

بِسْمِ اللَّهِ الرَّحْمَنِ الرَّحِيمِ



پردازش سیگنال دیجیتال

درس ۱۹

اثرات عددی دقت متناهی

Finite Precision Numerical Effects

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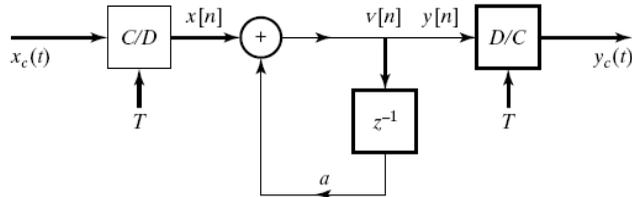
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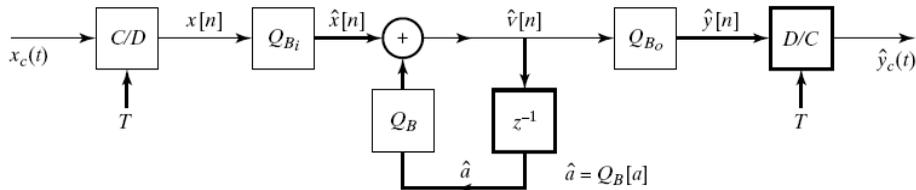
Finite Precision Numerical Effects

Quantization in Implementing Systems

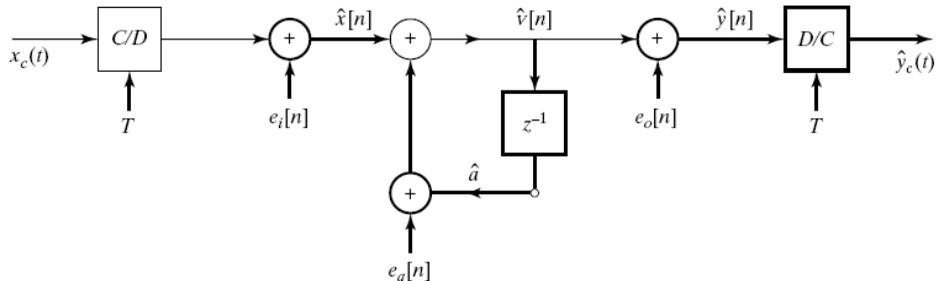
- Consider the following system:



- A more realistic model would be: **(non-linear model)**



- In order to analyze it we would prefer: **(linearized model)**



Effects of Coefficient Quantization in IIR Systems

- When the parameters of a rational system are **quantized**
 - The poles and zeros of the system function **move**
- If the system structure of the system is sensitive to **perturbation of coefficients**
 - The resulting system **may no longer be stable**
 - The resulting system **may no longer meet the original specs**
- We need to do a detailed **sensitivity analysis**
 - **Quantize** the coefficients and analyze **frequency response**
 - **Compare** frequency response to original response
- We would like to have a general sense of **the effect of quantization**

Effects on Roots

$$H(z) = \frac{\sum_{k=0}^M b_k z^{-k}}{1 - \sum_{k=1}^N a_k z^{-k}} \xrightarrow{\text{Quantization}} \hat{H}(z) = \frac{\sum_{k=0}^M \hat{b}_k z^{-k}}{1 - \sum_{k=1}^N \hat{a}_k z^{-k}}$$

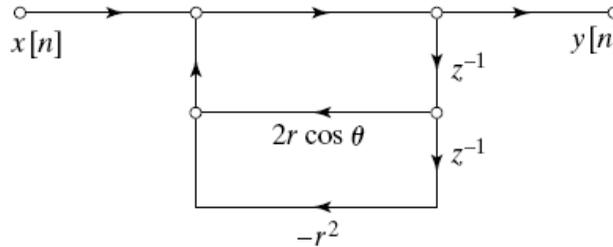
- Each root is affected by quantization errors in ALL coefficient
- Tightly clustered roots can be significantly effected
 - \Rightarrow Narrow-bandwidth lowpass or bandpass filters can be very sensitive to quantization noise
- The larger the number of roots in a cluster the **more sensitive** it becomes
- *This is the reason why second order cascade structures are less sensitive to quantization error than higher order system*
 - Each second order system is independent from each other

