

# Signal Sampling summary

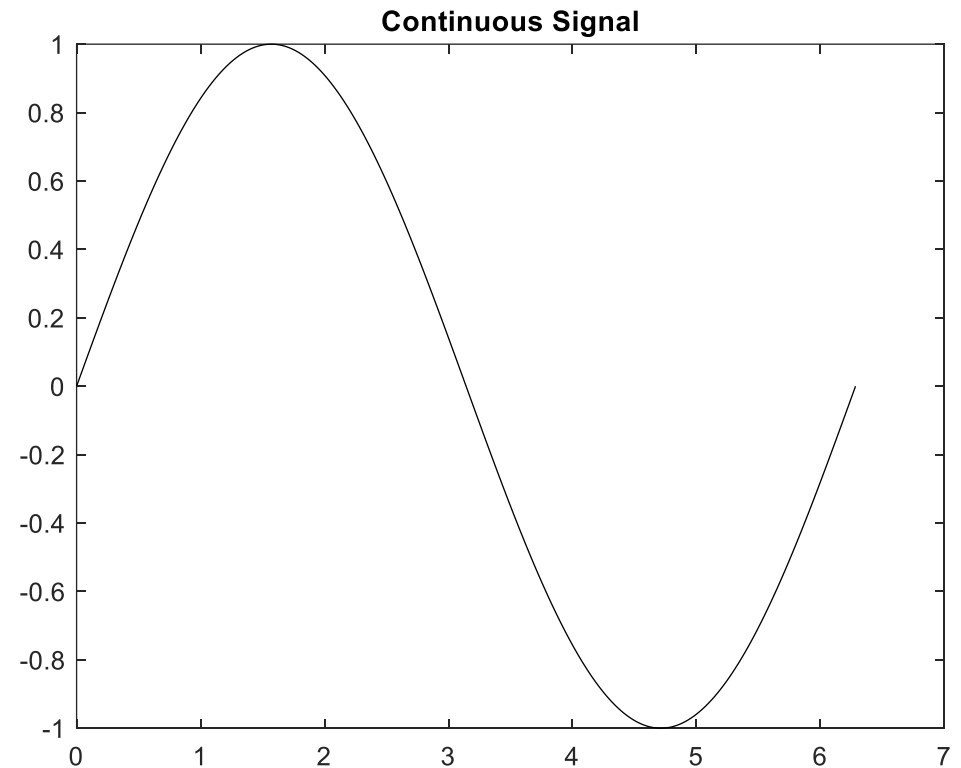
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**Version 2.1.5**

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- Discrete/Continuous Signals
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# Continuous Signals

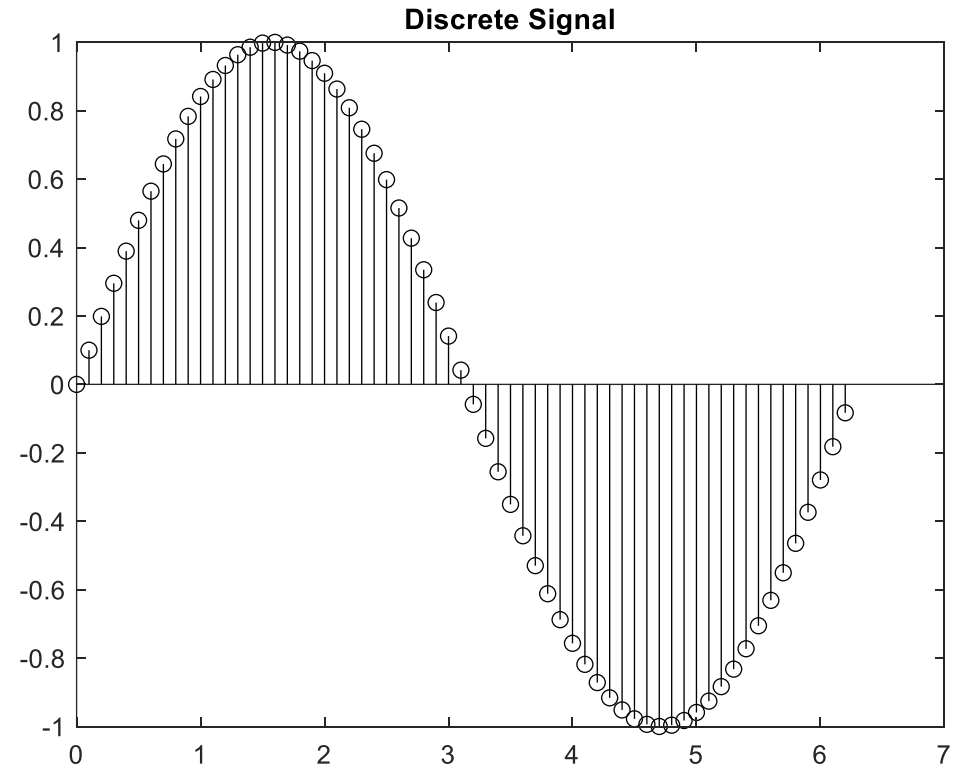
Let the values of a signal  $x(t)$  be known for a continuous period of time, then we have a **continuous-time signal**  $x(t): \mathbb{R} \rightarrow \mathbb{R}$ .



# Discrete Signals

A **discrete-time (discrete)** signal is a time series (function)  $x(n): \mathbb{Z} \rightarrow \mathbb{R}$ , whose values are known only for some certain, discrete-time moments  $nT$ :

