

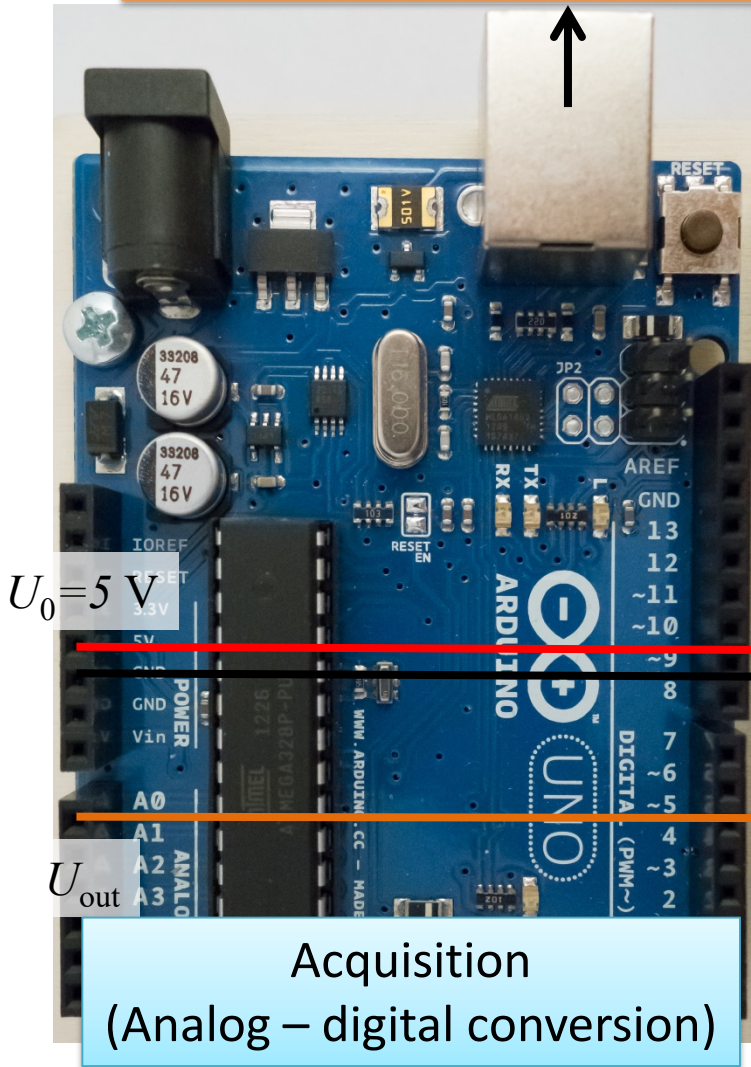
# Measurement systems

Lecturer: Andras Kis

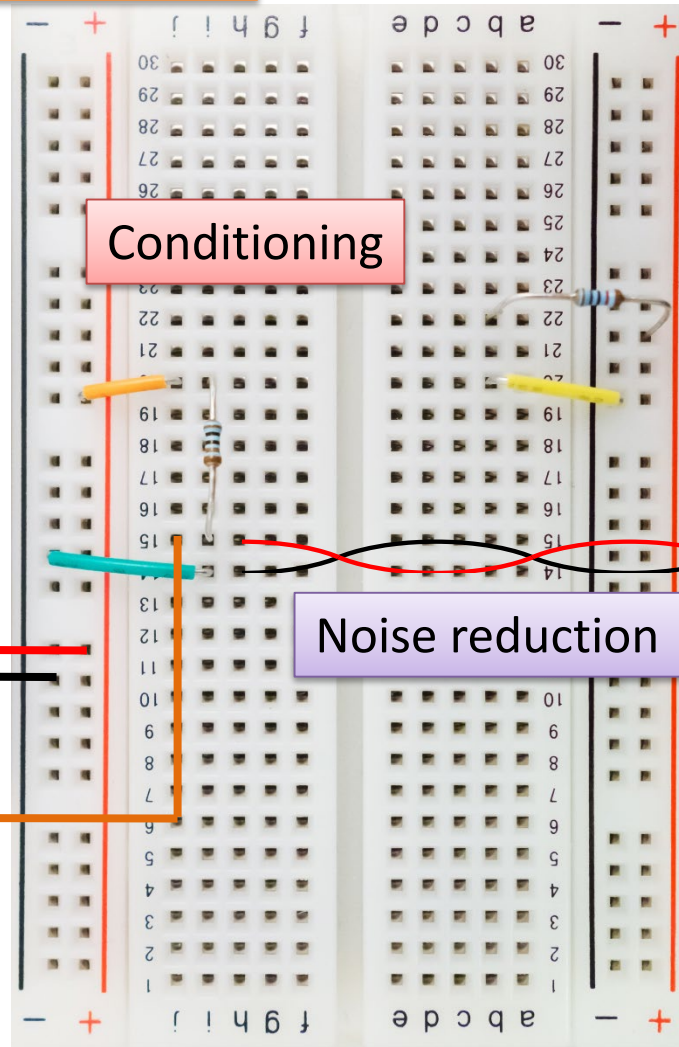
# Chapter 4: Data Acquisition

# Measurement chain

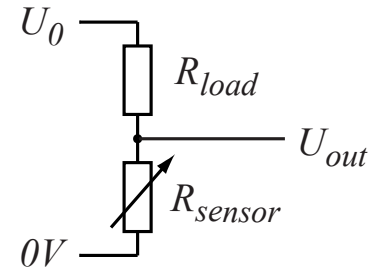
Data analysis (recording, averaging, etc.)



Arduino UNO board



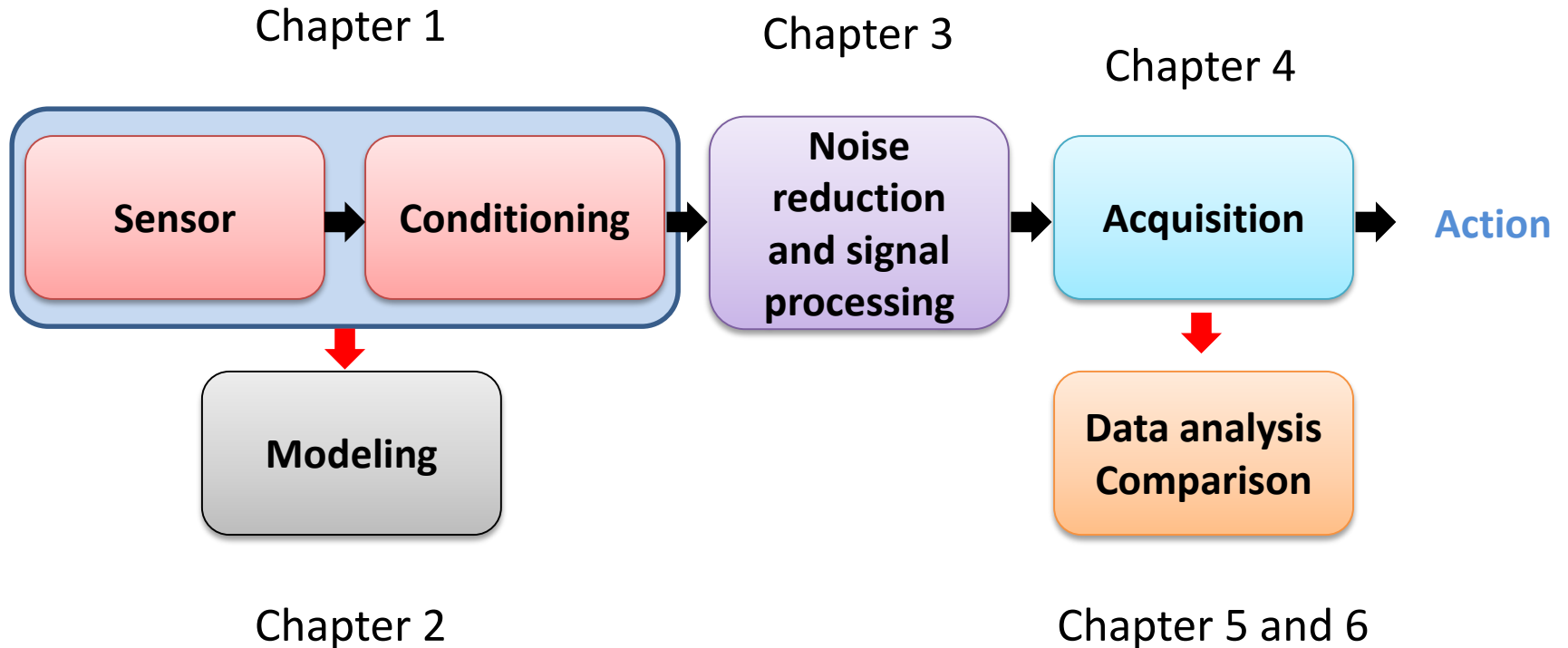
Conditioning circuit



Sensor

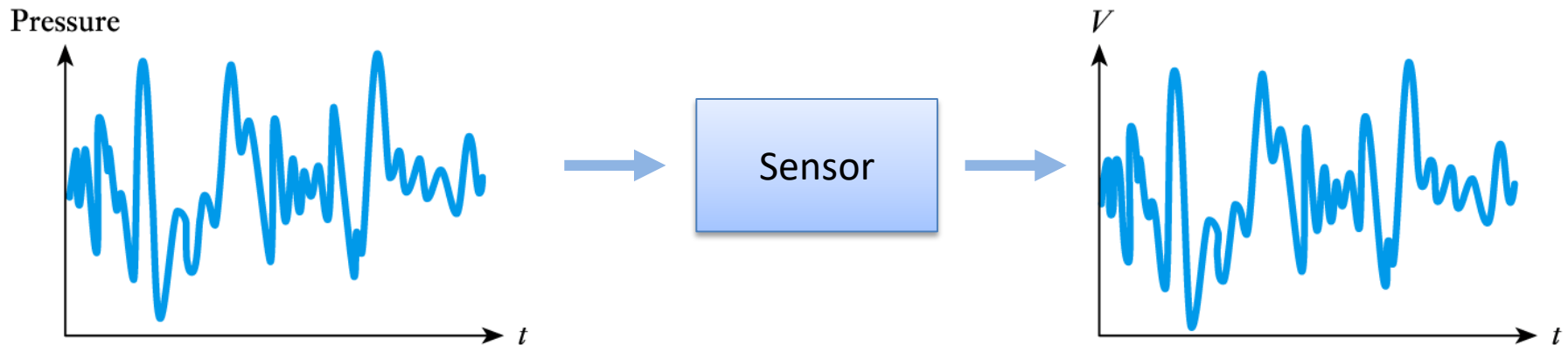
Modeling

# Measurement chain



# Analog signal

- Continuous both in amplitude and time and can assume an infinite number of different values – infinite resolution



