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# Introduction to EECS II

## 6.082

### Lecture 5

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#### Filtering

- Filter Types
- Filtering using Difference Equations
- Examples

9/18/2006

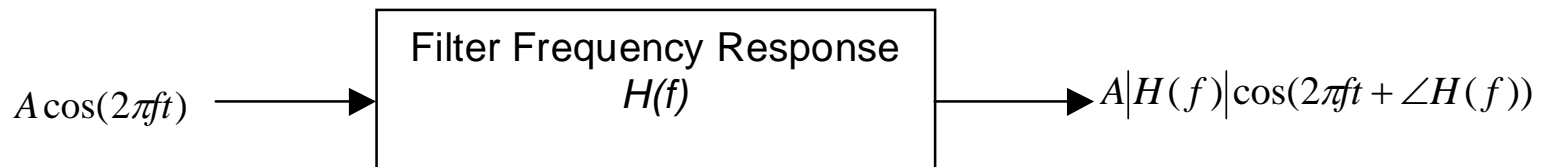
# Frequency Response

- Input sinusoid of amplitude  $A$  frequency  $f$   
 $A \cos(2\pi ft)$

- Given a linear filter (obeys superposition)

$$\alpha x_1(t) + \beta x_2(t) = \alpha y_1(t) + \beta y_2(t)$$

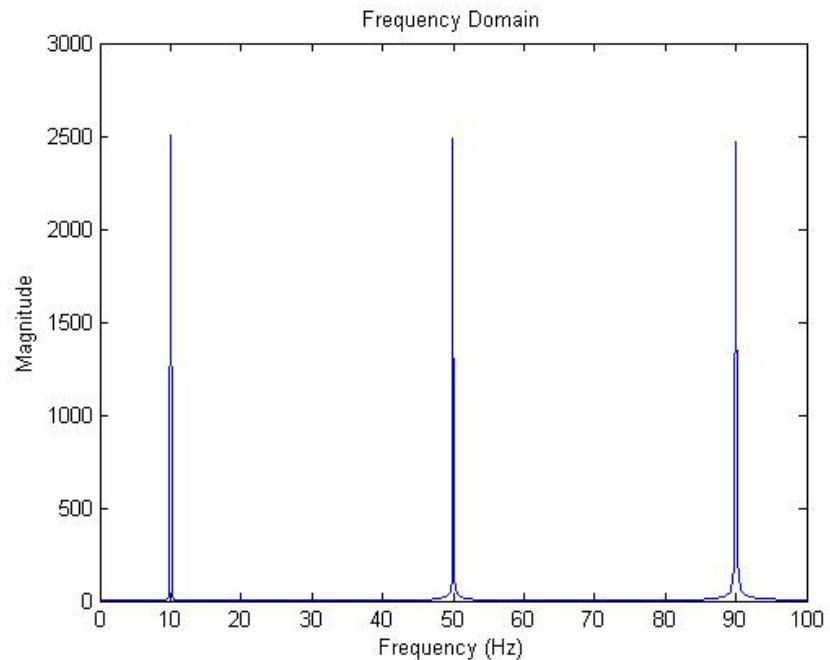
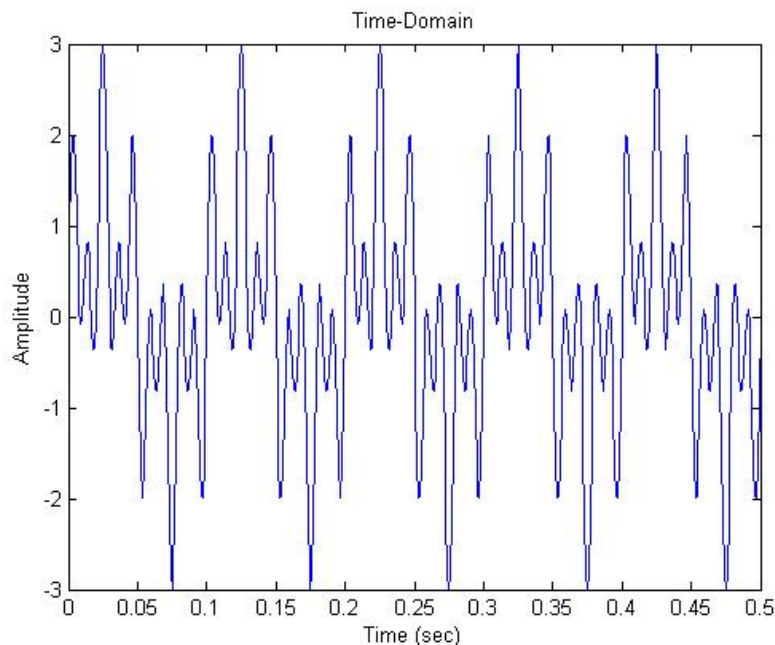
- Output sinusoid has amplitude scaled and phase shifted by the frequency response of the filter