$$x(n) = x(nT), n \in \mathbb{Z}.$$

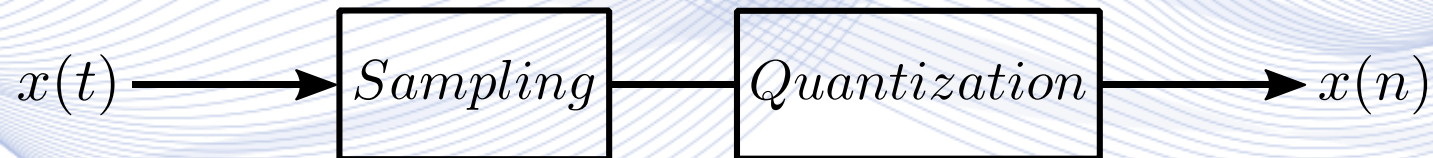


# Signal Digitization

**Signal digitization** has two steps:

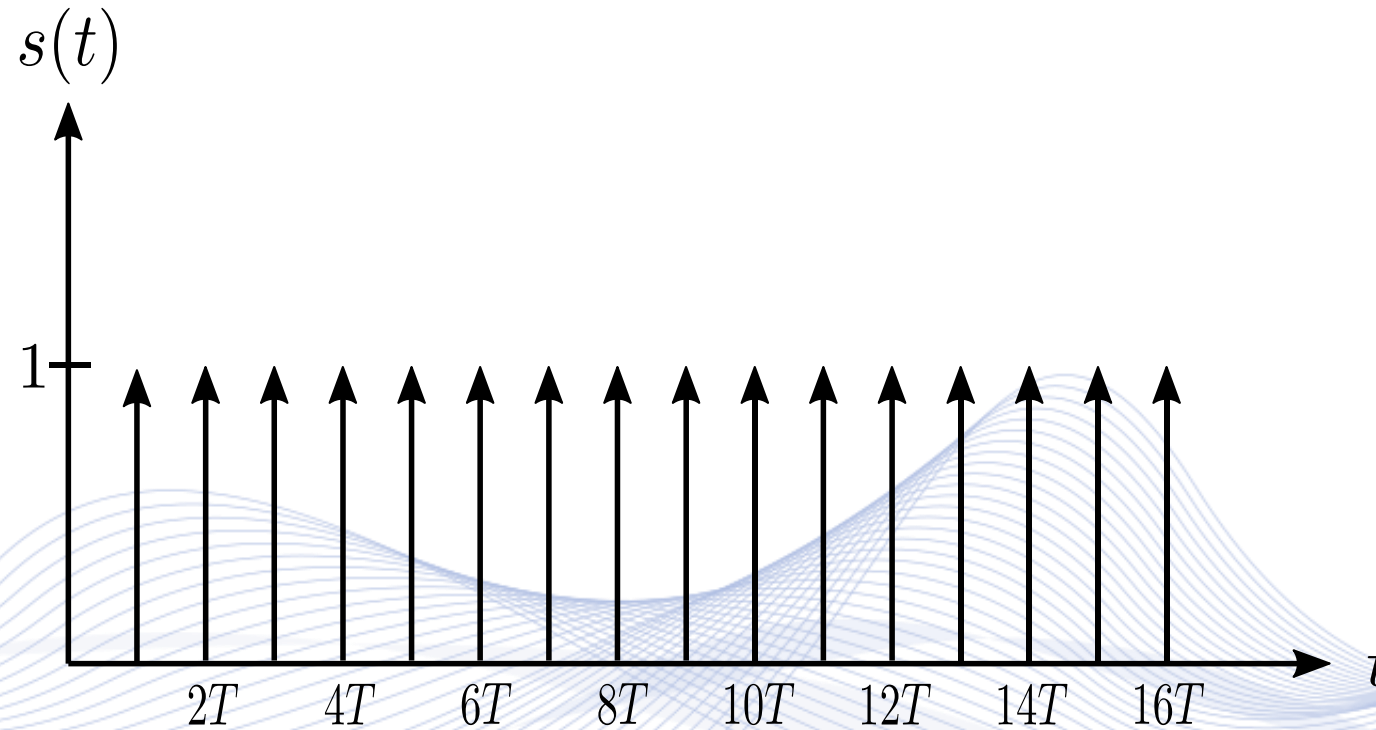
- **Signal sampling** at sampling frequency  $F$ .
- **Signal quantization** at  $b$  bit/sample.

Signal digitization is performed by A/D converters.





# Sampling Function



Sampling function is a series of delta functions.

# Signal Sampling

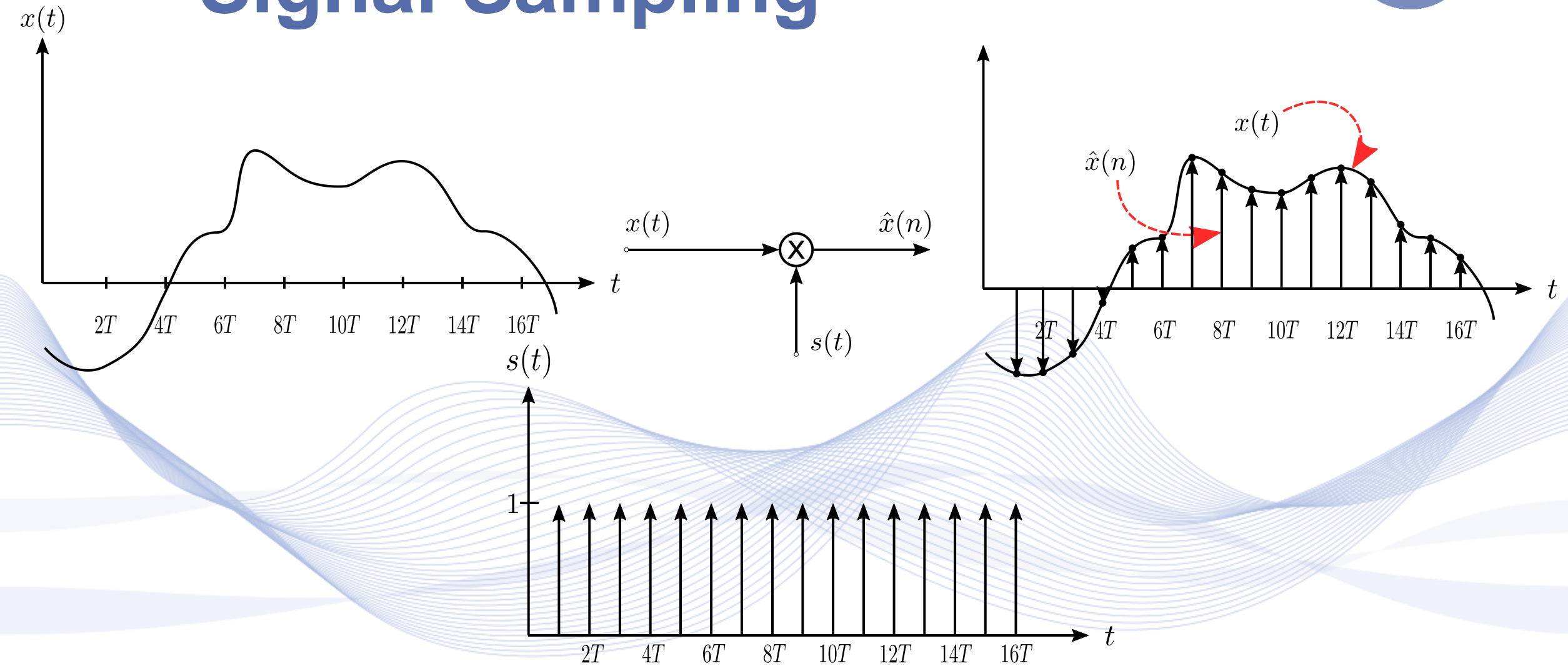
The output of a 1D **signal sampling** system is the discrete function  $\hat{x}(t)$ :

$$\hat{x}(t) = x(t)s(t) = \sum_{n=-\infty}^{\infty} x(t)\delta(t - nT) = \sum_{n=-\infty}^{\infty} x(nT)\delta(t - nT).$$

