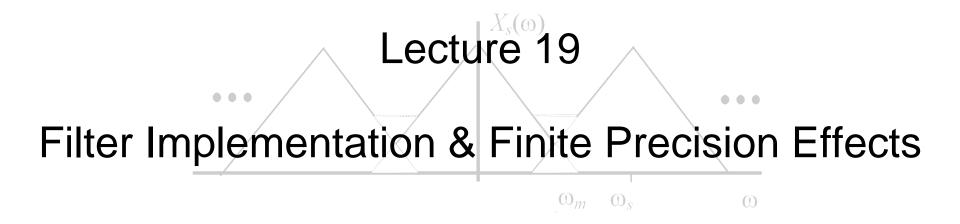
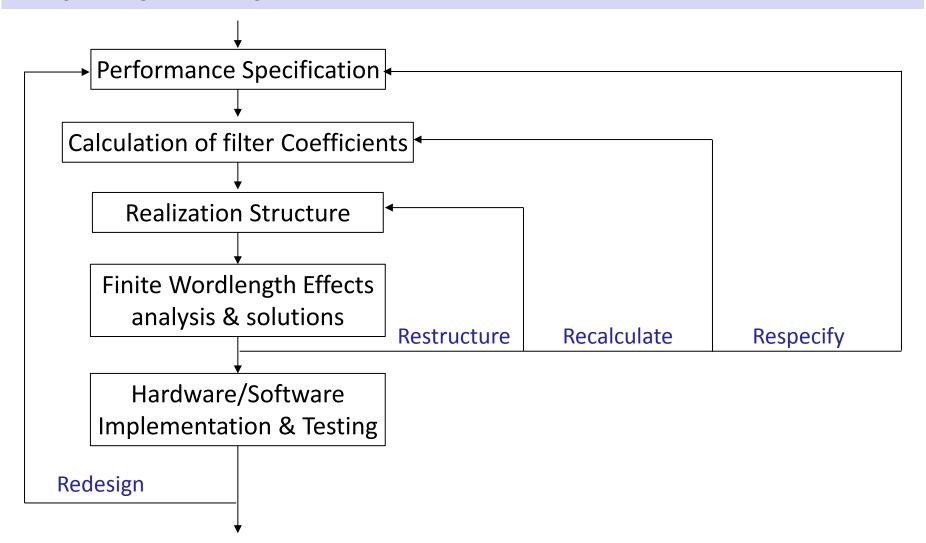
# Digital Filters & Spectral Analysis