# Example Input Signal to Filters

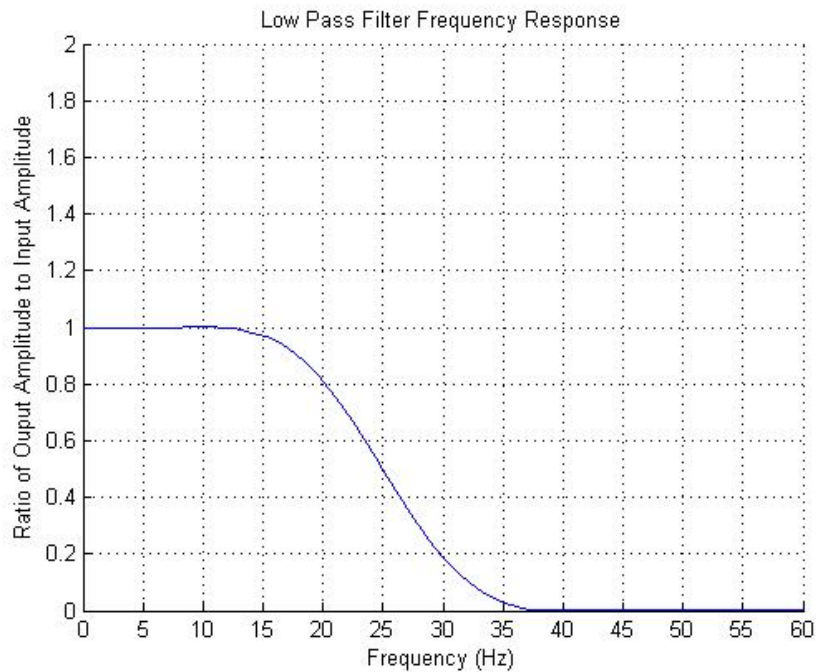
- Input signal - sum of 3 sinusoids
  - 10Hz, 50Hz, 90Hz

$$x(n) = \sin(2\pi * 10 * n * Ts) + \sin(2\pi * 50 * n * Ts) + \sin(2\pi * 90 * n * Ts)$$

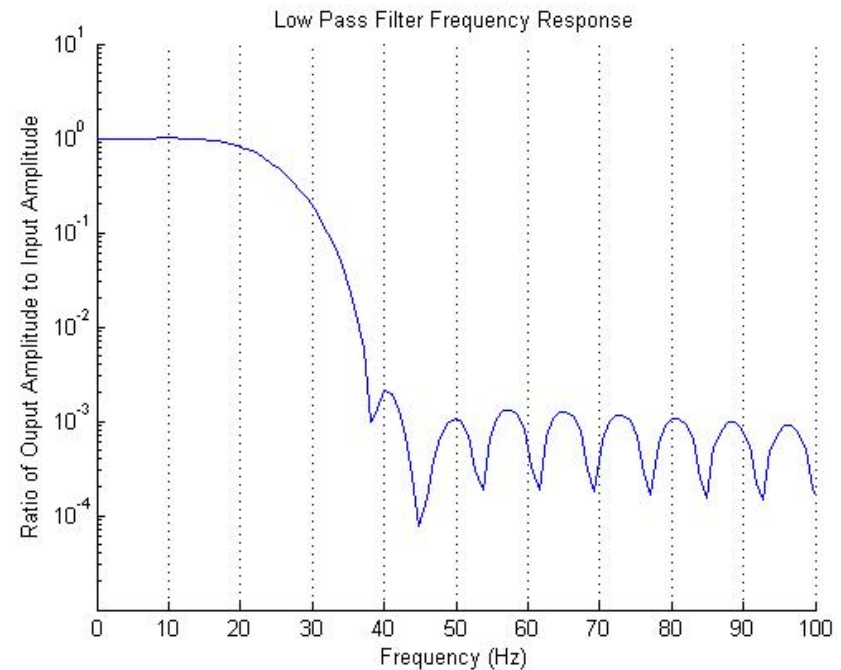


# Low Pass Filter Example

- Magnitude of Frequency Response
  - Ratio of output to input amplitude
  - Ignore ripples that are less than 0.1%



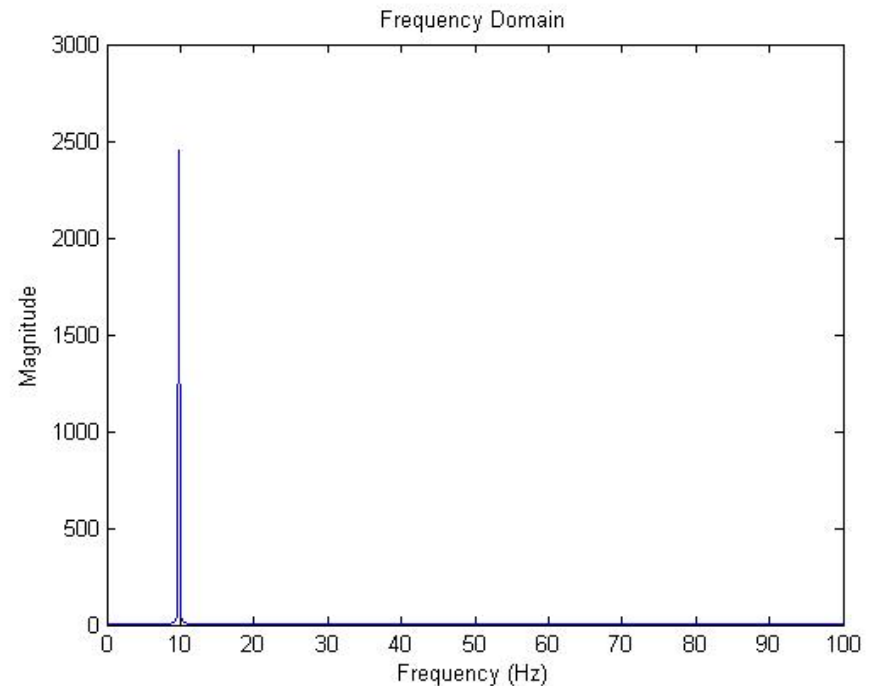
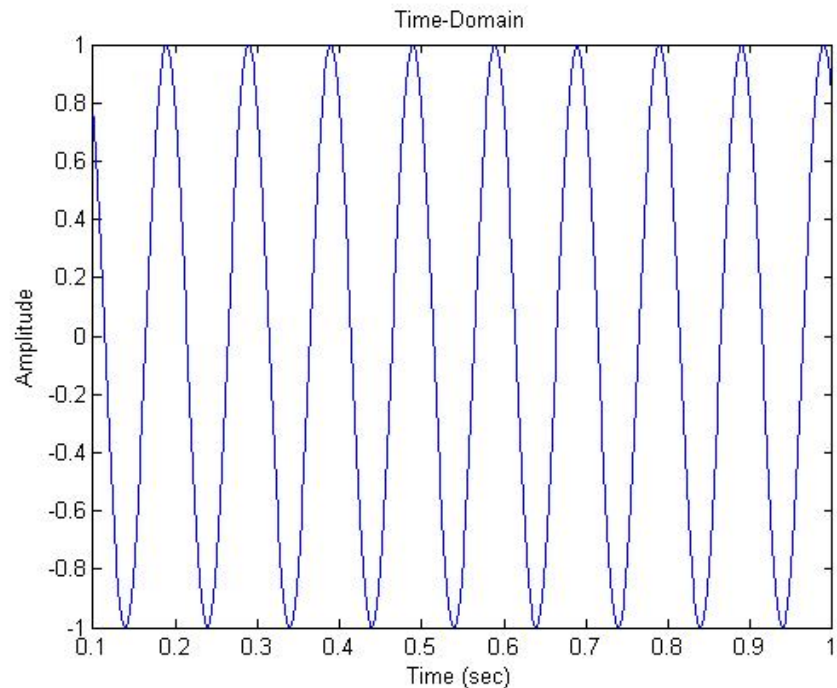
Linear Scale