Equivalently, a discrete-time sampled signal is a function  $\mathbb{Z} \rightarrow \mathbb{R}$  :

$$\hat{x}(n) = x(nT), \quad n \in \mathbb{Z}.$$

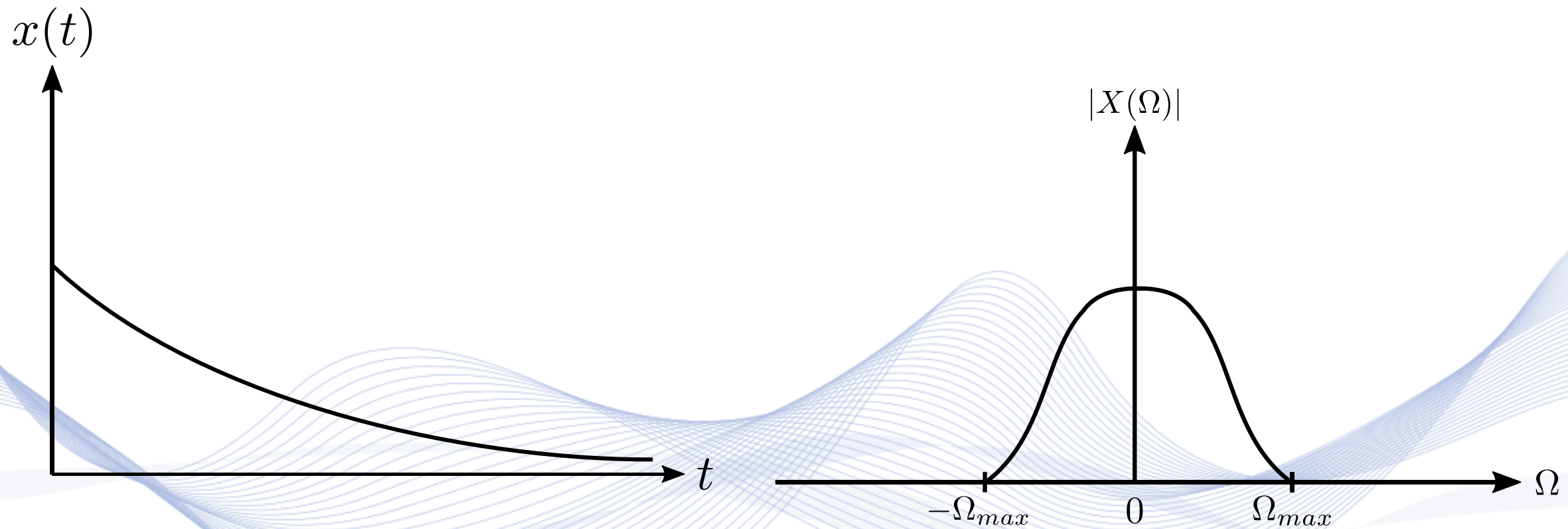
# Signal Sampling



Signal sampling.

