

# ***AD e DA***

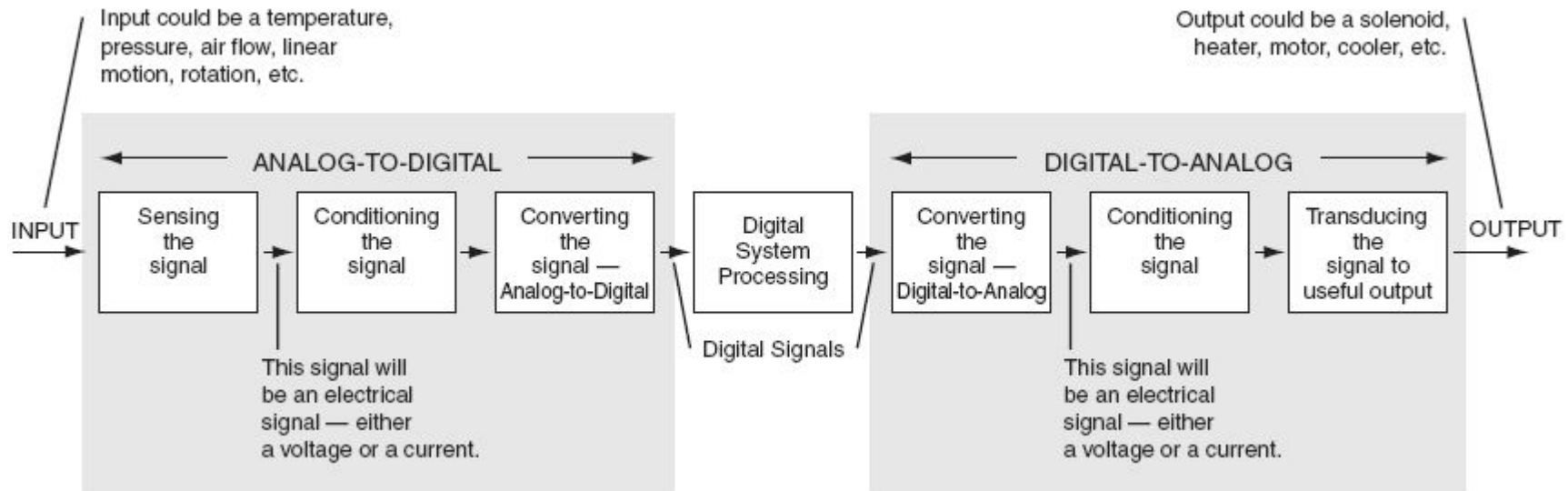
## **Conversão de Sinais**

### ***Aliasing e Reconstrução de Sinais***

***Daniel Varela Magalhães***

# Amostrar e Reconstruir?

- Armazenagem, transmissão, chaveamento, processamento e síntese digital;



# Por que preocupar-se?

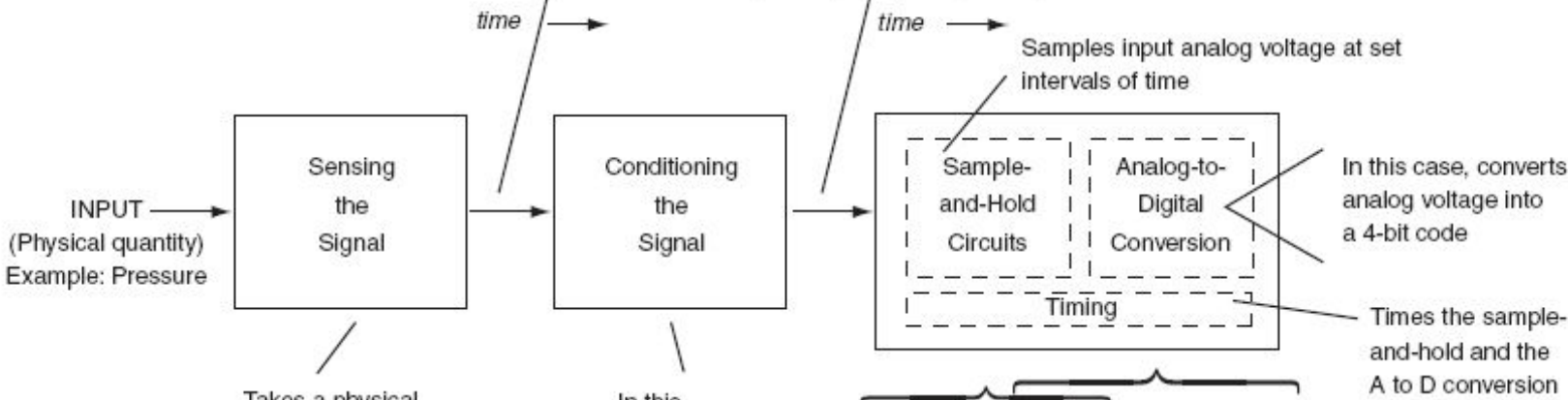
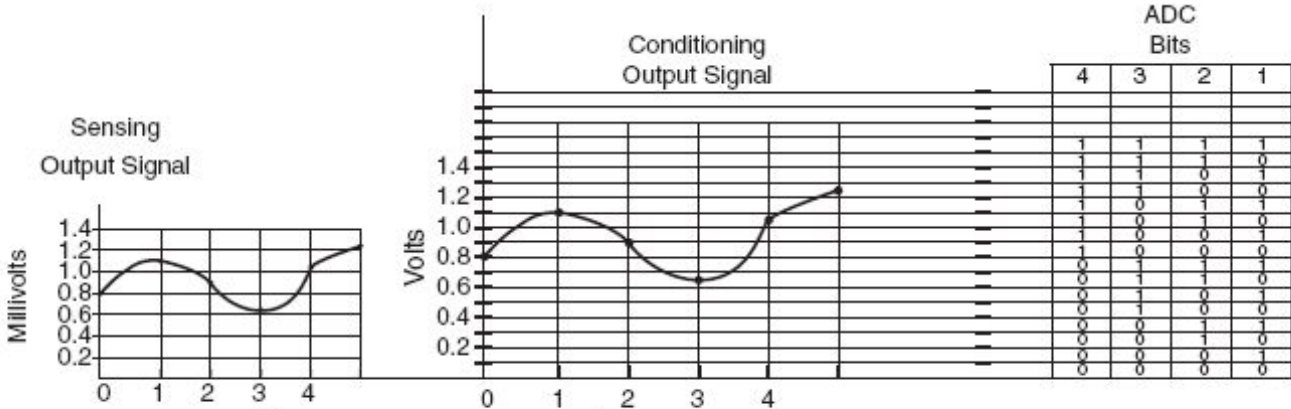
- Placas de aquisição de dados mais acessíveis;
- Conversores rápidos e menos custosos;
- Suavização em programas de visualização;

# Por outro lado...

- Grande expansão de uC de baixo custo com AD's menos poderosos (...inos ou mesmo outros);
- Velocidade implica, normalmente, em maior consumo de energia;
- Demandas de IoT;

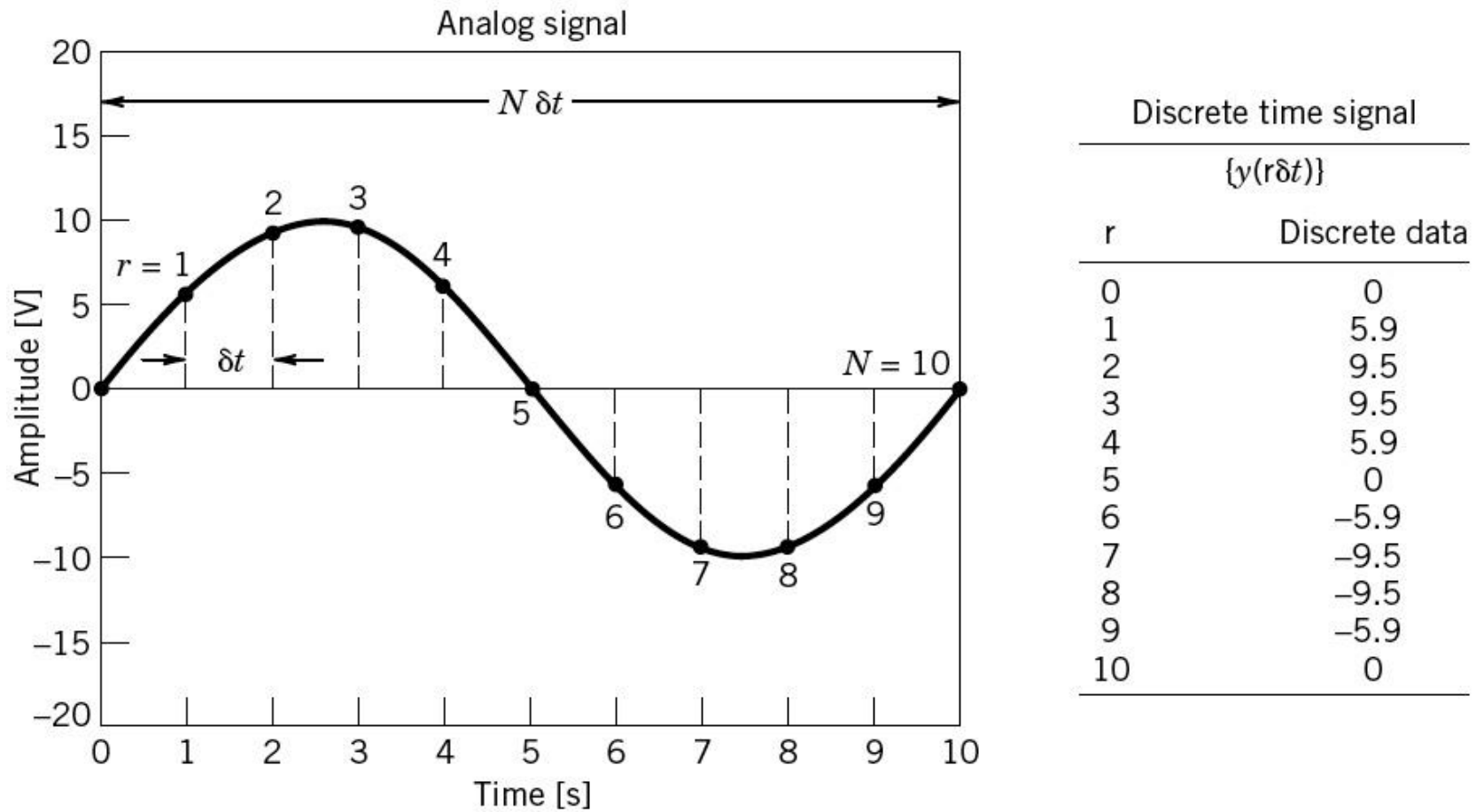
# Como um sinal analógico é visto pelo AD

Sinal Original



Sample	Value	Digital Code
0	0.8V	1000
1	1.1V	1011
2	0.9V	1001
3	0.65V	0110
4	1.05V	1010
5	1.25V	1100

