

---

# MULTIRATE SIGNAL PROCESSING

# Multirate Signal Processing

---

- Definition: Signal processing which uses more than one sampling rate to perform operations
- *Upsampling* increases the sampling rate
- *Downsampling* reduces the sampling rate
- Reference: *Digital Signal Processing*, DeFatta, Lucas, and Hodgkiss

# Multirate Signal Processing

---

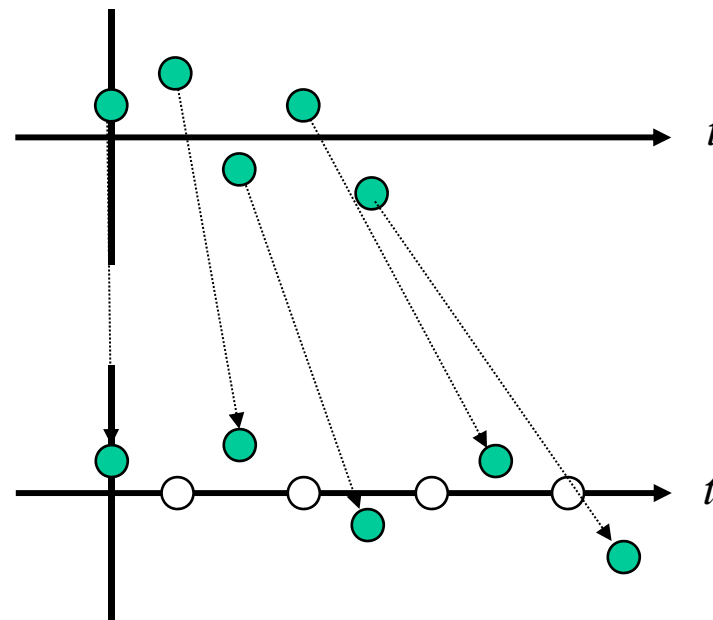
- Advantages of lower sample rates
  - May require less processing
  - Likely to reduce power dissipation,  $P = C V^2 f$ , where  $f$  is frequently directly proportional to the sample rate
  - Likely to require less storage
- Advantages of higher sample rates
  - May simplify computation
  - May simplify surrounding analog and RF circuitry
- Remember that information up to a frequency  $f$  requires a sampling rate of at least  $2f$ . This is the *Nyquist sampling rate*.
  - Or we can equivalently say the Nyquist sampling rate is  $\frac{1}{2}$  the sampling frequency,  $f_s$

---

# Upsampling

# Upsampling or Interpolation

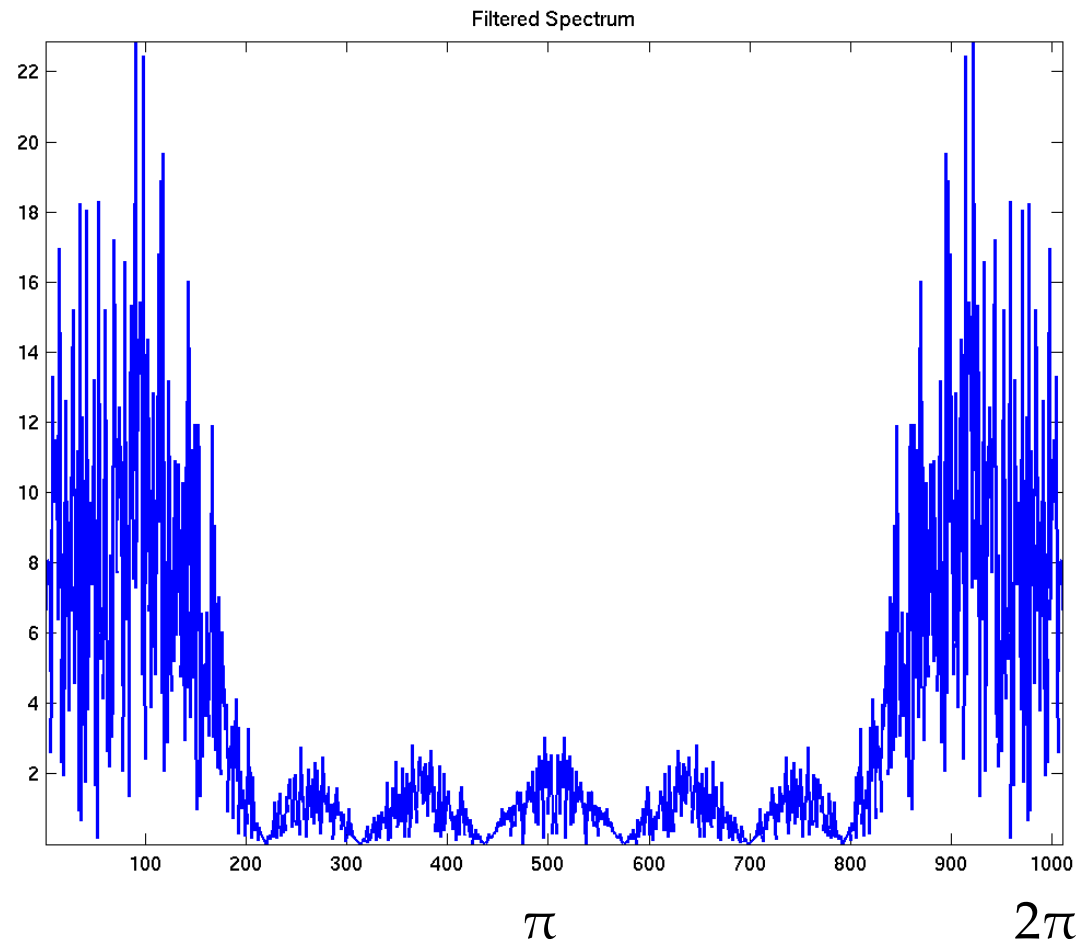
- For an upsampling by a factor of  $I$ , add  $I-1$  zeros between samples in the original sequence
- An upsampling by a factor  $I$  is commonly written  $\uparrow I$   
For example, upsampling by two:  $\uparrow 2$
- Obviously the number of samples will approximately double after  $\uparrow 2$
- Note that if the sampling frequency doubles after an upsampling by two, that the original sample sequence will occur at the same points in time