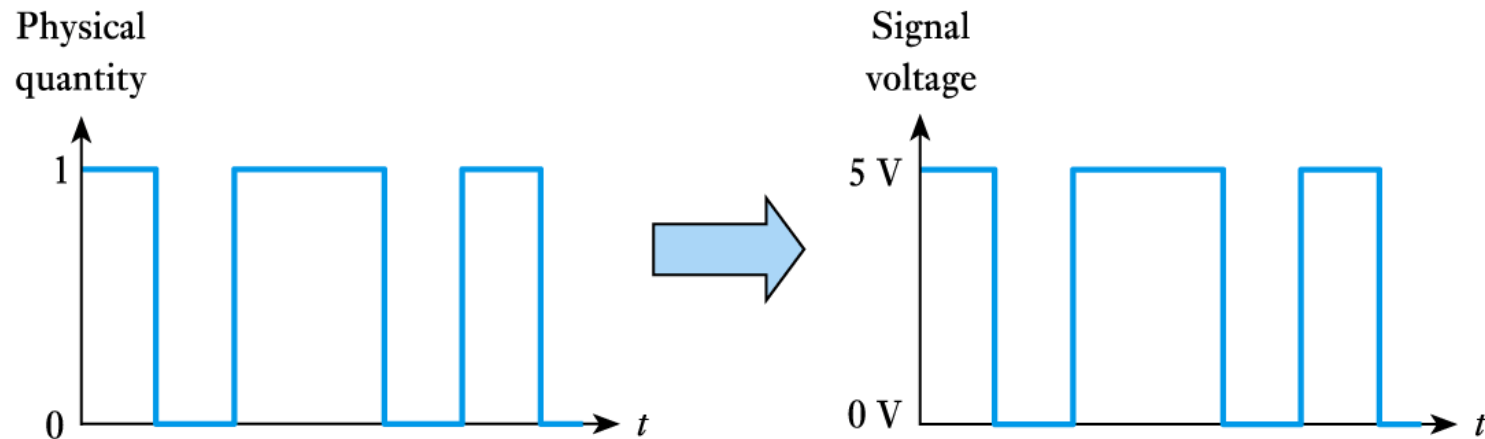
# Analog music recording

- Late 1980's, early 90s



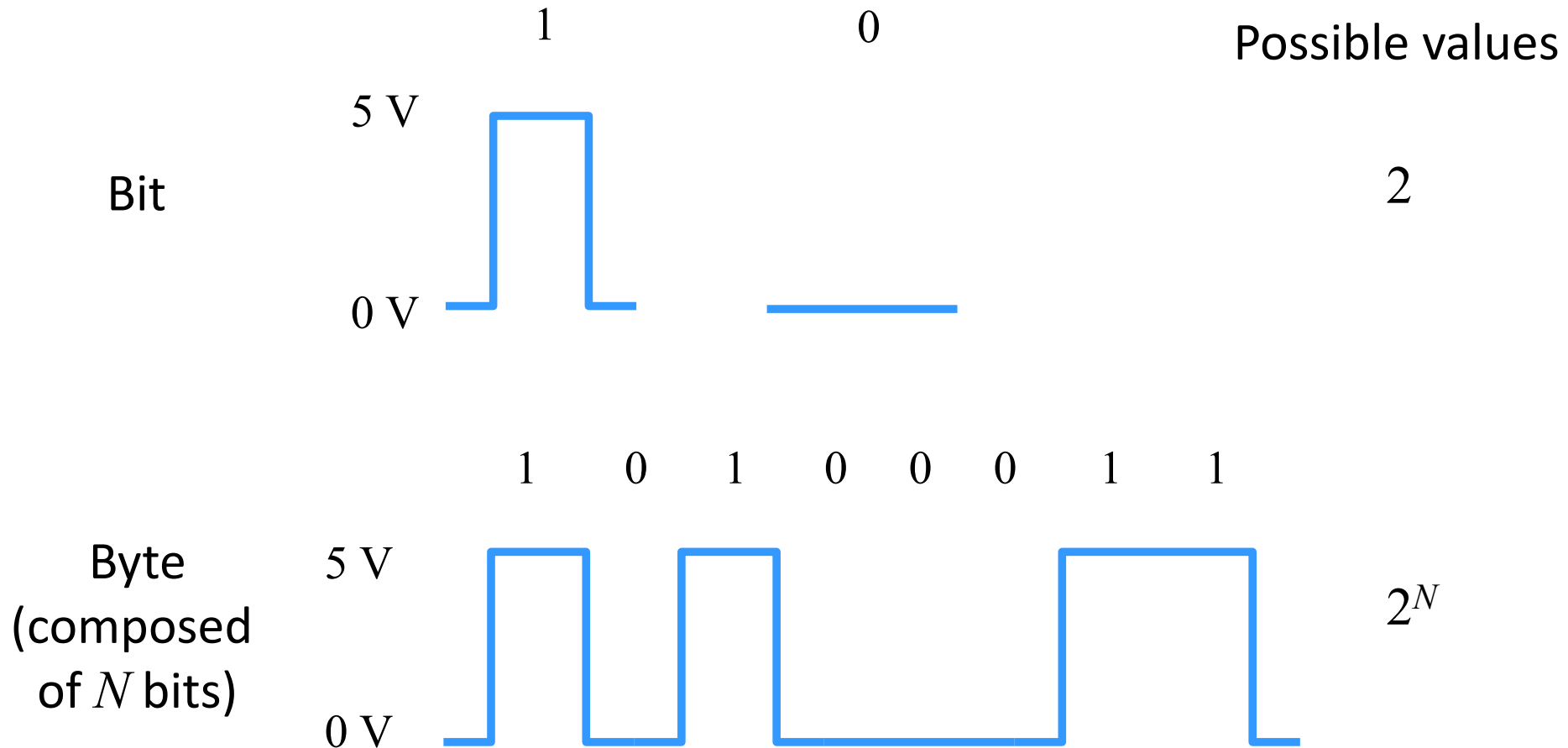
# Digital signal

- Signal is represented as two values (“low” and “high”), with distinct voltage levels



# Bit and byte

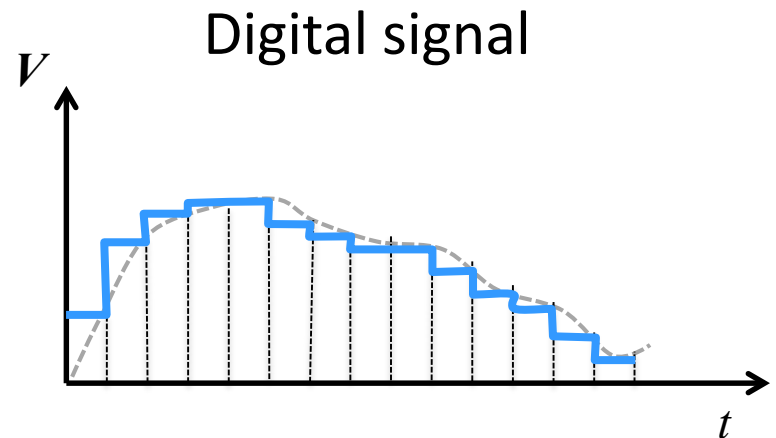
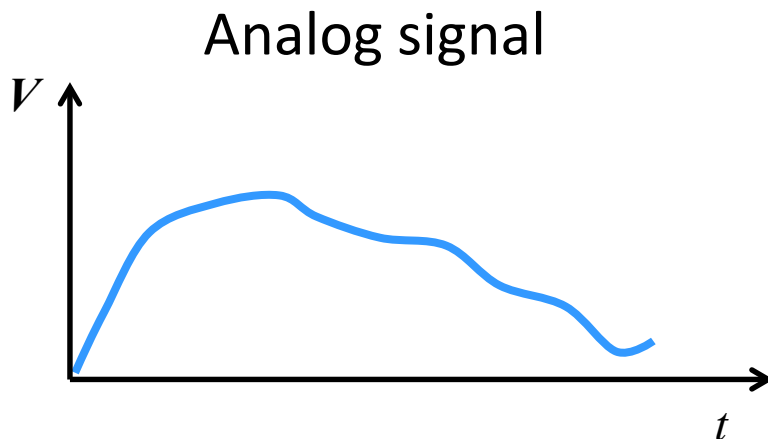
- A digital signal can represent either a state of a quantity (**bit**) or be an element of a unit of information (**byte**)





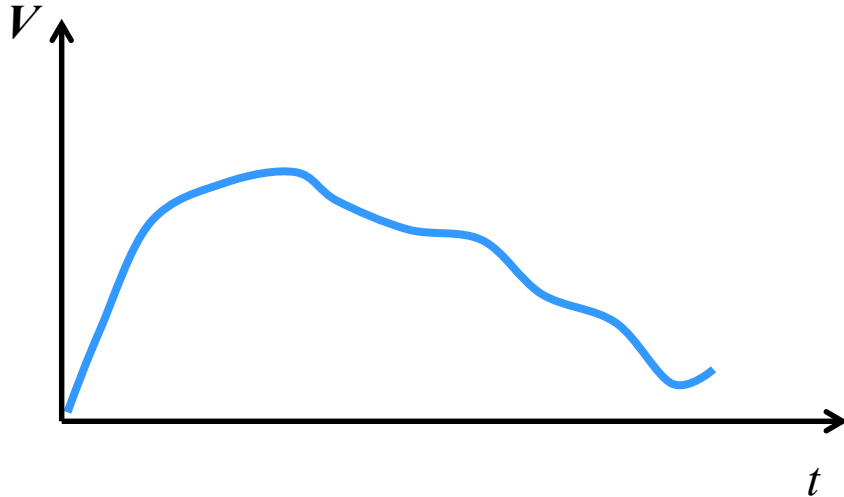
# Analog – digital conversion

- The digital signal is:
  - Less perturbed by noise
  - Easier to process, transmit or store
- Signal is often converted between analog – digital forms
  - Music playback, generation of analog voltages using computer-controlled instruments etc.
- AD and DA converters

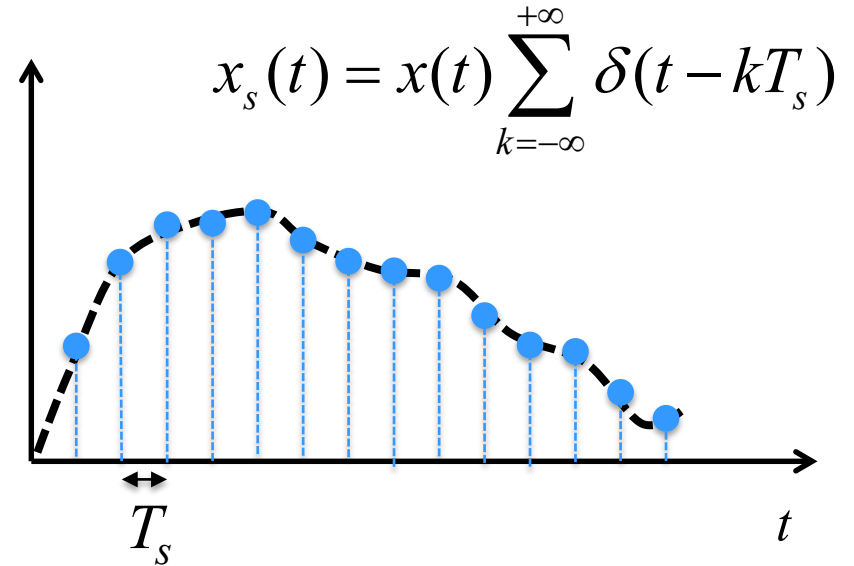


# Sampling

Analog signal

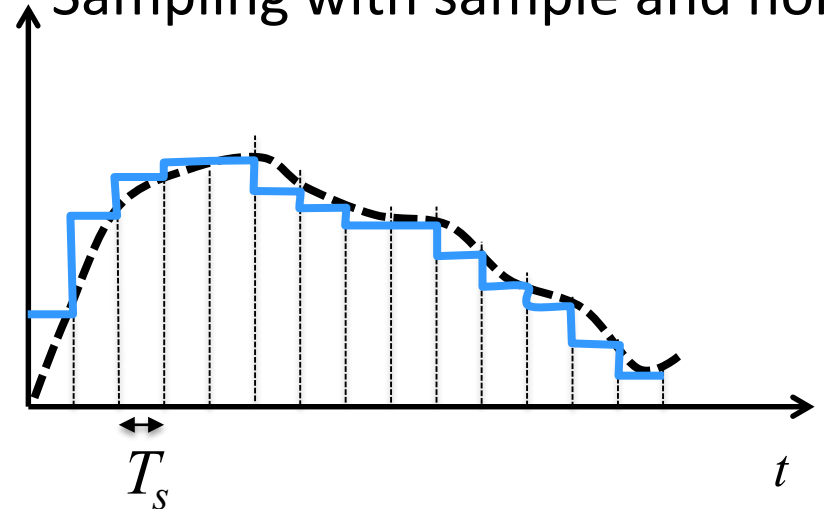


Ideal sampling



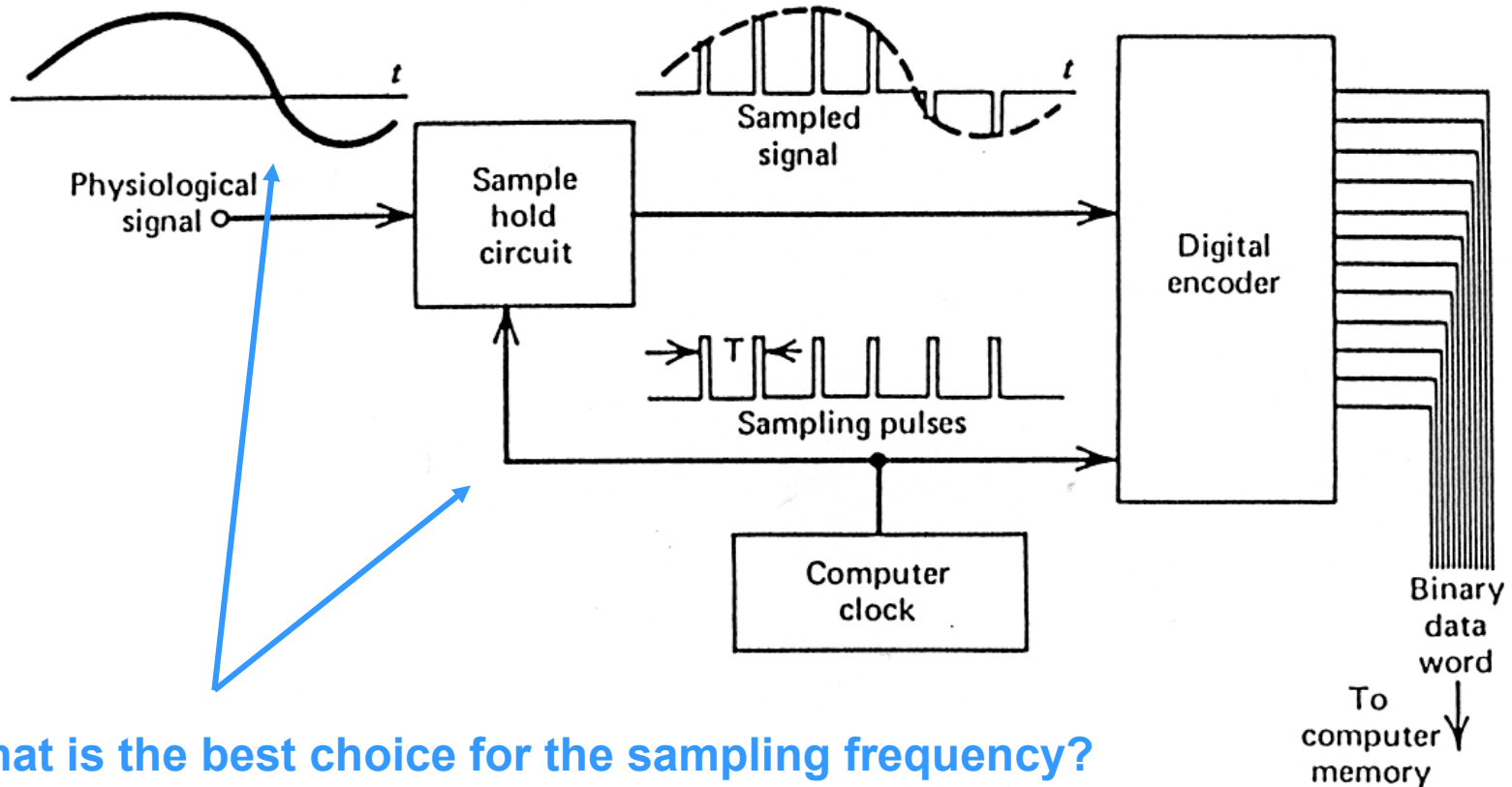
$$f_s = \frac{1}{T_s} \text{ sampling frequency}$$