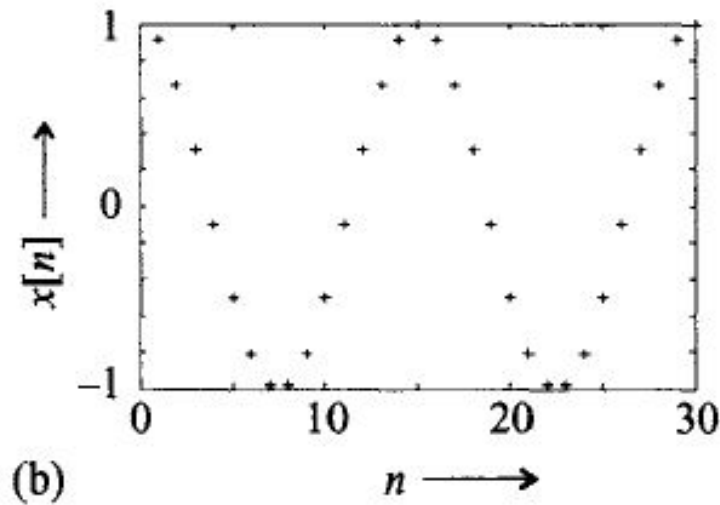
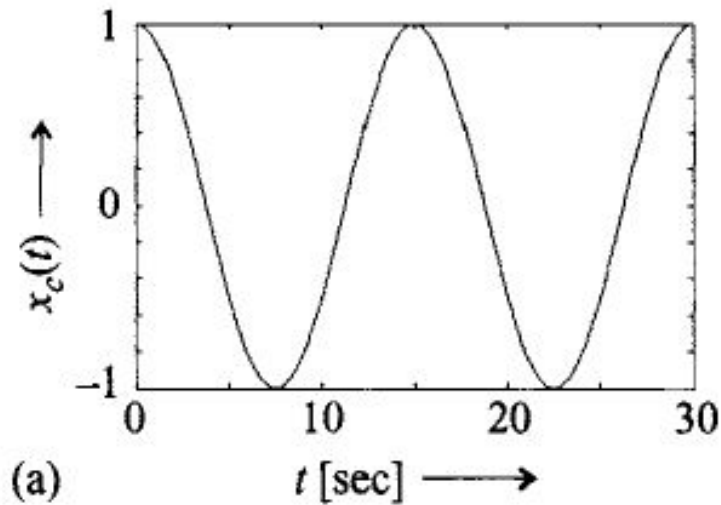
# Conversão para Sinal Digital



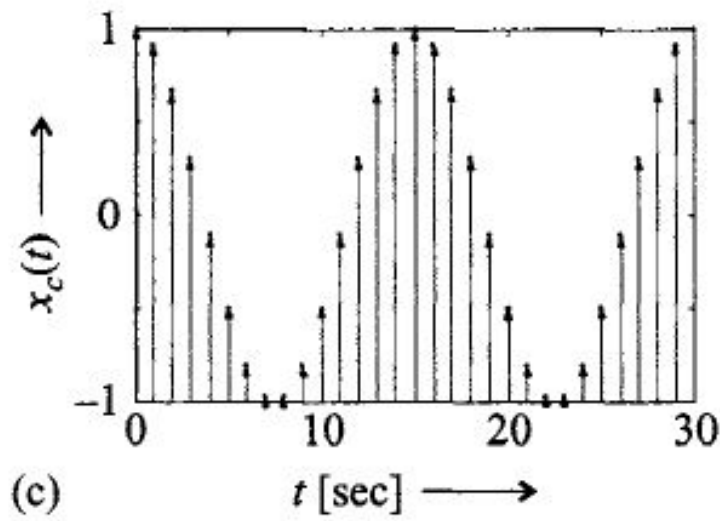
**Figure 7.1** Analog and discrete representations of a time-varying signal.

# Conversão para Sinal Digital

Formas de representar matematicamente após a amostragem

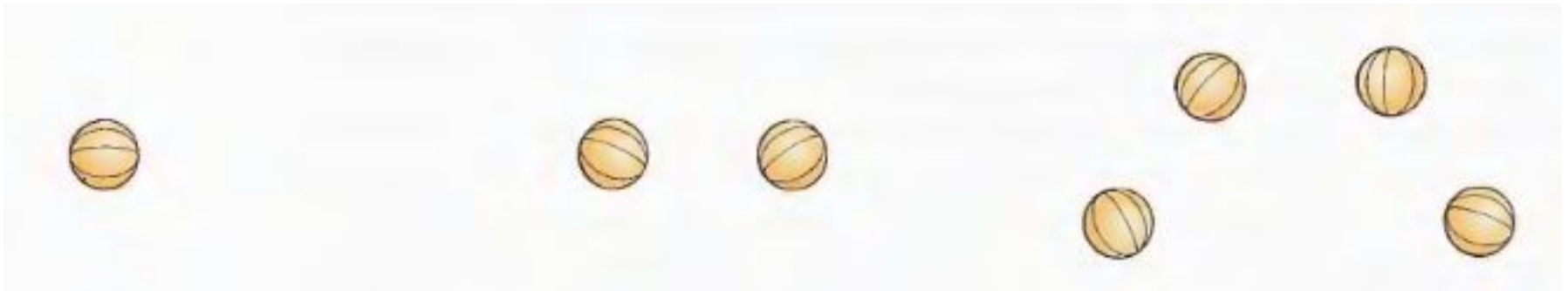


$$x[n] = x(nT), \quad n \text{ integer}$$



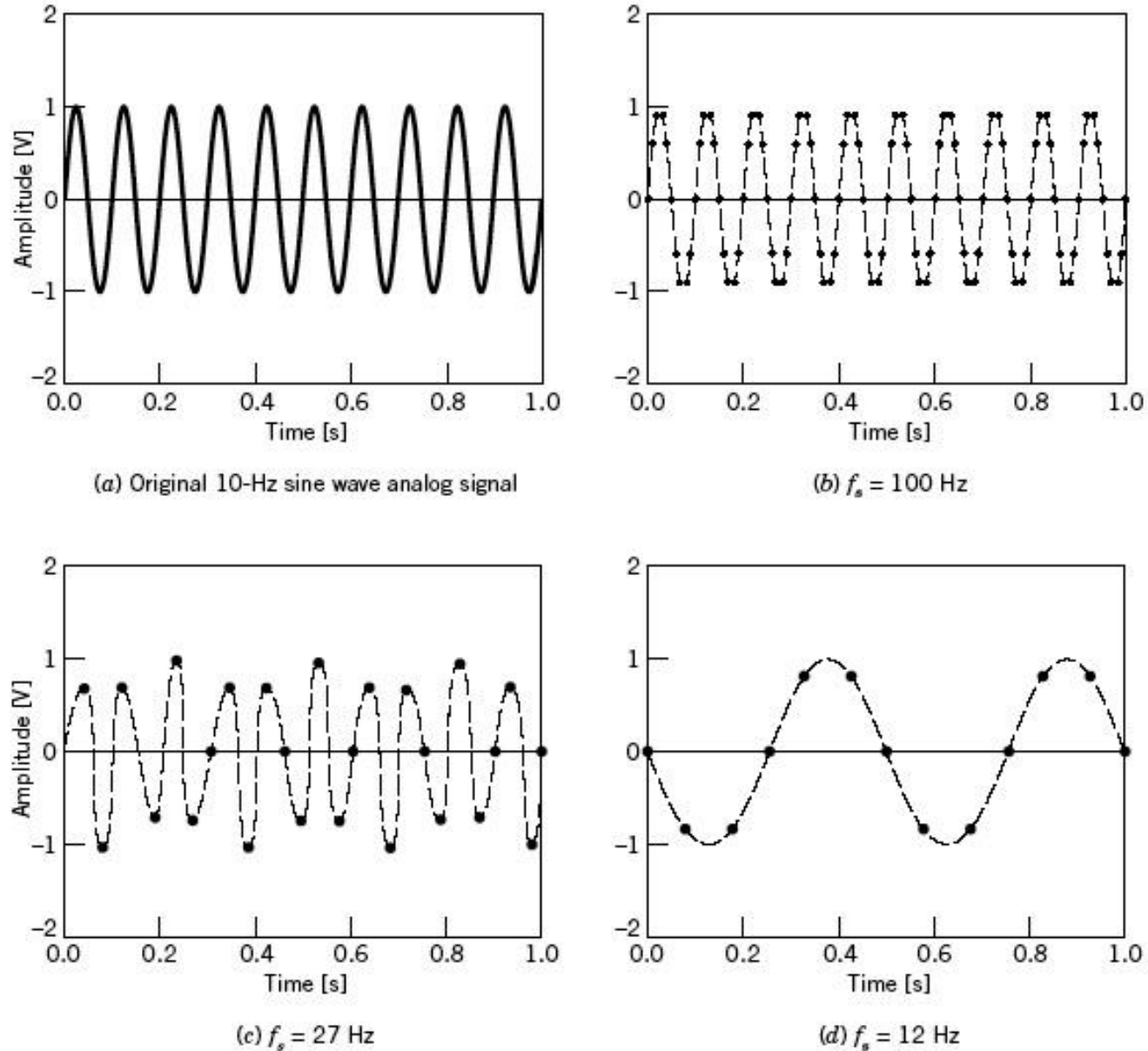
$$x_p(t) = \sum_{n=-\infty}^{+\infty} x(nT) \delta(t - nT)$$

