

# Digital Signal Processing

## Periodic Sampling

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Understanding Digital Signal Processing, Third Edition, Richard Lyons  
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# Periodic Sampling

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- Periodic sampling
  - Process of representing a continuous signal with a sequence of discrete data values
  - In practice, sampling is performed by applying a continuous signal to an analog-to-digital (A/D) converter
  - Primary concern is how fast a given continuous signal must be sampled to preserve its information content

# Aliasing

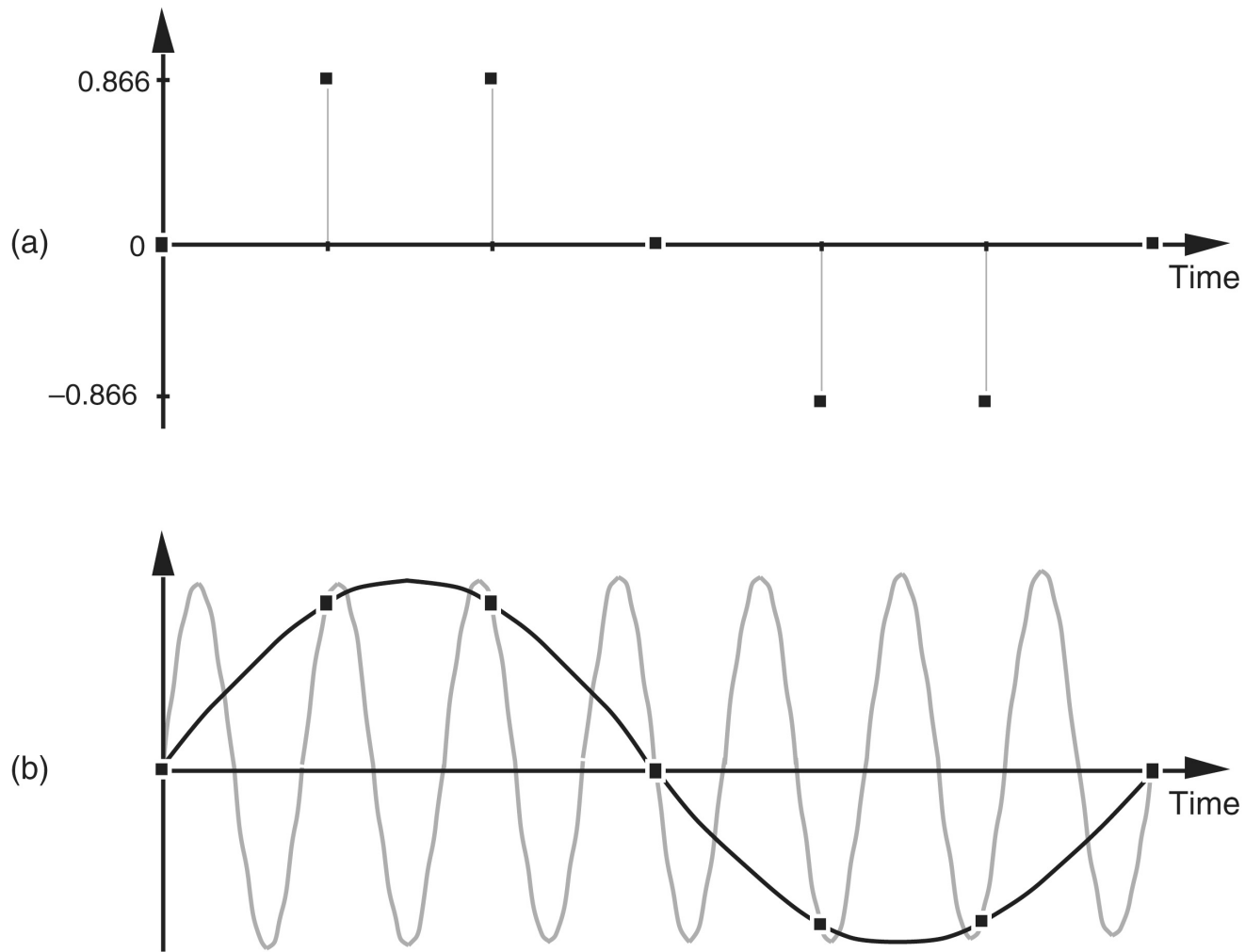
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- Example: given following sequence of values

$$x(0) = 0, x(1) = 0.866, x(2) = 0.866, x(3) = 0, x(4) = -0.866, x(5) = -0.866, x(6) = 0$$

- They represent values of a time-domain sinewave taken at periodic intervals
- Draw that sinewave

# Aliasing



**Figure 2-1** Frequency ambiguity: (a) discrete-time sequence of values; (b) two different sinewaves that pass through the points of the discrete sequence.

# Aliasing

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- Frequency ambiguity
  - If data sequence represents periodic samples of a sinewave, we cannot unambiguously determine frequency of sinewave from those sample values alone

# Aliasing

- Mathematical origin of frequency ambiguity

$$x(t) = \sin(2\pi f_o t)$$

$$x(n) = \sin(2\pi f_o n t_s) = \sin(2\pi f_o n t_s + 2\pi m) = \sin(2\pi(f_o + \frac{m}{n t_s})n t_s)$$

$$\xrightarrow{\text{if } m=kn} x(n) = \sin(2\pi(f_o + \frac{k}{t_s})n t_s)$$

$$\xrightarrow{f_s=1/t_s} x(n) = \sin(2\pi f_o n t_s) = \sin(2\pi(f_o + k f_s) n t_s)$$