Log Scale

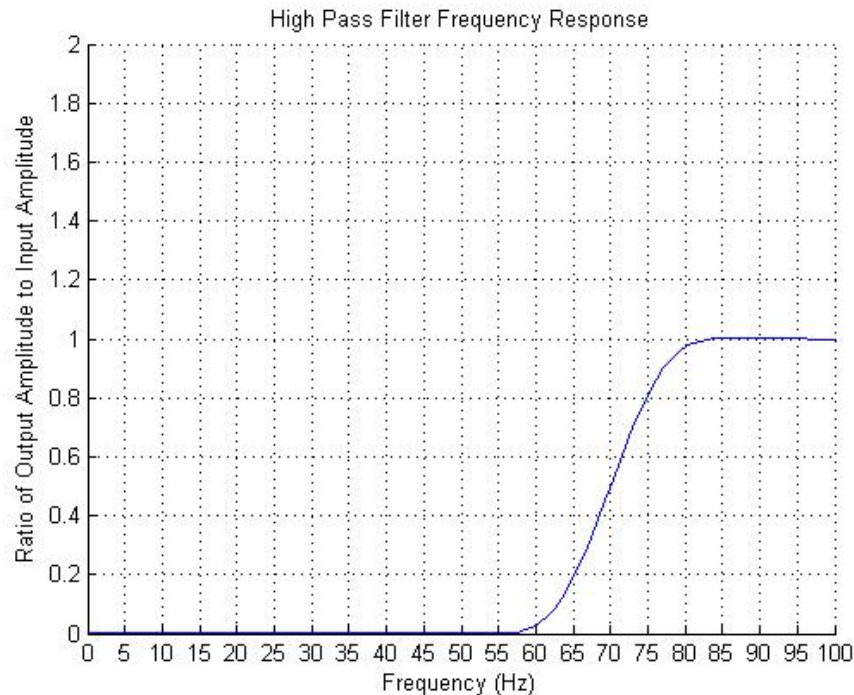
# Low Pass Filter Example

- Output signal in time and frequency domain shows that magnitude of 10Hz signal is nearly unaffected while 50Hz and 90Hz are attenuated.

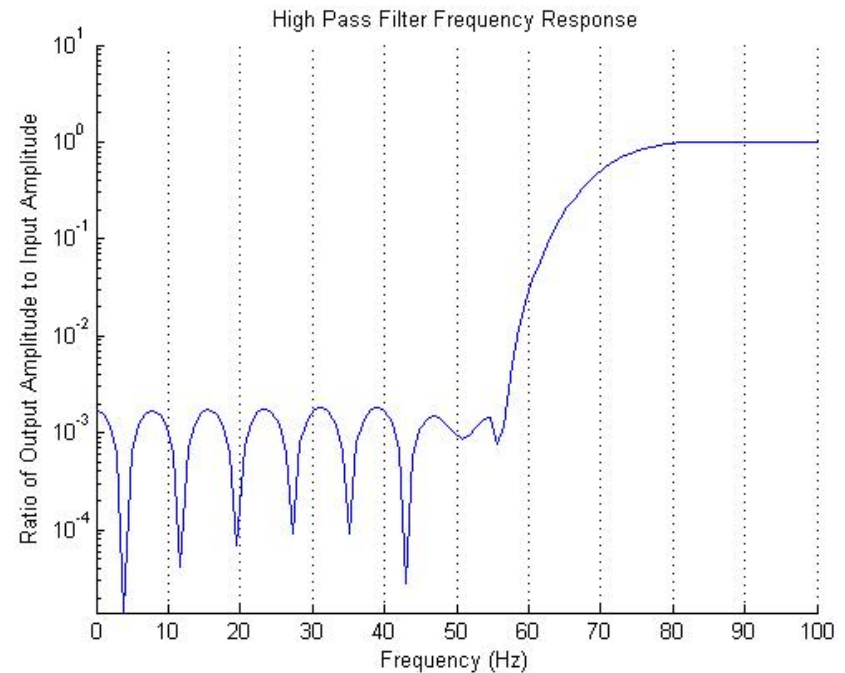


# High Pass Filter Example

- Magnitude of Frequency Response
  - Ratio of output to input amplitude
  - Ignore ripples that are less than 0.1%