Diferentes tempos de amostragem para um mesmo sinal de entrada



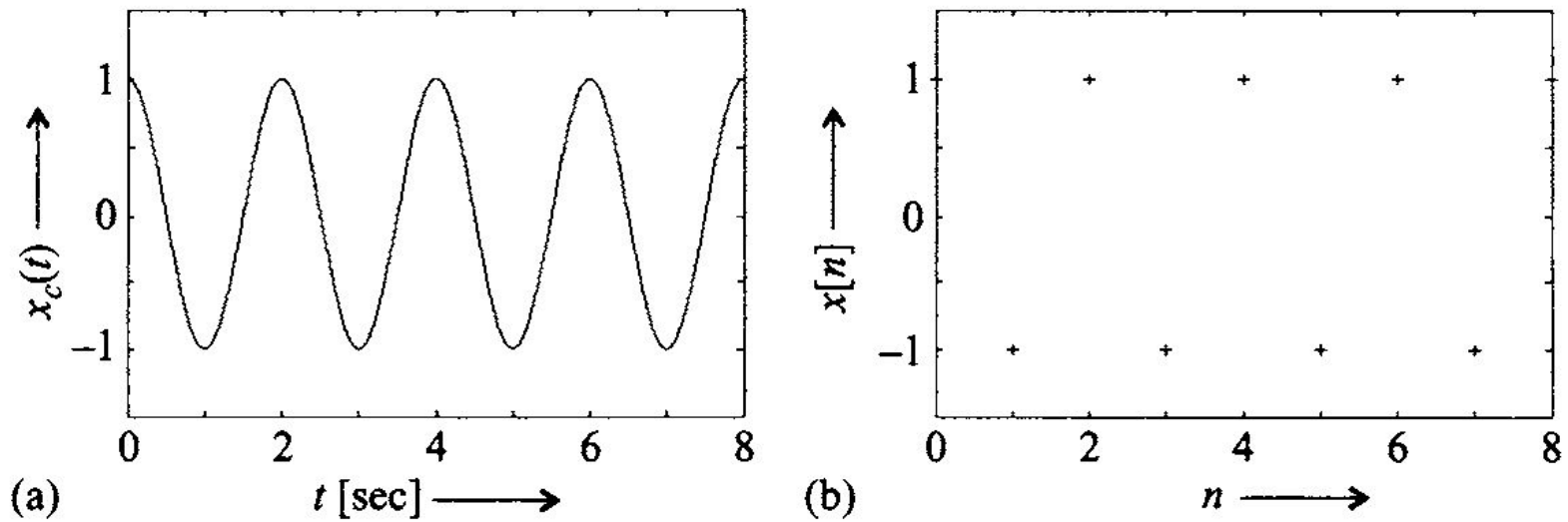


Diferentes tempos de amostragem para um mesmo sinal de entrada

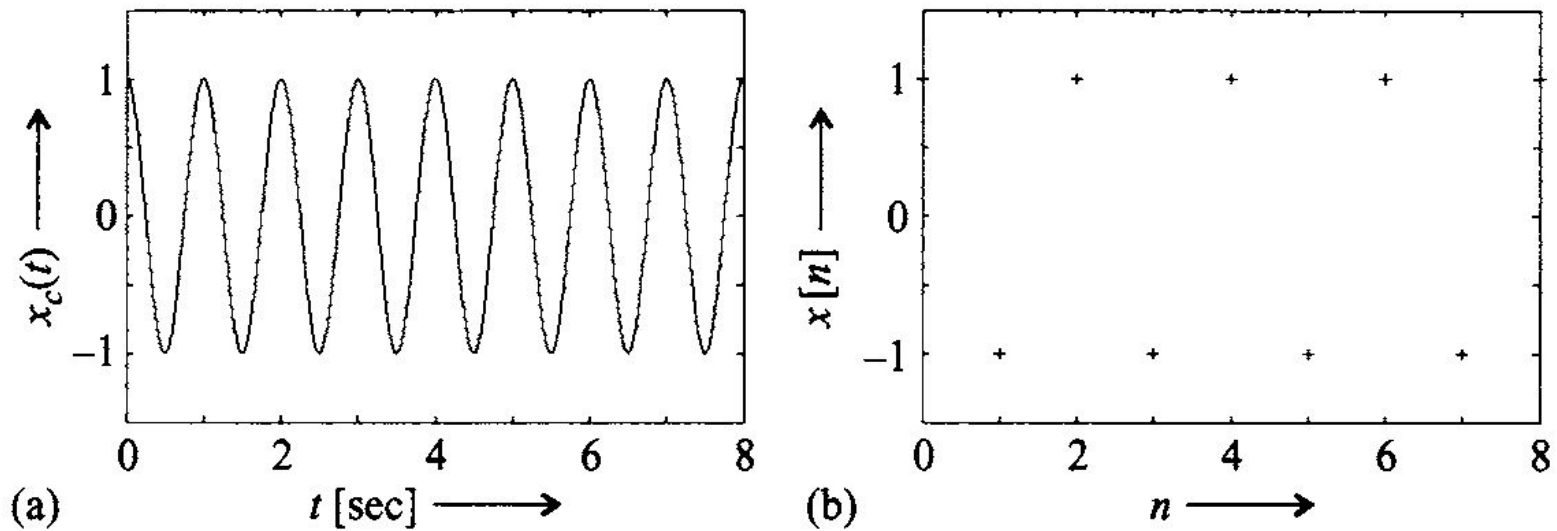


**Figure 7.2** The effect of sample rate on signal frequency and amplitude interpretation.

Diferentes tempos de amostragem para um mesmo sinal de



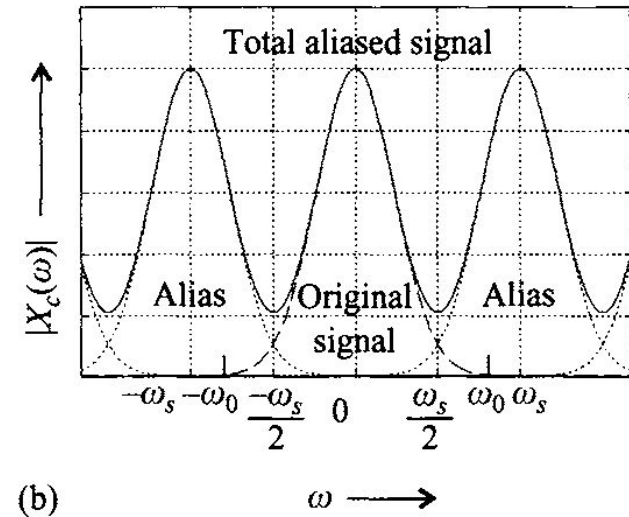
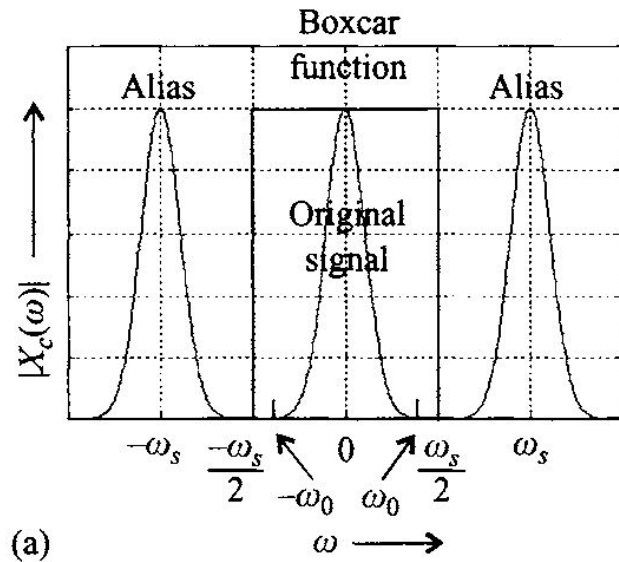
**Figure 5.3** (a)  $x_c(t) = \cos \pi t$ ; (b) sampled signal with  $\Delta t = 1$



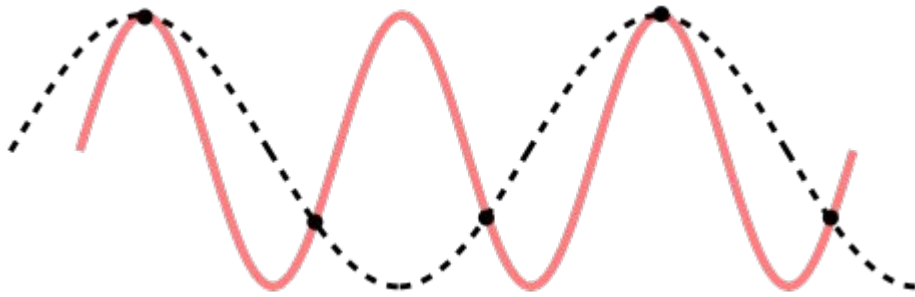
# Definindo uma Taxa de Amostragem

Critério de Nyquist

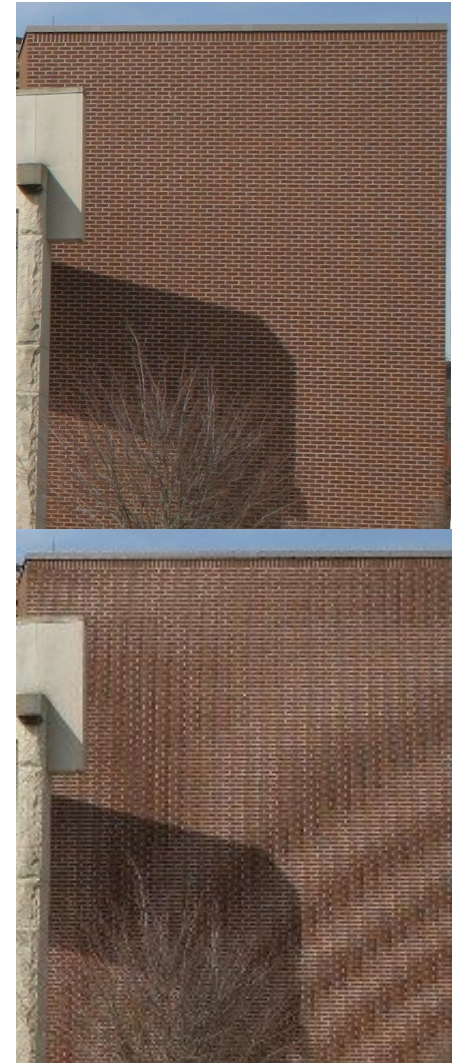
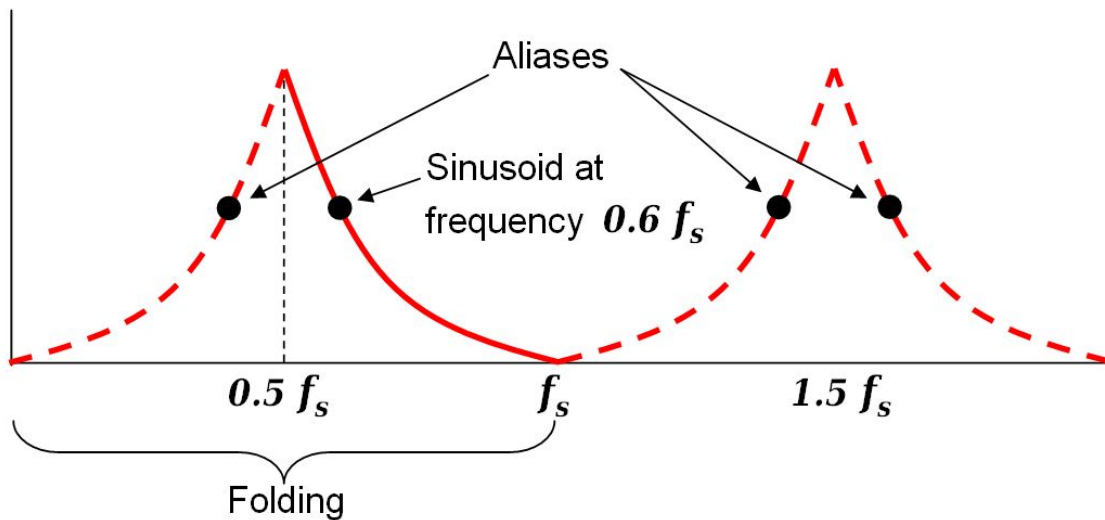
$$f_{\text{sampl}} \geq 2f_{\text{cut}}$$