# Original Signal Spectrum

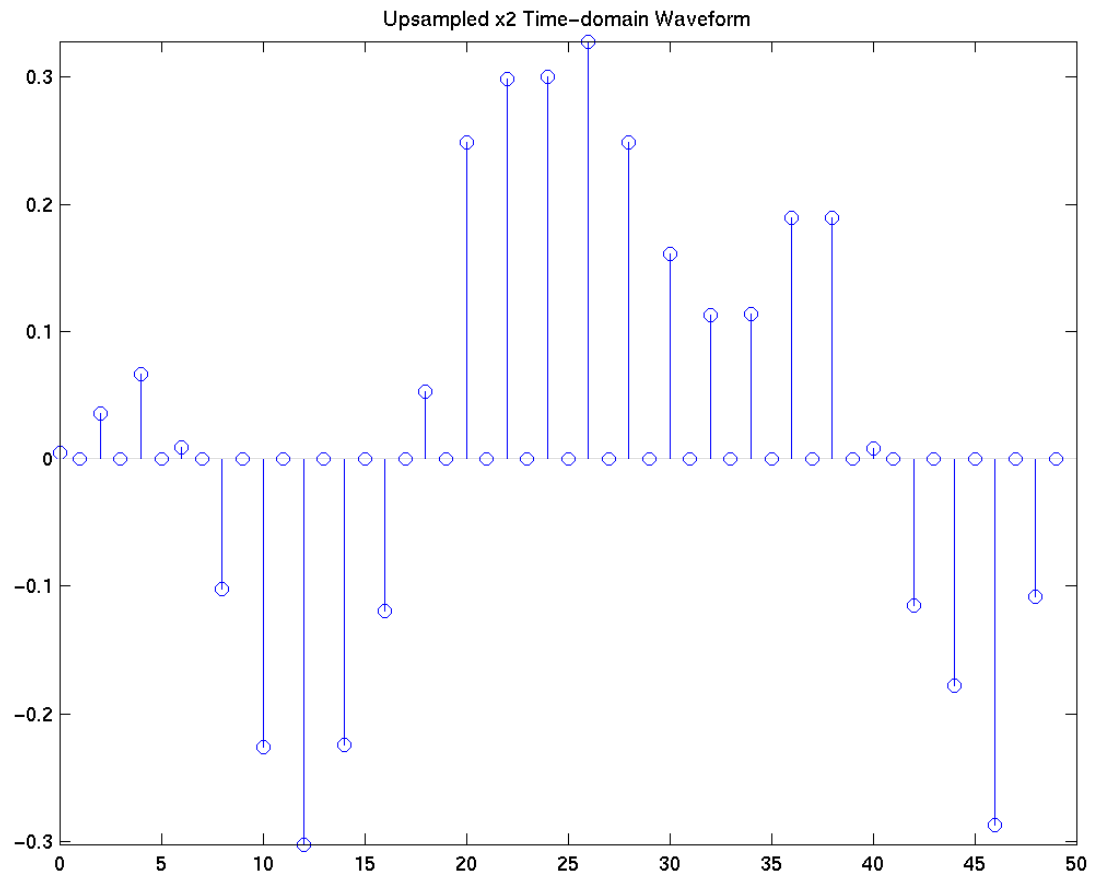
---

- Example signal with most energy near DC
- Notice 5 spectral “bumps” between large signal “bumps”



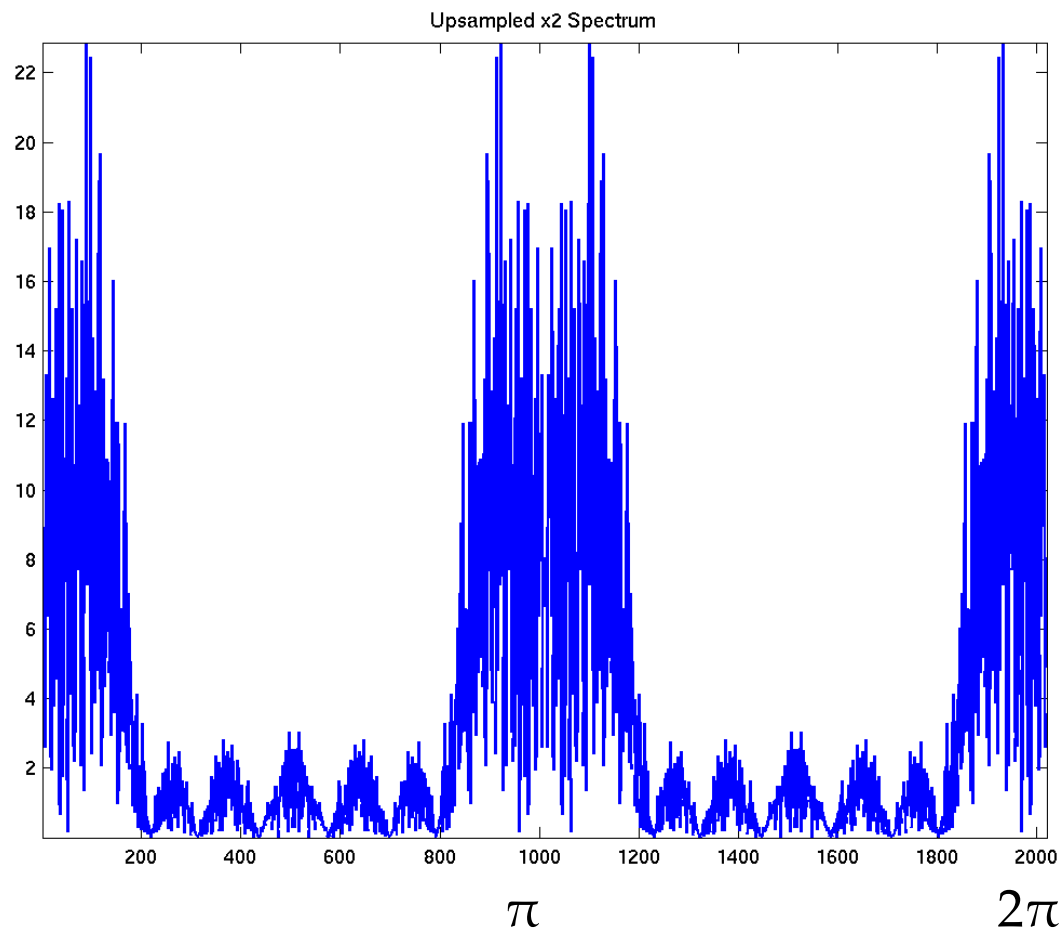
# Upsampled Signal (Time)