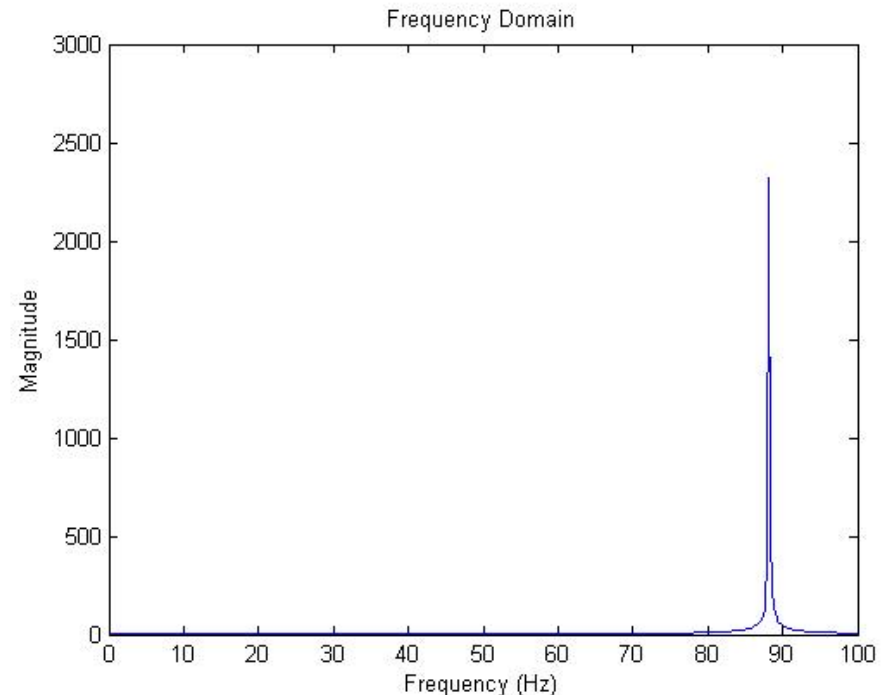
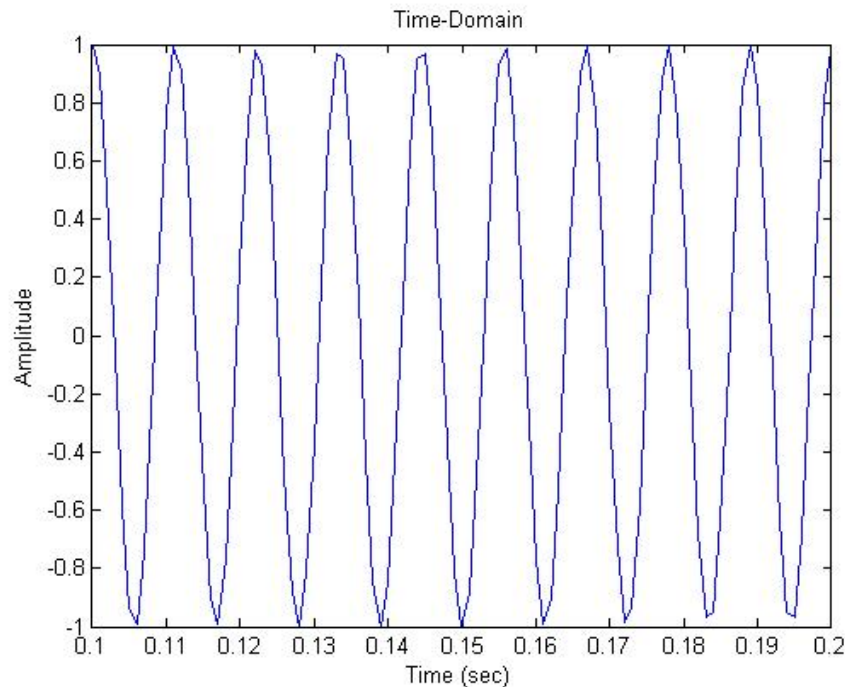
Linear Scale



Log Scale

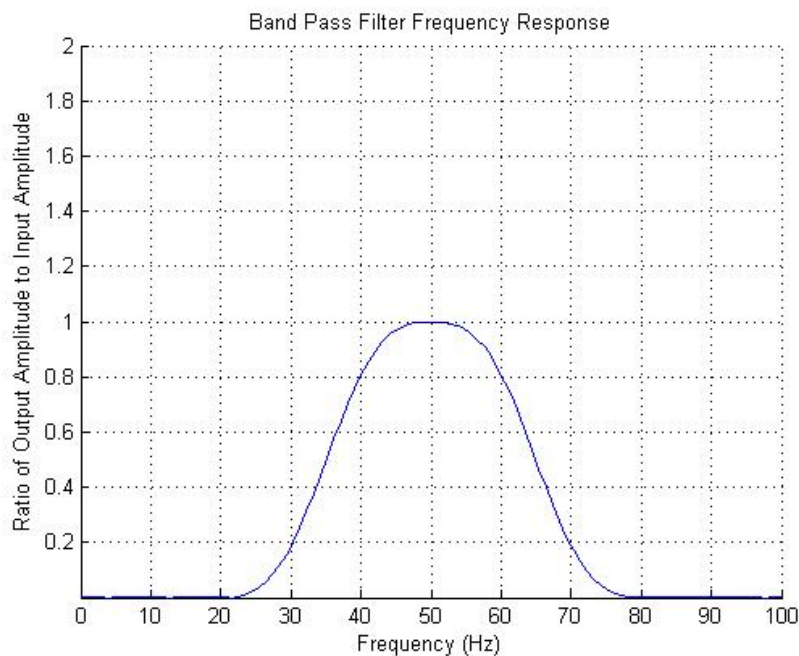
# High Pass Filter Example

- Output signal in time and frequency domain shows that magnitude of 90Hz signal is nearly unaffected while 10Hz and 50Hz are attenuated.