# Cuidados com Aliasing



$$f_{\text{alias}}(N) \stackrel{\text{def}}{=} |f - Nf_s|,$$



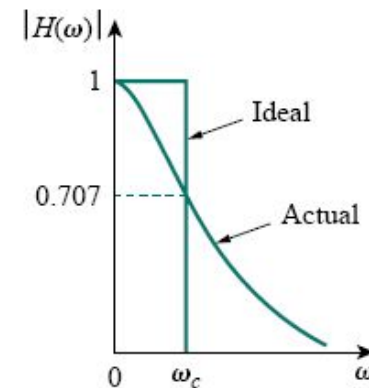
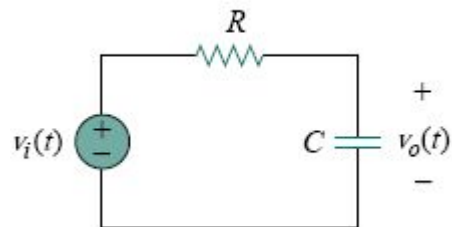
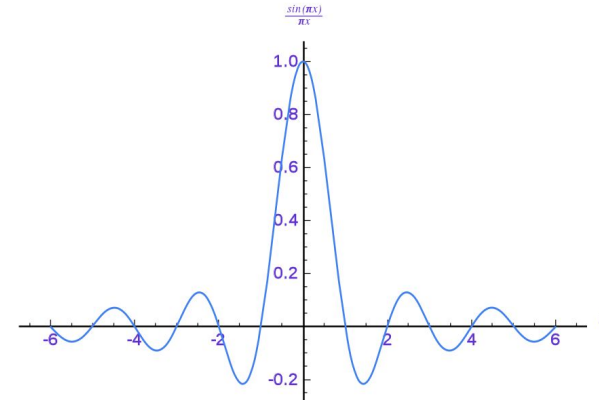
# Evitando “Falsos” Sinais

Sobre-amostragem

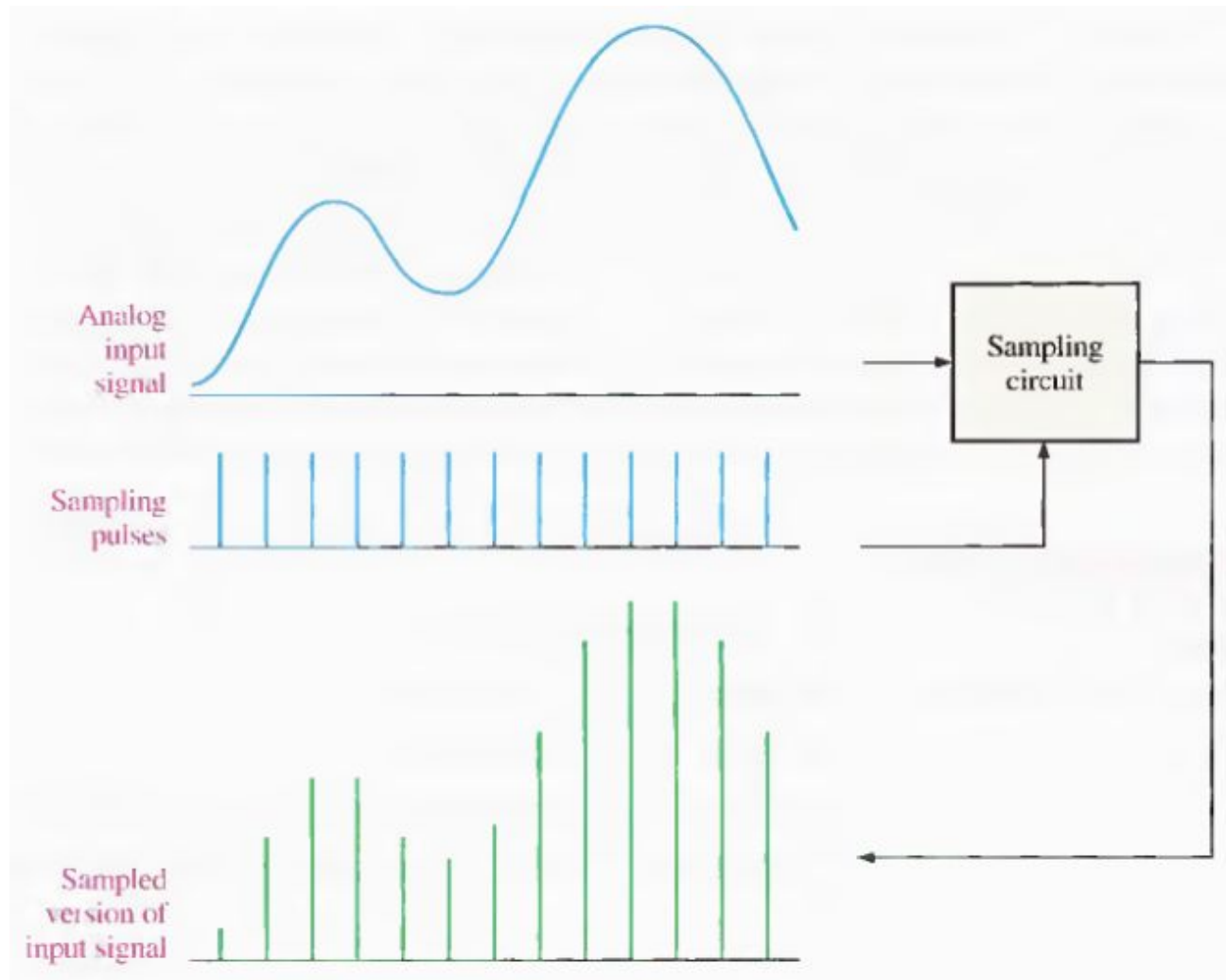
Filtros anti-aliasing

Tratamento com filtros reais

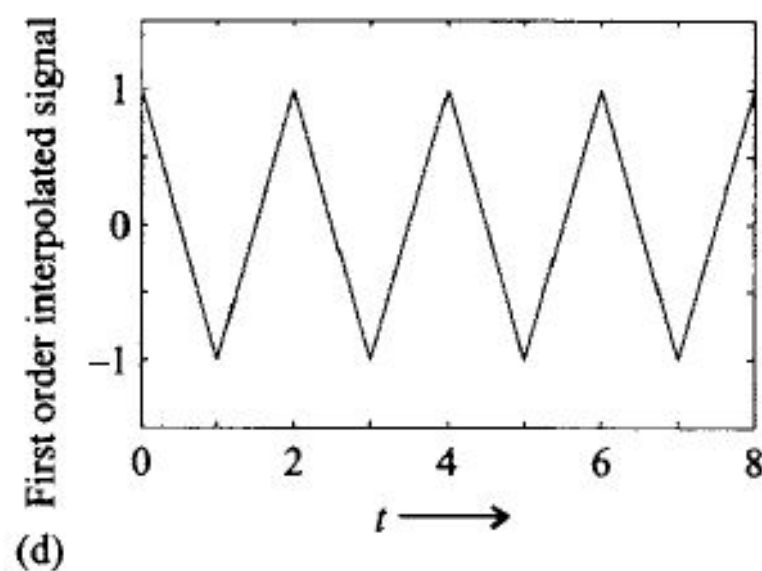
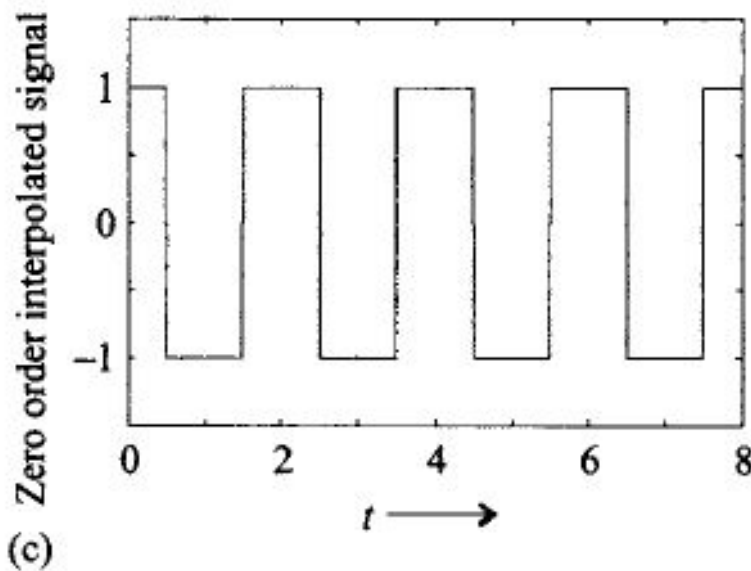
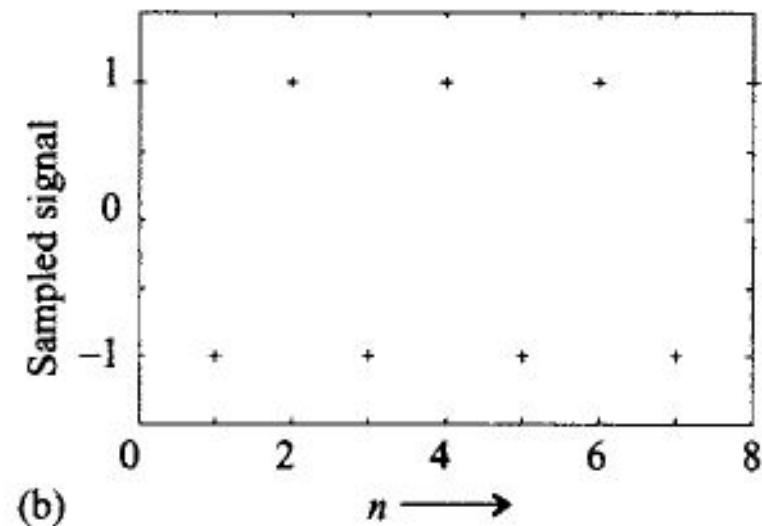
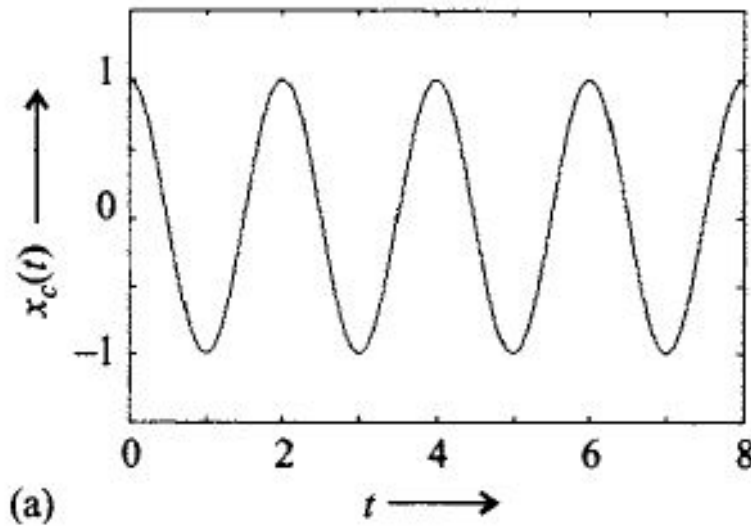
Custo-benefício para ordem dos filtros