- One zero is inserted between the original samples for 2x upsampling



# Upsampled Signal Spectrum (Frequency)

- Spectrum of  $2x$  upsampled signal
- Notice the location of the (now somewhat compressed) five “bumps” on each side of  $\pi$





# Post Upsampling Processing

---

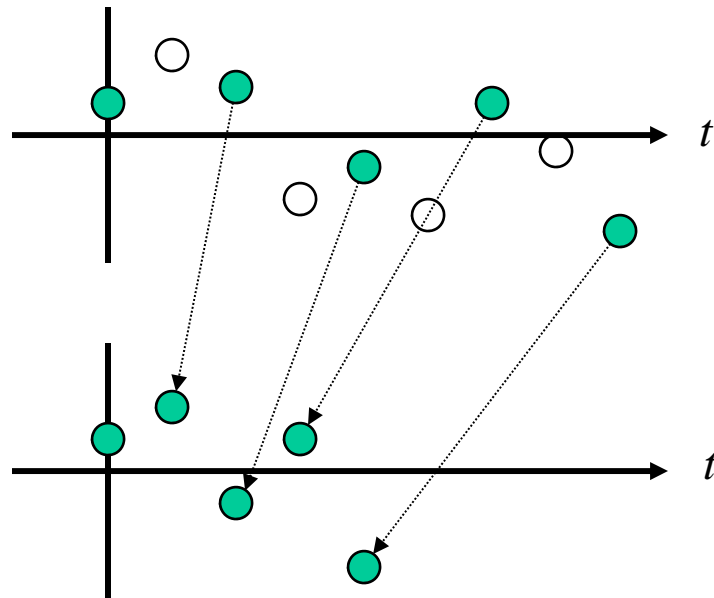
- We likely want to attenuate images centered at  $\pi$  from  $\pi/2$  to  $3\pi/2$  because these are artificial artifacts caused by the upsampling process
- A low-pass filter will keep the original desired signal and remove the artifacts (“image”) from  $\pi/2$  to  $3\pi/2$
- This low-pass filter is so common, that it has its own name: an *anti-image filter*

---

# Downsampling

# Downsampling or Decimation

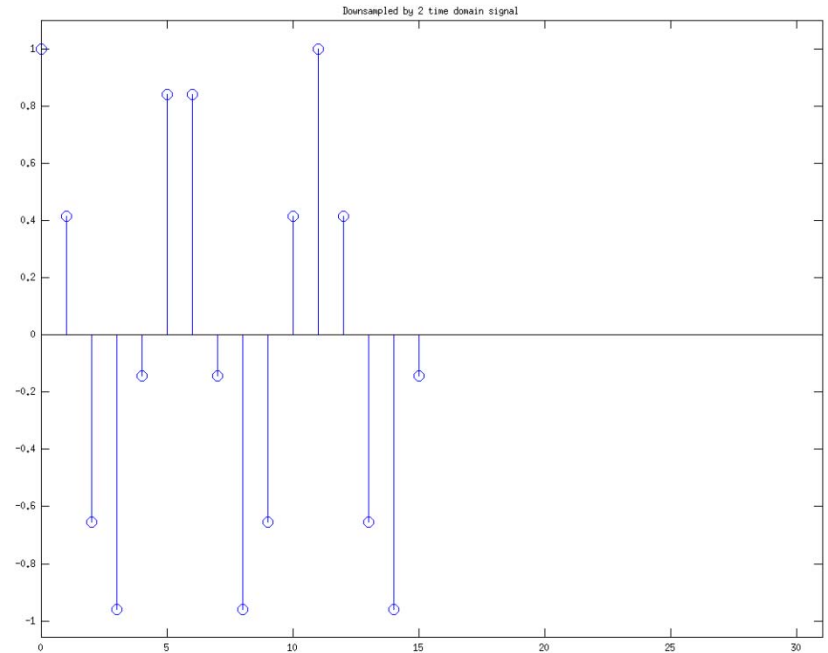
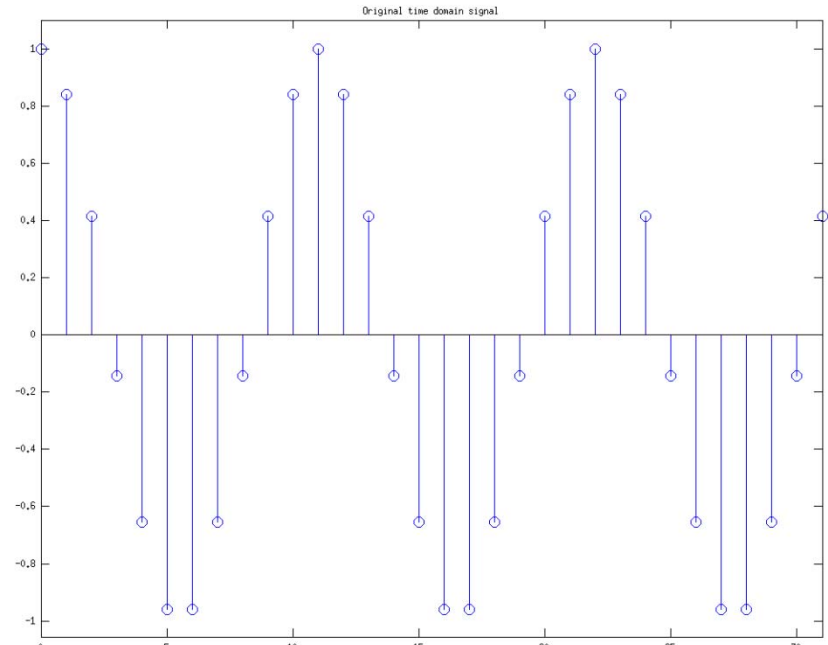
- To decimate by a factor  $D$ , keep one of every  $D$  samples—on a periodic basis
- Downsampling by a factor  $I$  is commonly written  $\downarrow I$   
For example, downsampling by two:  $\downarrow 2$
- Obviously the number of samples will be approximately cut in half after  $\downarrow 2$