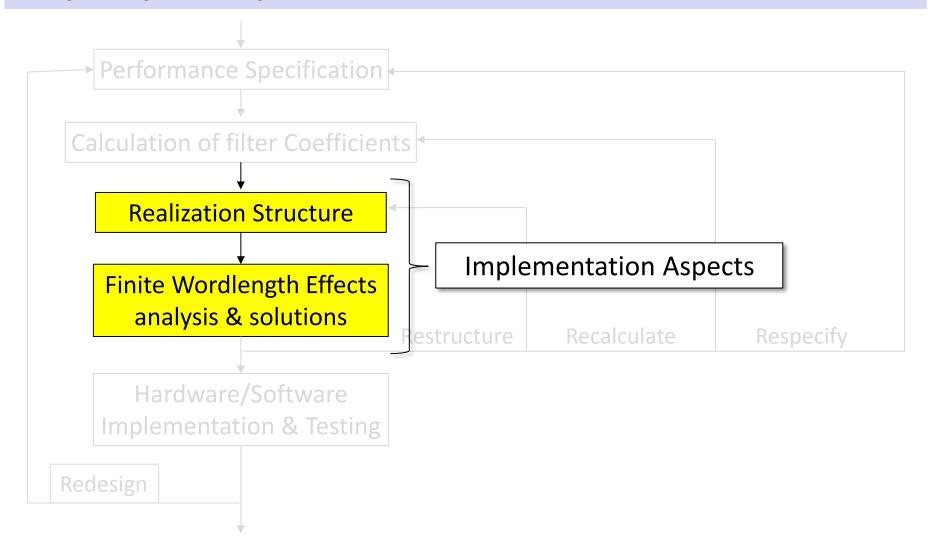
## Digital Filter Design Procedure

### Design Stages for Digital Filters



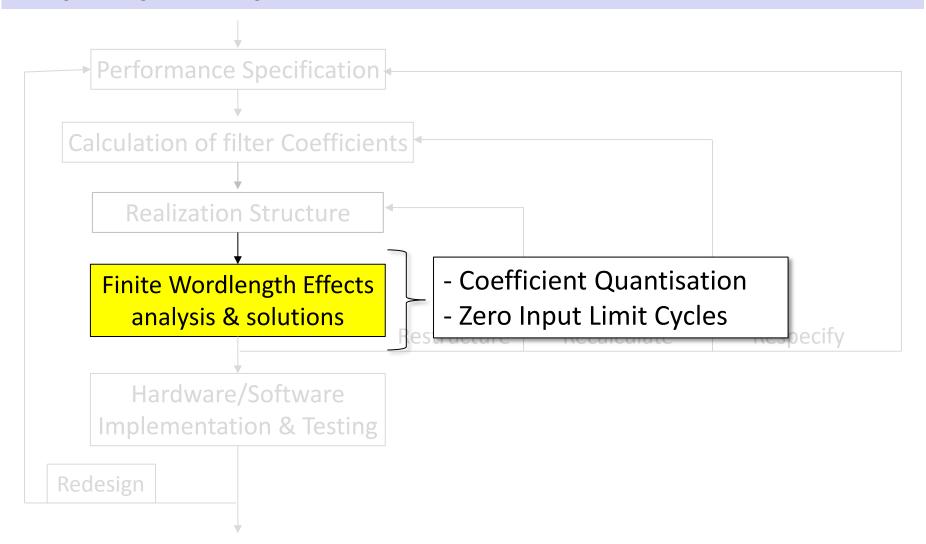
### Digital Filter Design Procedure

### Design Stages for Digital Filters



### Digital Filter Design Procedure

### Design Stages for Digital Filters



### Number Representation

### Fixed Point & Floating Point Arithmetic

- Implementing digital filters requires representation of numbers (coefficients, intermediate results and output) with finite precision.
- Quantisation is applied to map numbers to a fixed number of bits
- With **floating point arithmetic** and 32 or 64 bit wordlengths (e.g. general processors) accuracy is very high **quantisation** issues are **of little or no concern**
- With fixed point arithmetic and smaller wordlengths (e.g. many embedded processors) quantisation becomes an issue
- Quantisation is a non-linear operation

### **Fixed Point Arithmetic**

#### Quantisation Error & Dynamic Range

2<sup>s</sup> Complement Binary Representation

Infinite number of bits

Infinite precision representation:

$$if \quad b_0 = 0 \quad 0 \le x \le X_m$$

*if* 
$$b_0 = 1 - X_m \le x < 0$$

$$x = X_{m} \left( -b_{0} + \sum_{i=1}^{\infty} b_{i} 2^{-i} \right)$$
Scaling Sign factor Bit

Finite number of bits

Finite precision representation:

$$\hat{x} = Q_B[x] = X_m \left( -b_0 + \sum_{i=1}^B b_i 2^{-i} \right)$$

**Quantisation Step:** 

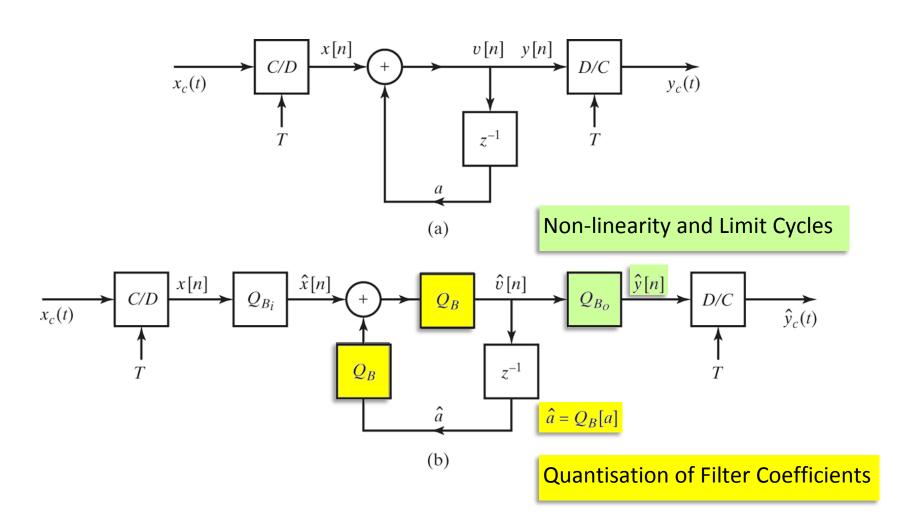
$$\Delta = X_m 2^{-B}$$

**Quantisation Error:** 

$$e = Q_{\scriptscriptstyle R}[x] - x$$

# Digital Filter Implementation

Infinite vs. Finite Precision Implementation



### Digital Filter Implementation

#### **Quantisation of Filter Coefficients**

How close is the performance of the implemented filter with system function  $\hat{H}(z)$  to the designed one with system function H(z)

$$\hat{H}(z) = \frac{1}{1 - \hat{a} z^{-1}}$$

Poles occur at slightly different location due to quantisation of filter coefficients

### **Effects of Coefficient Quantisation**

### **IIR Digital Filters**

- Poles and zeros change location due to coefficient quantisation
- The filter's frequency response will change and may not meet the specification
- The filter may even become unstable if the poles move outside the unit circle

$$\hat{H}(z) = \sum_{k=0}^{M} \hat{b}_k z^{-k} / 1 - \sum_{k=1}^{N} \hat{a}_k z^{-k}$$

- The roots of the polynomials (denominator or numerator) are affected by all the coefficients.
- Each pole and zero will be affected by all the quantization errors in the denominator and numerator polynomial respectively
- If roots are tightly clustered then large shifts can happen with the direct form

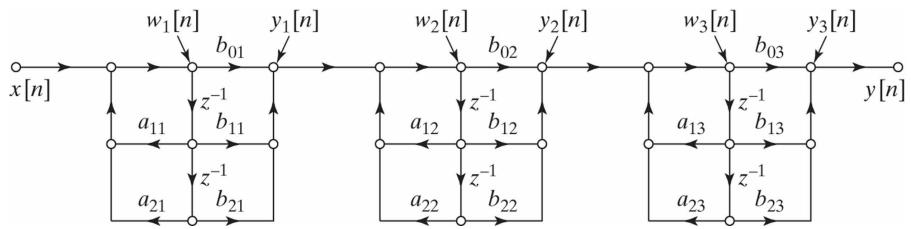
### **Effects of Coefficient Quantisation**

#### IIR Digital Filters – Cascade and Parallel Forms

- Combinations of 2<sup>nd</sup> order direct form systems
- Pairs of poles and zeros (the latter only for cascade form) are realized independently of other poles
- Parallel and especially cascade form less sensitive to coefficient quantisation

$$H(z) = \prod_{k=1}^{N_s} H_k(z) = \prod_{k=1}^{N_s} \frac{b_{0k} + b_{1k} z^{-1} + b_{2k} z^{-2}}{1 - a_k z^{-1} - a_{2k} z^{-2}}$$