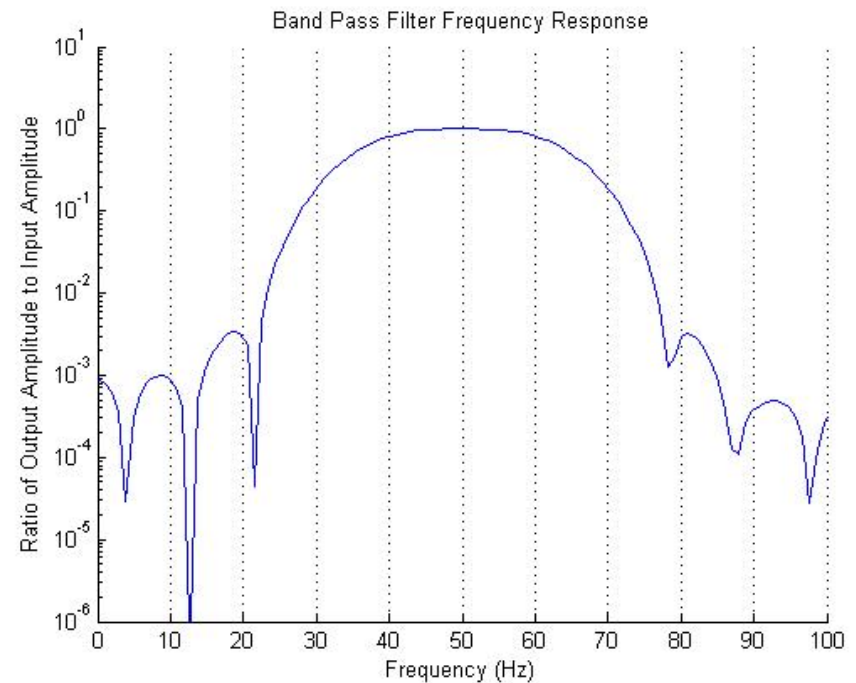


# Band Pass Filter Example

- Magnitude of Frequency Response
  - Ratio of output to input amplitude
  - Ignore ripples that are less than 0.1%



Linear Scale

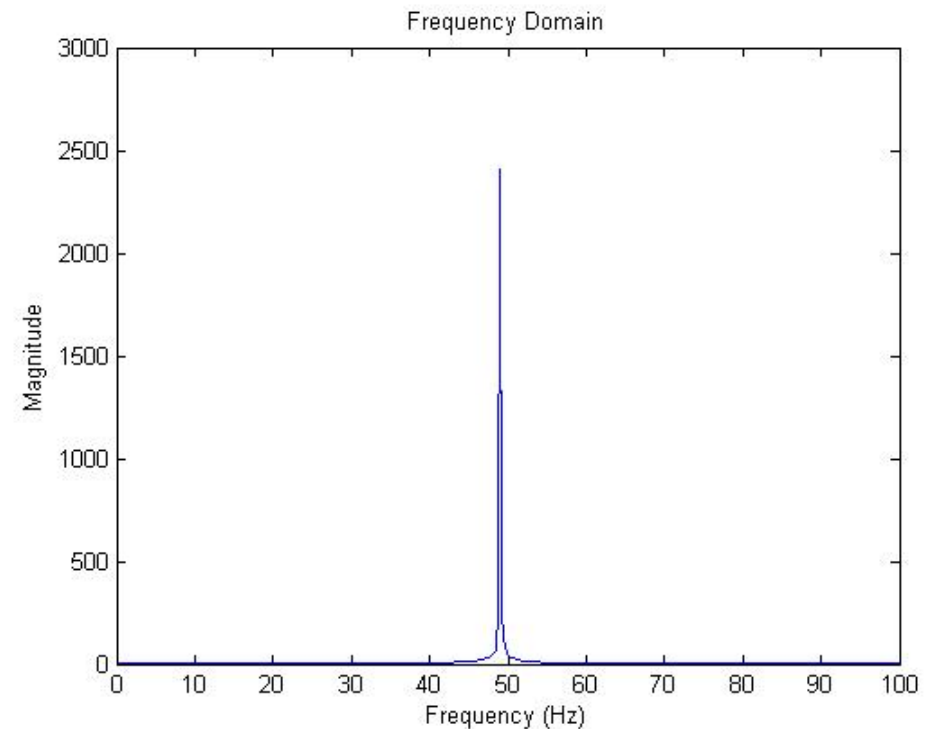
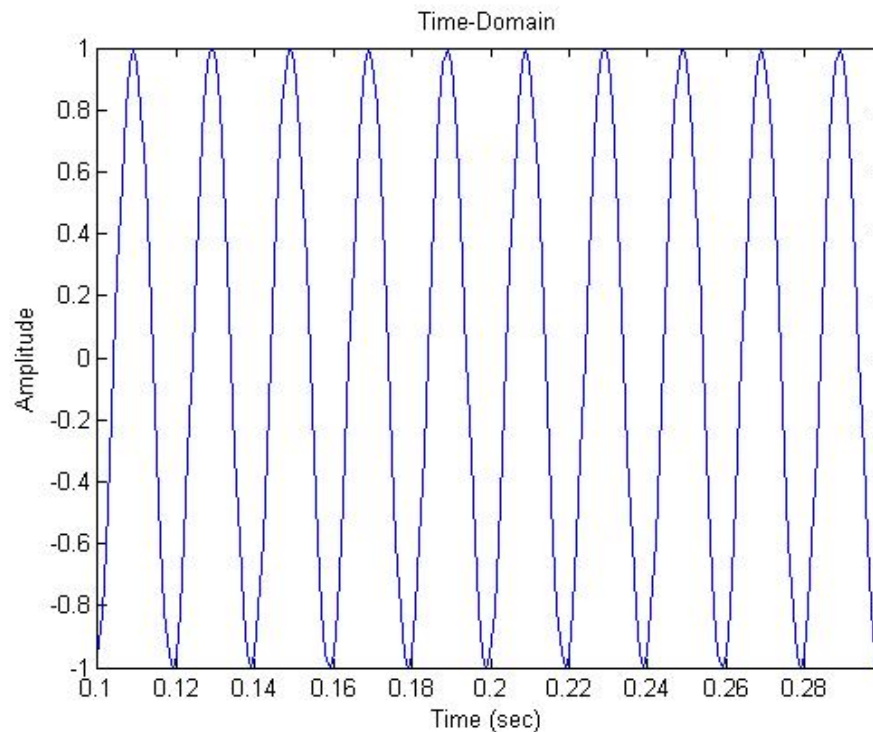