# Decimation Example 1— Time Domain

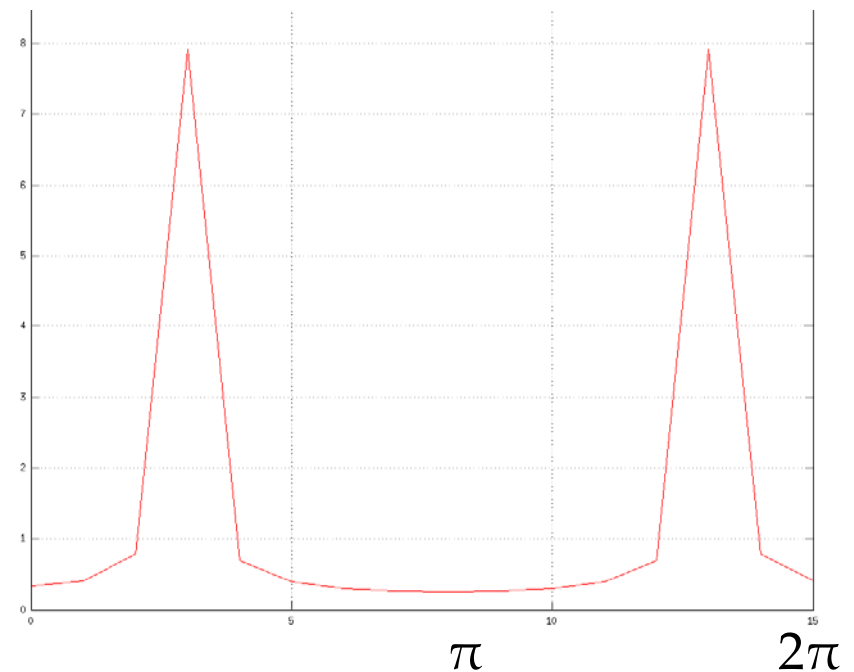
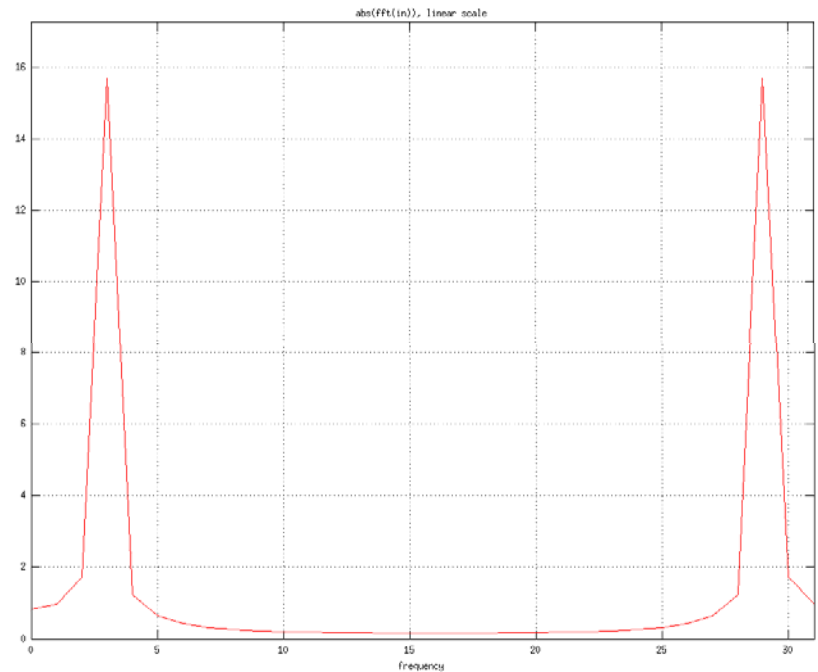
---

- 32 samples in original waveform
- Downsampled by 2
- 16 samples in downsampled waveform



# Decimation Example 1— Frequency Domain

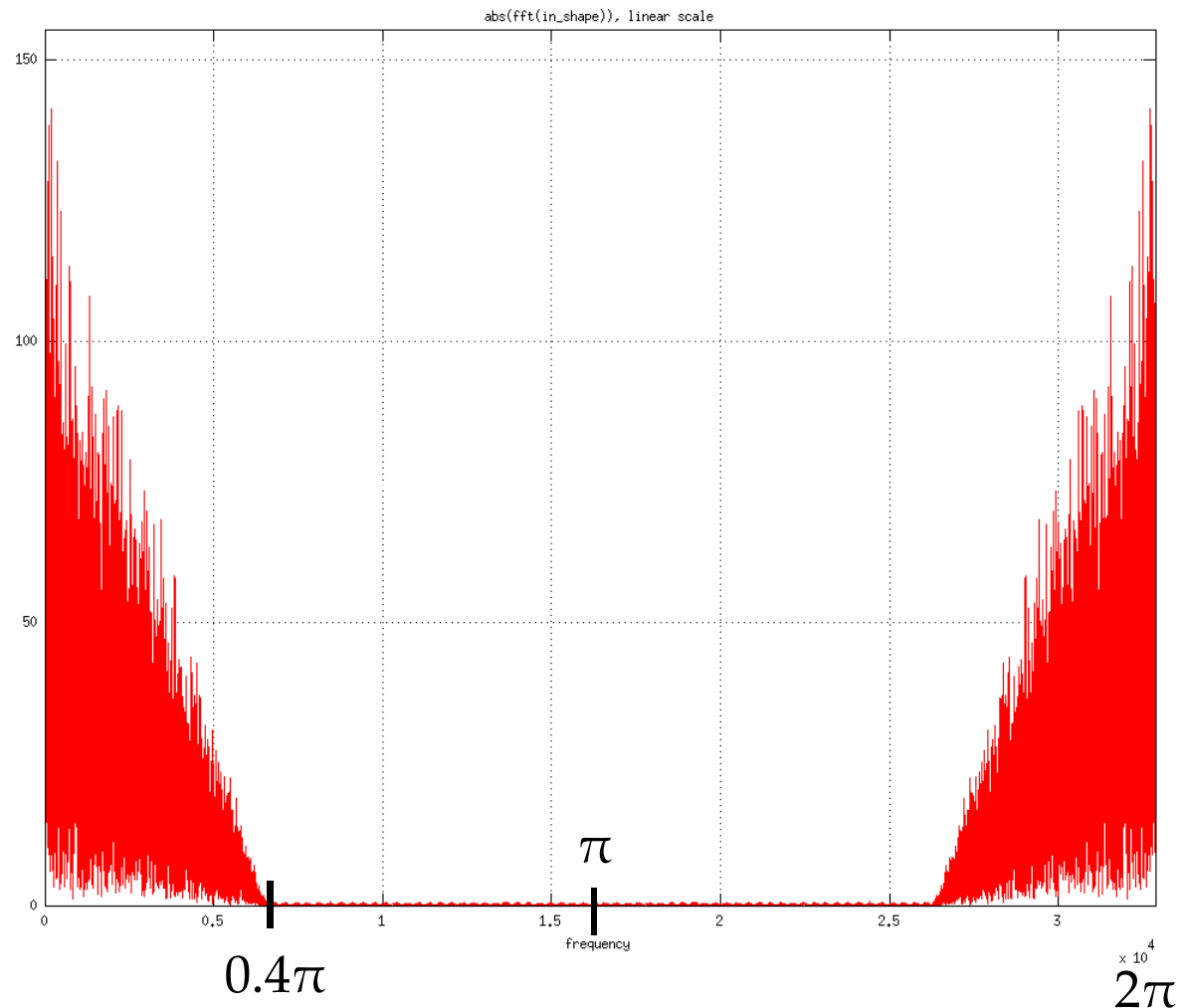
- Downsampled by 2
- Frequencies in downsampled waveform are 2x higher in the “digital frequency” domain
- They interfere when input frequencies reach  $\pi/2$  (downsampled frequencies reach  $\pi$ )