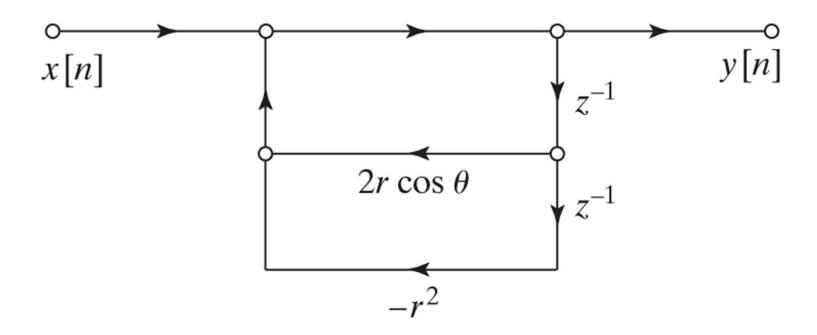
$$w_1[n] \qquad y_1[n] \qquad w_2[n] \qquad y_2[n]$$



### **Effects of Coefficient Quantisation**

#### IIR Digital Filters - Example

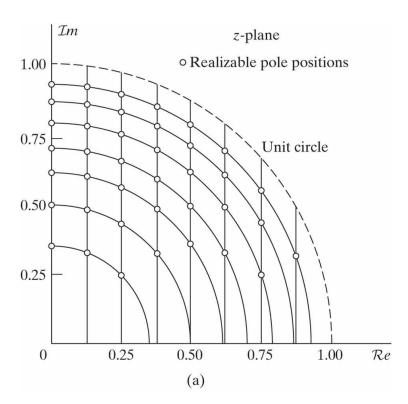
• 2<sup>nd</sup> order resonator filter  $H(z) = \frac{1}{1 - 2r\cos(\theta)z^{-1} + r^2z^{-2}}$ 

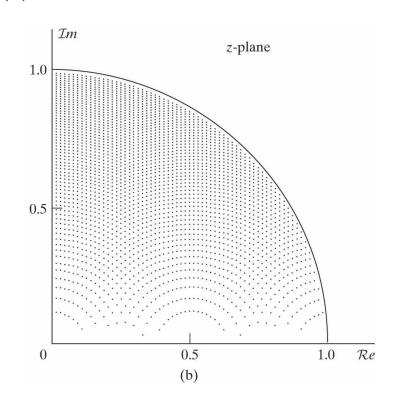


### **Effects of Coefficient Quantisation**

#### IIR Digital Filters - Example

• 2<sup>nd</sup> order resonator filter  $H(z) = \frac{1}{1 - 2r\cos(\theta)z^{-1} + r^2z^{-2}}$ 





Pole-locations for 2<sup>nd</sup>-order IIR direct form resonator filter with (a) four-bit quantization of coefficients, (b) seven-bit quantization.

### **Effects of Coefficient Quantisation**

#### IIR Digital Filters - Example

• 2<sup>nd</sup> order resonator filter  $H(z) = \frac{1}{1 - 2r\cos(\theta)z^{-1} + r^2z^{-2}}$ 

• 
$$r = 0.99$$
  $\theta = \frac{\pi}{4}$   $H(z) = \frac{1}{1 - 1.4001z^{-1} + 0.9801z^{-2}}$ 

• Quantize coefficients to nearest multiple of 1/16  $\hat{H}(z) = \frac{1}{1 - 1.375z^{-1} + z^{-2}}$ 

Unstable due to poles on unit circle

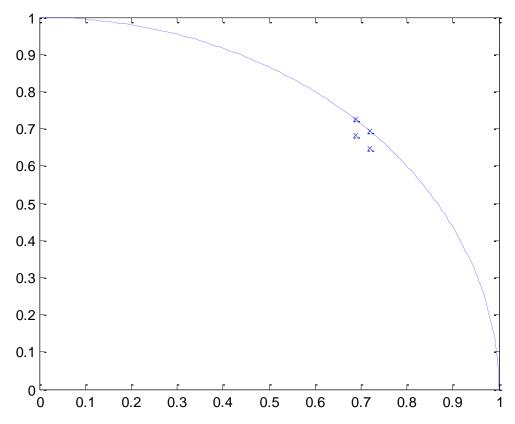
### **Effects of Coefficient Quantisation**