# “Cara” do sinal amostrado



# Maneiras de Visualizar o Sinal Interpolação



# Tática de Reconstrução

$$X(f) = H(f) \cdot X_s(f),$$

$$H(f) \stackrel{\text{def}}{=} \begin{cases} 1 & |f| < B \\ 0 & |f| > f_s - B. \end{cases}$$

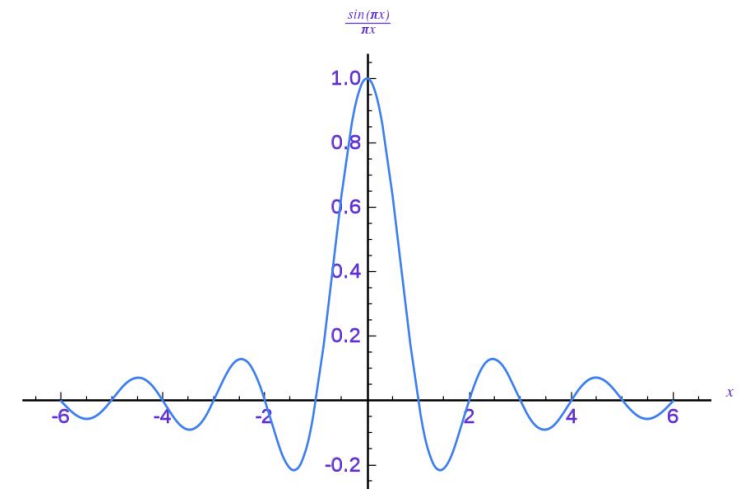
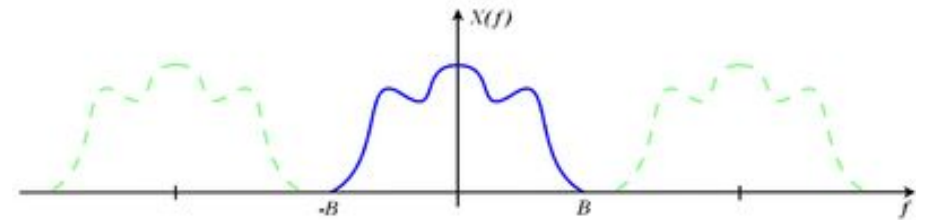
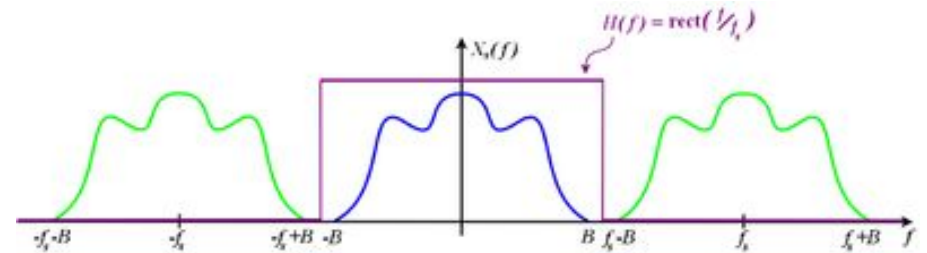
$$H(f) = \text{rect}\left(\frac{f}{f_s}\right) = \begin{cases} 1 & |f| < \frac{f_s}{2} \\ 0 & |f| > \frac{f_s}{2}, \end{cases}$$

$$X(f) = \text{rect}\left(\frac{f}{f_s}\right) \cdot X_s(f)$$

$$= \sum_{n=-\infty}^{\infty} x(nT) \cdot T \cdot \underbrace{\text{rect}(Tf) \cdot e^{-i2\pi nTf}}_{\mathcal{F}\left\{\text{sinc}\left(\frac{t-nT}{T}\right)\right\}}$$

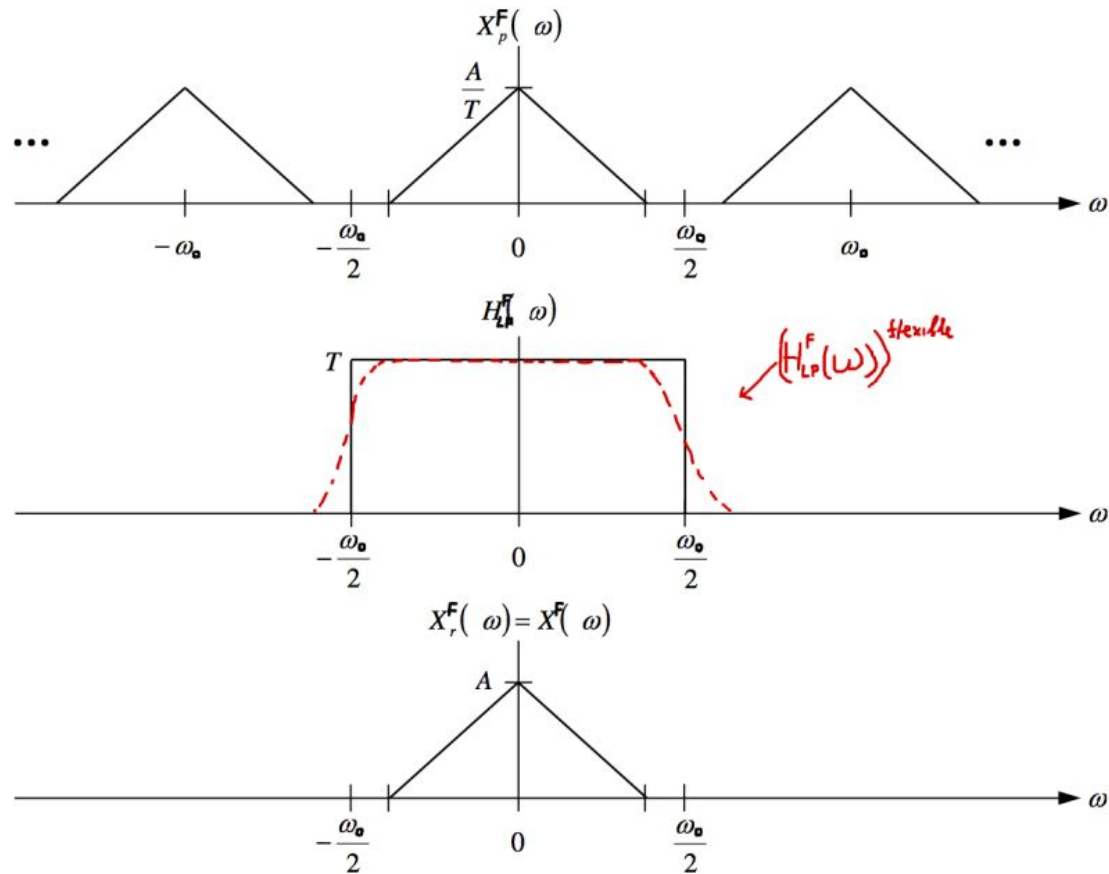
$$x(t) = \sum_{n=-\infty}^{\infty} x(nT) \cdot \text{sinc}\left(\frac{t-nT}{T}\right),$$

Whittaker–Shannon interpolation formula

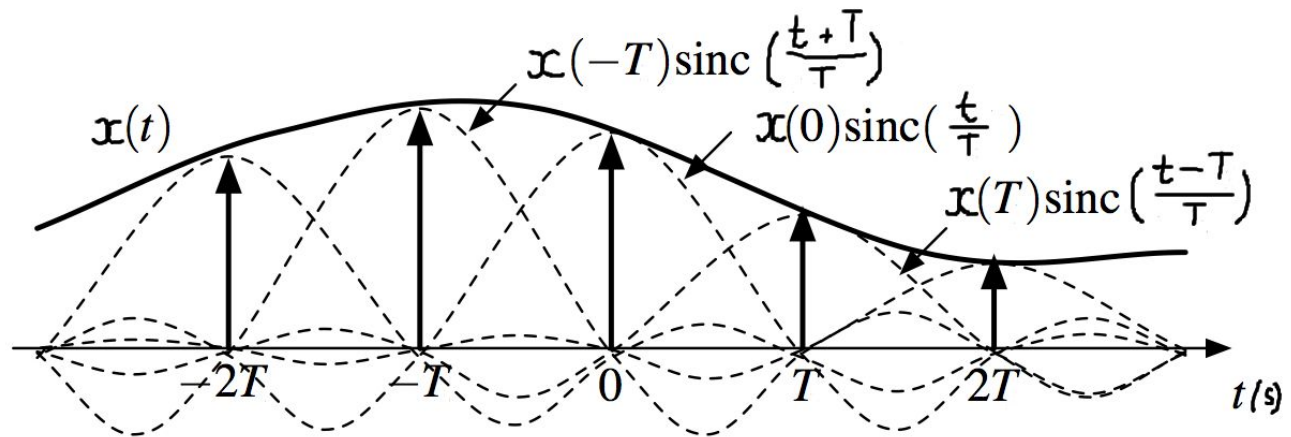
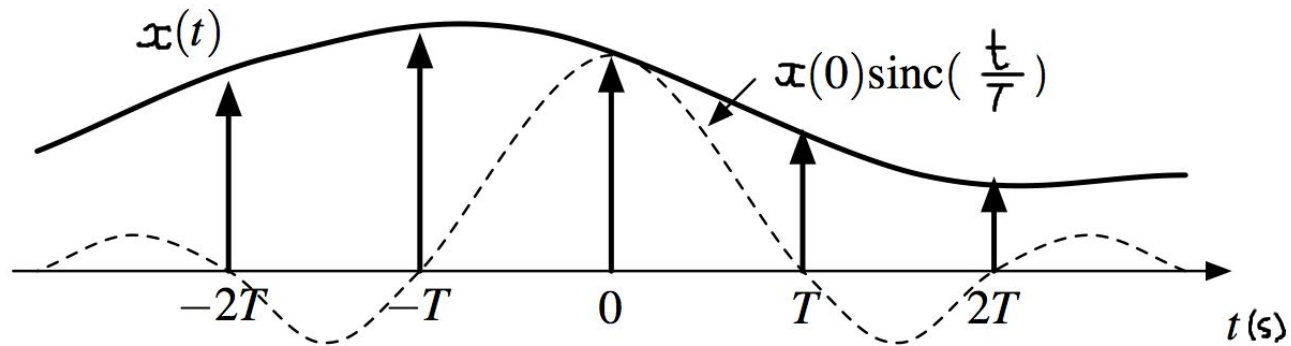
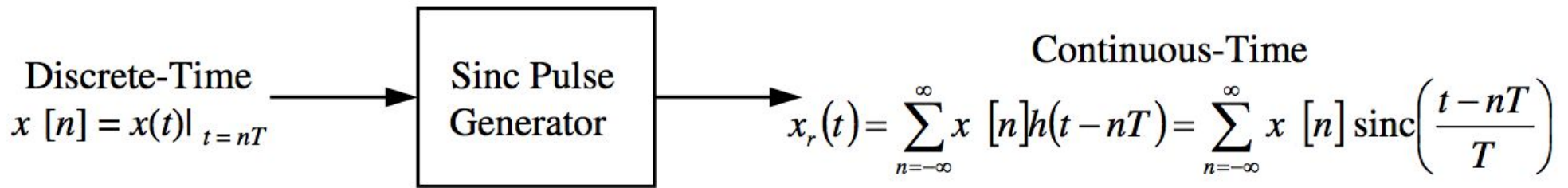