# Decimation Example 2

## Spectrum, Linear Scale

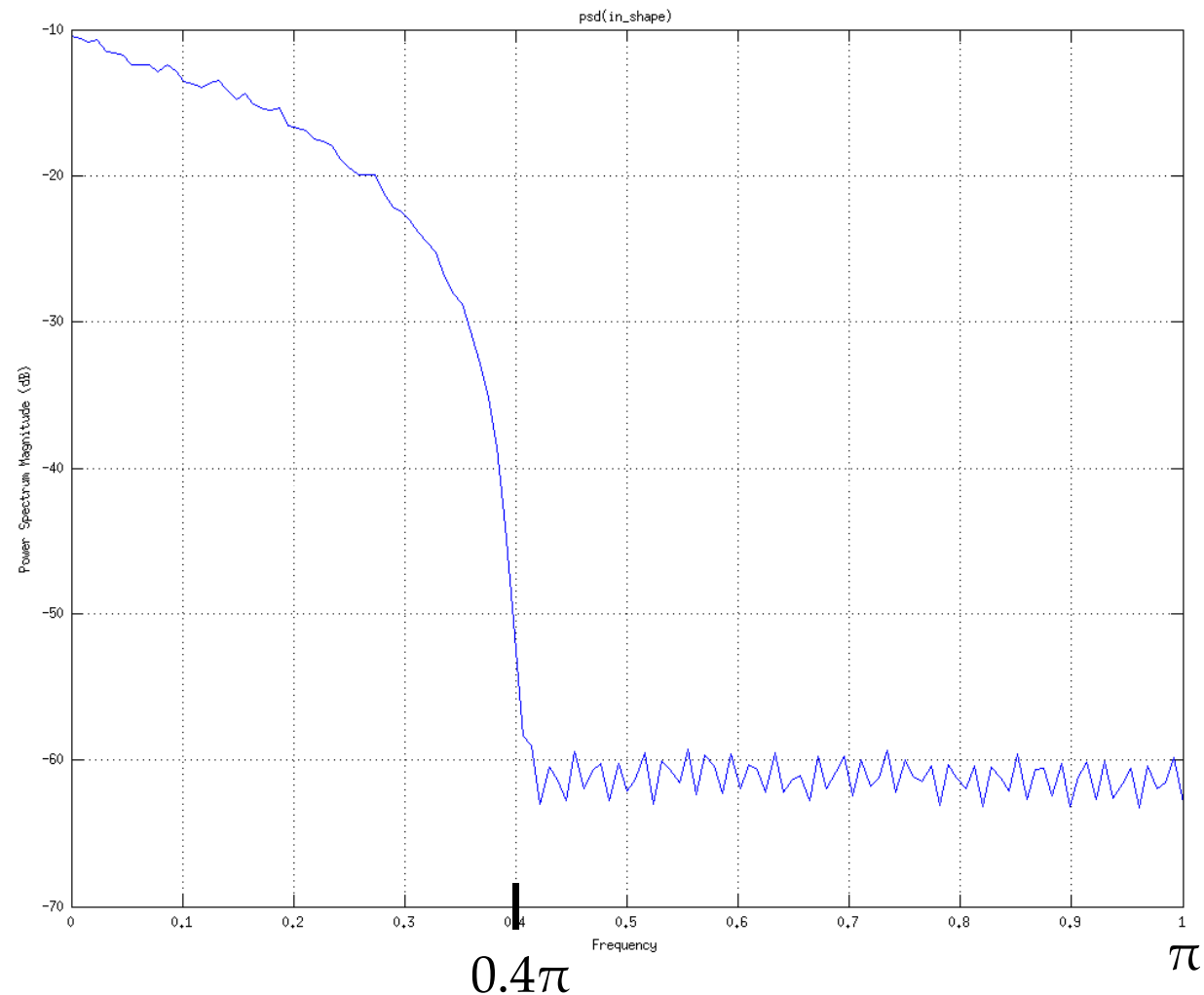
- Notice signal frequency slope from  $0-0.4\pi$
- Plotted with `abs(fft(•))`