Poles of Quantized Second-Order Sections

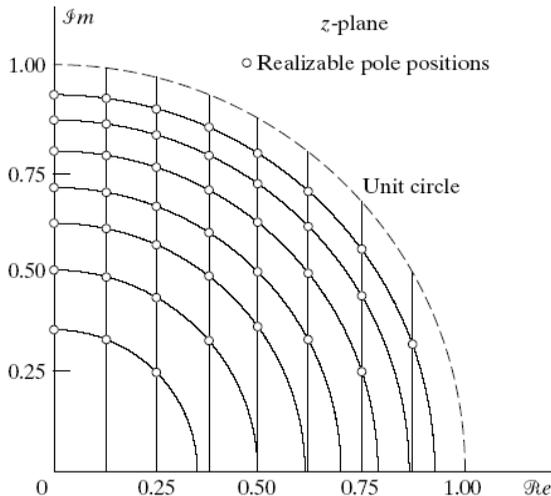
- Consider a 2nd order system with complex-conjugate pole pair

$$z_1 = re^{j\theta}, z_2 = re^{-j\theta}$$

$$-r^2, 2r\cos\theta$$

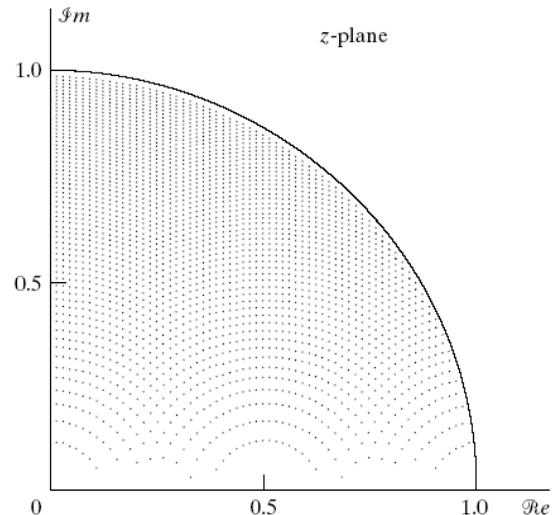


- The pole locations after quantization will be **on the grid point**



← 4-bits

7-bits →



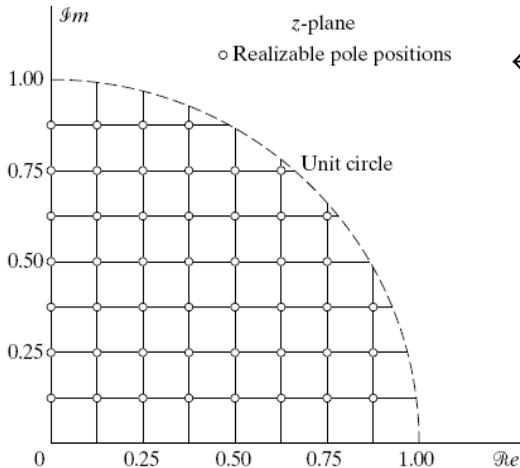
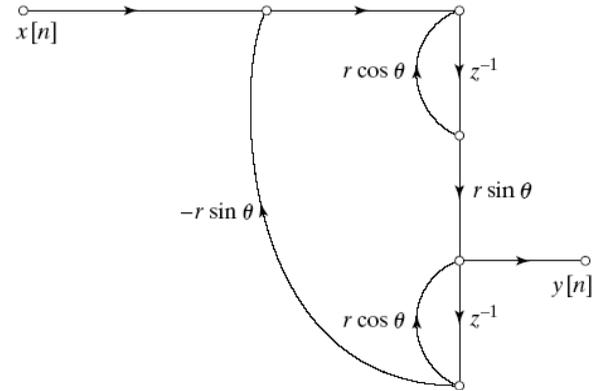
Coupled-Form Implementation of Complex-Conjugate Pair

- Equivalent implementation of the second order system

$$z_1 = re^{j\theta}, z_2 = re^{-j\theta}$$

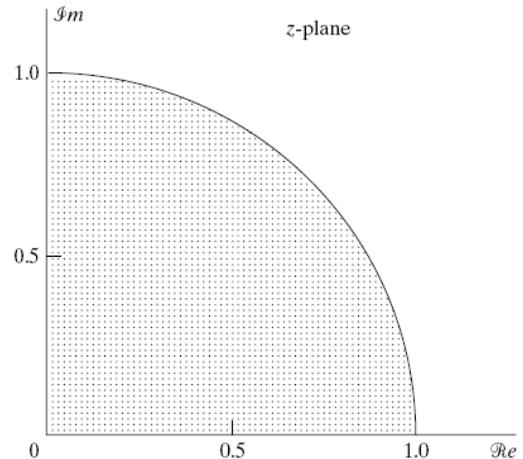
$$z_1 = re^{j\theta} = r \cos \theta + r \sin \theta$$