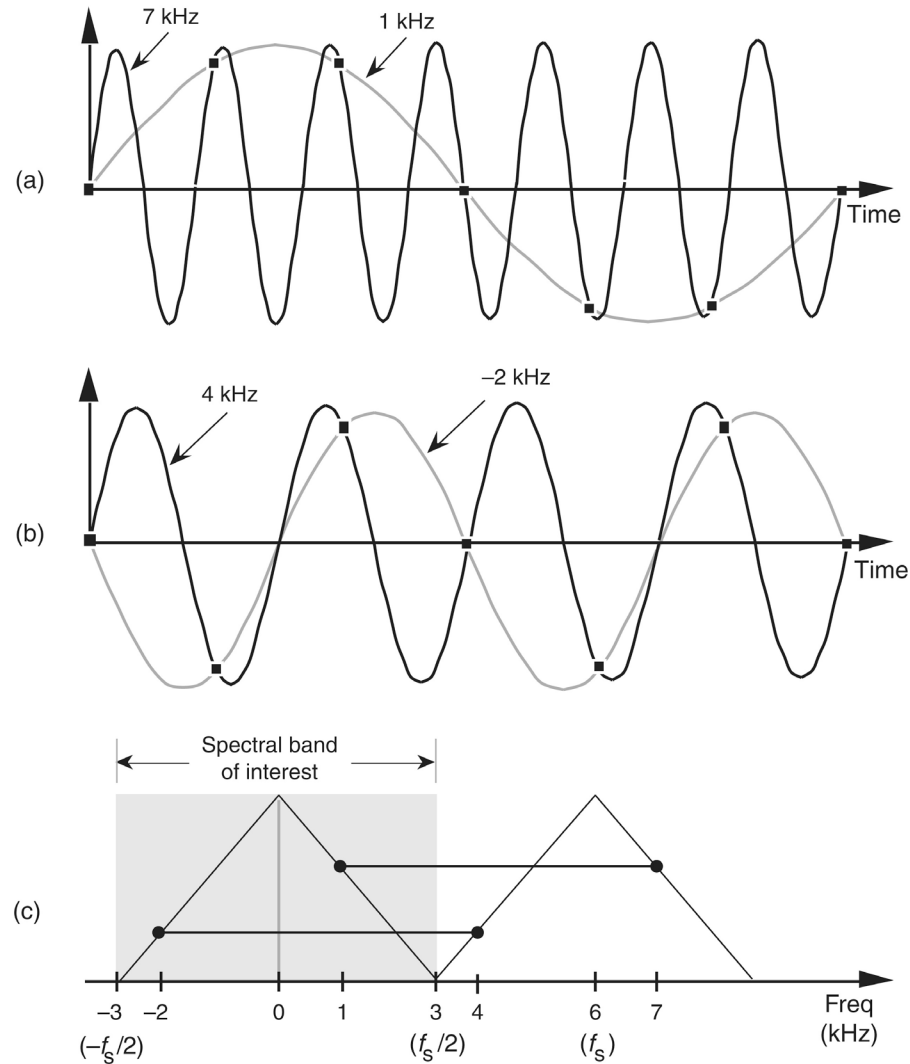
- **When sampling at a rate of  $f_s$  samples/second, if  $k$  is any positive or negative integer, we cannot distinguish between sampled values of a sinewave of  $f_o$  Hz and a sinewave of  $(f_o + k f_s)$  Hz**

# Aliasing

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- Frequency ambiguity (*aliasing*) effects
  - Spectrum of any discrete series of sampled values contains periodic replications of original continuous spectrum
  - Period between these replicated spectra in frequency domain is always  $f_s$
  - Spectral replications repeat all the way in both directions of frequency spectrum

# Aliasing



**Figure 2-2** Frequency ambiguity effects of Eq. (2-5): (a) sampling a 7 kHz sinewave at a sample rate of 6 kHz; (b) sampling a 4 kHz sinewave at a sample rate of 6 kHz; (c) spectral relationships showing aliasing of the 7 and 4 kHz sinewaves.



# Aliasing

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- Fig. 2-2(a)

- $f_o = 7 \text{ kHz}, f_s = 6 \text{ kHz}$
- $k = -1 \rightarrow f_o + kf_s = [7 + (-1 \cdot 6)] = 1 \text{ kHz}$
- No processing scheme can determine if sequence of sampled values came from a 7 kHz or a 1 kHz sinusoid
- 1 kHz is an *alias* of 7 kHz

- Fig. 2-2(b)

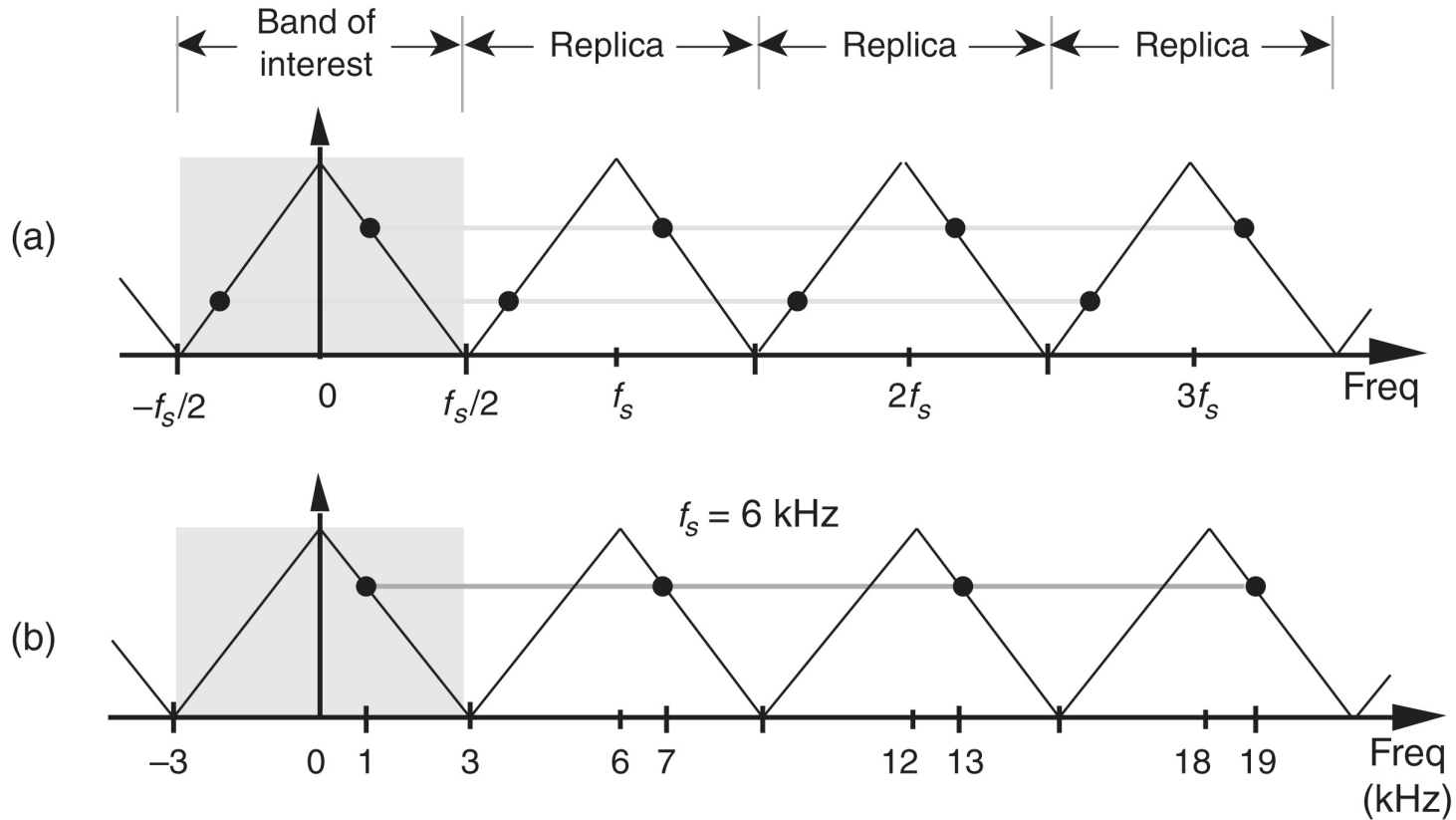
- $f_o = 4 \text{ kHz}, f_s = 6 \text{ kHz}$
- $k = -1 \rightarrow f_o + kf_s = [4 + (-1 \cdot 6)] = -2 \text{ kHz}$