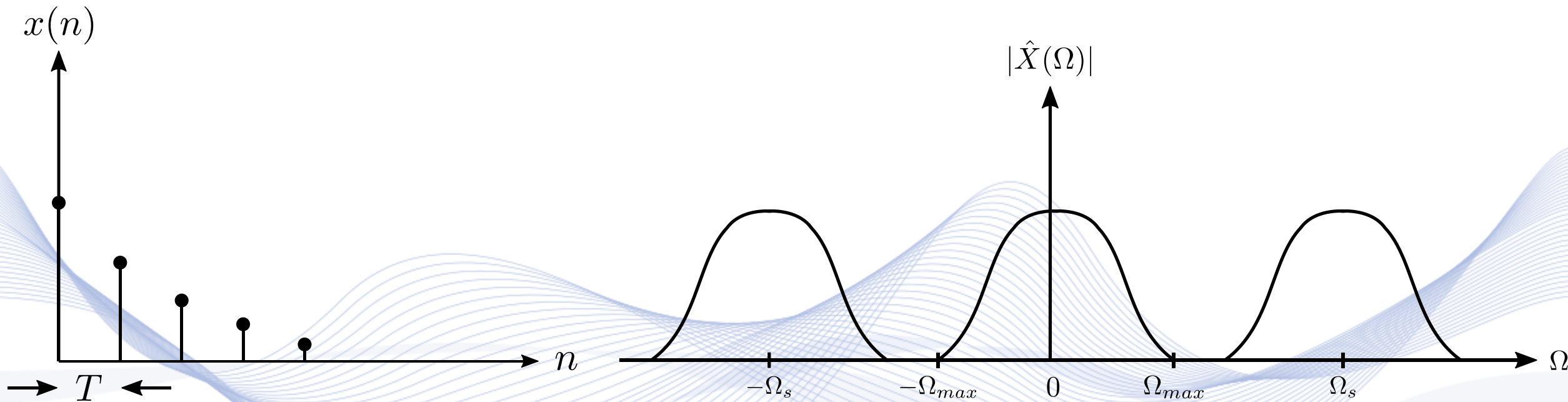


# Shannon Theorem



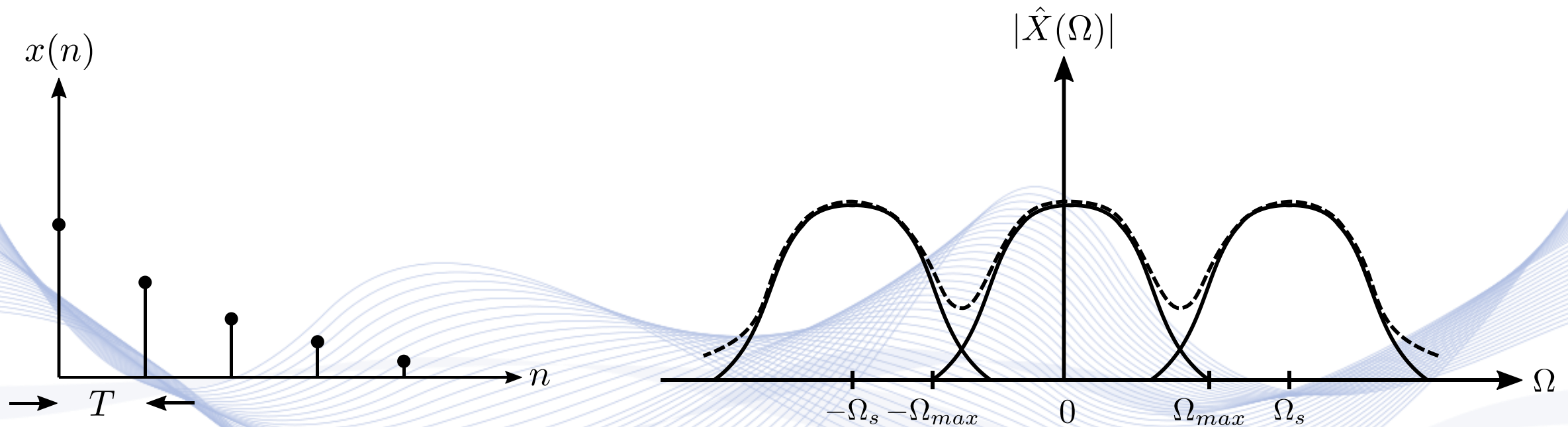
Spectrum  $X(\Omega)$  of signal  $x(t)$ .

# Sampling without Aliasing



Sampled signal spectrum for  $\Omega_s \geq 2\Omega_{max}$ .

# Sampling with Aliasing



Sampled signal spectrum for  $\Omega_s < 2\Omega_{max}$ .

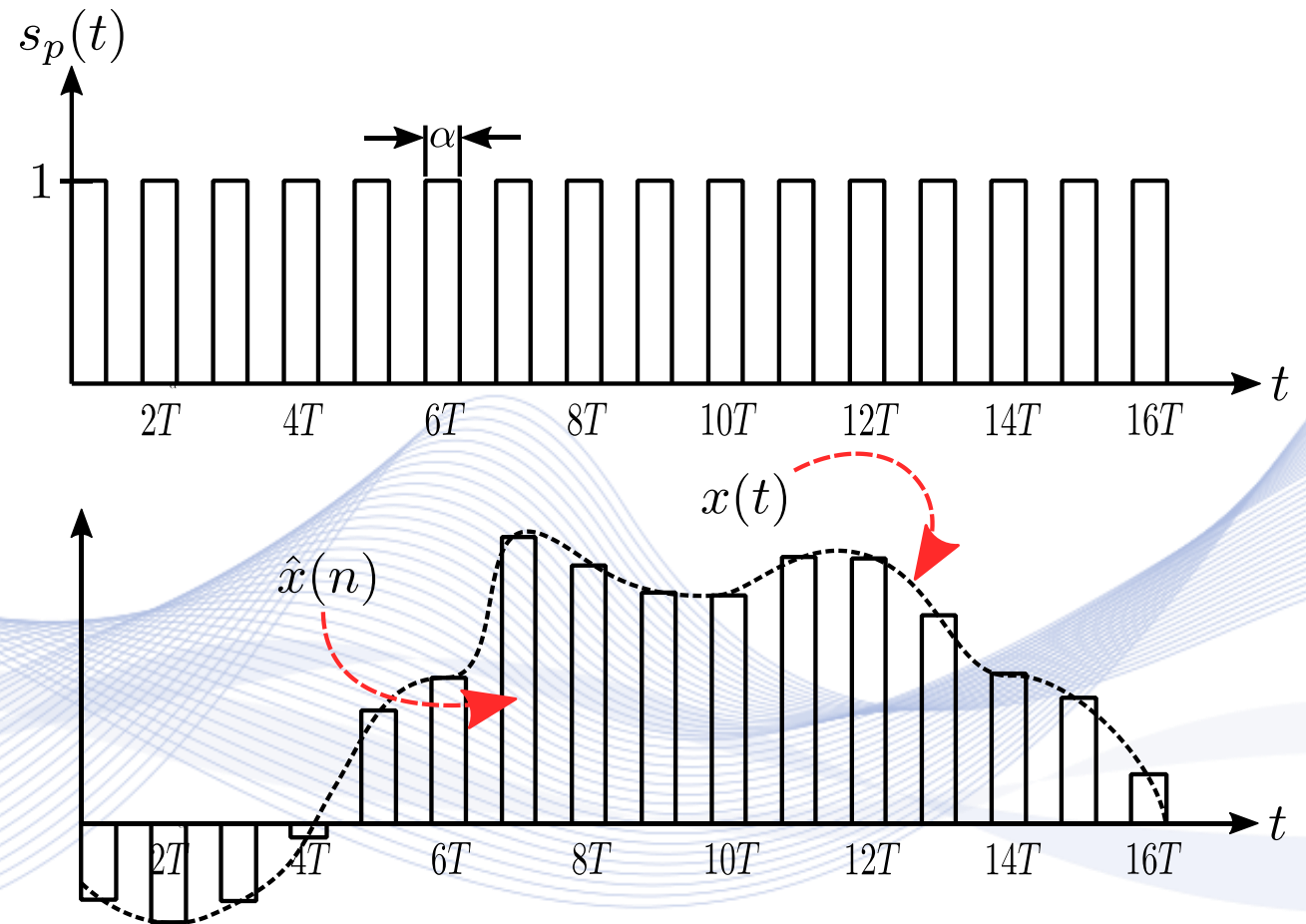
# Shannon Theorem

- The function  $x(t)$ , of which the spectrum  $X(\Omega)$  has the highest frequency  $\Omega_{max}$ , is described absolutely with the values of  $x(nT)$ ,  $n = 0, \pm 1, \pm 2, \dots$ ,  $T = \frac{2\pi}{\Omega_s}$ , if and only if  $\Omega_s$  is greater than  $2\Omega_{max}$ .
- This special frequency ( $2\Omega_{max}$ ), is called ***Nyquist frequency***.



# Applied Signal Sampling

It is practically impossible to implement ideal delta functions. Instead, sampling can be done using impulses of width  $\alpha$ .