- But the quantization grid this time is



← 4-bits

7-bits →



Effects of Coefficient Quantization in FIR Systems

- No poles to worry about only zeros
- Direct form is commonly used for FIR systems

$$H(z) = \sum_{n=0}^M h[n]z^{-n}$$

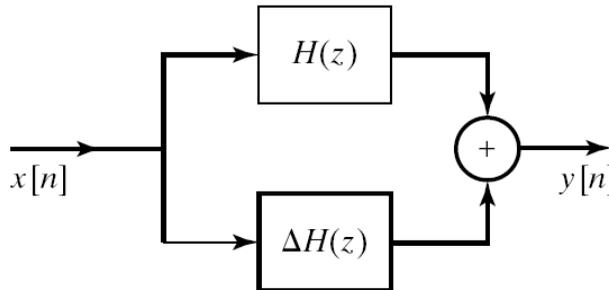
$$\hat{h}[n] = h[n] + \Delta h[n]$$

- Suppose the coefficients are quantized

$$\hat{H}(z) = \sum_{n=0}^M \hat{h}[n]z^{-n} = H(z) + \Delta H(z)$$

$$\Delta H(z) = \sum_{n=0}^M \Delta h[n]z^{-n}$$

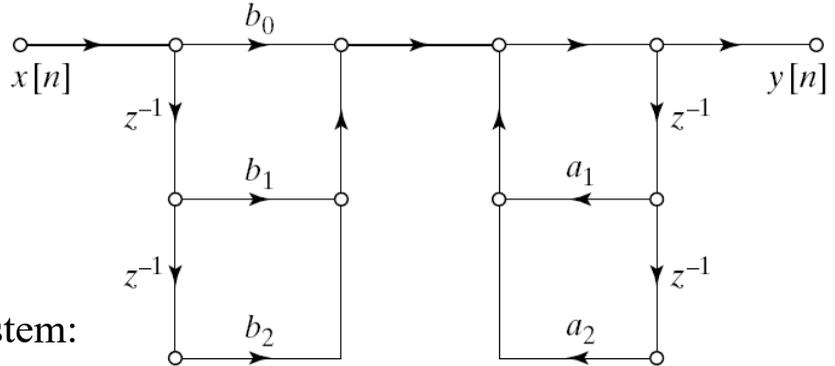
- Quantized system is linearly related to the quantization error



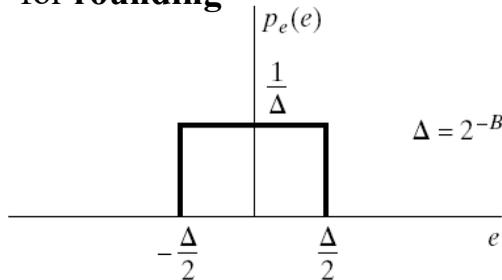
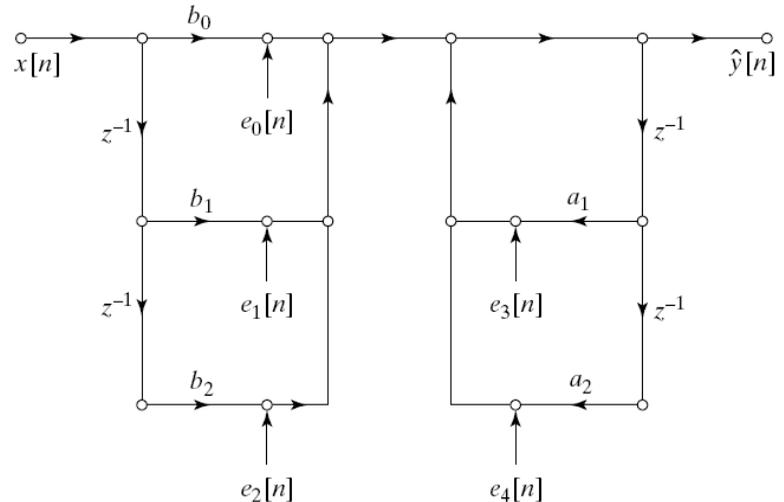
- Again quantization noise is higher for **clustered zeros**
- However, **most** FIR filters have spread zeros