# Aliasing

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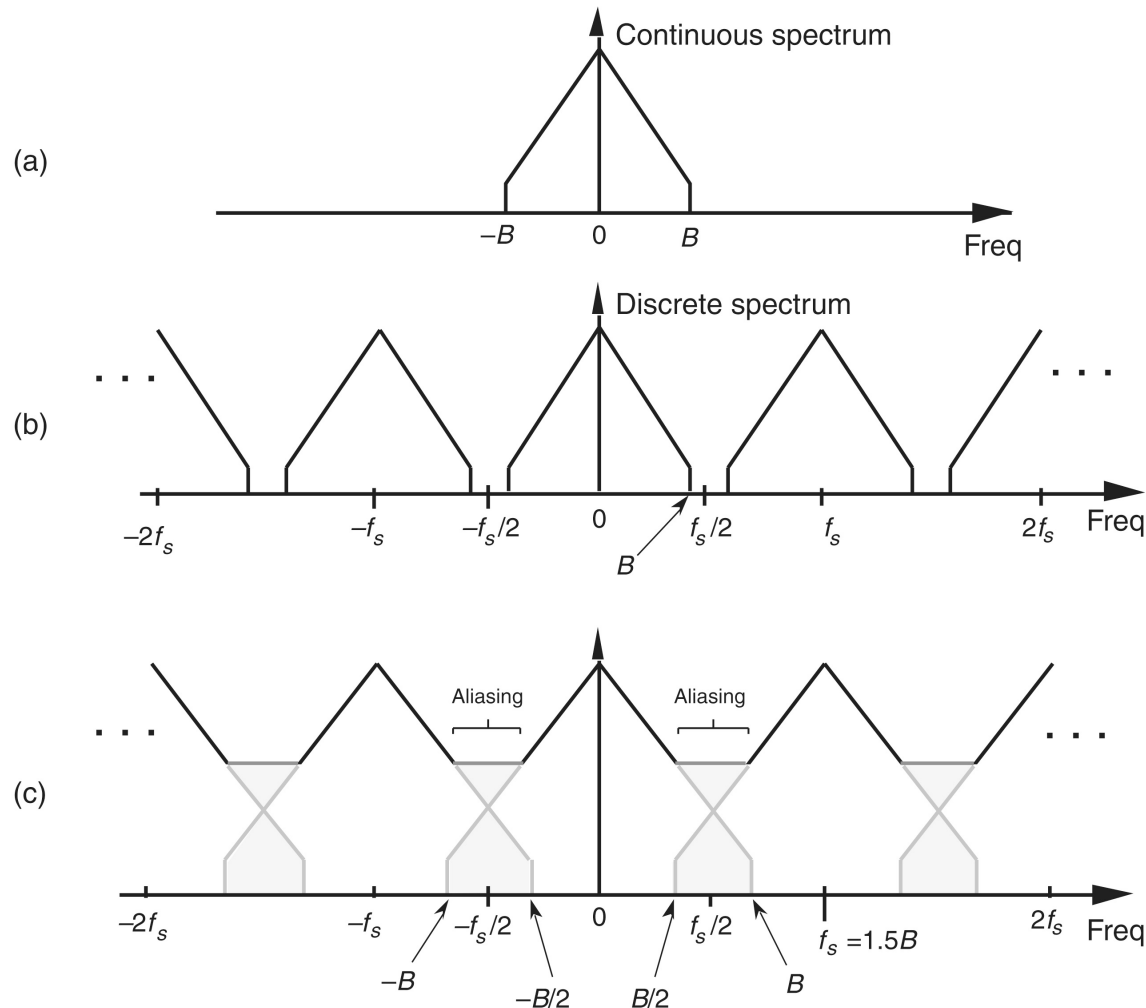
- Fig. 2-2(c)
  - $f_s/2$  is an important quantity, referred to by critical Nyquist, half Nyquist, or folding frequency
  - We're interested in signal components that are aliased into frequency band between  $-f_s/2$  and  $+f_s/2$

# Aliasing



**Figure 2-3** Shark's tooth pattern: (a) aliasing at multiples of the sampling frequency; (b) aliasing of the 7 kHz sinewave to 1 kHz, 13 kHz, and 19 kHz.

# Sampling Lowpass Signals



**Figure 2-4** Spectral replications: (a) original continuous lowpass signal spectrum; (b) spectral replications of the sampled lowpass signal when  $f_s/2 > B$ ; (c) frequency overlap and aliasing when the sampling rate is too low because  $f_s/2 < B$ .