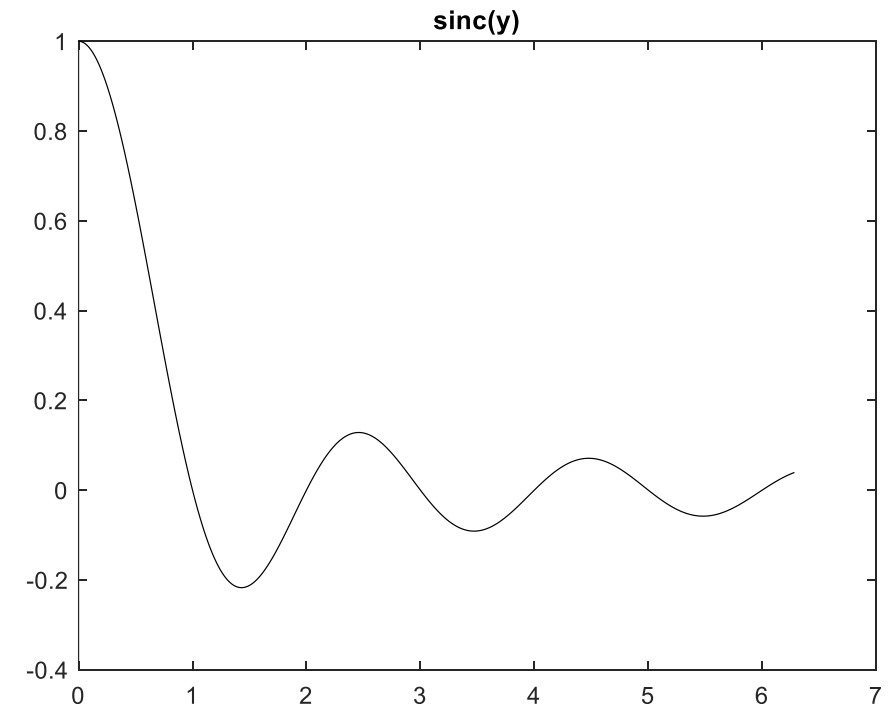
# Applied Signal Sampling

- In that case, the spectrum of  $\hat{X}(\Omega)$  is also periodically repeated, where coefficients  $C_n$  are given by:

$$C_n = \frac{1}{T} \int_{-\frac{\alpha}{2}}^{\frac{\alpha}{2}} e^{-in\Omega_s t} dt = \frac{\alpha}{T} \frac{\sin\left(\frac{n\Omega_s \alpha}{2}\right)}{\frac{n\Omega_s \alpha}{2}}.$$

- It is a sinc function:

$$\text{sinc}(y) = \frac{\sin(y)}{y} \text{ for: } y = \frac{n\Omega_s \alpha}{2}.$$

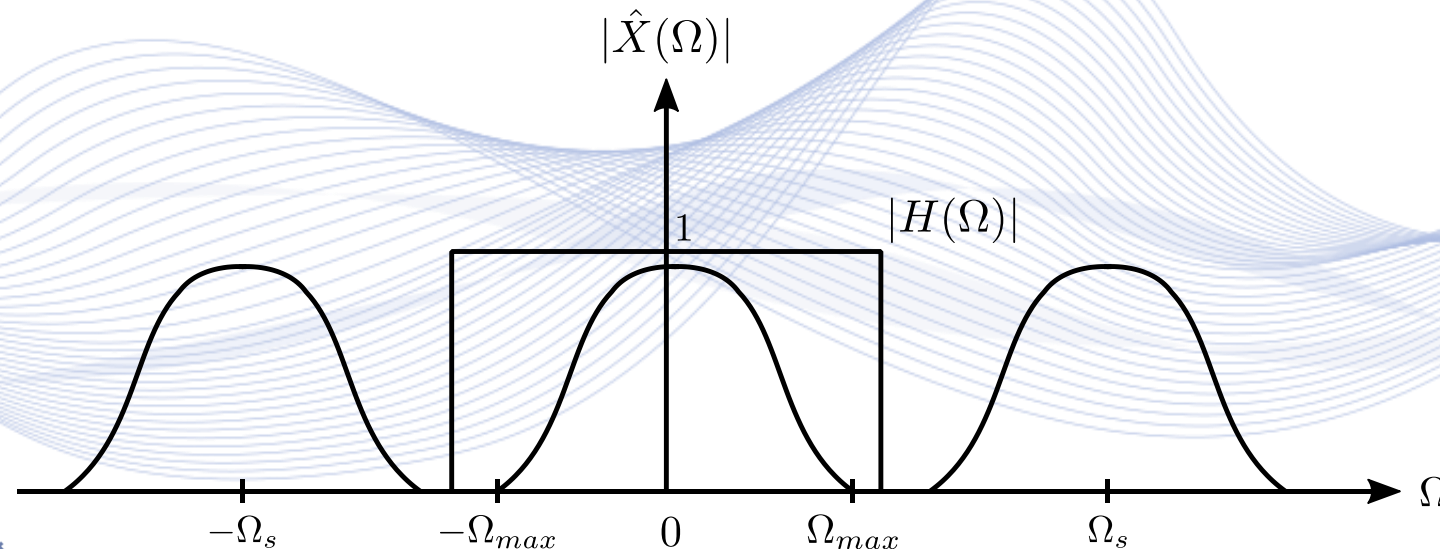


# Signal Reconstruction

If the sampling interval  $T$  is small enough, so that the spectrum  $X(\Omega)$  satisfies the relation:

$$X(\Omega) = 0, \quad |\Omega| \geq \frac{\pi}{T},$$

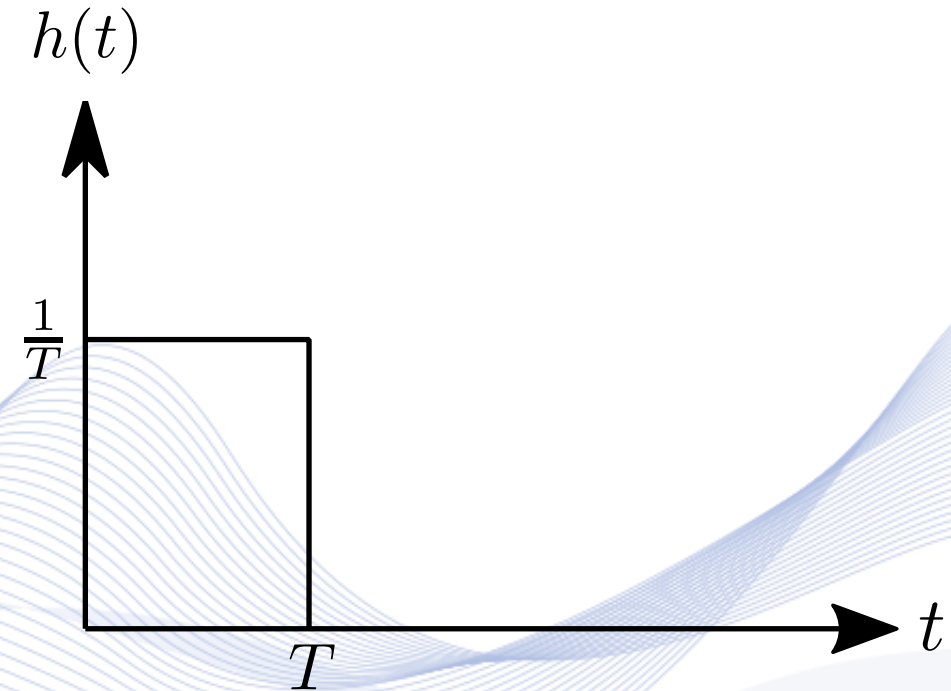
a square low-pass filter  $H(\Omega)$  can be used to recover  $X(\Omega)$  from the discrete 2D image spectrum  $\hat{X}(\Omega)$  by retaining only its basic period.



# Signal Reconstruction

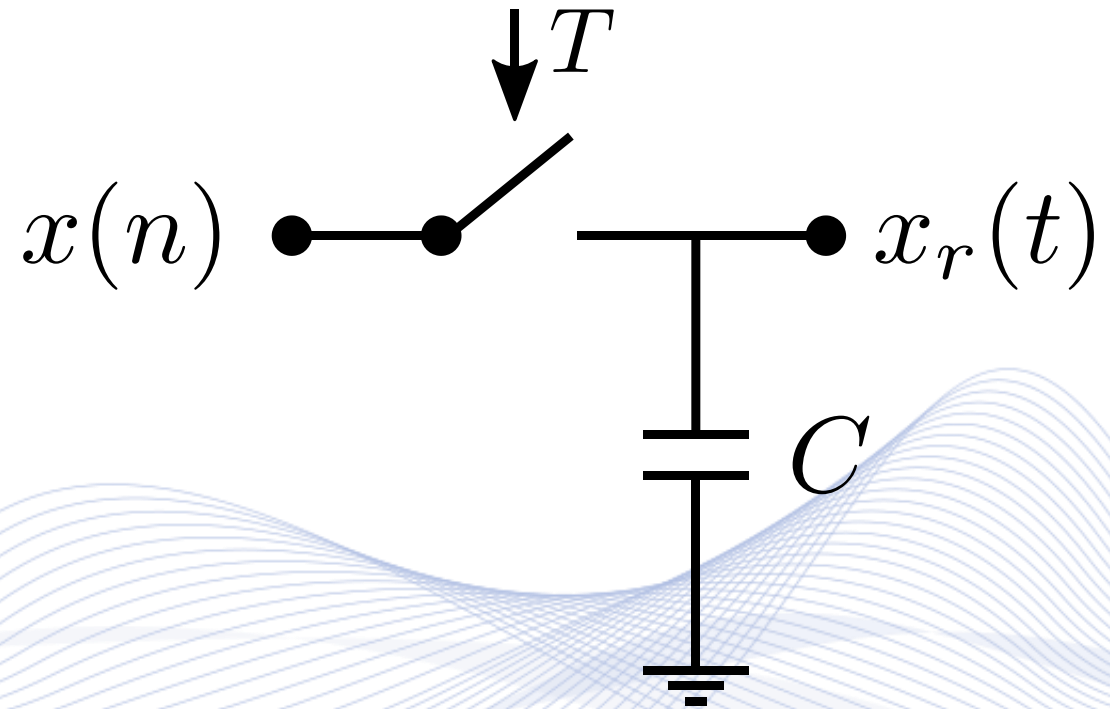
- The simplest **reconstruction filter** is the **sample-and-hold filter**, its impulse response is the following:

$$h(t) = \begin{cases} \frac{1}{T}, & 0 \leq t \leq T \\ 0, & t < 0, t > T. \end{cases}$$



- Its use corresponds to 0-order polynomial interpolation.

# Signal Reconstruction

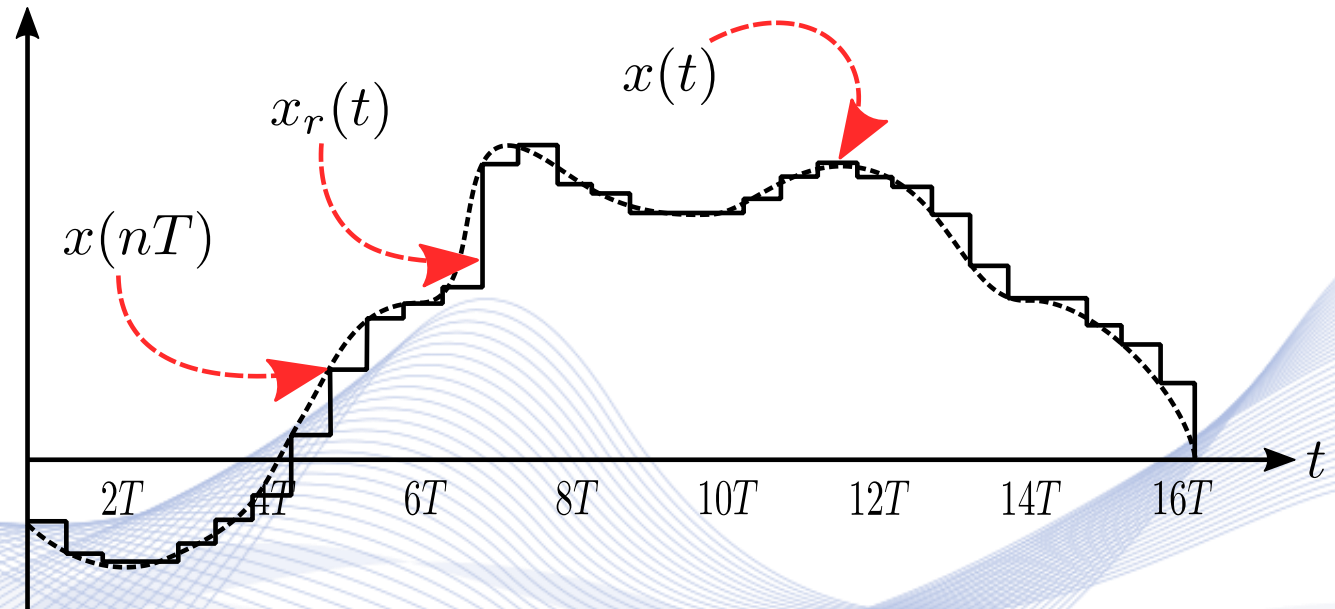


Elementary sample-and-hold circuit.