# Tática de Reconstrução

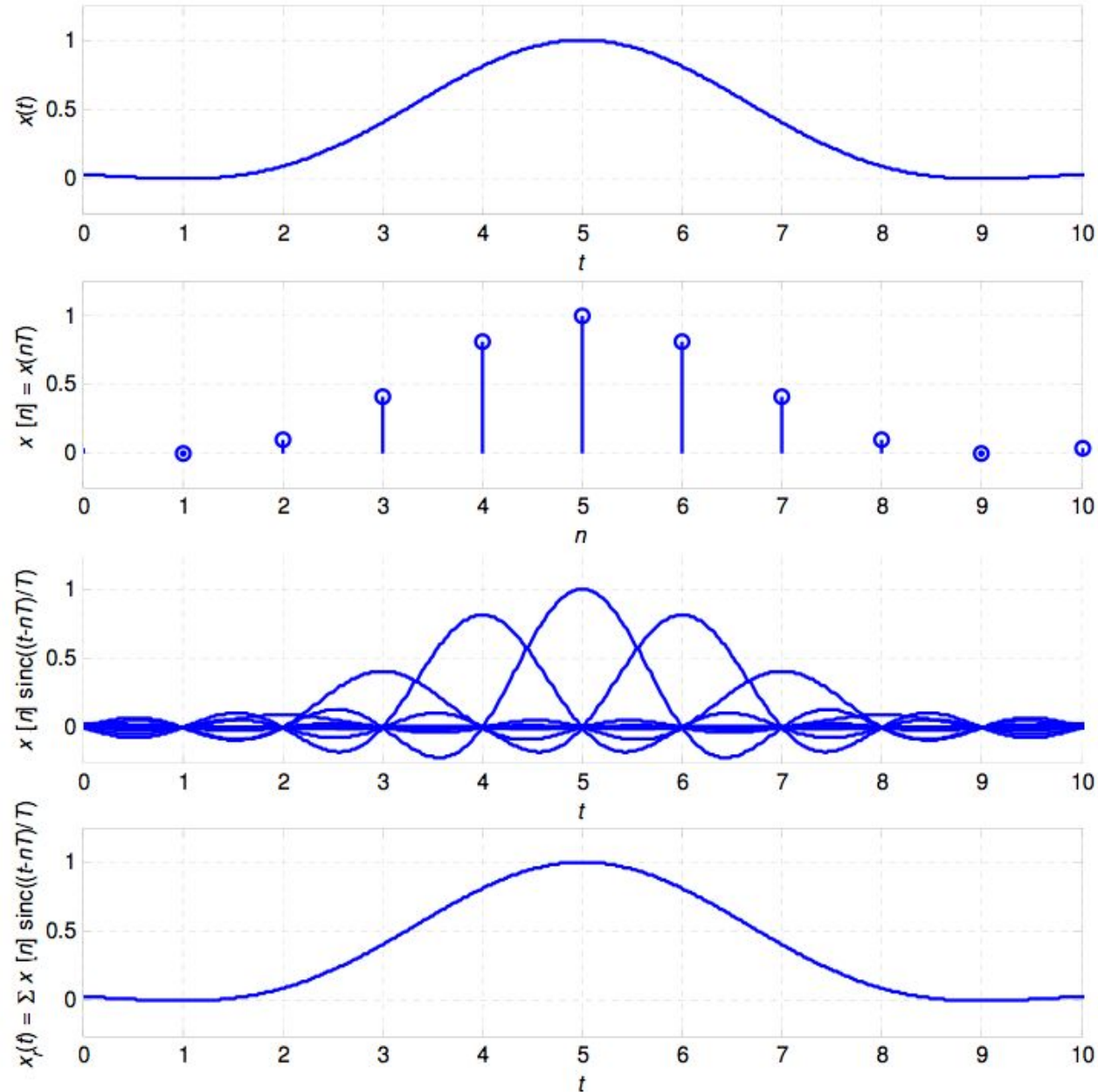


# Definindo um Reconstrutor



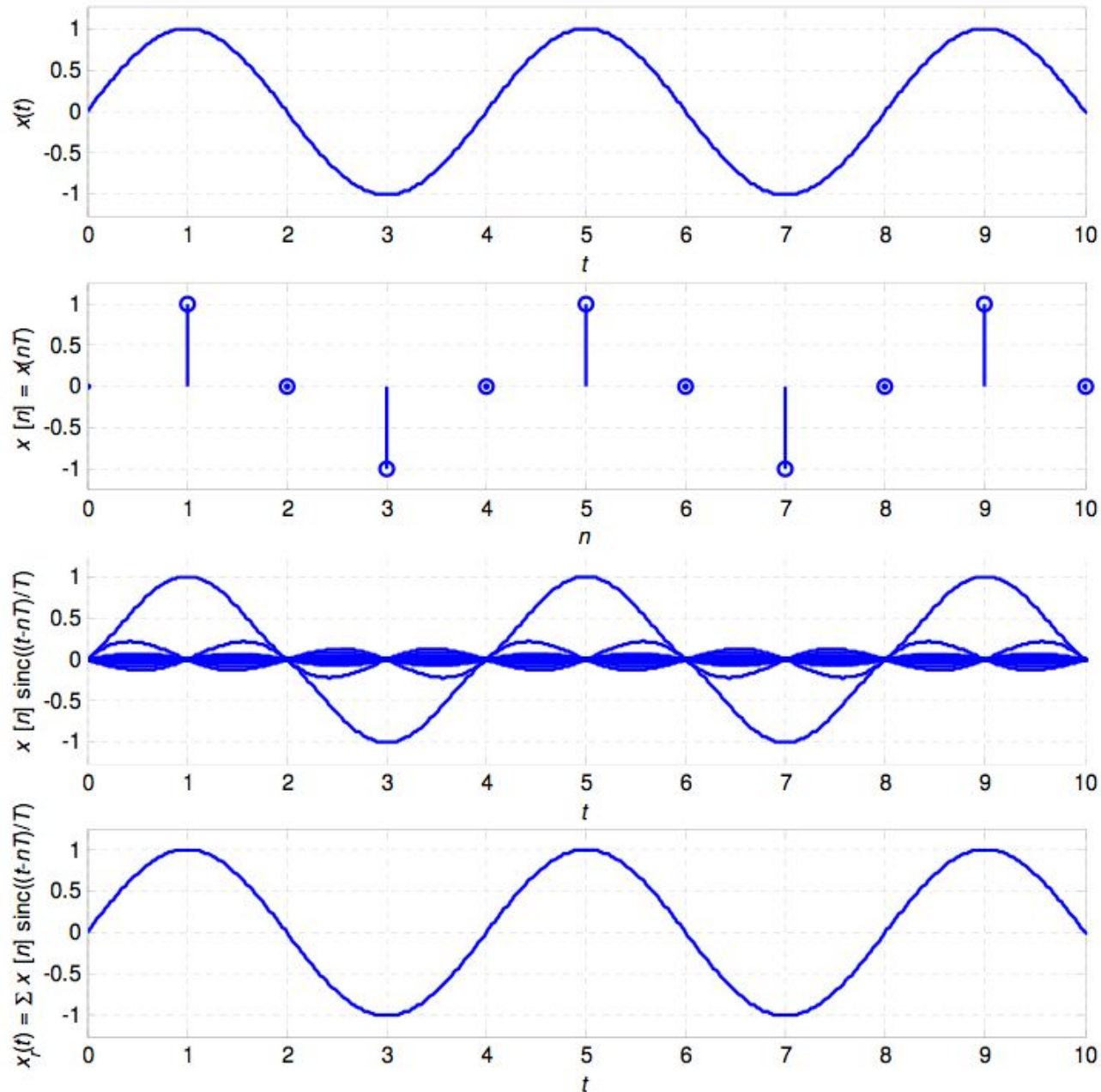
# Reconstruindo Sinais

$$x(t) = \text{sinc}^2\left(\frac{1}{4}(t-5)\right) \quad \left(\frac{\omega_m}{2\pi} = \frac{1}{4} \text{ Hz}\right) \quad T=1 \quad \left(\frac{\omega_v}{2\pi} = 1 \text{ Hz}\right) \quad \text{Ideal Bandlimited Reconstruction}$$