# Sampling Lowpass Signals

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- Fig. 2-4(a)
  - Spectrum of a continuous real-valued lowpass  $x(t)$  signal
  - Spectrum is symmetrical around zero Hz
  - Signal is *band-limited*
    - Its spectral amplitude is zero above  $+B$  Hz and below  $-B$  Hz
  - $x(t)$  time signal is called a *lowpass signal* because its spectral energy is low in frequency
  - Spectrum of a continuous signal *cannot* be represented in a digital machine in its current band-limited form  $\rightarrow$  replicated form of (b)

# Sampling Lowpass Signals

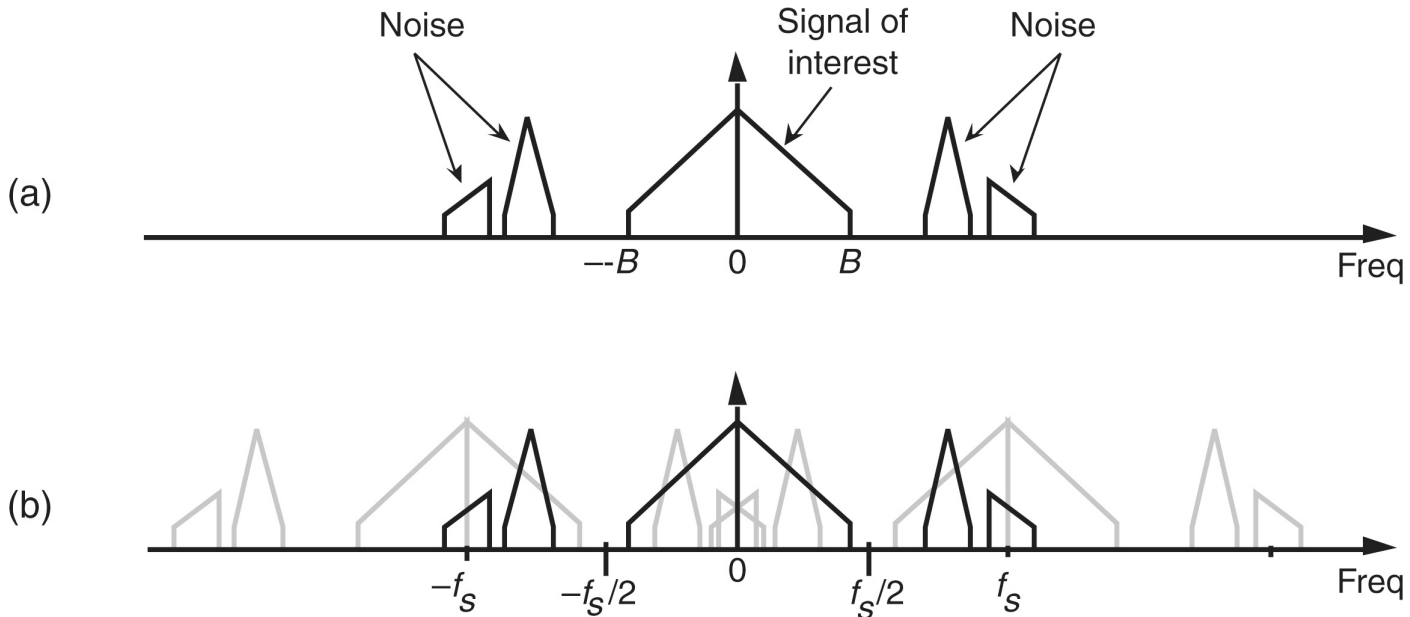
- Nyquist criterion
  - $f_s \geq 2B$ , to separate spectral replications at *folding frequencies* of  $\pm f_s/2$
- Fig. 2-4(c)
  - Sampling frequency is lowered to  $f_s = 1.5B$  Hz
  - Lower edge and upper edge of spectral replications centered at  $+f_s$  and  $-f_s$  now lie in band of interest
    - Equivalent to original spectrum folding to left at  $+f_s/2$  and folding to right at  $-f_s/2$
    - Spectral information in bands of  $-B$  to  $-B/2$  and  $B/2$  to  $B$  Hz is corrupted (aliasing errors)

# Sampling Lowpass Signals

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- A key property of band  $\pm f_s/2$  Hz
  - Entire spectral content (any signal energy located above  $+B$  Hz and below  $-B$  Hz) of original continuous spectrum always ends up in band of interest between  $-f_s/2$  and  $+f_s/2$  after sampling, regardless of sample rate
  - For this reason, continuous (analog) *lowpass* filters are necessary in practice

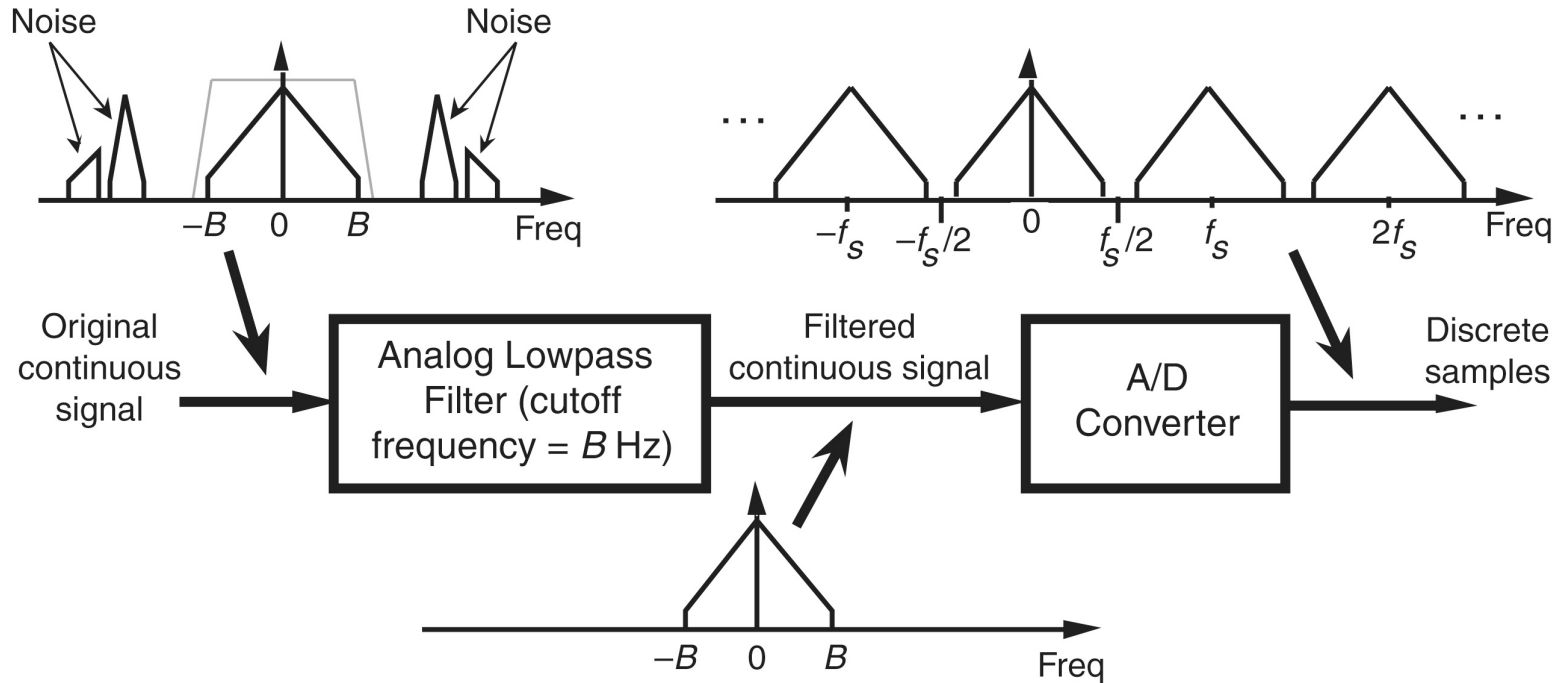
# Sampling Lowpass Signals



**Figure 2-5** Spectral replications: (a) original continuous signal-plus-noise spectrum; (b) discrete spectrum with noise contaminating the signal of interest.