Round-Off Noise in Digital Filters

- Difference equations implemented with finite-precision arithmetic are **non-linear** systems
- Second order direct form I system:

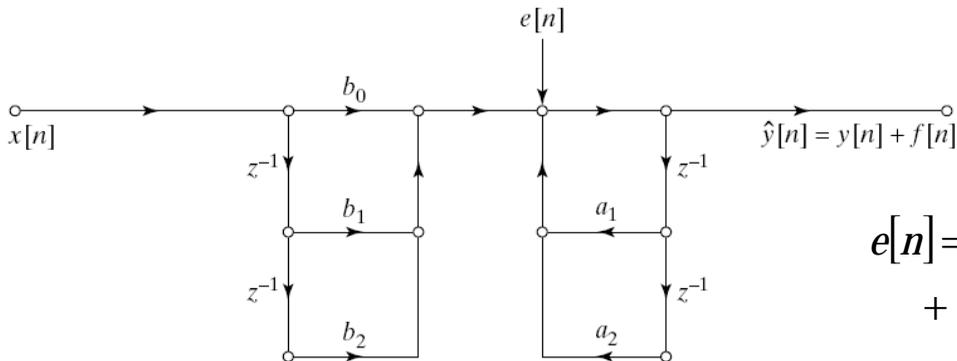


- Model with quantization effect:
- Density function error terms for **rounding**



Analysis of Quantization Error

- Combine all error terms to single location to get



$$e[n] = e_0[n] + e_1[n] + e_2[n] + e_3[n] + e_4[n]$$

- The variance of $e[n]$ in the general case is $\sigma_e^2 = (M+1+N) \frac{2^{-2B}}{12}$
- The contribution of $e[n]$ to the output is $f[n] = \sum_{k=1}^N a_k f[n-k] + e[n]$
- The variance of the output error term $f[n]$ is

$$\sigma_f^2 = (M+1+N) \frac{2^{-2B}}{12} \sum_{n=-\infty}^{\infty} |h_{ef}[n]|^2 \quad H_{ef}(z) = 1/A(z)$$

Round-Off Noise in a First-Order System

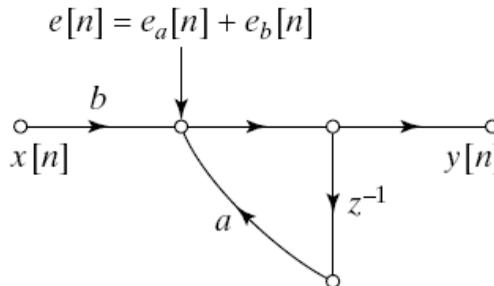
- Suppose we want to implement the following stable system

$$H(z) = \frac{b}{1 - az^{-1}} \quad |a| < 1$$

- The quantization error noise variance is

$$\sigma_f^2 = (M+1+N) \frac{2^{-2B}}{12} \sum_{n=-\infty}^{\infty} |h_{ef}[n]|^2 = 2 \frac{2^{-2B}}{12} \sum_{n=0}^{\infty} |a|^{2n} = 2 \frac{2^{-2B}}{12} \left(\frac{1}{1-|a|^2} \right)$$

- Noise variance increases as $|a|$ gets closer to the unit circle
- As $|a|$ gets closer to 1 we have to use more bits to compensate for the increasing error

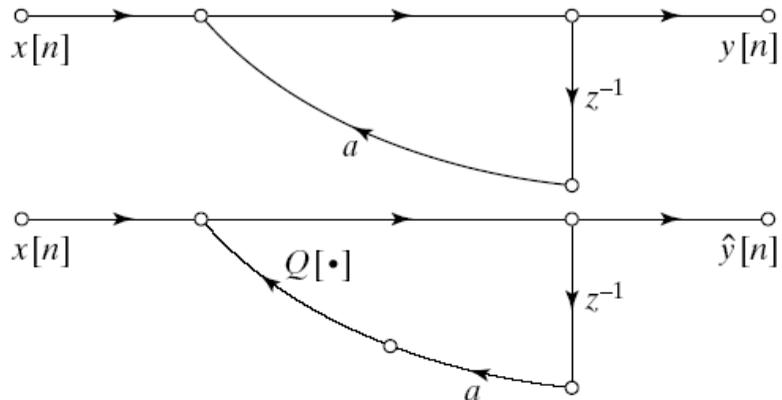


Zero-Input Limit Cycles in Fixed-Point Realization of IIR Filters

- For stable IIR systems the output will decay to zero when the input becomes zero
- A finite-precision implementation, however, may continue to oscillate indefinitely
- Nonlinear behaviour very difficult to analyze so we will study by example
- **Example: Limite Cycle Behavior in First-Order Systems**