# Decimation Example 2

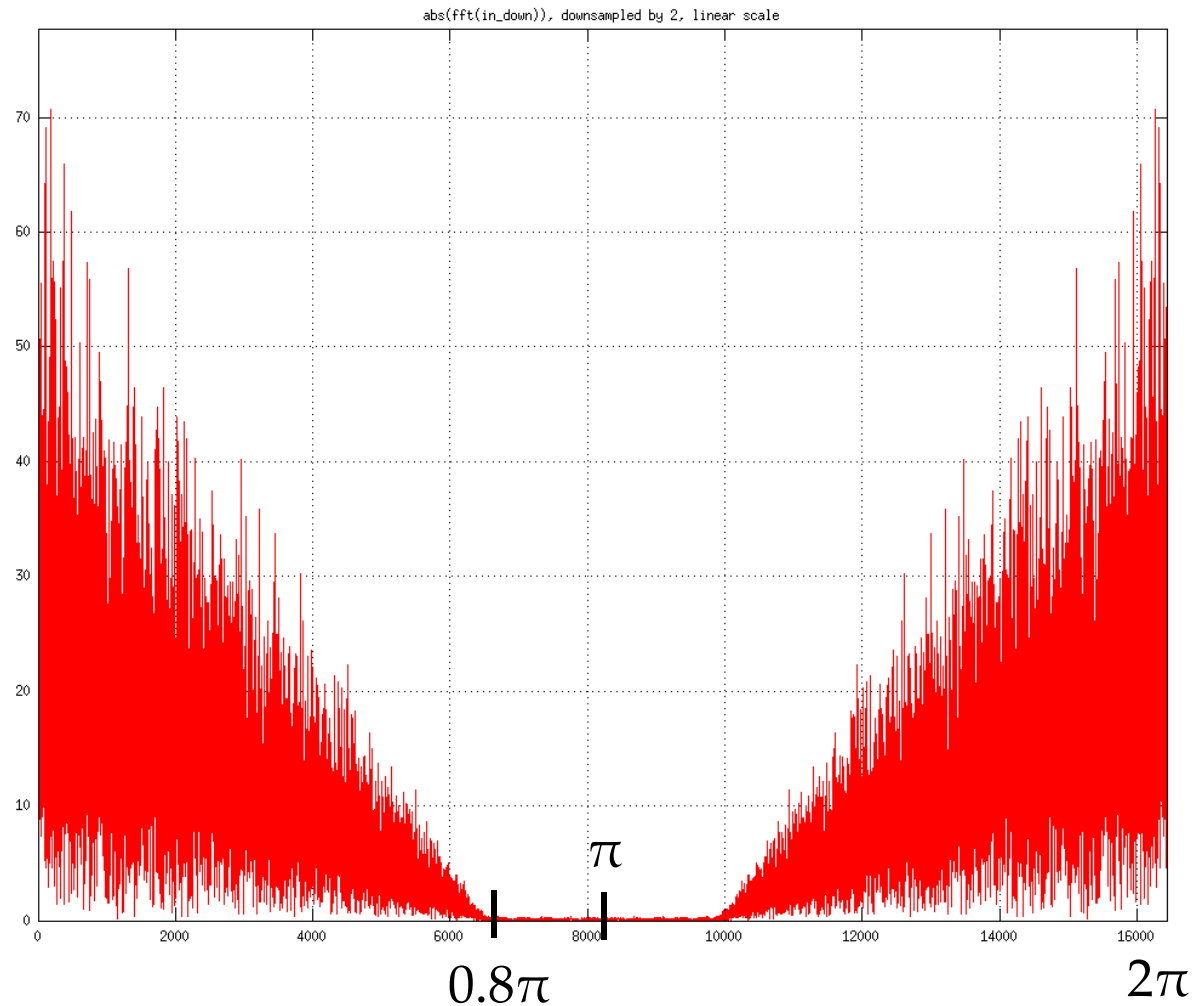
## Spectrum, dB Scale

- Spectral slope from  $0-0.4\pi$  not visible with dB vertical scale
- Notice signal goes to “zero” at  $0.4\pi$
- Plotted with `psd(•)`



# Decimation Example 2

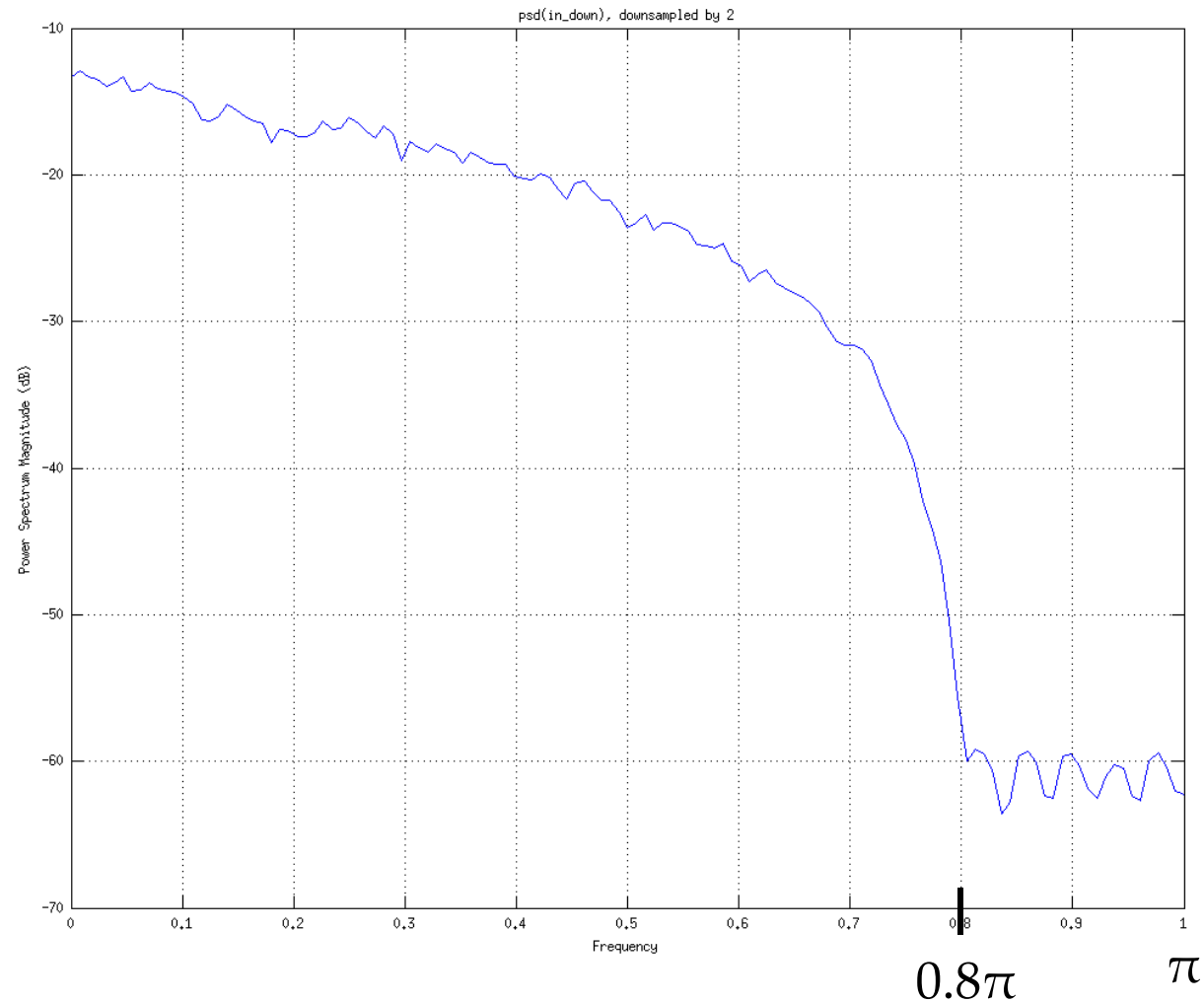
- Decimated by 2
- Spectral slope now from  $0-0.8\pi$
- Plotted with  $\text{abs}(\text{fft}(\bullet))$