# Sampling Lowpass Signals



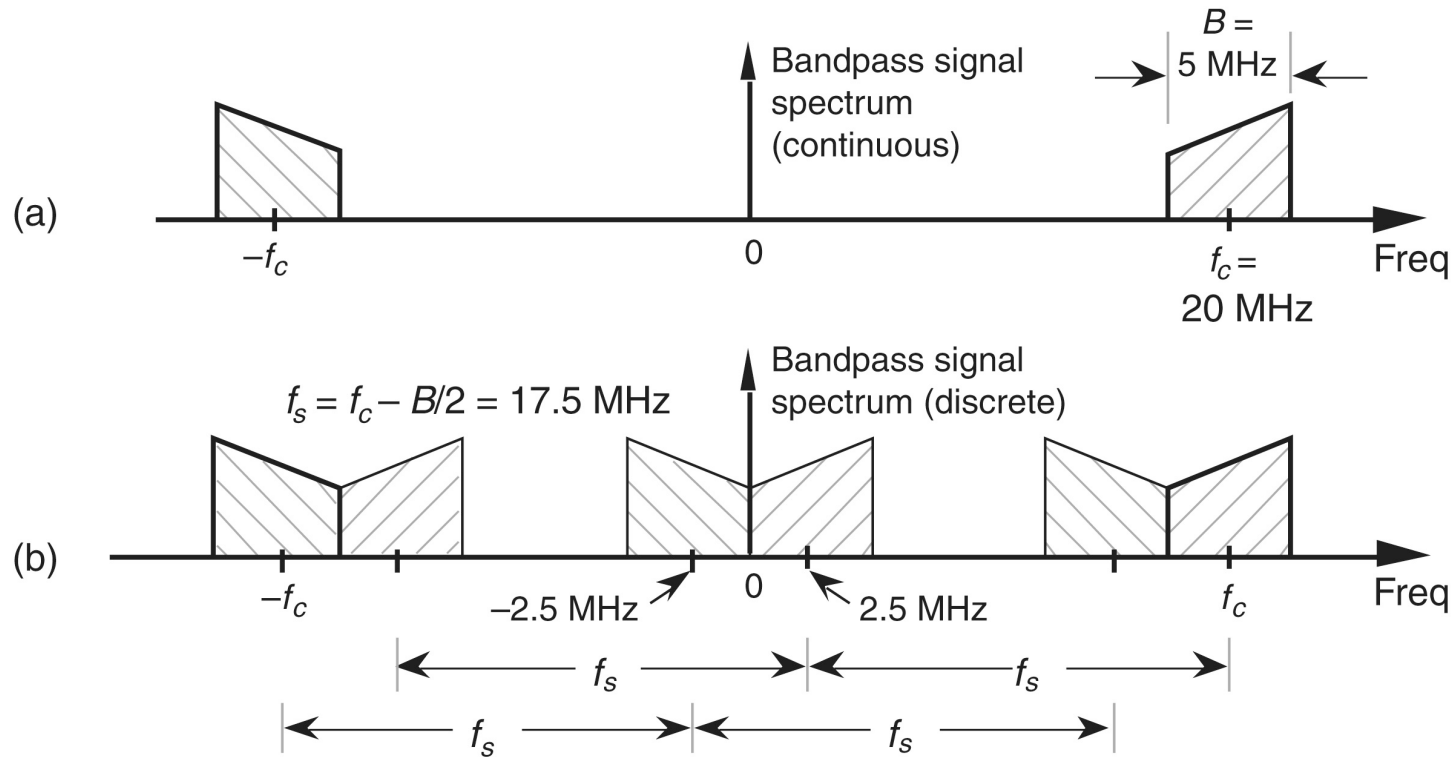
**Figure 2-6** Lowpass analog filtering prior to sampling at a rate of  $f_s$  Hz.

# Sampling Bandpass Signals

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- Bandpass sampling
  - A technique to sample a continuous bandpass signal that is centered about some frequency other than zero Hz
  - Reduces speed requirement of A/D converters below that necessary with traditional lowpass sampling
  - Reduces amount of digital memory necessary to capture a given time interval of a continuous signal
  - We're more concerned with a signal's bandwidth than its highest-frequency component

# Sampling Bandpass Signals



**Figure 2-7** Bandpass signal sampling: (a) original continuous signal spectrum; (b) sampled signal spectrum replications when sample rate is 17.5 MHz.