# Signal Reconstruction

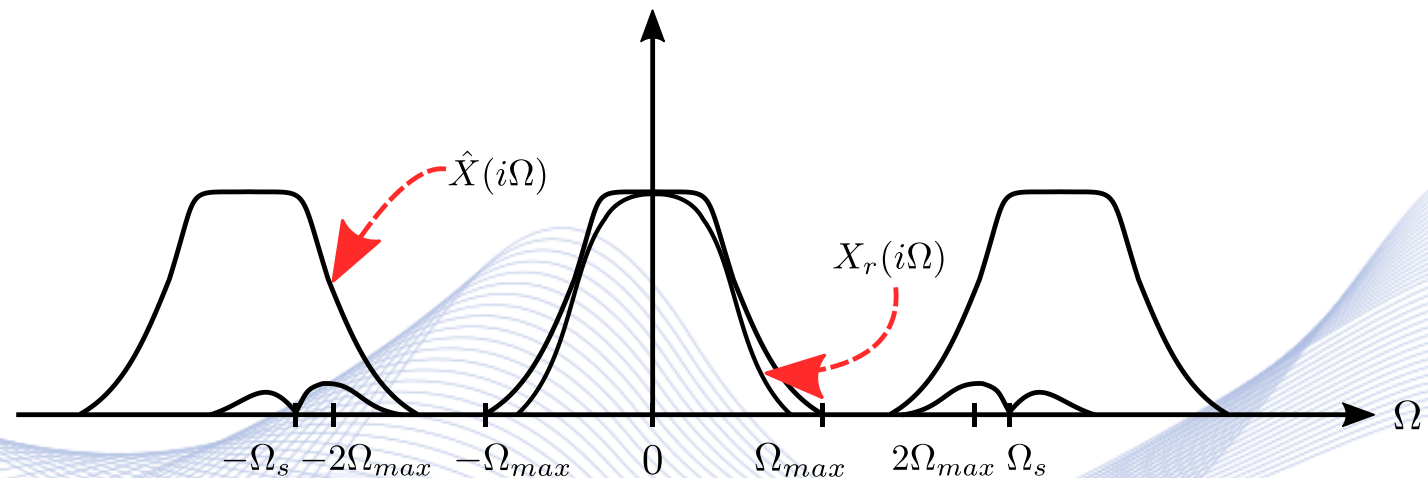
- The reconstructed signal  $x_r(t)$  has high frequencies due to discontinuities.
- It converges to the original signal  $x(t)$ , as sampling period  $T$  tends to zero.





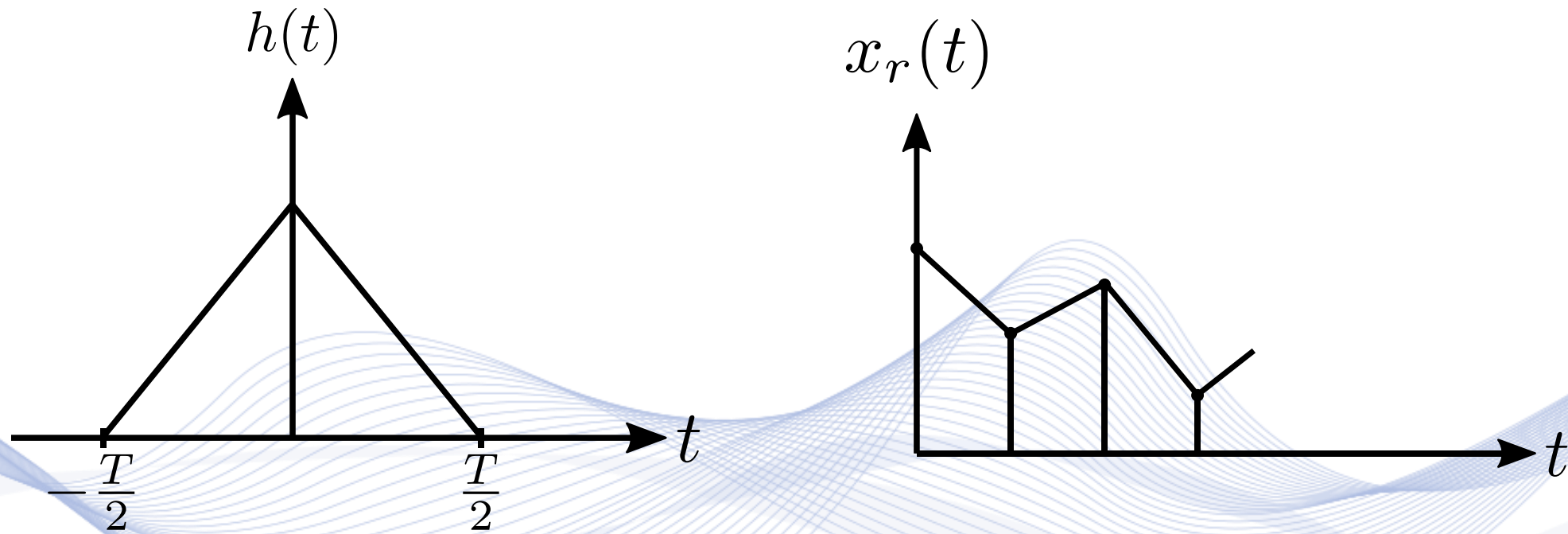
# Signal Reconstruction

- The spectrum  $X_r(i\Omega)$  of the reconstructed signal contains residual high frequencies.
- Therefore, signal  $x_r(t)$  is usually filtered with a low-pass filter in order, to cut off the high frequency residues of  $X_r(i\Omega)$ .