Sampling with sample and hold



# Sampling

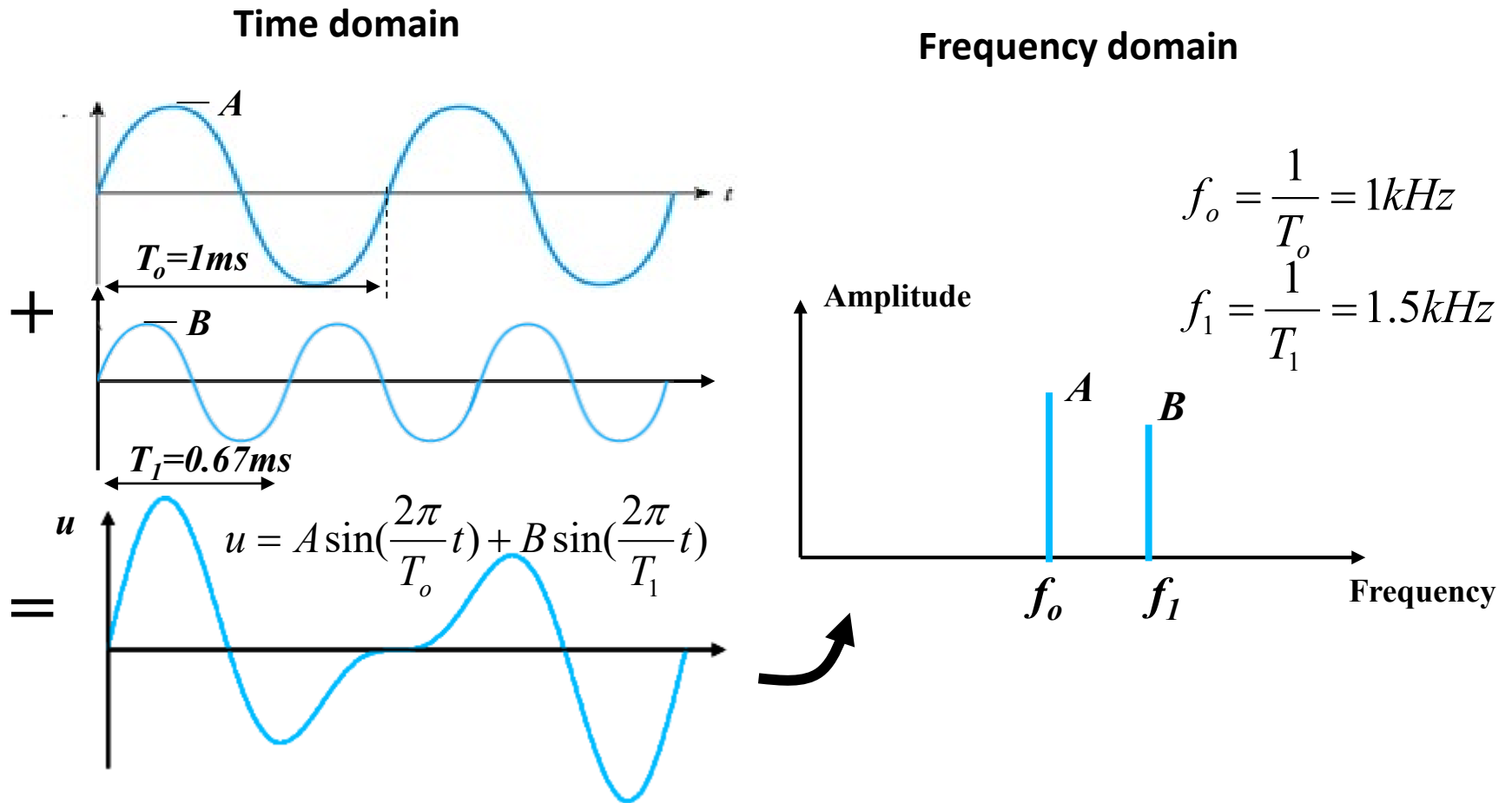
- Before the conversion, the analog signal is sampled
- The signal to be sampled is multiplied with a pulse train signal



What is the best choice for the sampling frequency?

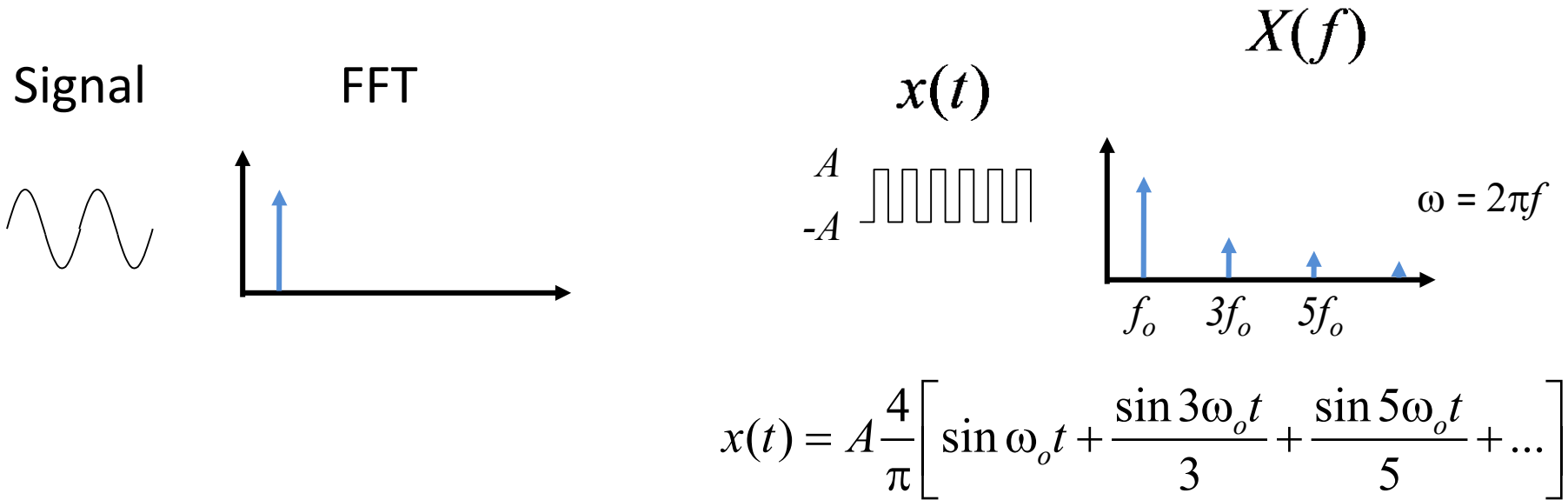
# Reminder: frequency spectrum

- Sinusoidal signals

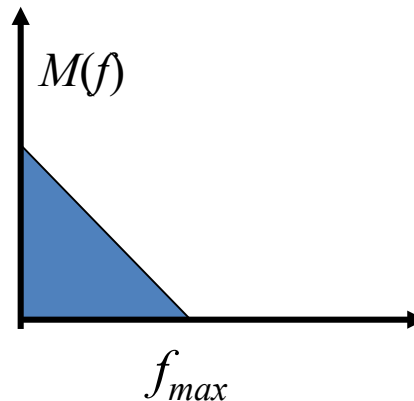


# Representation

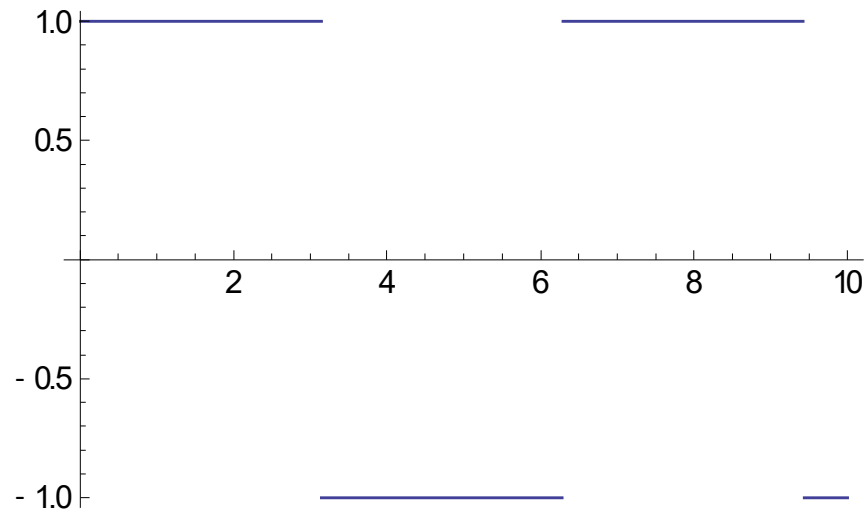
- Periodic signal



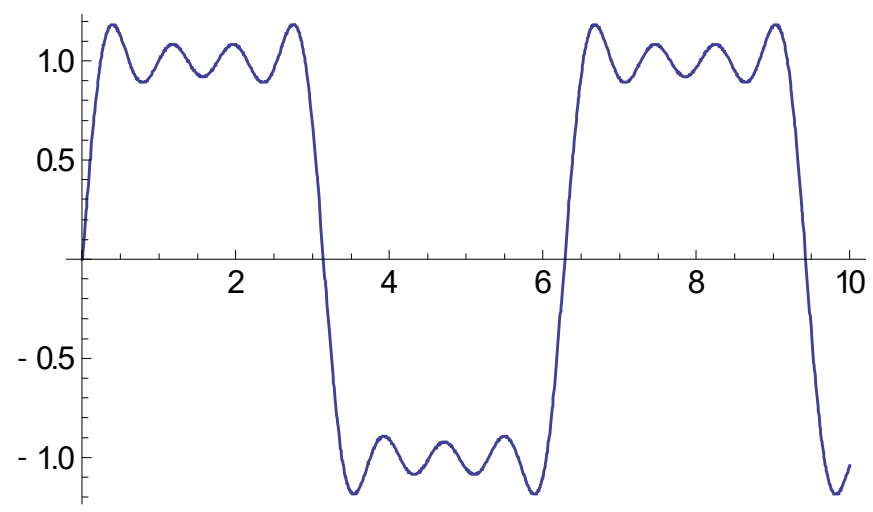
- Non-periodic signal



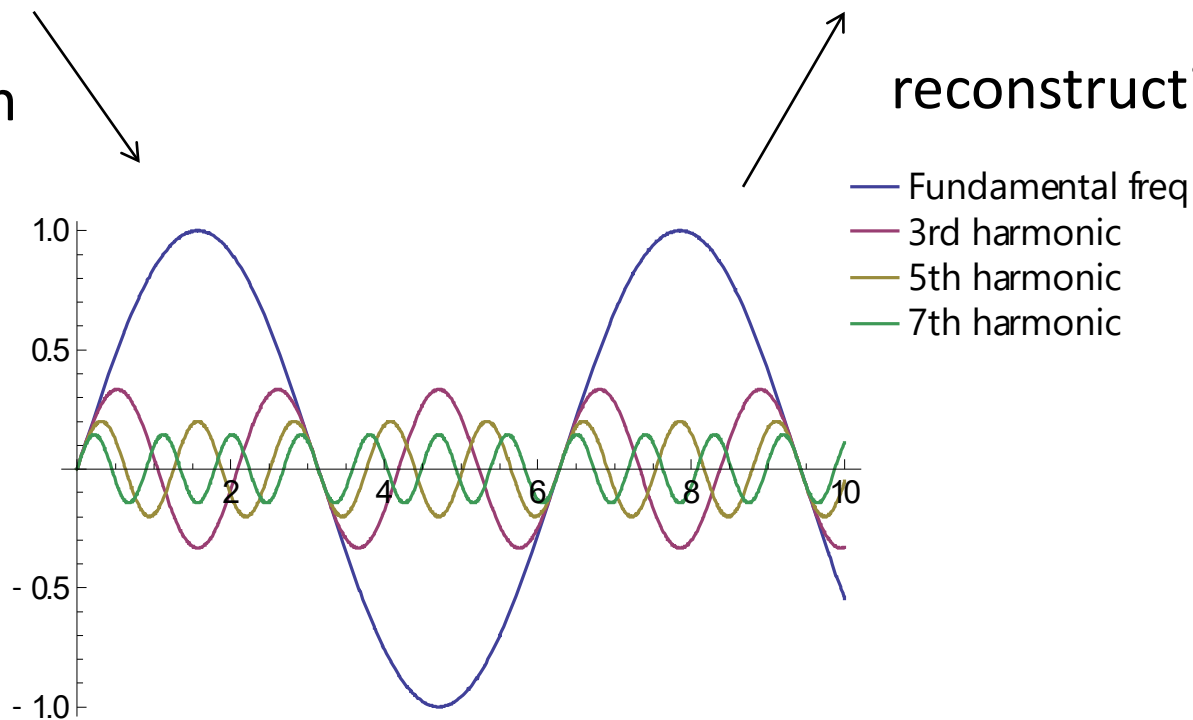
# Reconstruction of a square signal



decomposition



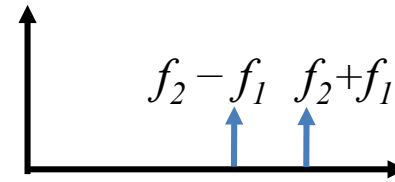
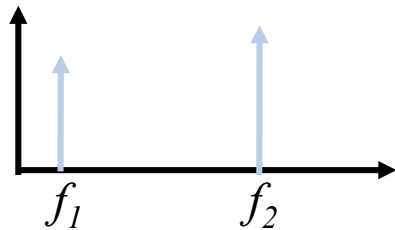
reconstruction



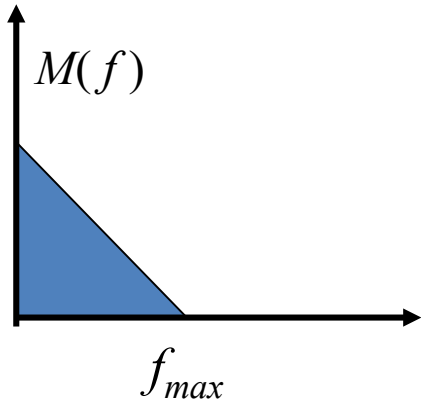
# Multiplication operation

- Product:

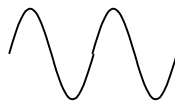
$$\cos(2\pi f_1 t) \cdot \cos(2\pi f_2 t) = [\cos(2\pi(f_2 - f_1)t) + \cos 2\pi(f_2 + f_1)t] / 2$$