# Sampling Bandpass Signals

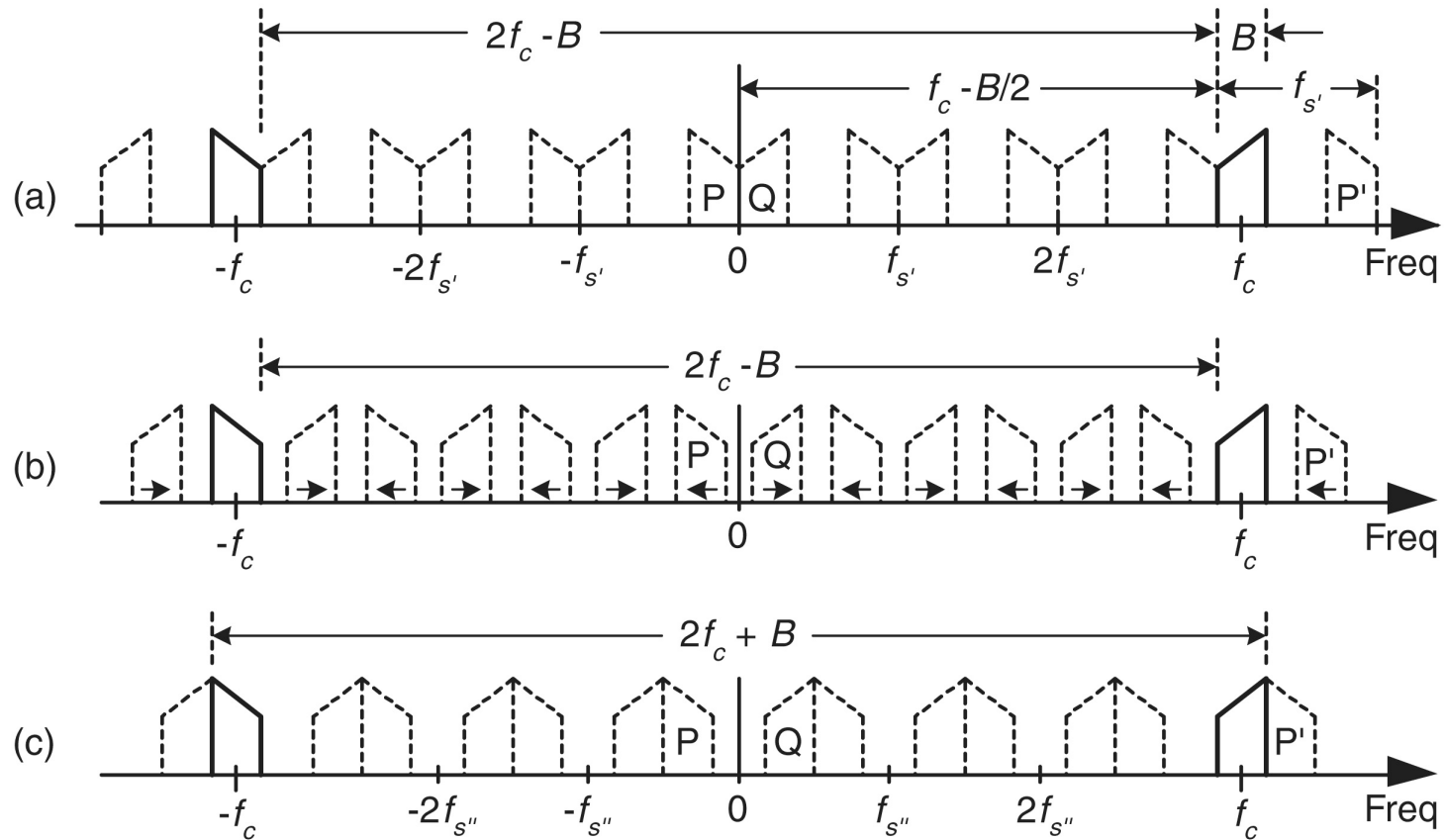
- Fig. 2-7(a)
  - Negative frequency portion of signal is mirror image of positive frequency portion (real signal)
  - Highest-frequency = 22.5 MHz
  - Nyquist criterion → sampling frequency must be a minimum of 45 MHz
- Fig. 2-7(b)
  - If sample rate is 17.5 MHz, spectral replications are located exactly at baseband
  - Sampling at 45 MHz was unnecessary to avoid aliasing—instead we've used spectral replicating effects to our advantage

# Sampling Bandpass Signals

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- Sampling translation
  - Bandpass sampling performs digitization and frequency translation in a single process
- We can sample at some still lower rate and avoid aliasing

# Sampling Bandpass Signals



**Figure 2-8** Bandpass sampling frequency limits: (a) sample rate  $f_{s'} = (2f_c - B)/6$ ; (b) sample rate is less than  $f_{s'}$ ; (c) minimum sample rate  $f_{s''} < f_{s'}$ .

# Sampling Bandpass Signals

## ■ Fig. 2-8(a)

- Continuous input bandpass signal of bandwidth  $B$
- *Carrier frequency* (signal is centered at) =  $f_c$  Hz
- Sample rate =  $f_{s'}$  Hz  $\rightarrow$  spectral replications of positive and negative bands, Q and P, butt up against each other at zero Hz

$$mf_{s'} = 2f_c - B \quad \text{or} \quad f_{s'} = \frac{2f_c - B}{m}$$

- $m$  = an arbitrary number of replications in the range of  $2f_c - B$ 
  - $m$  can be any positive integer so long as  $f_{s'}$  is never less than  $2B$

# Sampling Bandpass Signals

## ■ Fig. 2-8

- If  $f_{s'}$  is increased, original spectra (bold) do not shift, but all replications will shift
- At zero Hz, P band shifts to right, and Q band shifts to left
- These replications will overlap and aliasing occurs
- Thus, for an arbitrary  $m$ , there is a frequency that sample rate must not exceed

$$f_{s'} \leq \frac{2f_c - B}{m}$$



# Sampling Bandpass Signals

- Fig. 2-8(b) and (c)
  - If we reduce sample rate below  $f_s'$ , shown in (a), spacing between replications will decrease in direction of arrows in (b)
    - Original spectra do not shift
  - At some sample rate  $f_s''$  ( $f_s'' < f_s'$ ), replication P' will butt up against positive original spectrum at  $f_c$  as shown in (c)