Log Scale



# Band Pass Filter Example

- Output signal in time and frequency domain shows that magnitude of 50Hz signal is nearly unaffected while 10Hz and 90Hz are attenuated.



# Difference Equation as LPF

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- Let  $y(n)$  be the arithmetic average of 10 input samples  $x(n)$ ,  $x(n-1)$ , ...,  $x(n-9)$

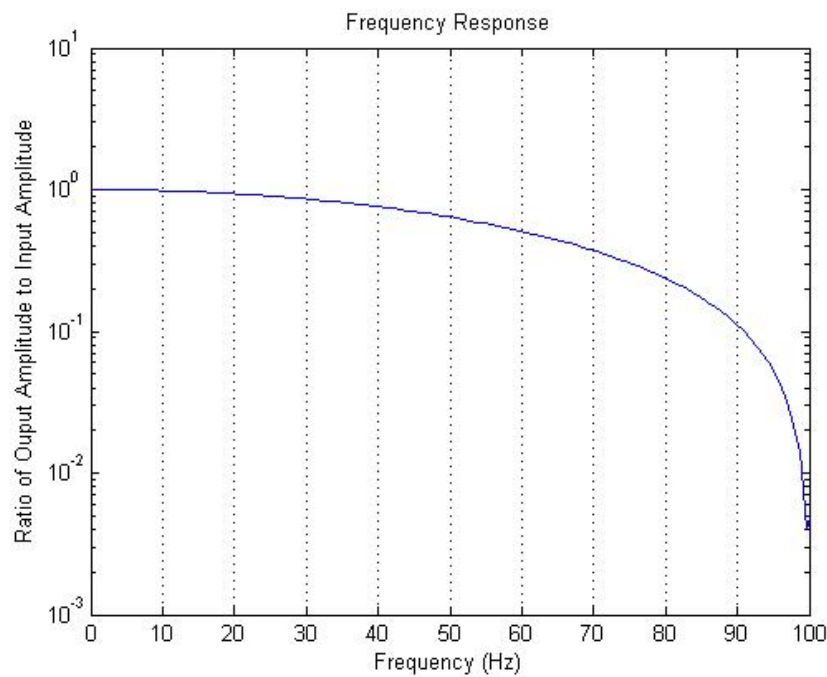
$$y(n) = \frac{1}{10} * x(n) + \frac{1}{10} * x(n-1) + \frac{1}{10} * x(n-2) + \dots + \frac{1}{10} x(n-9)$$

$$y(n) = \sum_{i=0}^9 \frac{1}{10} * x(n-i)$$

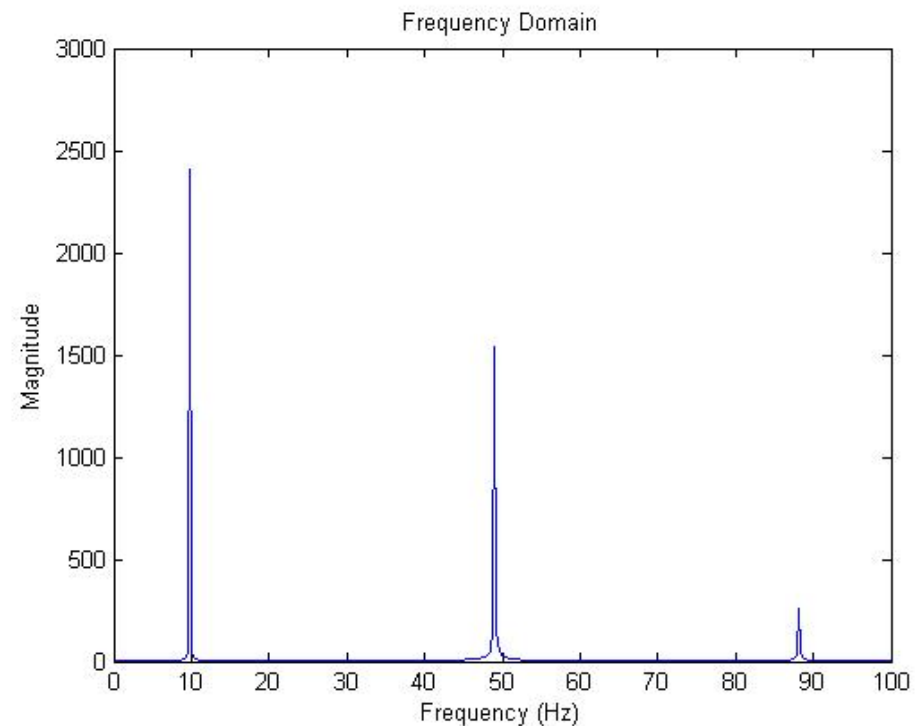
- Averaging operation let's slow changes in input pass to the output. Averaging is a form of low pass filtering