Signal A

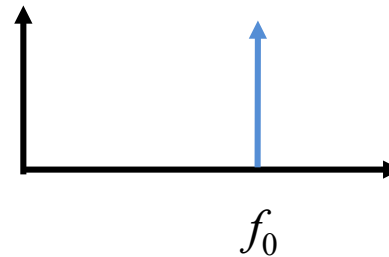


×



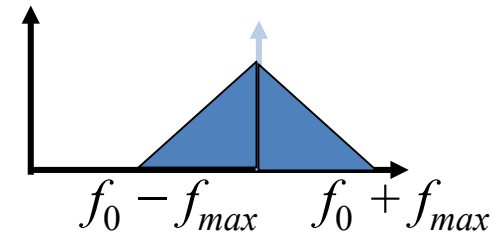
Signal B

FFT



=

Signal A × B



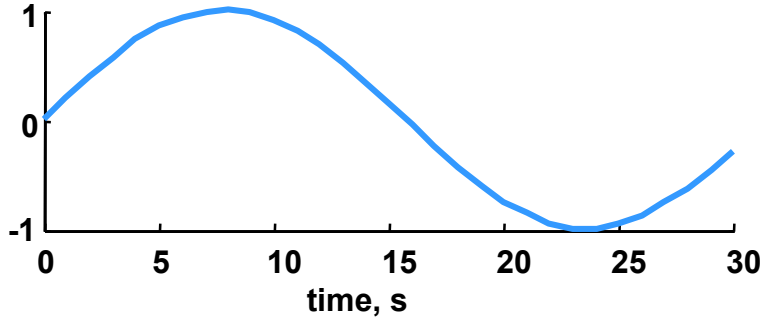
$\Delta f = f_{max}$  bandwidth,  
continuous signal  $m(t)$

periodic signal

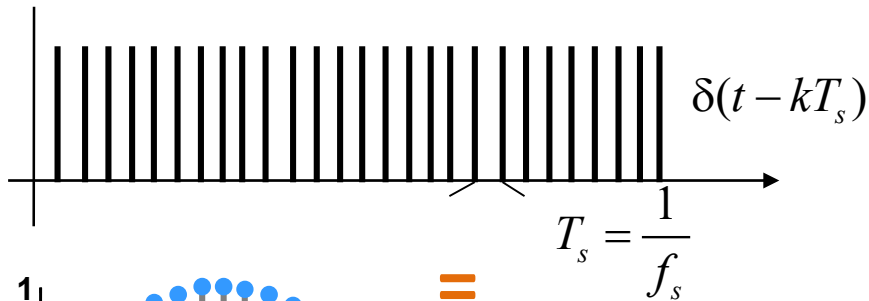
# Sampling of a periodic signal

Time domain

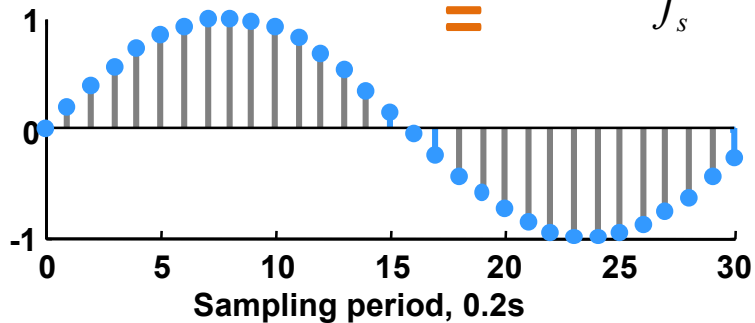
$$x(t) = A \cdot \sin \omega_1 t \quad f_1 = \frac{\omega_1}{2\pi}$$



×



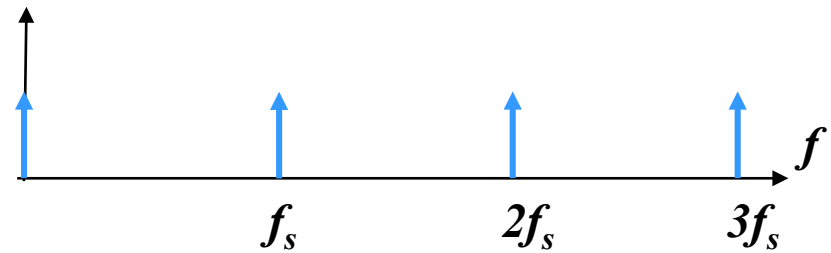
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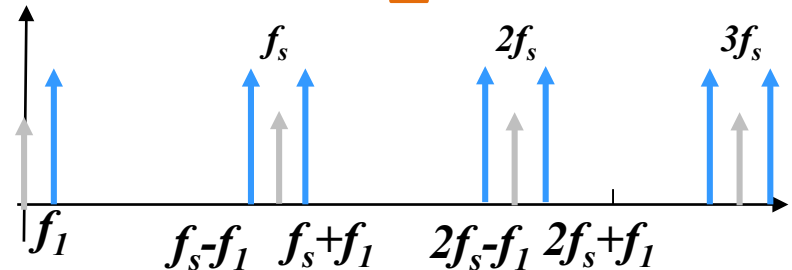
Frequency domain



×



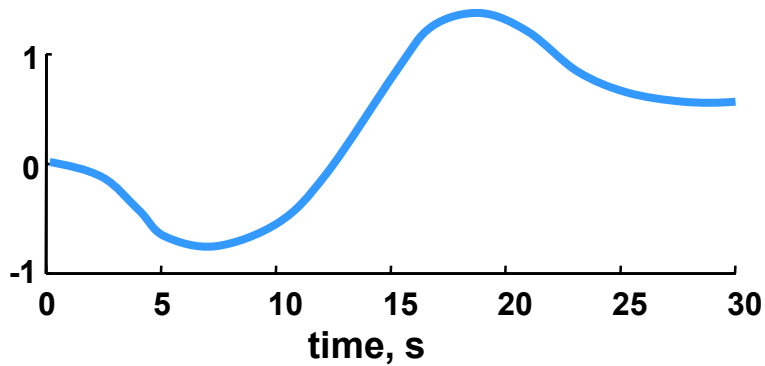
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# Sampling of an arbitrary signal

Time domain

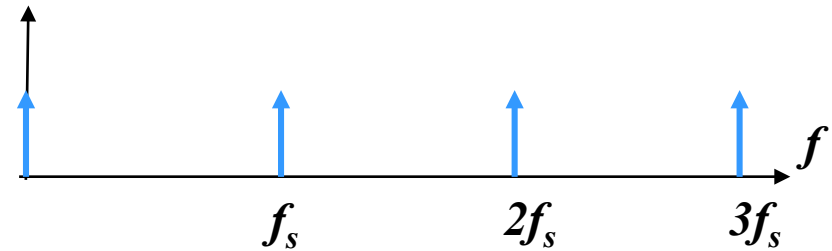
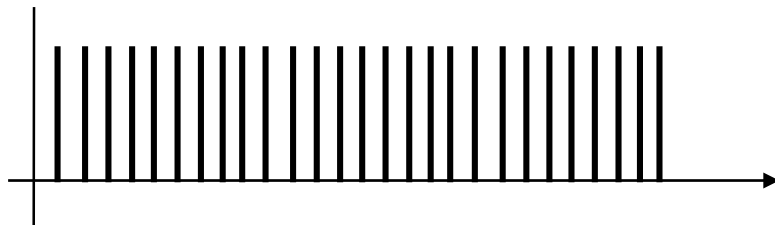


Frequency domain



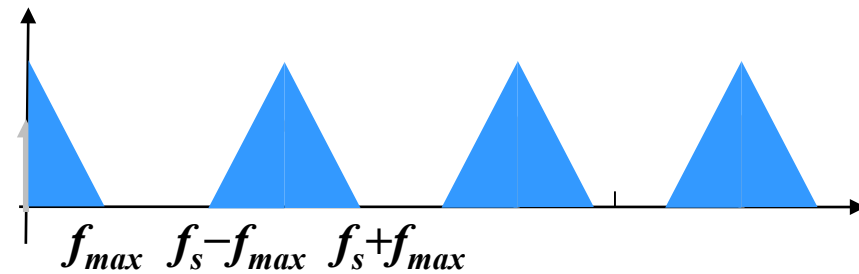
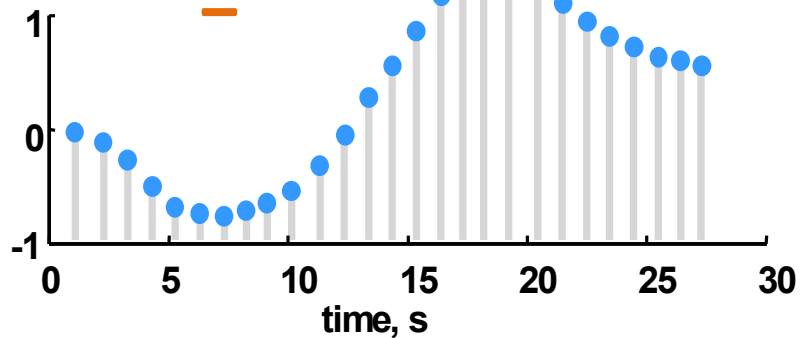
×

×

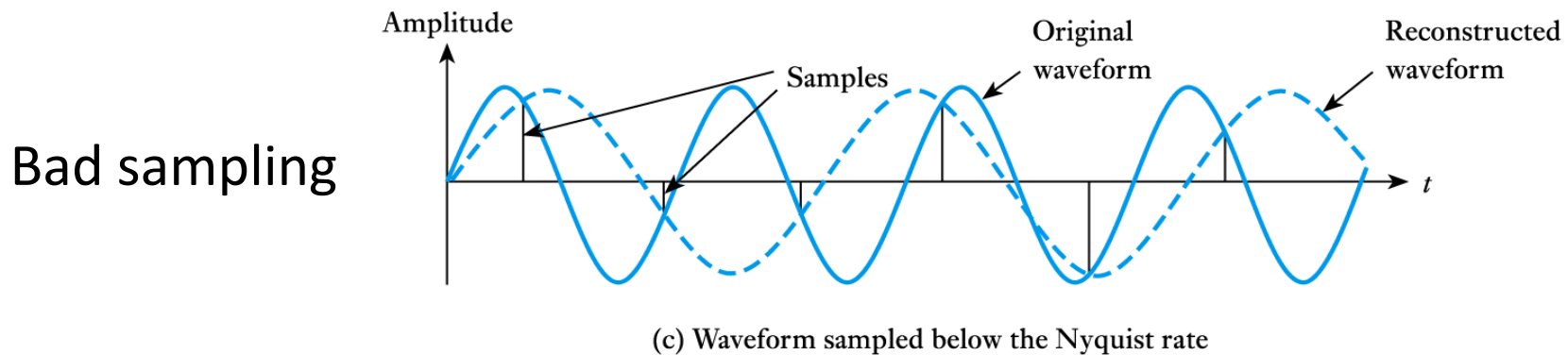
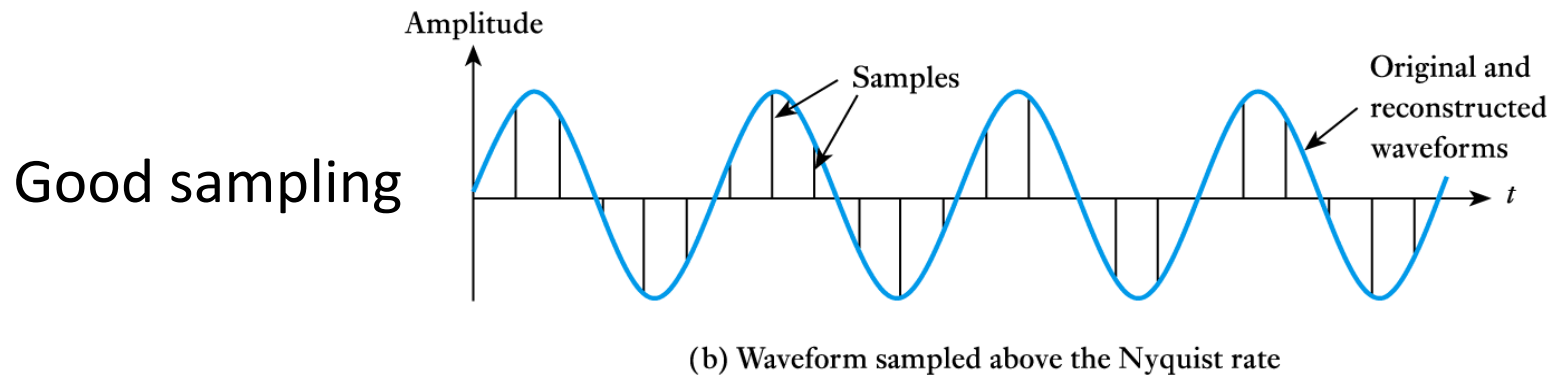
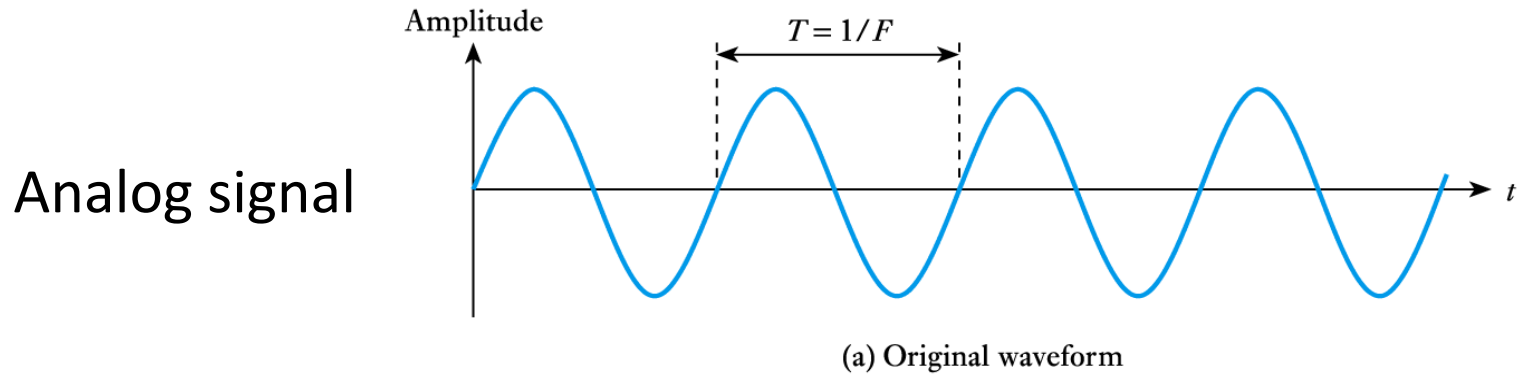