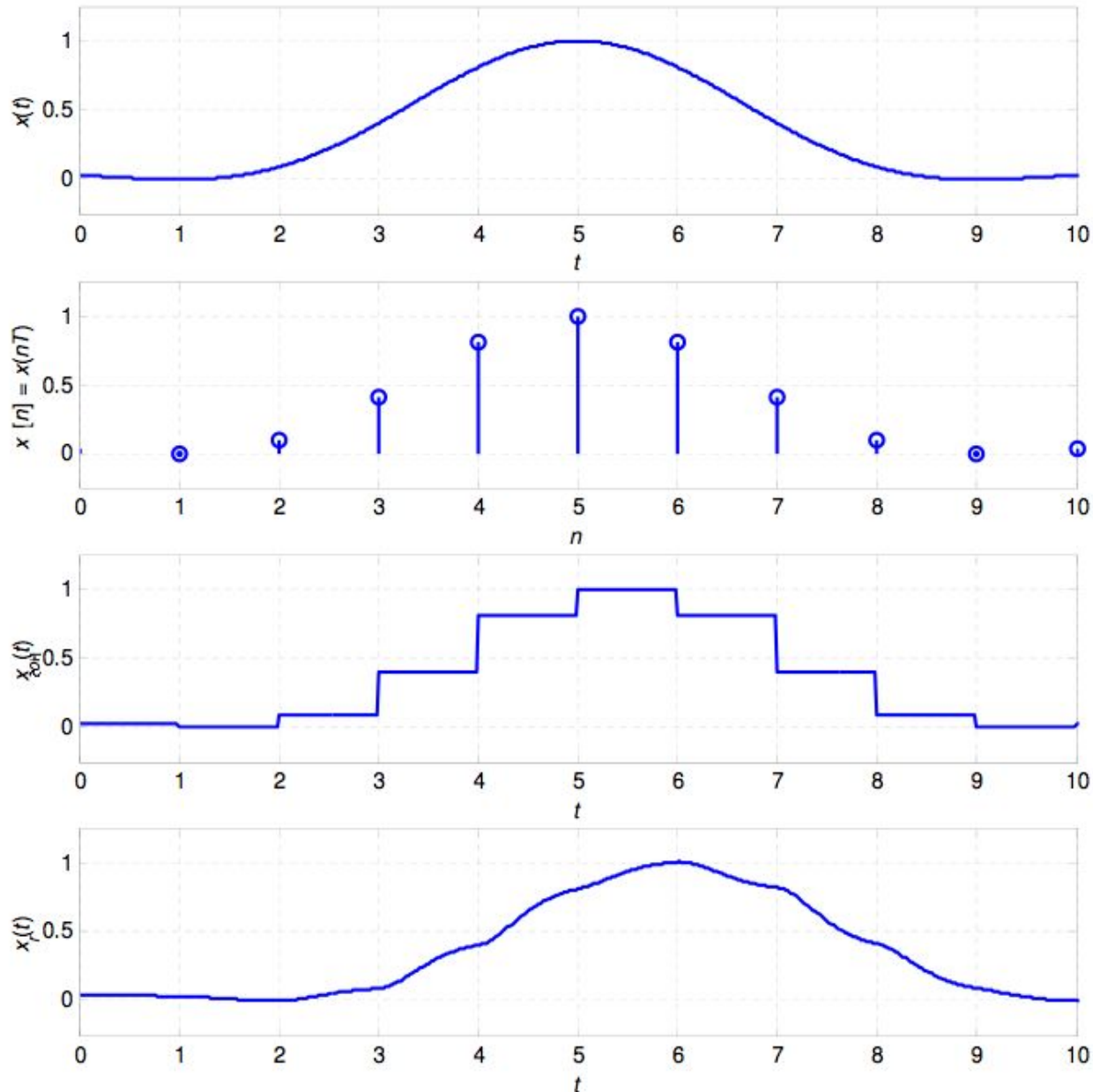
# Reconstruindo Sinais

$$x(t) = \sin\left(\frac{\pi}{2}t\right) \quad \left(\frac{\omega_m}{2\pi} = \frac{1}{4} \text{ Hz}\right) \quad T = 1 \quad \left(\frac{\omega_a}{2\pi} = 1 \text{ Hz}\right) \quad \text{Ideal Bandlimited Reconstruction}$$



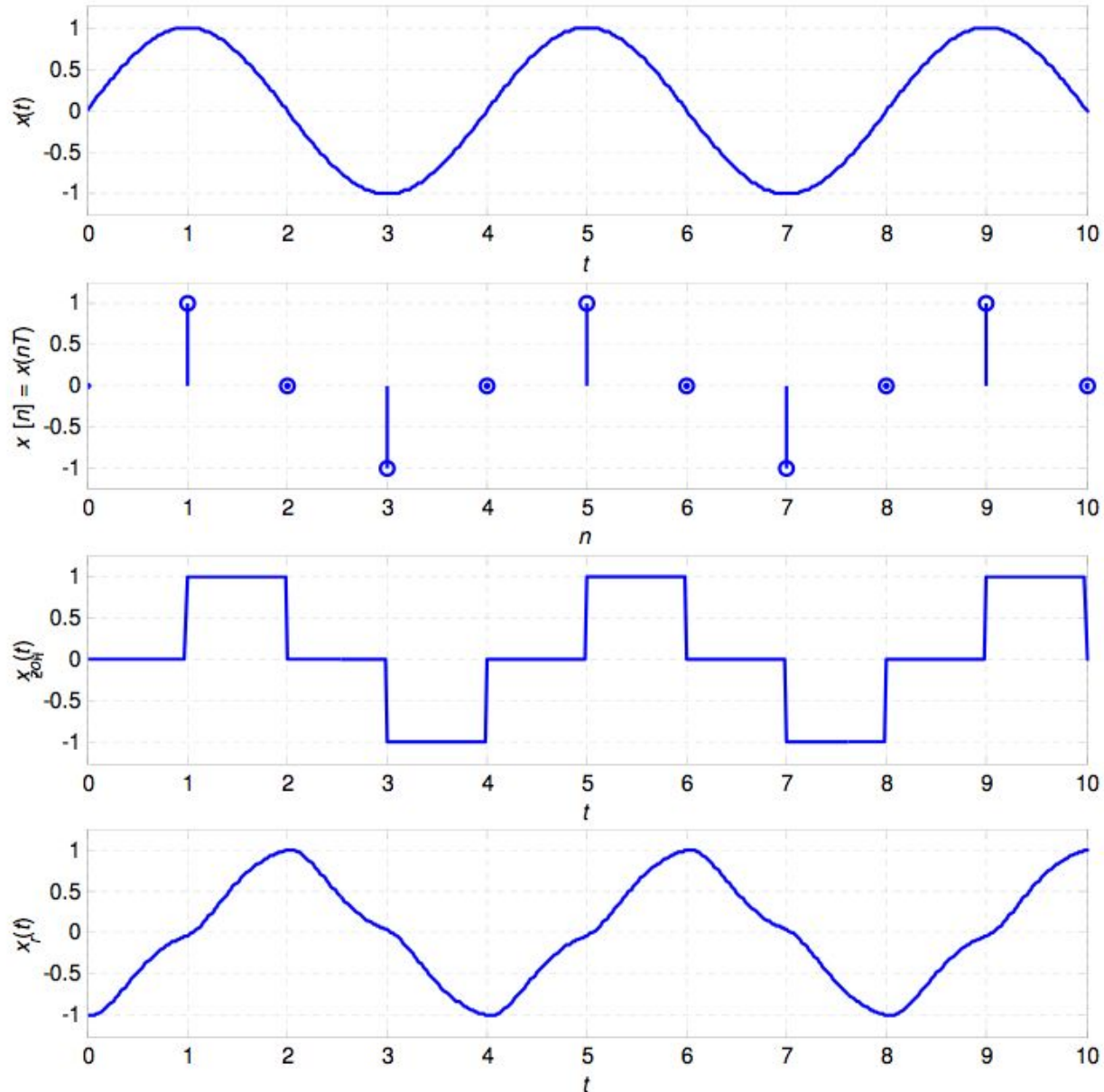
# Reconstruindo Sinais

$$x(t) = \text{sinc}^2\left(\frac{1}{4}(t-5)\right) \quad \left(\frac{\omega_m}{2\pi} = \frac{1}{4} \text{ Hz}\right) \quad T = 1 \quad \left(\frac{\omega_a}{2\pi} = 1 \text{ Hz}\right) \quad \text{Zero-Order Hold, 2nd-Order Butterworth LPF} \quad \frac{\omega_c}{2\pi} = \frac{1}{2} \text{ Hz}$$



# Reconstruindo Sinais

$$x(t) = \sin\left(\frac{\pi}{2}t\right) \quad \left(\frac{\omega_m}{2\pi} = \frac{1}{4} \text{ Hz}\right) \quad T = 1 \quad \left(\frac{\omega_n}{2\pi} = 1 \text{ Hz}\right) \quad \text{Zero-Order Hold, 2nd-Order Butterworth LPF} \quad \frac{\omega_c}{2\pi} = \frac{1}{2} \text{ Hz}$$

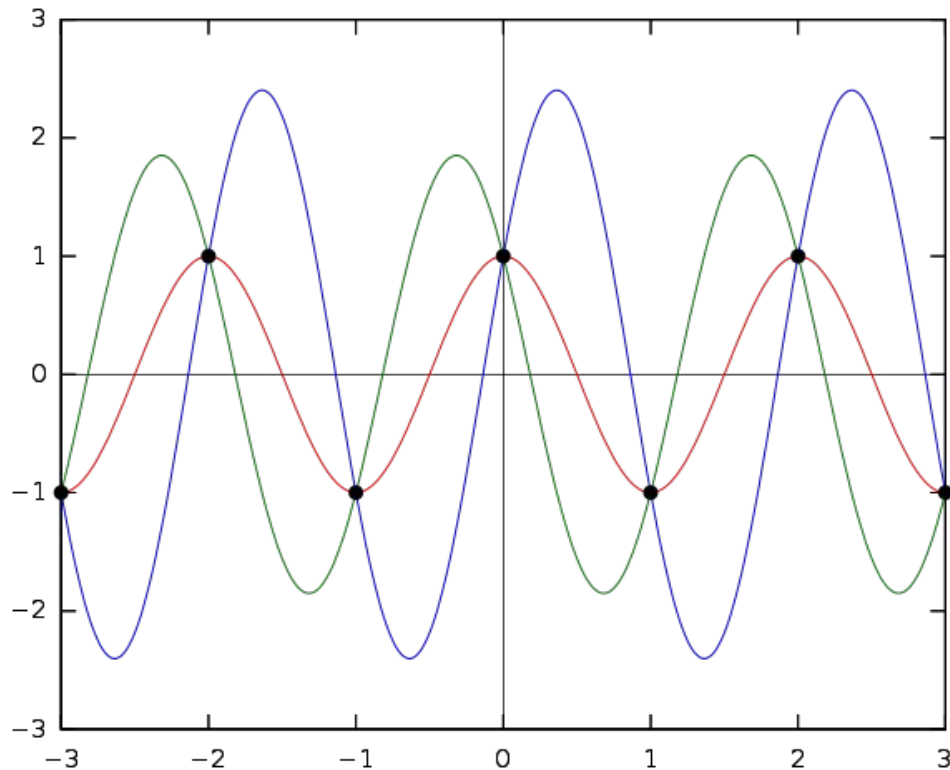


# Considerações Aliasing e Reconstrução

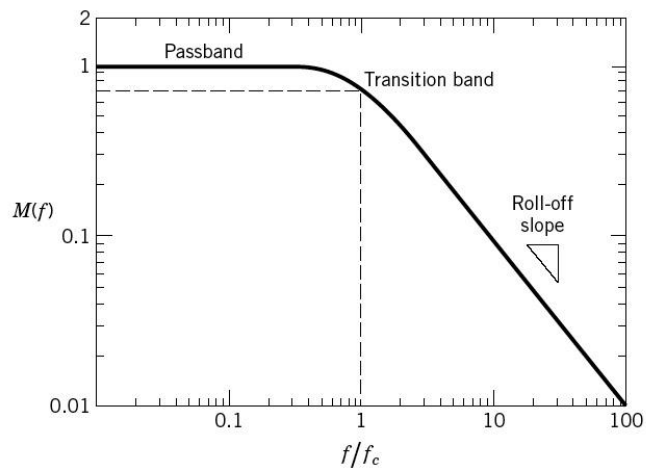
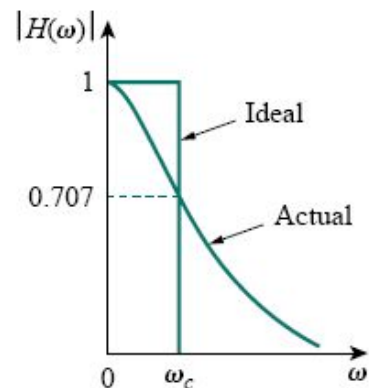
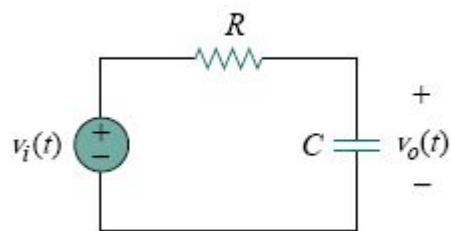
Adequações de condições ideais e reais