$$(m+1)f_s'' = 2f_c + B \quad \text{or} \quad f_s'' = \frac{2f_c + B}{m+1}$$

- $f_s''$  decreased  $\rightarrow$  aliasing occurs

$$f_s'' \geq \frac{2f_c + B}{m+1}$$

# Sampling Bandpass Signals

- To avoid aliasing,  $f_s$  may be chosen anywhere in the range

$$\frac{2f_c - B}{m} \geq f_s \geq \frac{2f_c + B}{m+1} \quad (1)$$

- $m$  is an arbitrary, positive integer ensuring  $f_s \geq 2B$

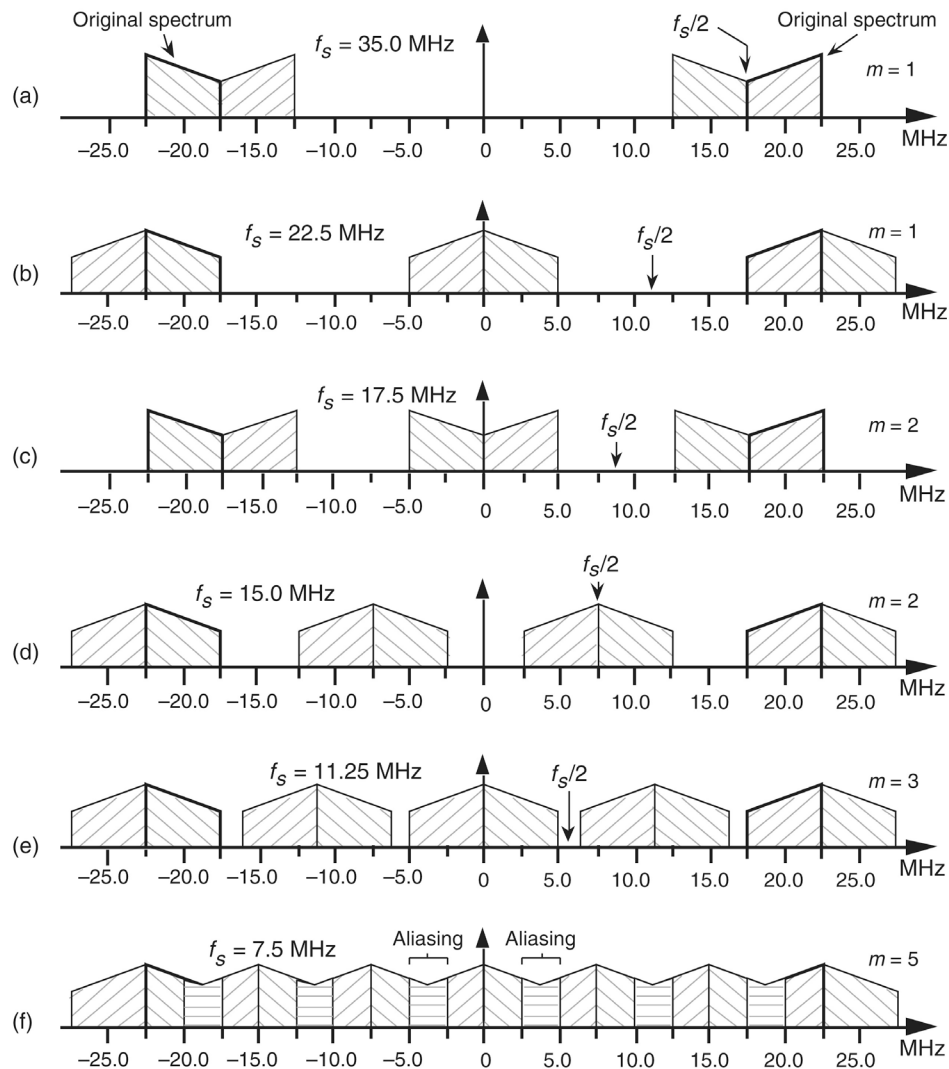
# Sampling Bandpass Signals

- Example (Fig. 2-7(a))
  - $f_c = 20$  MHz,  $B = 5$  MHz

$m$	$(2f_c - B) / m$	$(2f_c + B) / (m+1)$	Optimum sampling rate
1	35.0 MHz	22.5 MHz	22.5 MHz
2	17.5 MHz	15.0 MHz	17.5 MHz
3	11.66 MHz	11.25 MHz	11.25 MHz
4	8.75 MHz	9.0 MHz	---
5	7.0 MHz	7.5 MHz	---

- Sample rates below 11.25 MHz unacceptable
  - Will not satisfy Eq. (1) as well as  $f_s \geq 2B$
- Optimum sampling frequency is the frequency where spectral replications butt up against each other at zero Hz

# Sampling Bandpass Signals

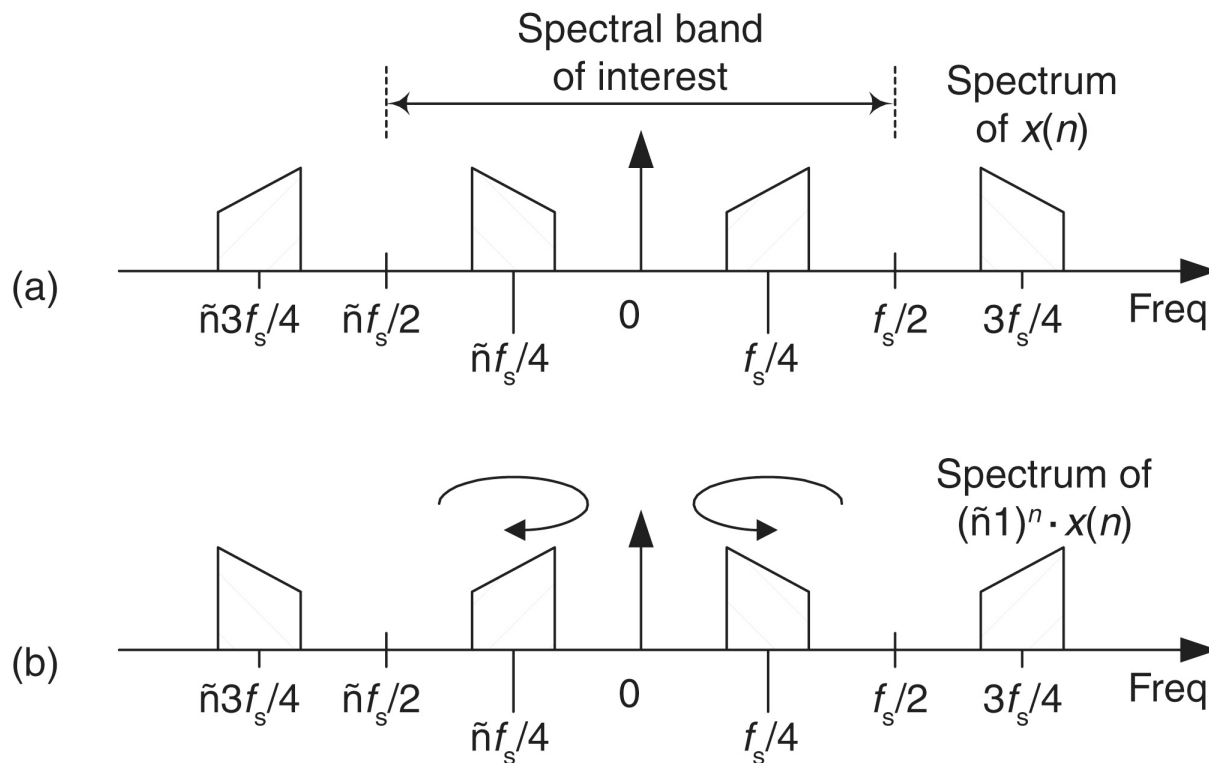


**Figure 2-9** Various spectral replications from Table 2-1: (a)  $f_s = 35$  MHz; (b)  $f_s = 22.5$  MHz; (c)  $f_s = 17.5$  MHz; (d)  $f_s = 15$  MHz; (e)  $f_s = 11.25$  MHz; (f)  $f_s = 7.5$  MHz.