=

=



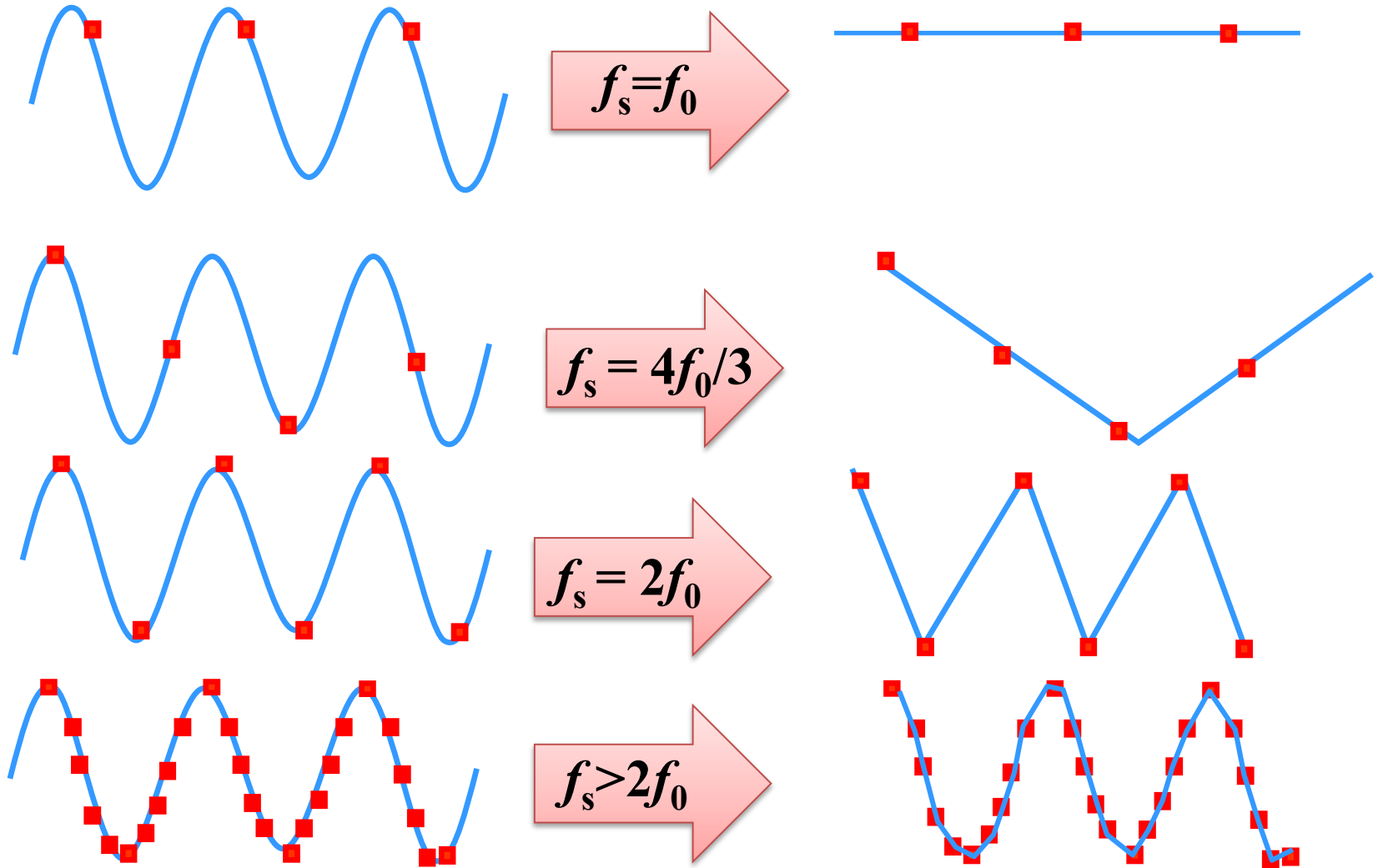
# Choice of the sampling frequency



# Example: sinusoidal signal, frequency $f_0$

Original signal + sampling points

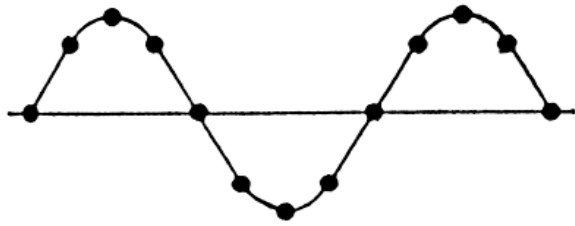
Recovered signal



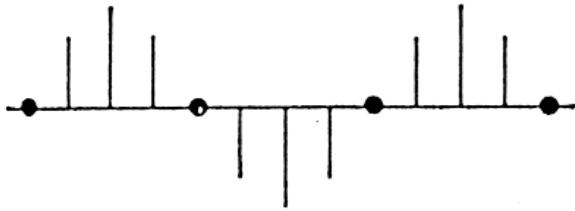
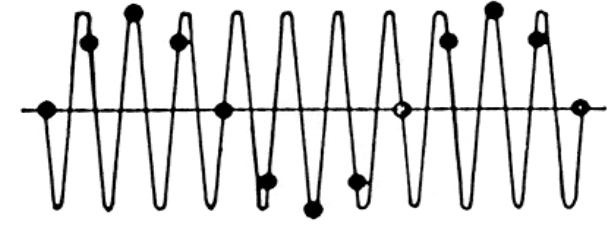
# Example: fixed sampling frequency

Good sampling

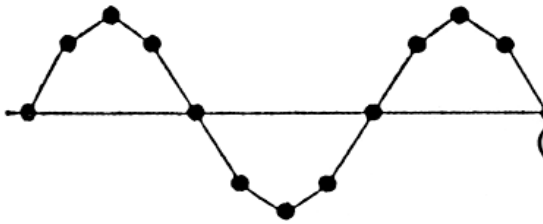
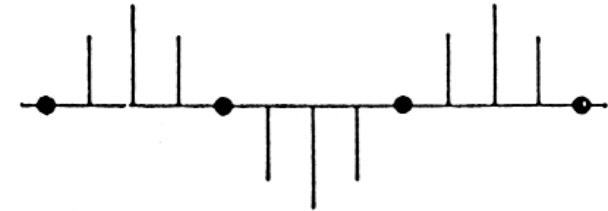
Bad sampling



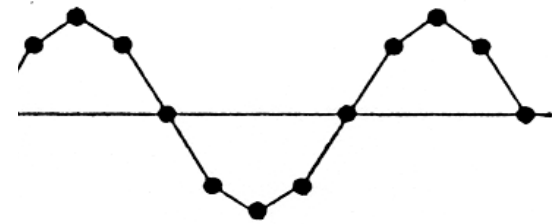
Original signal



Sampled signal

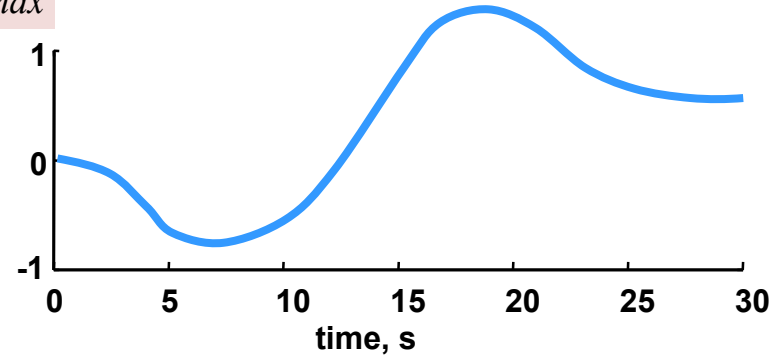


Reconstructed signal

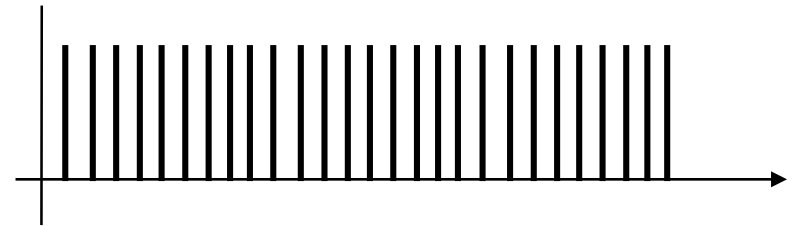
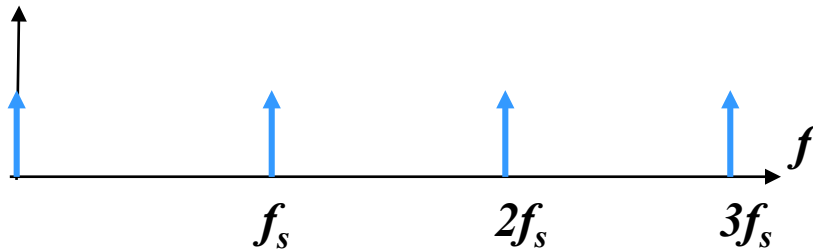


# Nyquist - Shannon theorem of sampling

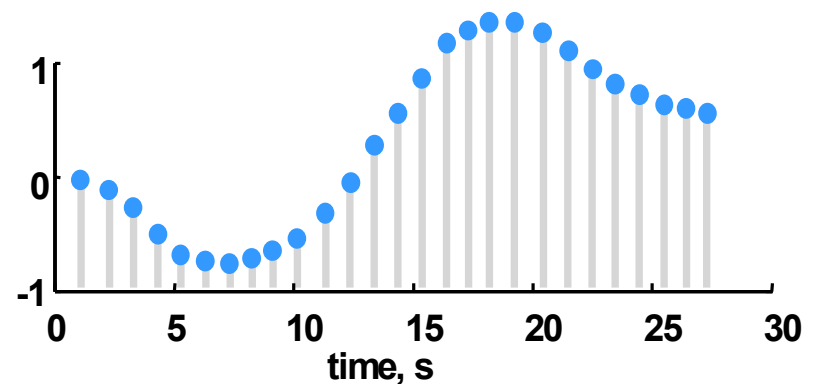
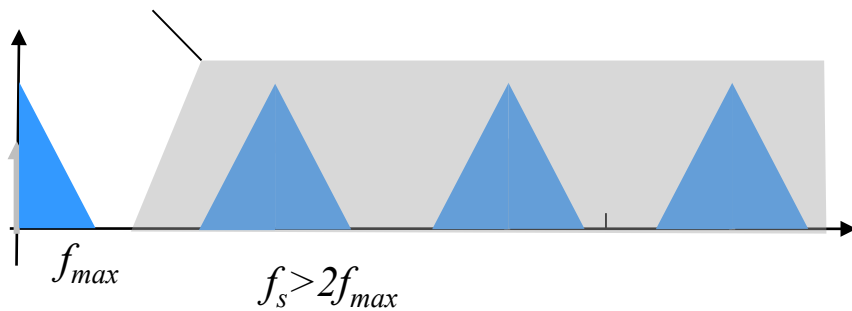
$$f_s > 2f_{max}$$



×



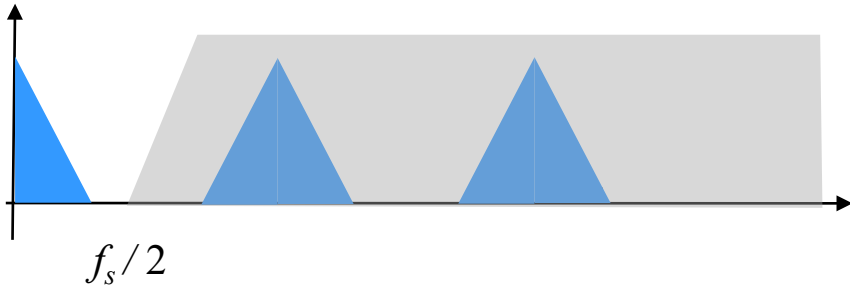
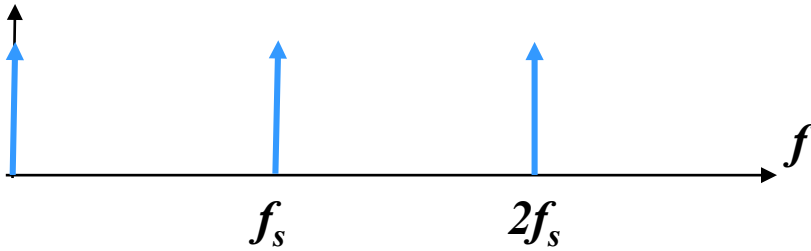
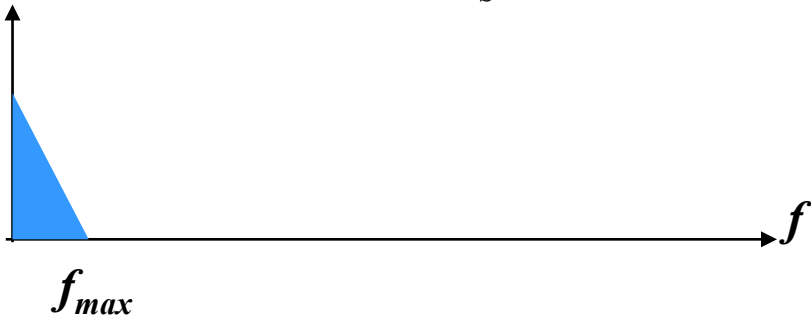
Reconstruction filter



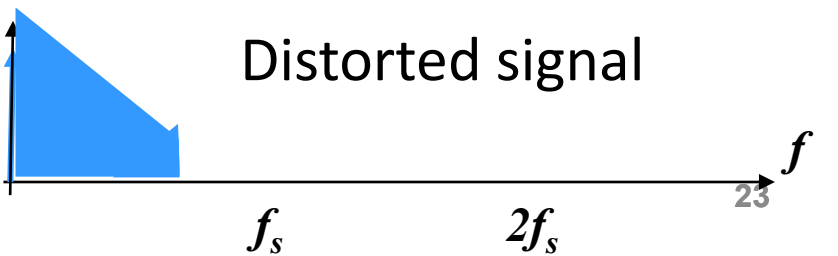
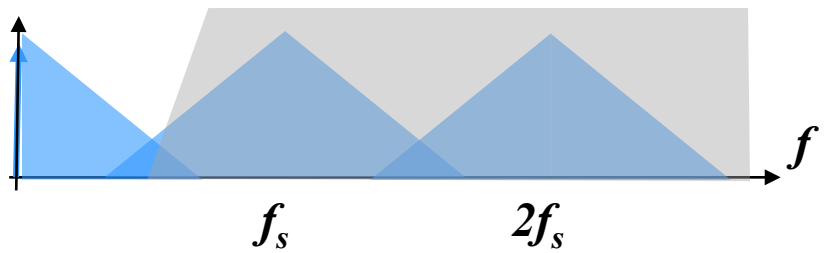
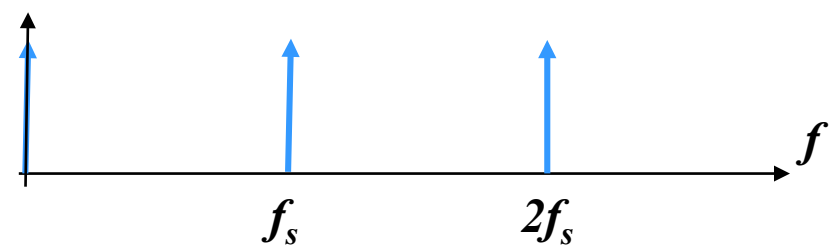
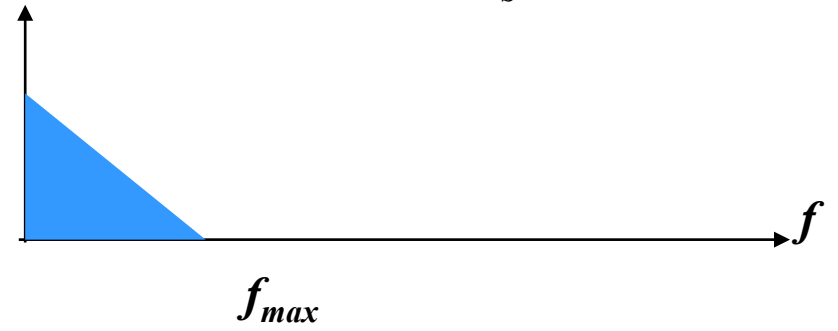
In practice  $f_s$  several times larger than  $f_{max}$