#### IIR Digital Filters - Example

• 2<sup>nd</sup> order resonator filter  $\hat{H}(z) = \frac{1}{1 - 1.375z^{-1} + z^{-2}}$ 

Rounding up or down to a multiple of 1/16 gives four choices for the location of

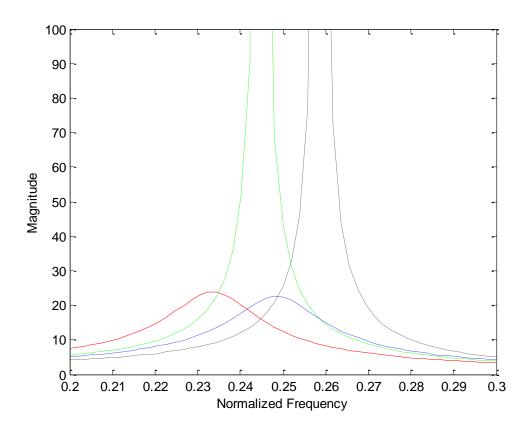
the poles



### **Effects of Coefficient Quantisation**

#### IIR Digital Filters - Example

- 2<sup>nd</sup> order resonator filter  $\hat{H}(z) = \frac{1}{1 1.375z^{-1} + z^{-2}}$
- Rounding up or down to a multiple of 1/16 gives four frequency responses



### Zero Input Limit Cycles

#### Fixed Point Realisation of IIR Digital Filters

- With infinite precision arithmetic if the input becomes zero the output will decay to zero after a certain number of samples (assuming the filter is stable)
- With fixed point arithmetic the output may continue to oscillate indefinitely with a periodic pattern while the input remains zero
- Successive rounding-off or truncation of products in an iterated difference equation can create such repeating patterns
- Rounding of data stored in feedback path is a non-linear effect

### Zero Input Limit Cycles

#### Example

$$H(z) = \frac{1}{1 + 0.75z^{-1}} \qquad y[n] = x[n] - 0.75y[n-1]$$

- Impulse response {1, -0.75, 0.5625, -0.4219, 0.3164...}
- Rounding y[n] to nearest multiple of 0.25 gives
   {1, -0.75, 0.5, -0.25, 0.25, -0.25, 0.25, ...}

Decays to zero

Oscillation

## Zero Input Limit Cycles

#### Does it matter?

- Suppose that a speech signal is sampled, filtered by a digital filter, and then converted back to an acoustic signal using a D/A converter
- If the filter suffers from periodic limit cycles whenever the input is zero an audible tone would be present (due to the oscillating output)

## Implementation Complexity

#### How to reduce it

- 1. Reduce the filter order.
- 2. Quantize the coefficients to fixed word-length.
- 3. Replace multipliers by additions of power-of-two shifted values. Note that power-of-two multipliers are simple bit shifts. e.g. 45x = 32x + 8x + 4x + x
- 4. Replace multipliers with signed power-of-two terms. e.g. 31x = 32x x
- 5. Using other representations allows further savings. e.g. 45x = (8+1)(4+1)x
- 6. For FIR filters, the transpose structure allows all the multipliers to be implemented together in one multiplier block. This can offer further savings.
- 7. Designing filters as a cascade and/or sum of simple sections can also help reduce complexity.

### FIR vs. IIR

### FIR Advantages relative to IIR

- FIR filters may be linear phase
- FIR filters have guaranteed stability, while IIR filters require poles in the unit-circle
- FIR filters are less sensitive to coefficient quantisation (IIR filters can become unstable)
- FIR filters do not suffer from limit cycle problems

### FIR Disadvantages relative to IIR

• FIR filters need higher filter order (complexity) for comparable performance