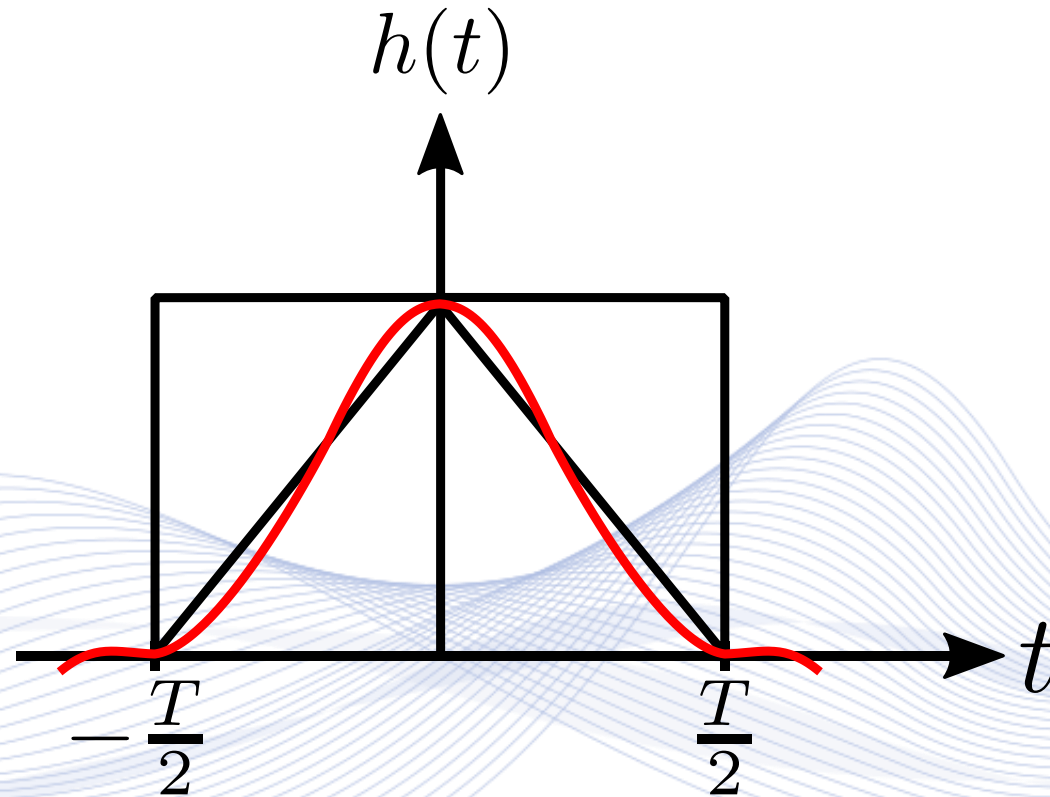
Spectrum  $X_r(i\Omega)$  of the reconstructed signal.

# Signal Reconstruction



Linear interpolation kernel and linear interpolation.

# Signal Reconstruction

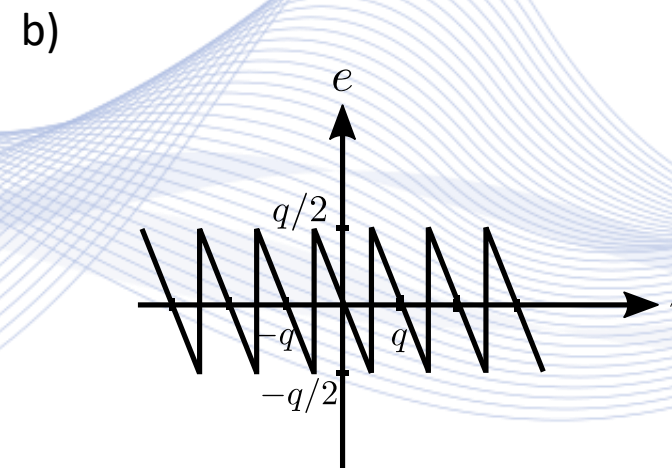
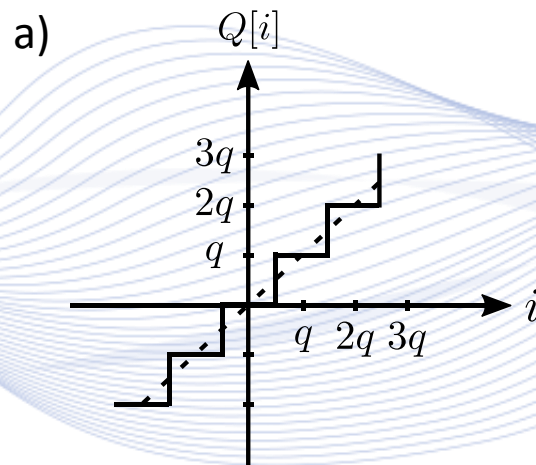


Spline interpolation kernel and interpolation.

# Signal Quantization

**Quantization** is performed by an *A/D* converter.

- When  $b$  bits are allocated by signal sample, **quantization step**  $q$  is given by  $q = \frac{1}{2^b}$ ;
- Quantized signal levels:  $kq, k = 0, 1, 2, \dots, 2^b - 1$ .



a) Input-output curve of quantizer; b) Quantization error.



# Bibliography



[OPP2013] A. Oppenheim, A. Willsky, Signals and Systems, Pearson New International, 2013.

[MIT1997] S. K. Mitra, Digital Signal Processing, McGraw-Hill, 1997.

[OPP1999] A.V. Oppenheim, Discrete-time signal processing, Pearson Education India, 1999.

[HAY2007] S. Haykin, B. Van Veen, Signals and systems, John Wiley, 2007.

[LAT2005] B. P. Lathi, Linear Systems and Signals, Oxford University Press, 2005.

[HWE2013] H. Hwei. Schaum's Outline of Signals and Systems, McGraw-Hill, 2013.

[MCC2003] J. McClellan, R. W. Schafer, and M. A. Yoder, Signal Processing, Pearson Education Prentice Hall, 2003.



# Bibliography



[PHI2008] C. L. Phillips, J. M. Parr, and E. A. Riskin, Signals, Systems, and Transforms, Pearson Education, 2008.

[PRO2007] J.G. Proakis, D.G. Manolakis, Digital signal processing. PHI Publication, 2007.

[DUT2009] T. Dutoit and F. Marques, Applied Signal Processing. A MATLAB-Based Proof of Concept. New York, N.Y.: Springer, 2009

# Bibliography

- [PIT2000] I. Pitas, “Digital Image Processing Algorithms and Applications”, J. Wiley, 2000.
- [PIT2021] I. Pitas, “Computer vision”, Createspace/Amazon, in press.
- [PIT2017] I. Pitas, “Digital video processing and analysis” , China Machine Press, 2017 (in Chinese).
- [PIT2013] I. Pitas, “Digital Video and Television” , Createspace/Amazon, 2013.
- [NIK2000] N. Nikolaidis and I. Pitas, “3D Image Processing Algorithms”, J. Wiley, 2000.

# Q & A

**Thank you very much for your attention!**

**More material in  
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