# Decimation Example 2

- Signal now from  $0$ – $0.8\pi$  though sloping shape is still not visible with dB vertical scale
- Plotted with `psd(•)`



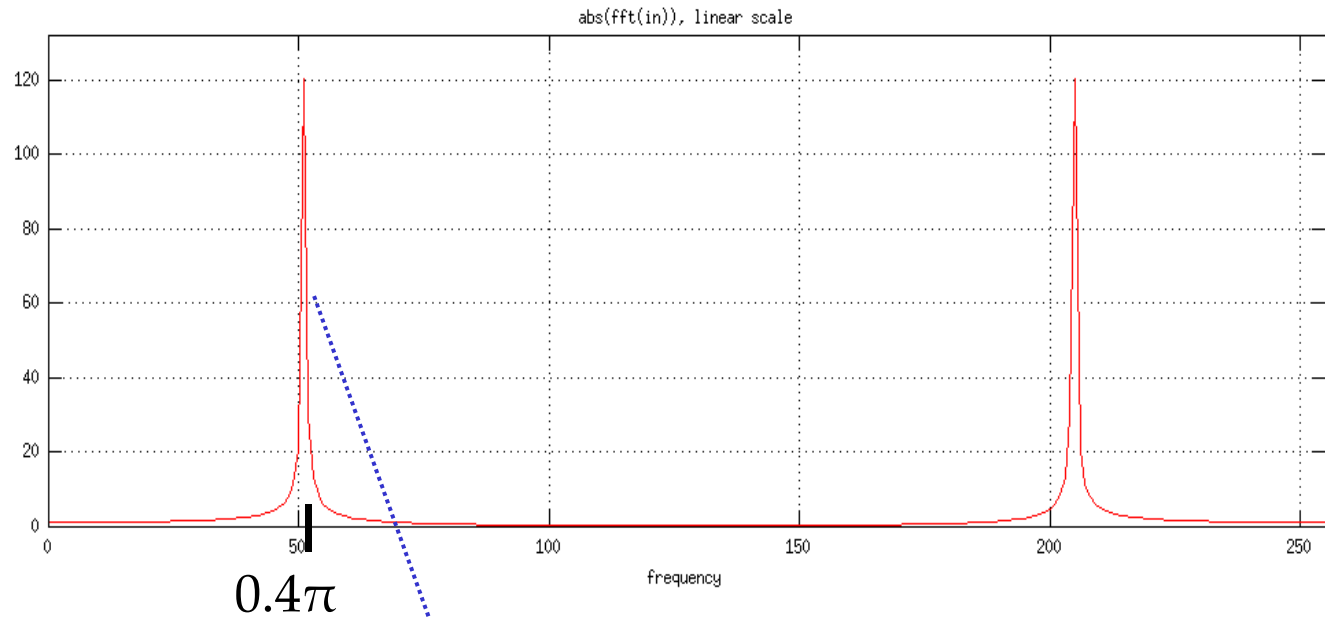
# Decimation

---

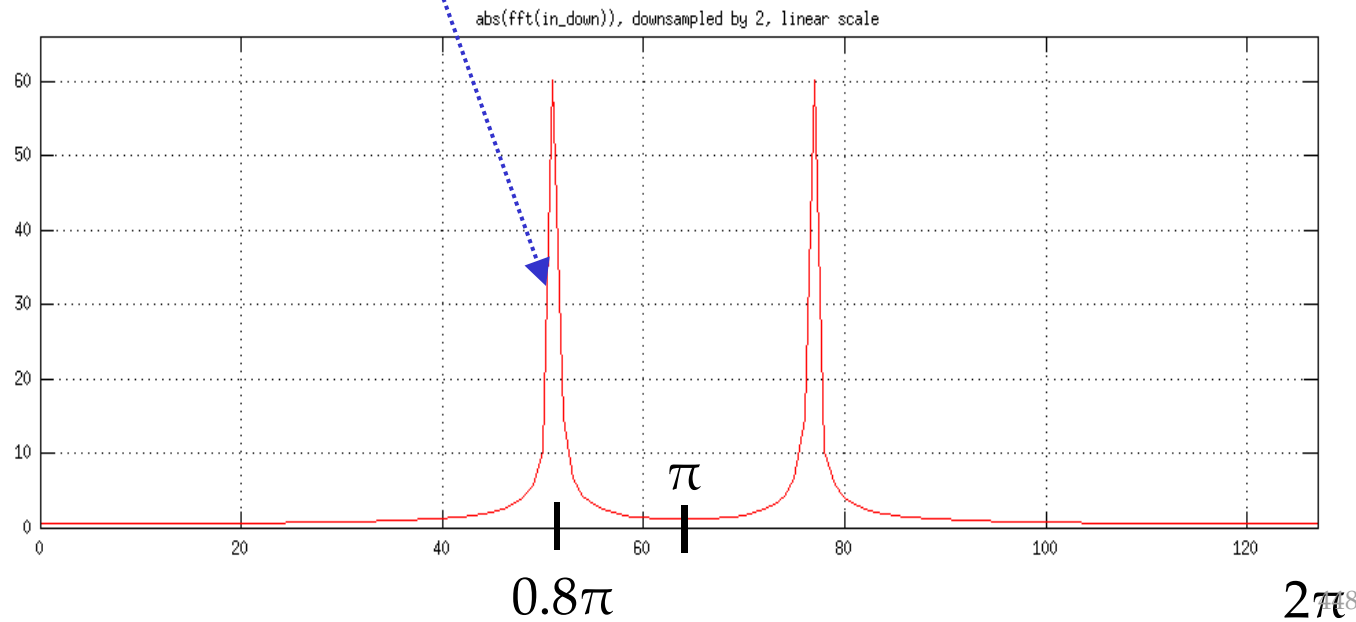
- Signals above  $\frac{1}{2}$  the Nyquist frequency *alias* to lower frequencies when downsampled
  - Normally this is bad
  - In rare cases, this can be exploited to some benefit