# Spectral folding

Good  $f_s$

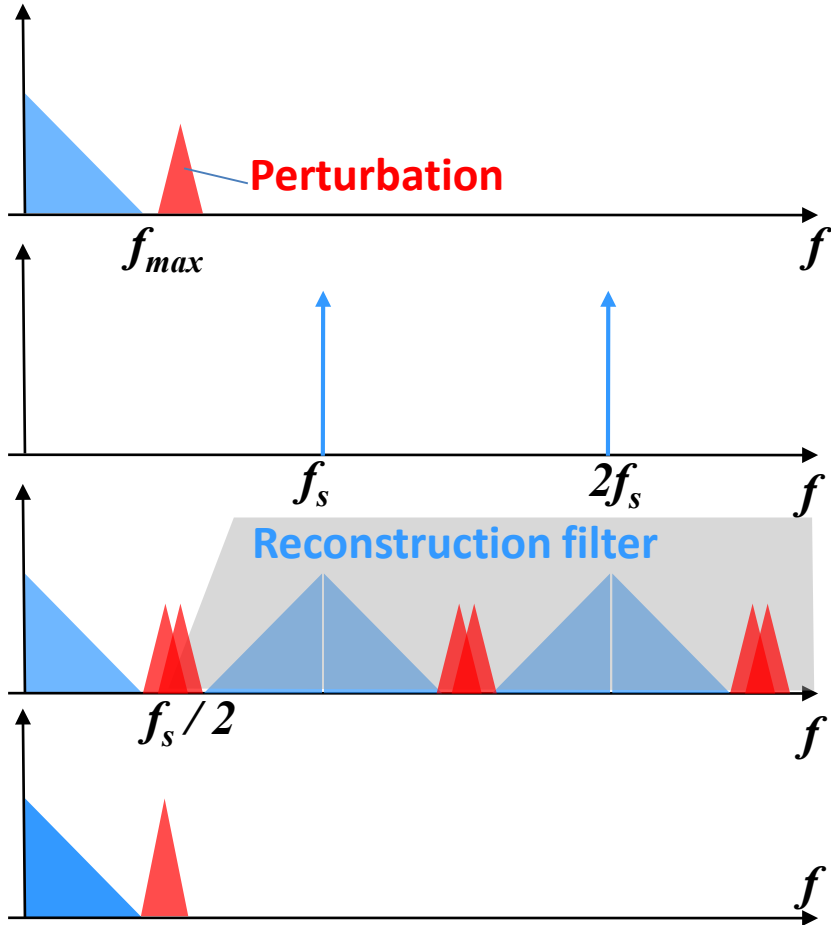


Bad  $f_s$

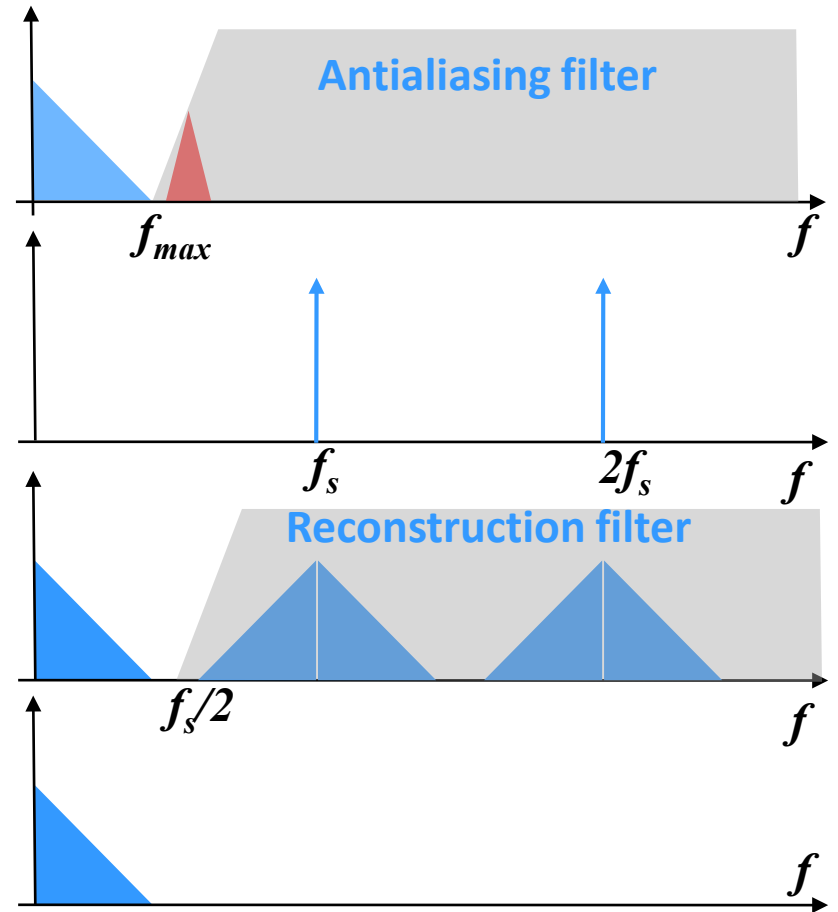


# Antialiasing filter

Without filter



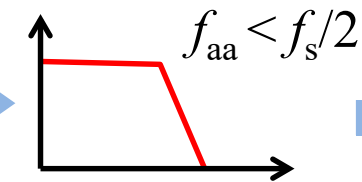
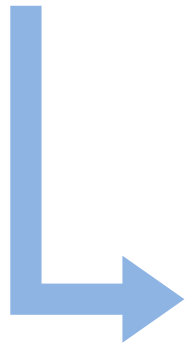
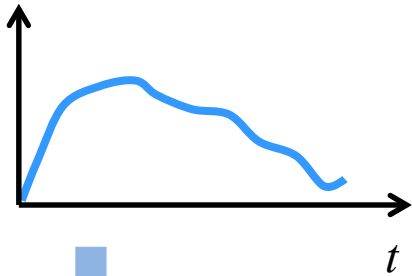
With filter



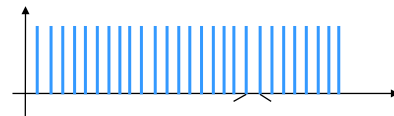
Eliminates unwanted frequencies ( $< f_s / 2$ ) before sampling

# Bloc diagram for sampling

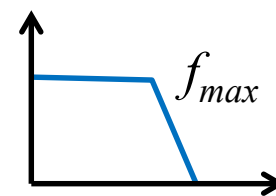
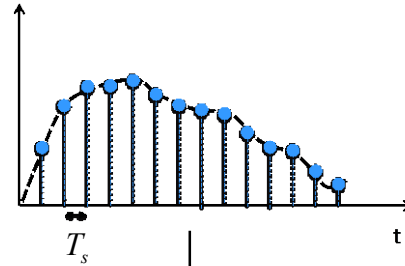
Original signal



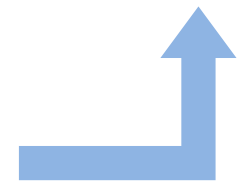
Antialiasing filter



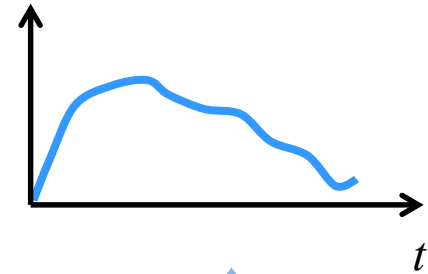
$$T_s = \frac{1}{f_s}$$



Reconstruction filter



Perfectly recovered original signal





# Decimal – binary number conversion

- Decimal system

$$1234_{10} = (1 \times 10^3) + (2 \times 10^2) + (3 \times 10^1) + (4 \times 10^0)$$

- Binary system

$$1101_2 = (1 \times 2^3) + (1 \times 2^2) + (0 \times 2^1) + (1 \times 2^0)$$

Conversion binary -> decimal

$$\begin{aligned} 11010_2 &= (1 \times 2^4) + (1 \times 2^3) + (0 \times 2^2) + (1 \times 2^1) + (0 \times 2^0) \\ &= 16 \quad + \quad 8 \quad + \quad 0 \quad + \quad 2 \quad + \quad 0 \\ &= 26_{10} \end{aligned}$$

# Conversion decimal -> binary number

- Decimal to binary number

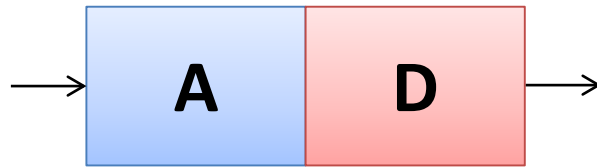
$26_{10}$		quotient	remainder
		26	
	÷ 2	13	0
	÷ 2	6	1
	÷ 2	3	0
	÷ 2	1	1
	÷ 2	0	1

read the number from starting from  
the last digit

=11010

# Encoding

Continuously  
changing  
variable



Digital form  
(binary code)

$$3 \longrightarrow 0011_2 = 0 \times 2^3 + 0 \times 2^2 + 1 \times 2^1 + 1 \times 2^0 = 2 + 1 = 3_{10}$$

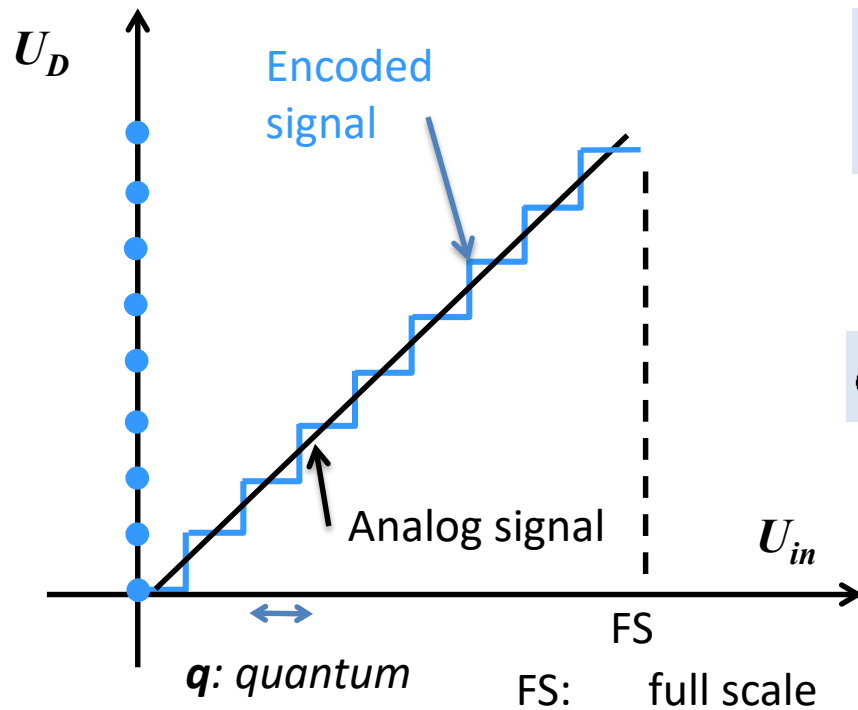
Conversion of a decimal number  $N_{dec}$  into a binary code

$$N_{dec} \longrightarrow a_1 a_2 a_3 \dots a_{n-1} a_n$$

$$\begin{aligned} N_{dec} &= \sum_{i=1}^n a_i 2^{n-i} = a_1 2^{n-1} + a_2 2^{n-2} + \dots + a_{n-1} 2^1 + a_n 2^0 \\ &= 2^n \sum_{i=1}^n a_i 2^{-i} = 2^n (a_1 2^{-1} + a_2 2^{-2} + \dots + a_n 2^{-n}) \end{aligned}$$

$a_1$  MSB – most significant bit  
 $a_n$  LSB – least significant bit

# Quantisation



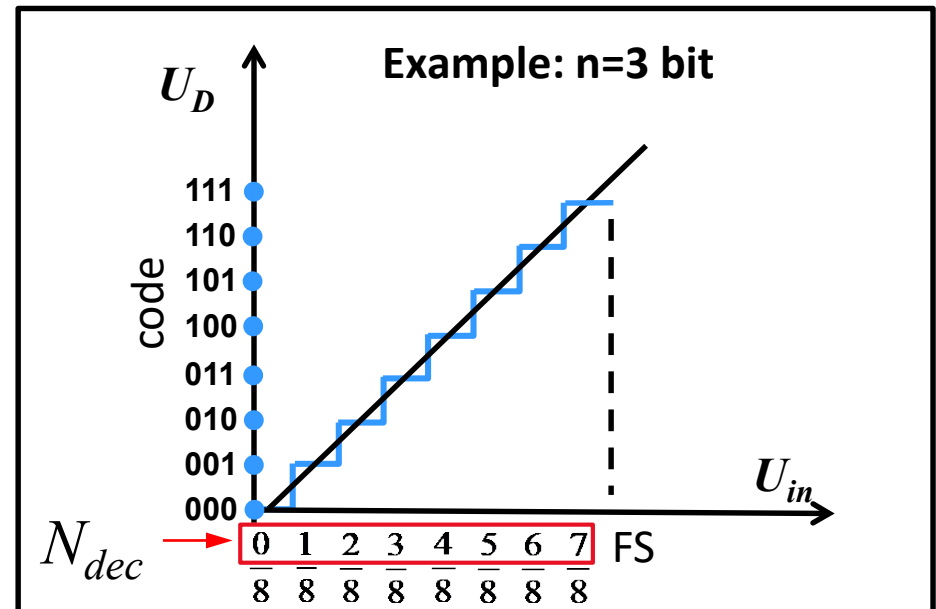
$$q = \frac{FS}{2^n}$$

$$N_{dec} = 2^n \cdot \frac{U_D}{FS}$$

ADC value (analog to digital converter output value) – ranges from 0 to  $2^n$

$n$ : number of bits

$$code(N_{dec}) : a_1 a_2 a_3 \dots a_{n-1} a_n$$



# Example

- Convert 4.5V with an 8-bit AD converter with a FS = 5V

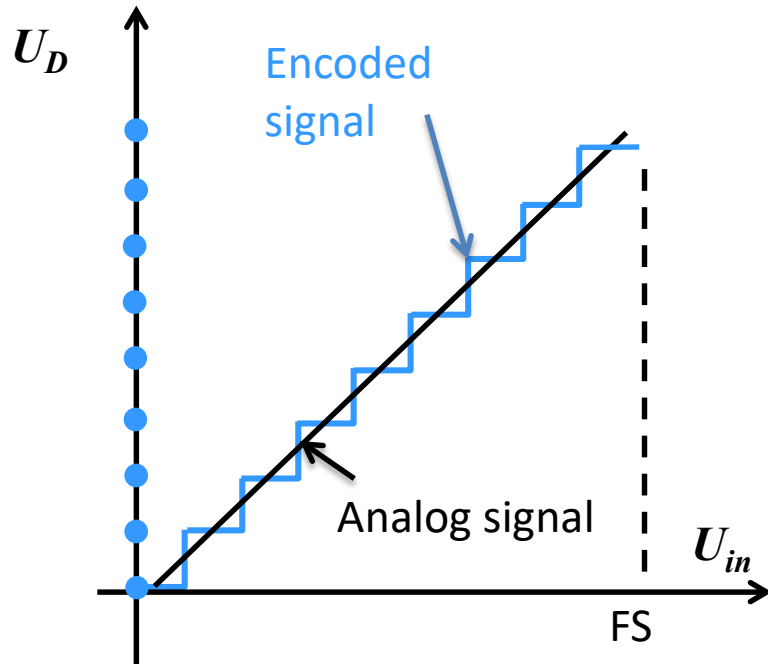
$$N_{dec} = 256 \times \frac{4.5}{5} = 230 = (11100110)_2$$

$$Resolution = \frac{5}{256} = 0.019V \quad (0.01953V)$$

- Convert an ADC value of 156 to volts (8 bit converter and FS = 5V)

