real-time processing.
- FPGAs
  - Most likely custom design, some off-the-shelf availability.
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Summary

### General-purpose CPUs: advantages

- Low cost per MIPS.
- Wide variety of development tools/environments.
- Easy to prototype and test algorithms.
- Intel/AMD CPUs have DSP extensions:
  - MMX, MMX2, SSE, SSE2, ...



Summary

#### General-purpose CPUs: disadvantages

- Real-time support issues.
- Input and output.
  - Real-time streaming I/O needs thought.
- Integration:
  - Startup and booting.
  - Power interruption handling.
  - Software maintenance.



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- Special instructions for filtering, Fourier transforms.

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- General-purpose CPUs include DSP engines
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# FPGAs: Pros and Cons

Pros:

- Natural for synchronous real-time processing
- Parallel structures provide significant speed gain
  - Each clock cycle multiple processing units execute simultaneously
  - Example: 64-tap FIR at 100 MHz
  - Equivalent to 6.4 GHz instruction rate on a single execution unit.
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