Condição limite do Critério de Nyquist

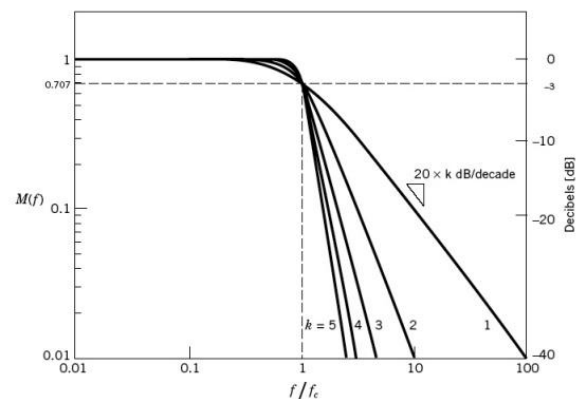
Custo-benefício de processamento dos filtros de interpolação



# Filtro anti-aliasing e a reconstrução



**Figure 6.28** Magnitude ratio for a low-pass Butterworth filter.



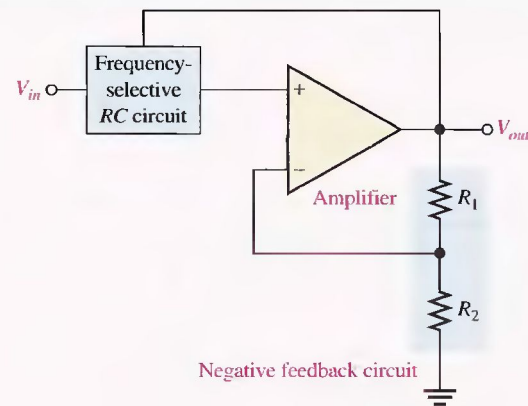
**Figure 6.31** Magnitude characteristics for Butterworth low-pass filters of various stages.



# Filtro anti-aliasing e a reconstrução

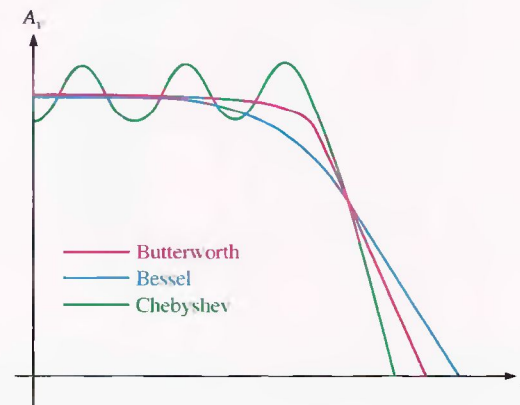
► FIGURE 15-6

General diagram of an active filter.



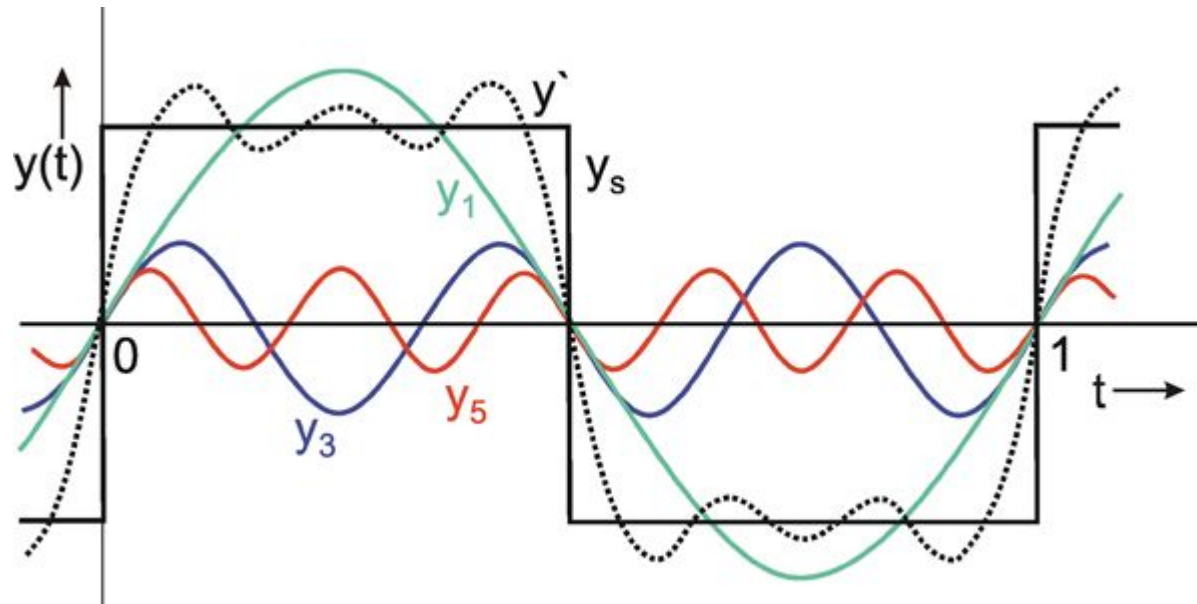
◀ FIGURE 15-5

Comparative plots of three types of filter response characteristics.



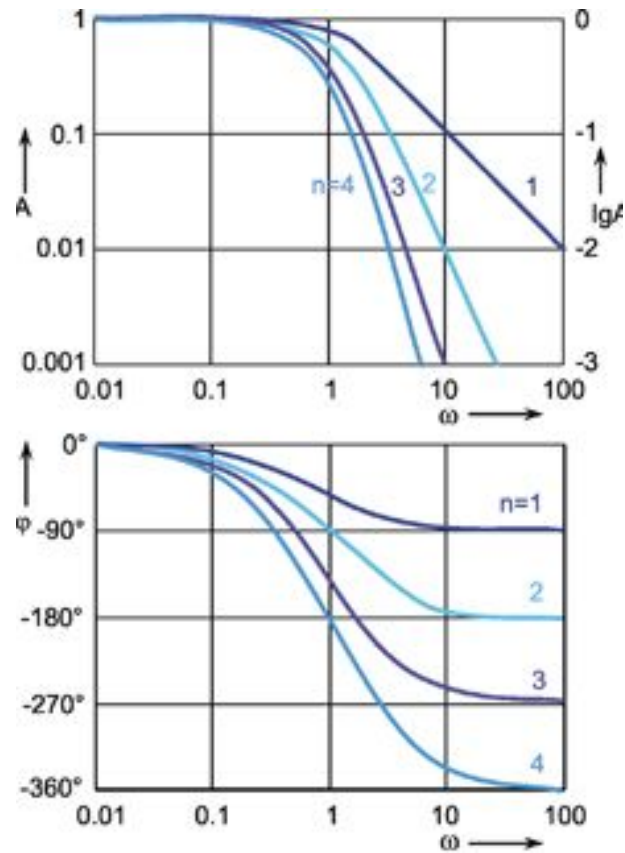
$$y(t) = a_0 + a_1 \sin(\omega t + \varphi_1) + a_2 \sin(2\omega t + \varphi_2) + \dots + a_k \sin(k\omega t + \varphi_k) + \dots$$

# Filtro anti-aliasing e a reconstrução

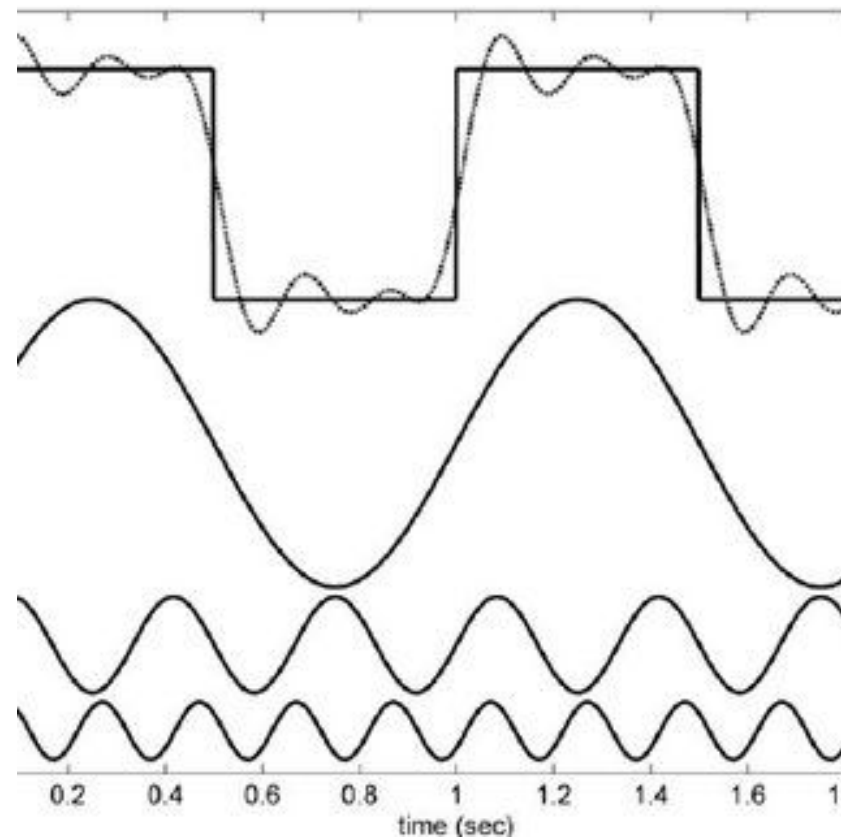


$$\begin{aligned}x_{\text{square}}(t) &= \frac{4}{\pi} \sum_{k=1}^{\infty} \frac{\sin(2\pi(2k-1)ft)}{(2k-1)} \\ &= \frac{4}{\pi} \left( \sin(2\pi ft) + \frac{1}{3} \sin(6\pi ft) + \frac{1}{5} \sin(10\pi ft) + \dots \right)\end{aligned}$$

# Filtro anti-aliasing e a reconstrução



# Filtro anti-aliasing e a reconstrução



# Bibliografia

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Signals and systems, by A.V. Oppenheim, A.S. Willsky, and I.T. Young. Prentice Hall, Englewood Cliffs, New Jersey, 1983

[https://en.wikipedia.org/wiki/Nyquist%E2%80%93Shannon\\_sampling\\_theorem](https://en.wikipedia.org/wiki/Nyquist%E2%80%93Shannon_sampling_theorem)