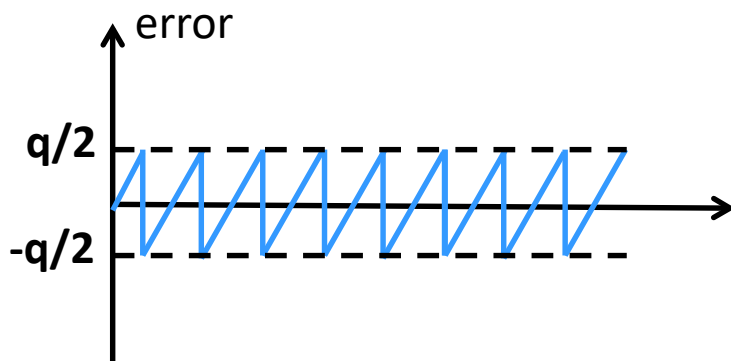
$$U_D = \frac{N_{dec}}{2^n} FS = \frac{156}{256} 5 = 3.0469V \quad U_{in} = 3.0469 \pm 0.0098V$$

# Quantisation error



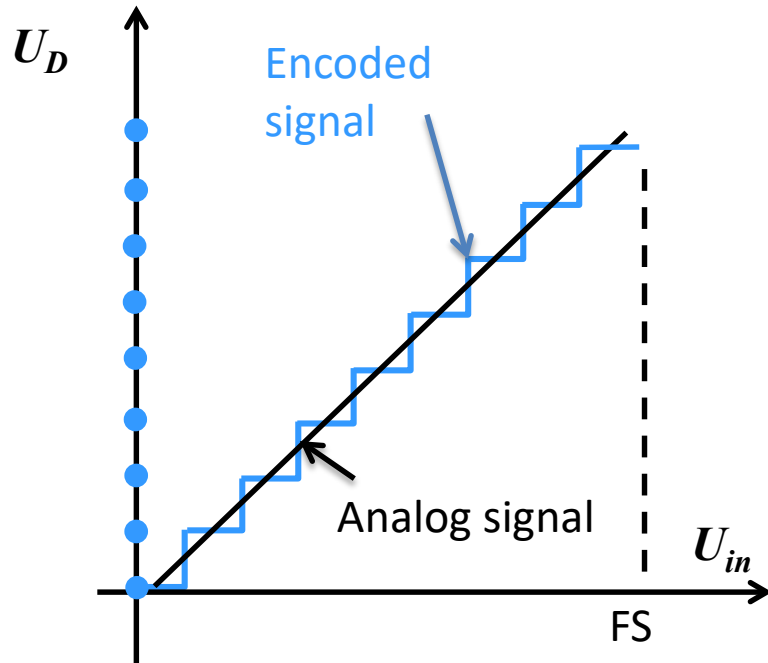
$$\text{Quantisation error} = |U_D - U_{in}|$$

$$= \left| \frac{N_{dec}}{2^n} FS - U_{in} \right|$$



$$\text{Max quantisation error} = \pm \frac{0.5 \cdot FS}{2^n} = \pm \frac{q}{2}$$

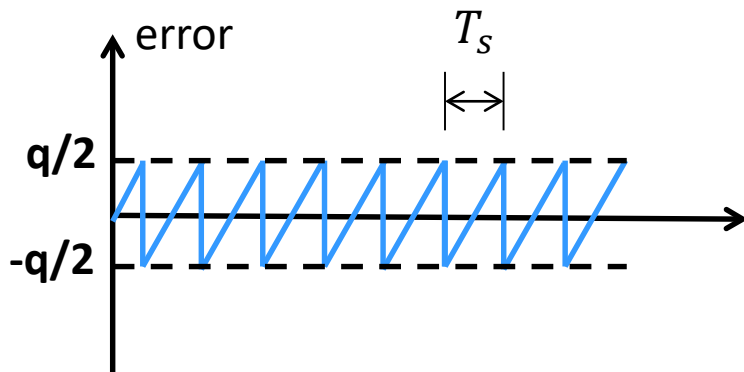
# Quantisation error as noise



Power of the noise associated with the quantisation error ( $R = 1\Omega$ )

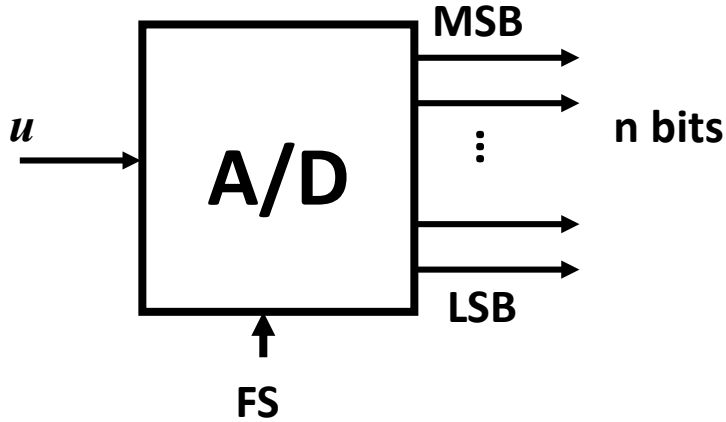
$$P_n = \frac{1}{T} \int_0^T u_n^2(t) dt = \frac{2}{T_s} \int_0^{T_s/2} \left( \frac{q/2}{T_s/2} t \right)^2 dt =$$

$$= \frac{2}{T_s} \frac{q^2}{T_s^2} \left[ \frac{t^3}{3} \right]_0^{T_s/2} = \frac{2q^2}{T_s^3} \frac{T_s^3}{24} = \frac{q^2}{12}$$



# Resolution

- The smallest detectable variation of the input



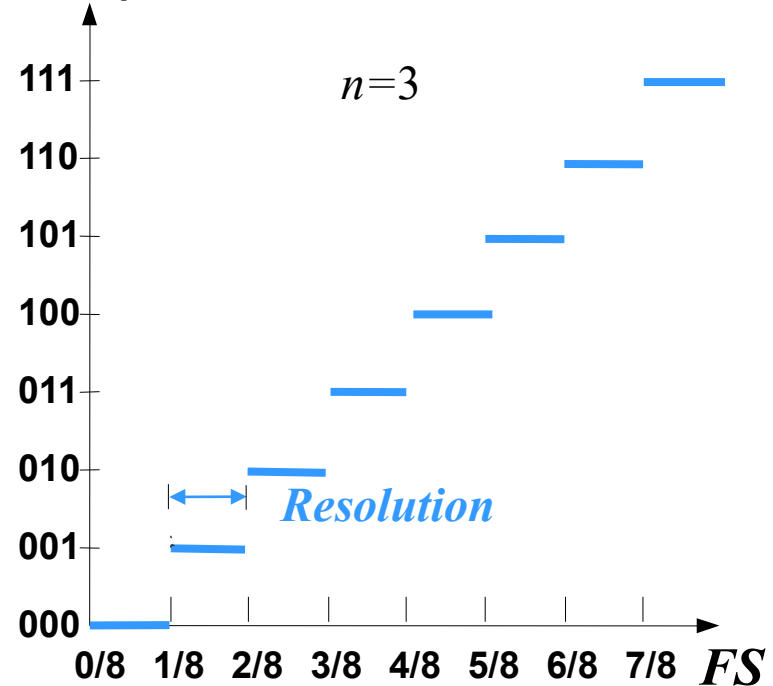
$$\text{Resolution} = \frac{1}{2^n} FS = q$$

Example:

$$FS = 5V, n = 4$$

$$\text{resolution} = 5V/2^4 = 0.31V$$

Digital output





# Example

- Convert 4.5V with an 8-bit AD converter with a FS = 5V

$$N_{dec} = 256 \times \frac{4.5}{5} = 230 = (11100110)_2$$

$$Error = \left| \frac{230}{256} 5 - 4.5 \right| = |4.4922 - 4.5| = 0.0078V$$

$$Max\ error = \frac{0.5 \times 5}{256} = 0.0098V$$

$$Resolution = \frac{5}{256} = 0.0195V \quad (0.01953V)$$

- Convert an ADC value of 156 to volts (8 bit converter and FS = 5V)

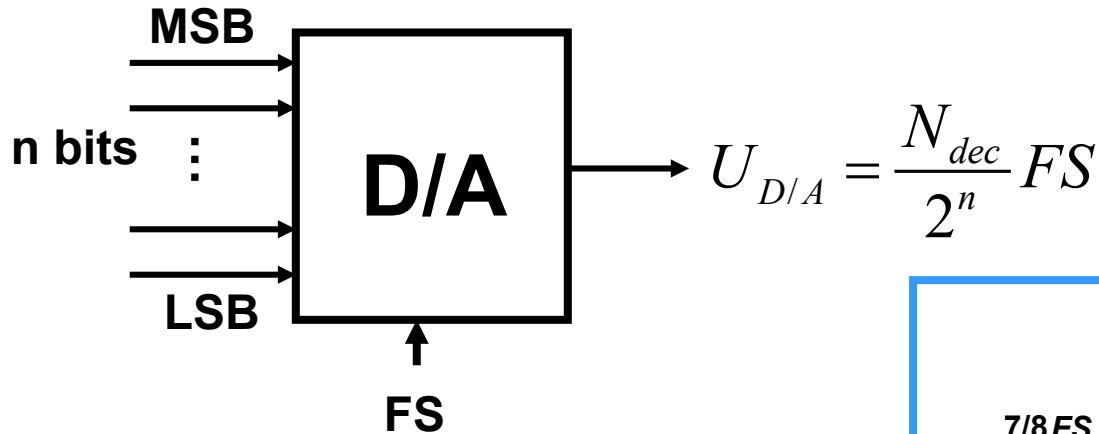
$$U_D = \frac{N_{dec}}{2^n} FS = \frac{156}{256} 5 = 3.0469V \quad U_{in} = 3.0469 \pm 0.0098V$$

# Example: 12 bit converter

$$\text{Resolution} = \frac{1}{2^{12}} FS = \frac{FS}{4096}$$

FS	Resolution
0 à 10 V	2,44 mV
0 à 5 V	1,22 mV
0 à 2,5 V	610 μV
0 à 1,25 V	305 μV
0 à 1 V	244 μV
0 à 0,1 V	24,4 μV
0mV à 20 mV	4,88 μV
-5 à 5V	2,44 mV
-2,5 à 2,5 V	1,22 mV
-1,25 à 1,25 V	610 μV
-0,625 à 0,625 V	305 μV
-0,5 à 0,5 V	244 μV
-50mV à 50 mV	24,4 μV
-10mV à 10 mV	4,88 μV
-10 à 10 V	4,88 mV
-5 à 5 V	2,44 mV
-2,5 à 2,5 V	1,22 mV
-1,25 à 1,25 V	610 μV
-1 à 1 V	488 μV
-0,1 à 0,1 V	48,8 μV
-20mV à 20 mV	9,76 μV