# “Arithmetic Average” Response

- The magnitude of the frequency response attenuates 10Hz and does not attenuate 50Hz and 90 Hz very much



Log Magnitude Frequency Response

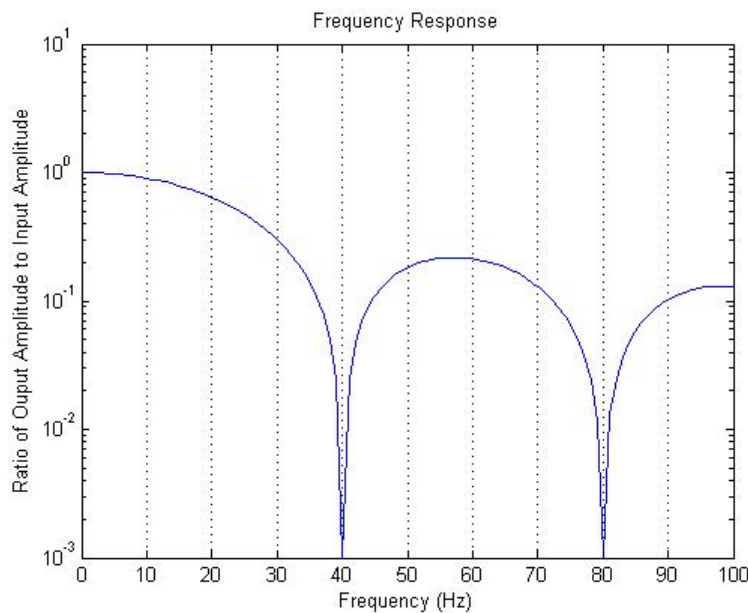


Magnitude of Output in Frequency Domain

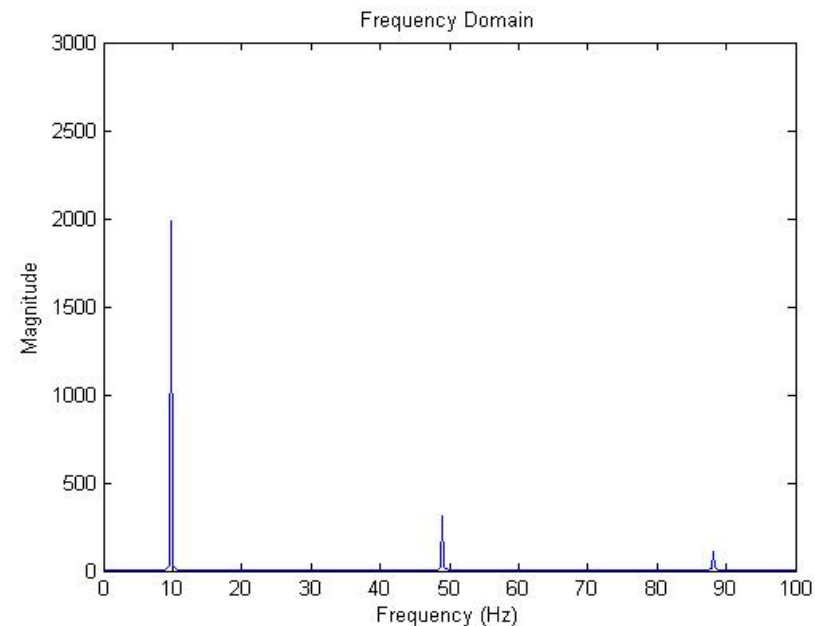
# Increase “Order of Filter”

- The order of the filter corresponds to the number of coefficients in the difference equation.

$$y(n) = \frac{1}{35} * x(n) + \frac{1}{35} * x(n-1) + \frac{1}{35} * x(n-2) + \dots + \frac{1}{35} x(n-34) == \sum_{i=0}^{34} \frac{1}{35} * x(n-i)$$