# Practical Aspects of Bandpass Sampling

- Spectral Inversion in Bandpass Sampling
  - Some of permissible  $f_s$  values from Eq. (1) provide a sampled baseband spectrum (located near zero Hz) that is inverted from original analog signal's positive and negative spectral shapes
  - Happens when  $m$ , in Eq. (1), is an odd integer
    - We can invert spectrum back to its original orientation
    - Discrete spectrum of any digital signal can be inverted by multiplying signal's discrete-time samples by  $(-1)^n$
    - Center of flipping is  $f_s/4$  Hz (and  $-f_s/4$  Hz)
  - When original positive spectral bandpass components are symmetrical about  $f_c$  frequency, spectral inversion presents no problem

# Practical Aspects of Bandpass Sampling



**Figure 2-10** Spectral inversion through multiplication by  $(-1)^n$ : (a) spectrum of original  $x(n)$ ; (b) spectrum of  $(-1)^n \cdot x(n)$ .

# Practical Aspects of Bandpass Sampling

- Positioning sampled spectra at  $f_s/4$ 
  - In many signal processing applications it is useful to use an  $f_s$  bandpass sampling rate that forces sampled spectra to be centered exactly at  $\pm f_s/4$
  - To ensure that sampled spectra reside at  $\pm f_s/4$ , select  $f_s$  using

$$f_s = \frac{4f_c}{2k-1}, \text{ where } k = 1, 2, 3, \dots$$

# Practical Aspects of Bandpass Sampling

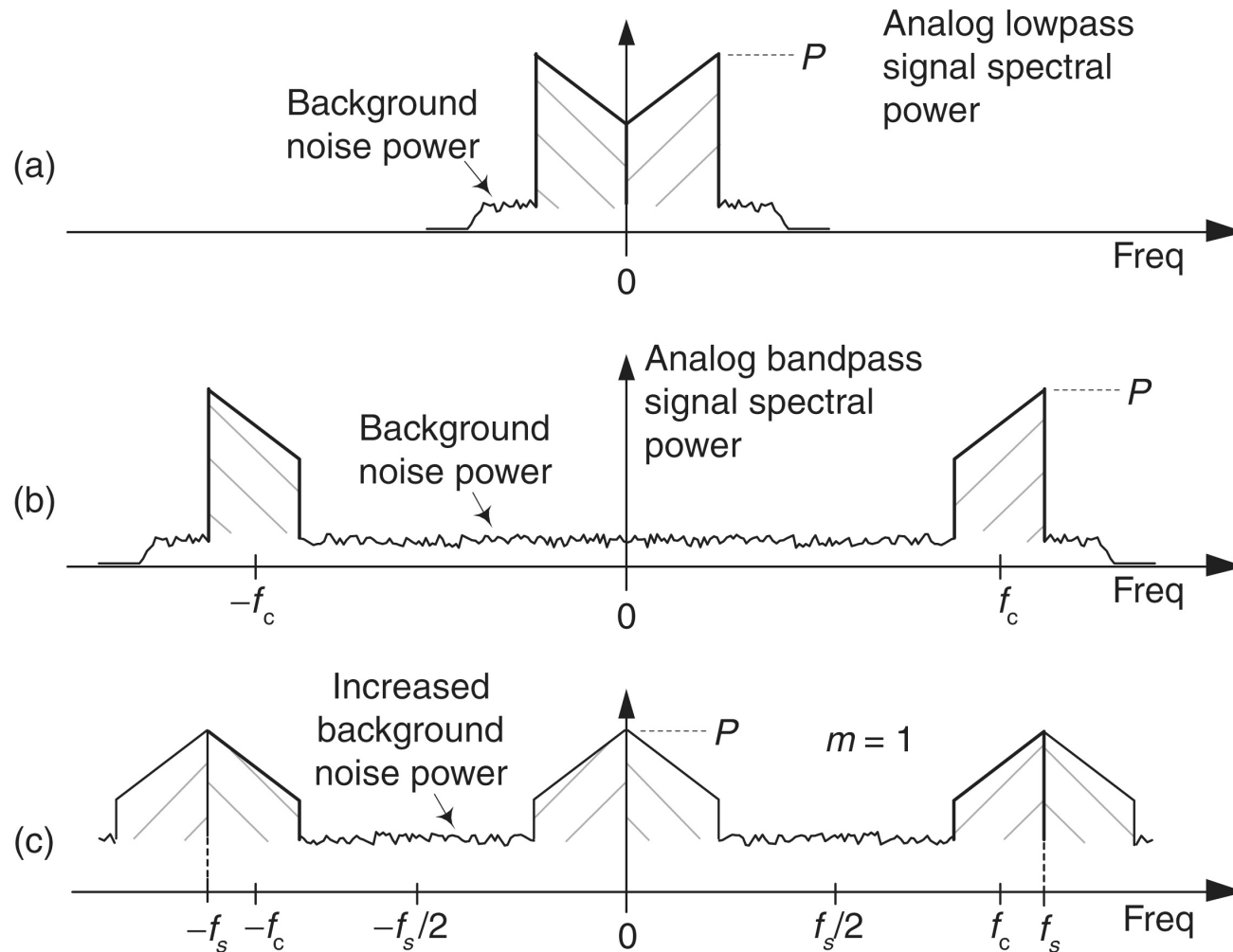
- Noise in bandpass-sampled signals
  - Signal-to-noise ratio (SNR) is ratio of power of a signal over total background noise power
  - Negative aspect of bandpass sampling
    - SNR of digitized signal is degraded
    - All of background spectral noise (Fig. 2-11(b)) resides in range of  $-f_s/2$  to  $f_s/2$  (Fig. 2-11(c))
    - Bandpass-sampled background noise power increases by a factor of  $m + 1$  (denominator of right-side ratio in Eq. (1)) while signal power  $P$  remains unchanged
    - Bandpass-sampled signal's SNR is reduced by

$$D_{SNR} = 10 \cdot \log_{10}(m + 1) \text{ dB}$$

below SNR of original analog signal



# Practical Aspects of Bandpass Sampling



**Figure 2-11** Sampling SNR degradation: (a) analog lowpass signal spectral power; (b) analog bandpass signal spectral power; (c) bandpass-sampled signal spectral power when  $m = 1$ .