$$y[n] = ay[n-1] + x[n] \quad |a| < 1$$

- Assume $x[n]$ and $y[n-1]$ implemented by 4 bit



Example Cont'd

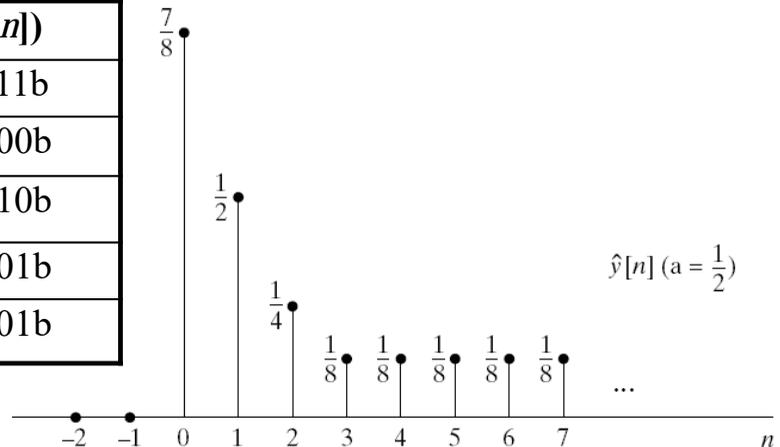
$$y[n] = ay[n-1] + x[n] \quad |a| < 1$$

- Assume that $a = \frac{1}{2} = 0.100b$ and the input is

$$x[n] = \frac{7}{8} \delta[n] = (0.111b)\delta[n]$$

- If we calculate the output for values of n

n	$y[n]$	$Q(y[n])$
0	$7/8 = 0.111b$	$7/8 = 0.111b$
1	$7/16 = 0.011100b$	$1/2 = 0.100b$
2	$1/4 = 0.010000b$	$1/4 = 0.010b$
3	$1/8 = 0.001000b$	$1/8 = 0.001b$
4	$1/16 = 0.00010b$	$1/8 = 0.001b$



- A finite input caused an oscillation with period 1

Example: Limite Cycles due to Overflow

- Consider a second-order system realized by

$$\hat{y}[n] = x[n] + Q(a_1 \hat{y}[n-1]) + Q(a_2 \hat{y}[n-2])$$

- Where $Q()$ represents two's complement rounding
- Word length is chosen to be 4 bits
- Assume $a_1 = 3/4 = 0.110b$ and $a_2 = -3/4 = 1.010b$
- Also assume

$$\hat{y}[-1] = 3/4 = 0.110b \text{ and } \hat{y}[-2] = -3/4 = 1.010b$$

- The output at sample $n = 0$ is

$$\begin{aligned}\hat{y}[0] &= 0.110b \times 0.110b + 1.010b \times 1.010b \\ &= 0.100100b + 0.100100b\end{aligned}$$

- After rounding up we get

$$\hat{y}[0] = 0.101b + 0.101b = 1.010b = -3/4$$

- Binary carry overflows into the sign bit changing the sign
- When repeated for $n = 1$

$$\hat{y}[1] = 1.010b + 1.010b = 0.110 = 3/4$$

Avoiding Limite Cycles

- **Desirable to get zero output for zero input:** [Avoid limit-cycles](#)
- Generally adding **more bits** would avoid overflow
- Using **double-length accumulators** at **addition points** would decrease likelihood of limit cycles
- **Trade-off** between **limit-cycle avoidance** and **complexity**
- **FIR systems** cannot support zero-input limit cycles (no feedback!)
 - because they have no feedback paths. The output of an FIR system will be zero no later than $(M + 1)$ samples after the input goes to zero and remains there.
 - This is a major advantage of FIR systems in applications wherein limit cycle oscillations cannot be tolerated.