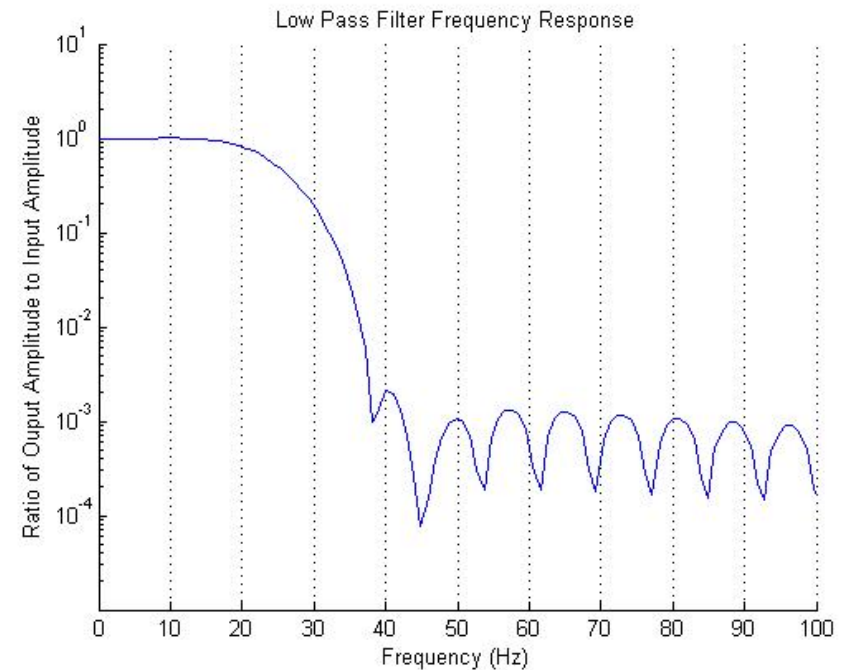
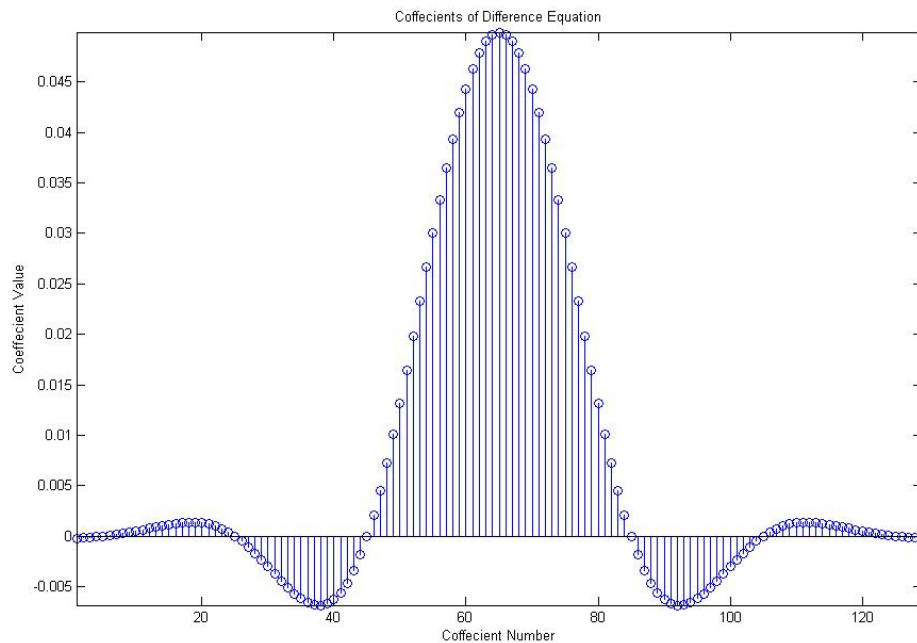
Log Magnitude Frequency Response



Magnitude of Output in Frequency Domain

# Design of LPF

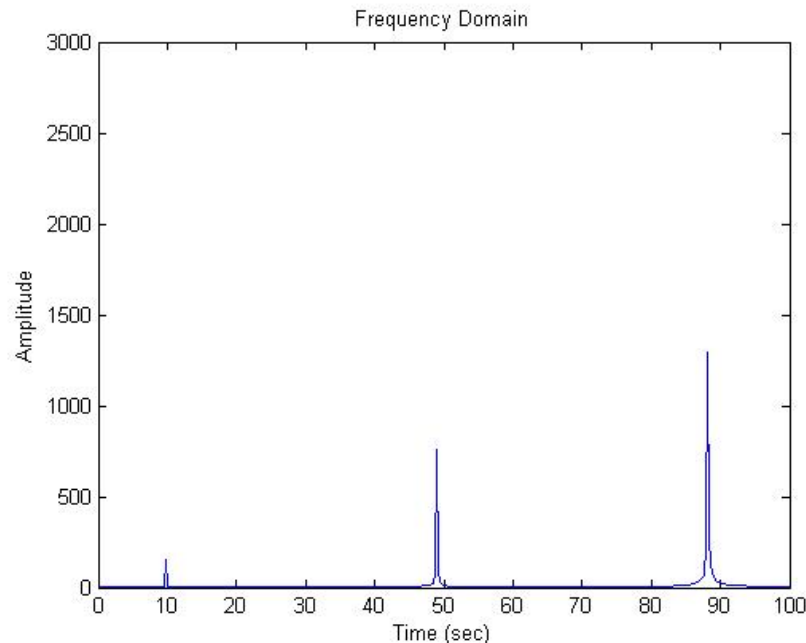
- Use higher order (costs computation)
- Coefficients need to be carefully chosen - Coefficient number 0 multiplies  $x(n)$ ; Coefficient number 1 multiplies  $x(n-1)$
- Use MATLAB to determine coefficients for now and 6.003 to learn methods later



# Difference Equation as HPF

$$y(n] = x(n] - x(n-1]$$

- $y(n]$  is the difference between input samples  $x(n]$  and  $x(n-1]$
- The difference operation prevents slow changes in the input  $x(n]$  (low frequencies) from passing to the output.



Frequency domain view of output

# Filter Design with Difference Equations

- Value and number of  $b_i$  coefficients determine filter type and “frequency roll-off”
- Higher filter order yields better characteristics at the cost of computation or hardware.

$$y(n) = b_0x(n) + b_1x(n-1) + b_2x(n-2) + \dots + b_Nx(n-N) = \sum_{i=0}^N b_i x(n-i)$$