Original

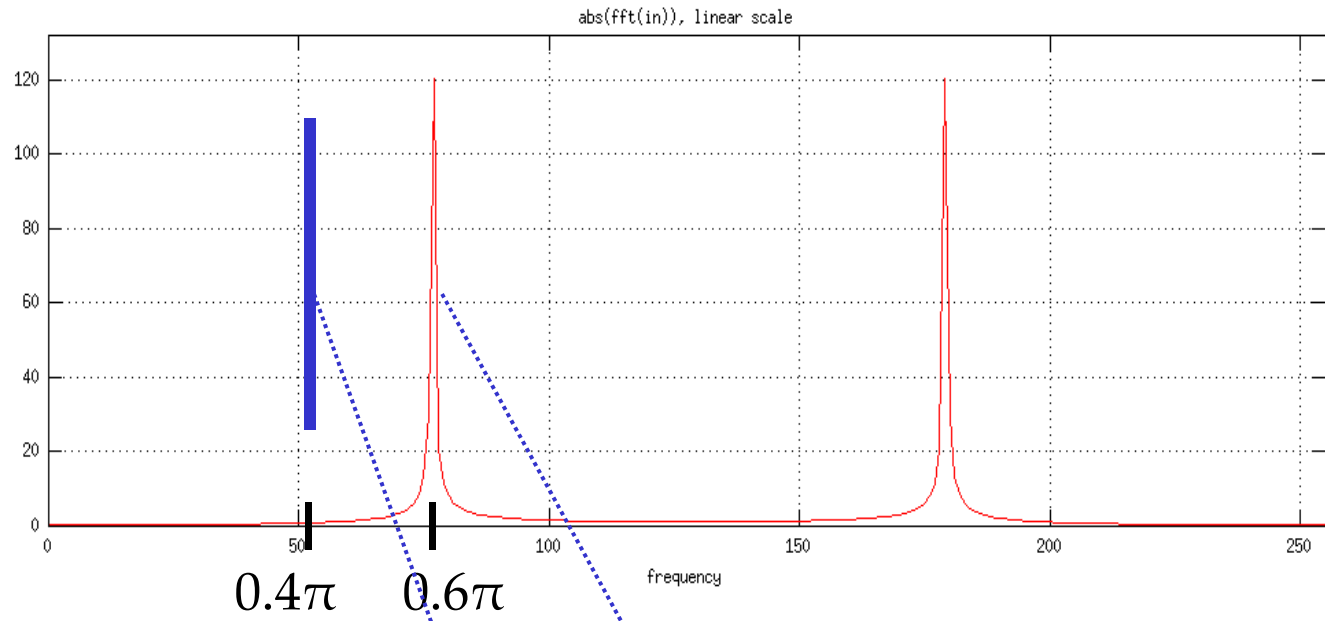


Down-sampled by 2

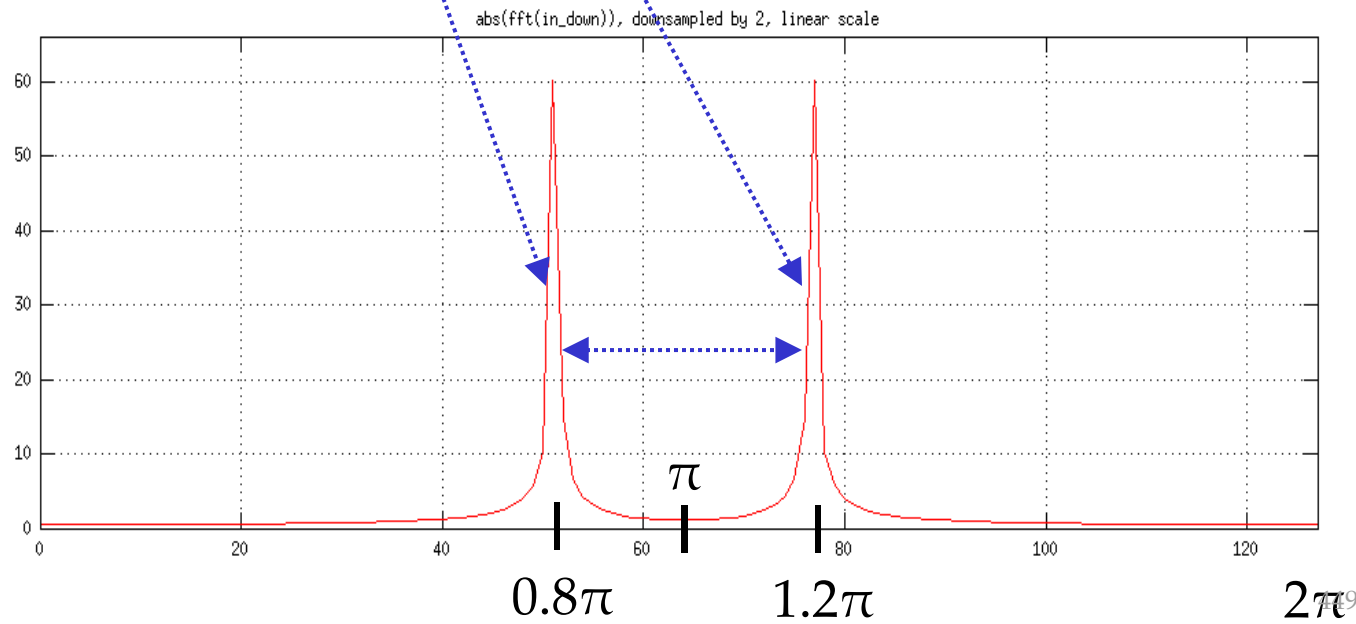




Original



Down-sampled by 2



# Anti-alias filtering

---

- Normally we will want to filter the original signal with a filter before decimation to attenuate signal components which would alias into the desired signal band(s)
- This filter also has its own name: an *anti-alias filter*

# Decimation Example

---

- Example
  - 1 MSample/sec signal, interested in 0–100 KHz portion only, decimate as much as possible
  - Need to watch “head room” above signal
  - Decimate by three → new  $f_s$  at 333 KHz
    - Leaves 67 KHz between highest freq components and  $f_s/2$
  - Decimate by four → new  $f_s$  at 250 KHz
    - Leaves 25 KHz between highest freq components and  $f_s/2$
  - Decimate by five → new  $f_s$  at 200 KHz
    - Leaves 0 KHz between highest freq components and  $f_s/2$
    - Some aliasing will occur