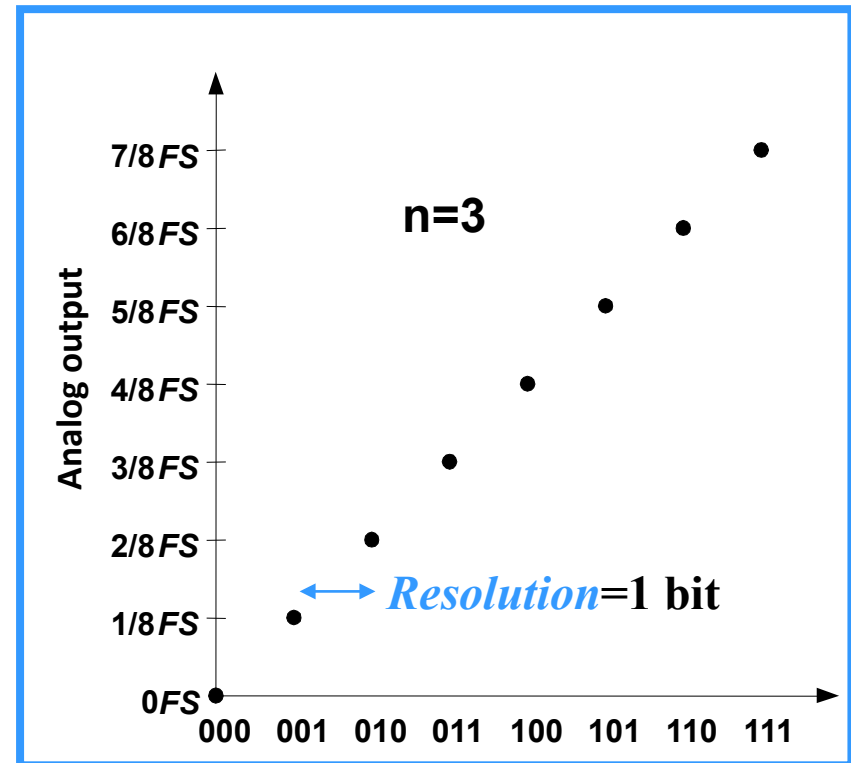
# Digital/Analog (D/A) Converter



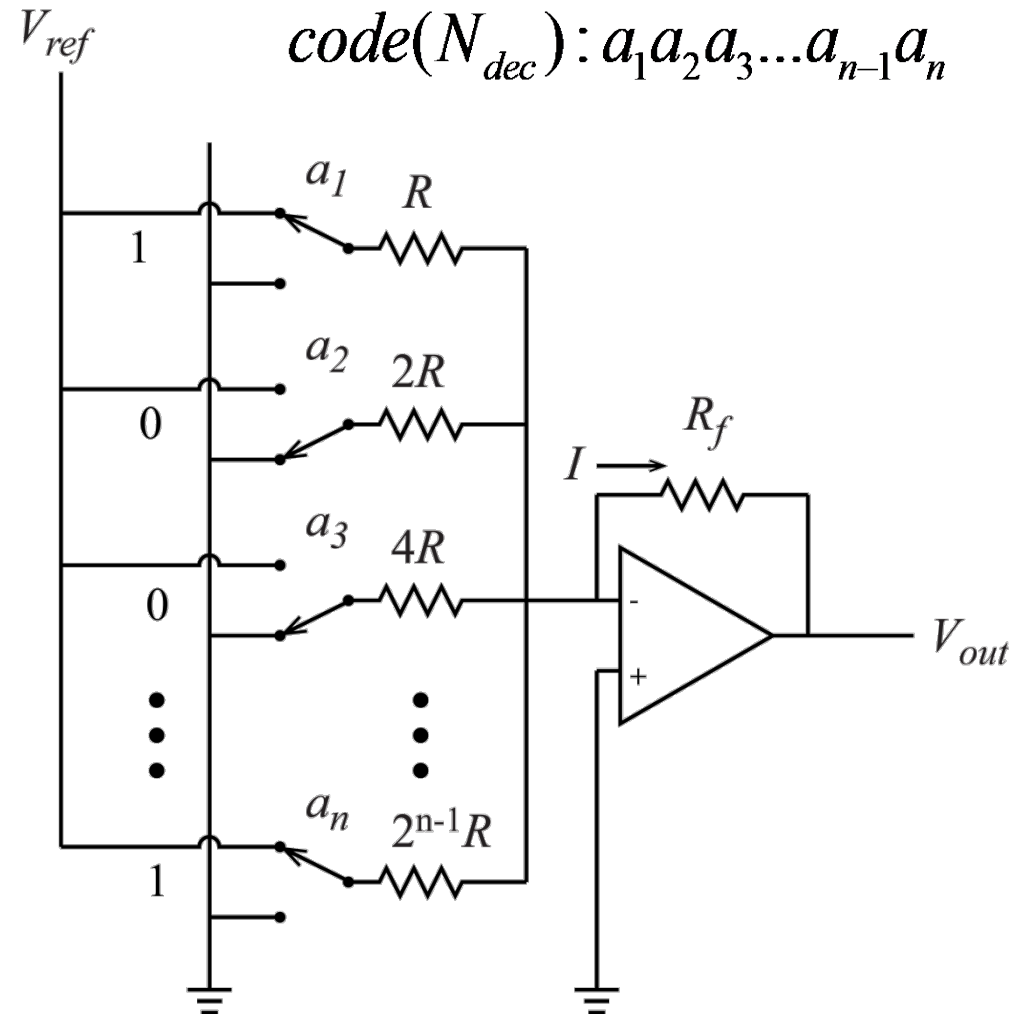
Ex. FS = 5V, n = 4, code = 1111:

$$N_{dec} = 15$$

$$U_{D/A} = \frac{15}{2^4} \times 5 = 4.69V$$

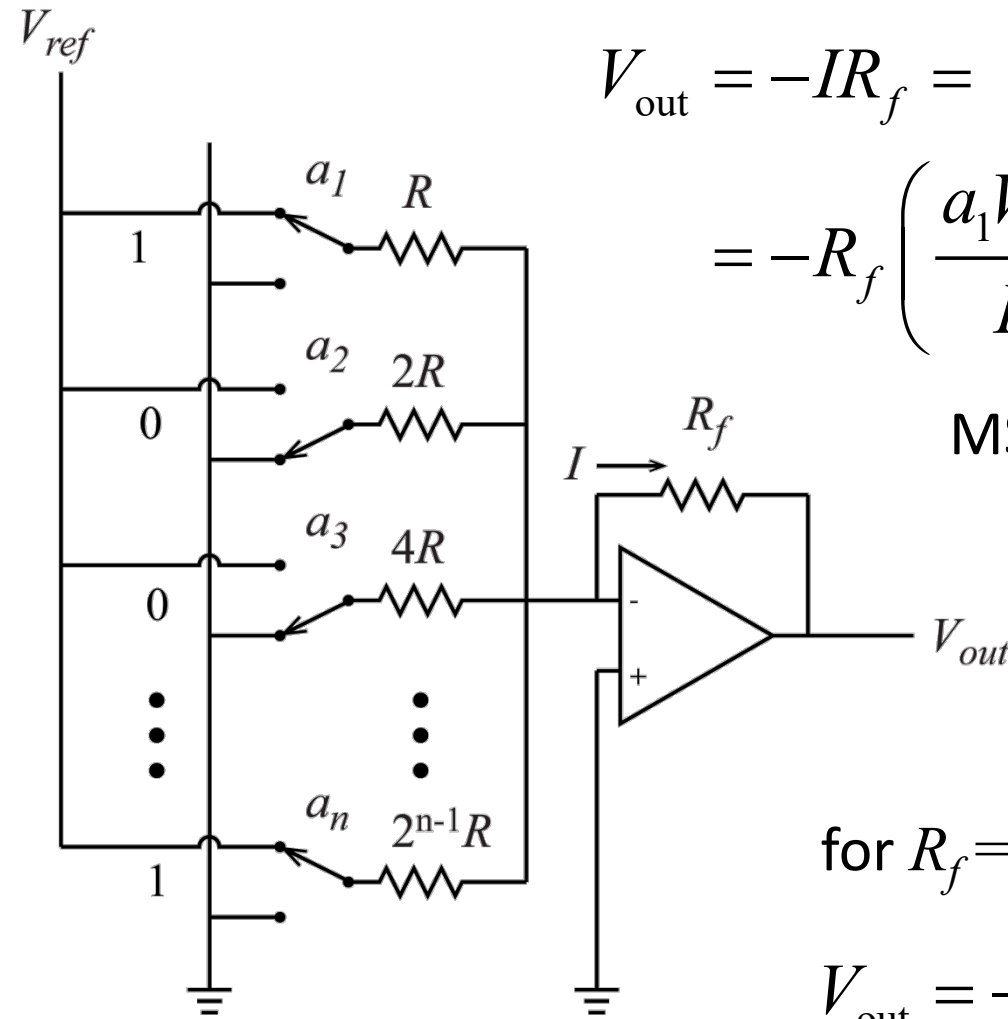


# D/A converter: binary weighted ladder



- Each input resistor is twice the value of the previous one
- Inputs are weighted according to their resistors

# D/A converter: binary weighted ladder



$$V_{out} = -IR_f =$$

$$= -R_f \left( \frac{a_1 V_{ref}}{R} + \frac{a_2 V_{ref}}{2R} + \frac{a_3 V_{ref}}{4R} + \dots + \frac{a_n V_{ref}}{2^{n-1}R} \right)$$

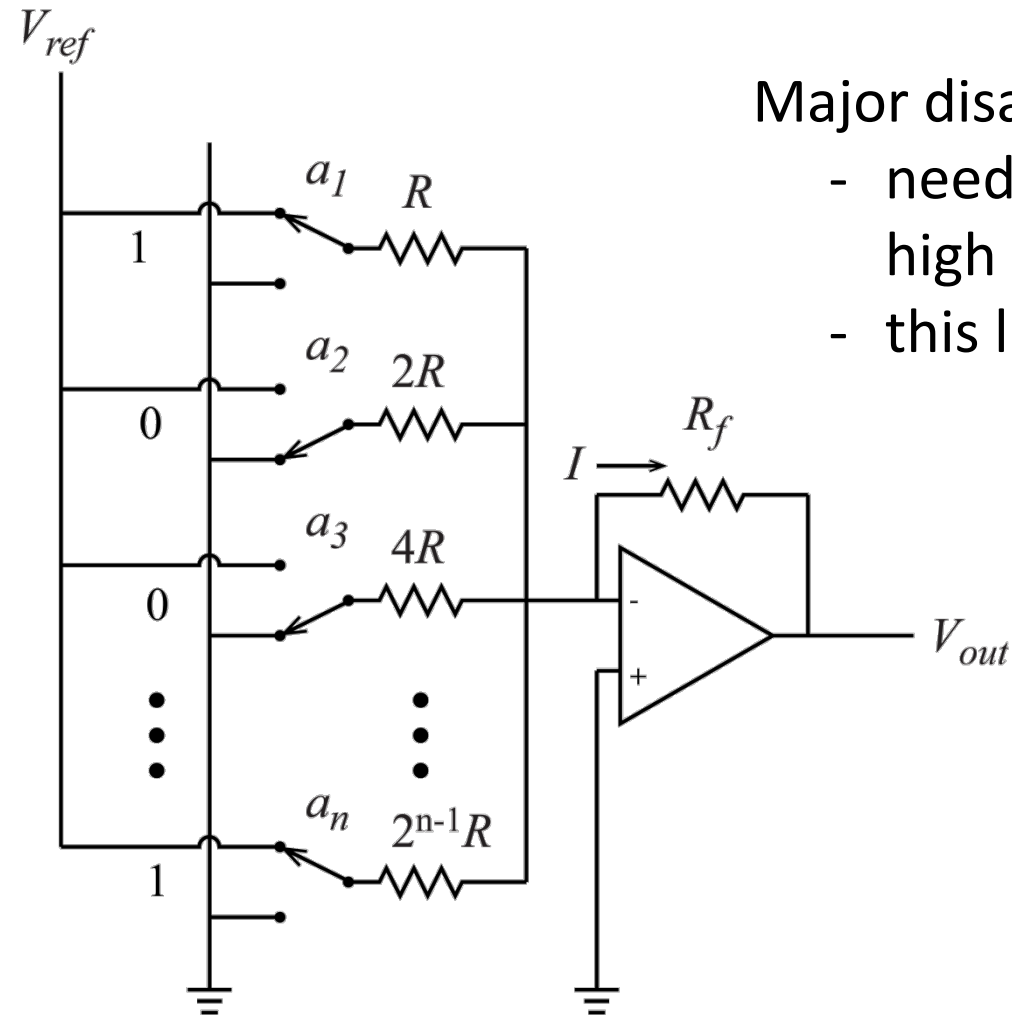
MSB LSB

for  $R_f = R/2$ :

$$V_{out} = -V_{ref} \left( \frac{a_1}{2} + \frac{a_2}{4} + \frac{a_3}{8} + \dots + \frac{a_n}{2^n} \right)$$

$code(N_{dec}) : a_1 a_2 a_3 \dots a_{n-1} a_n$

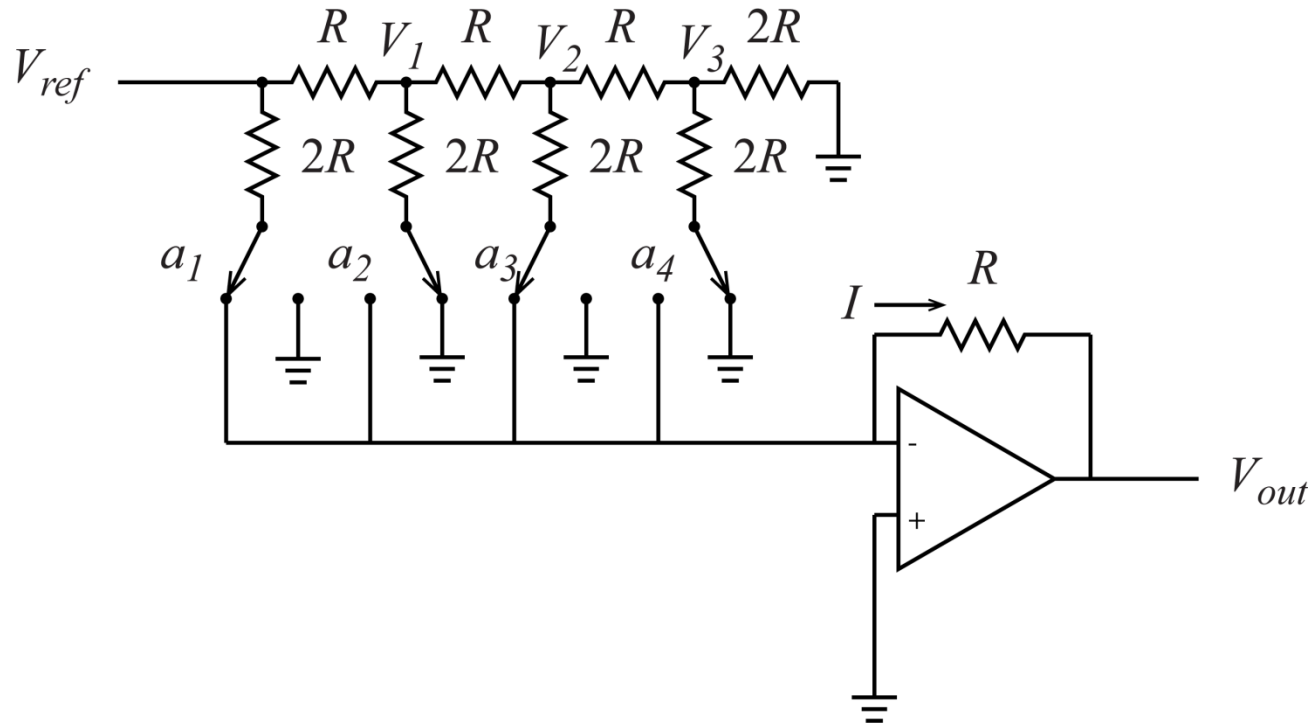
# D/A converter: binary weighted ladder



Major disadvantage:

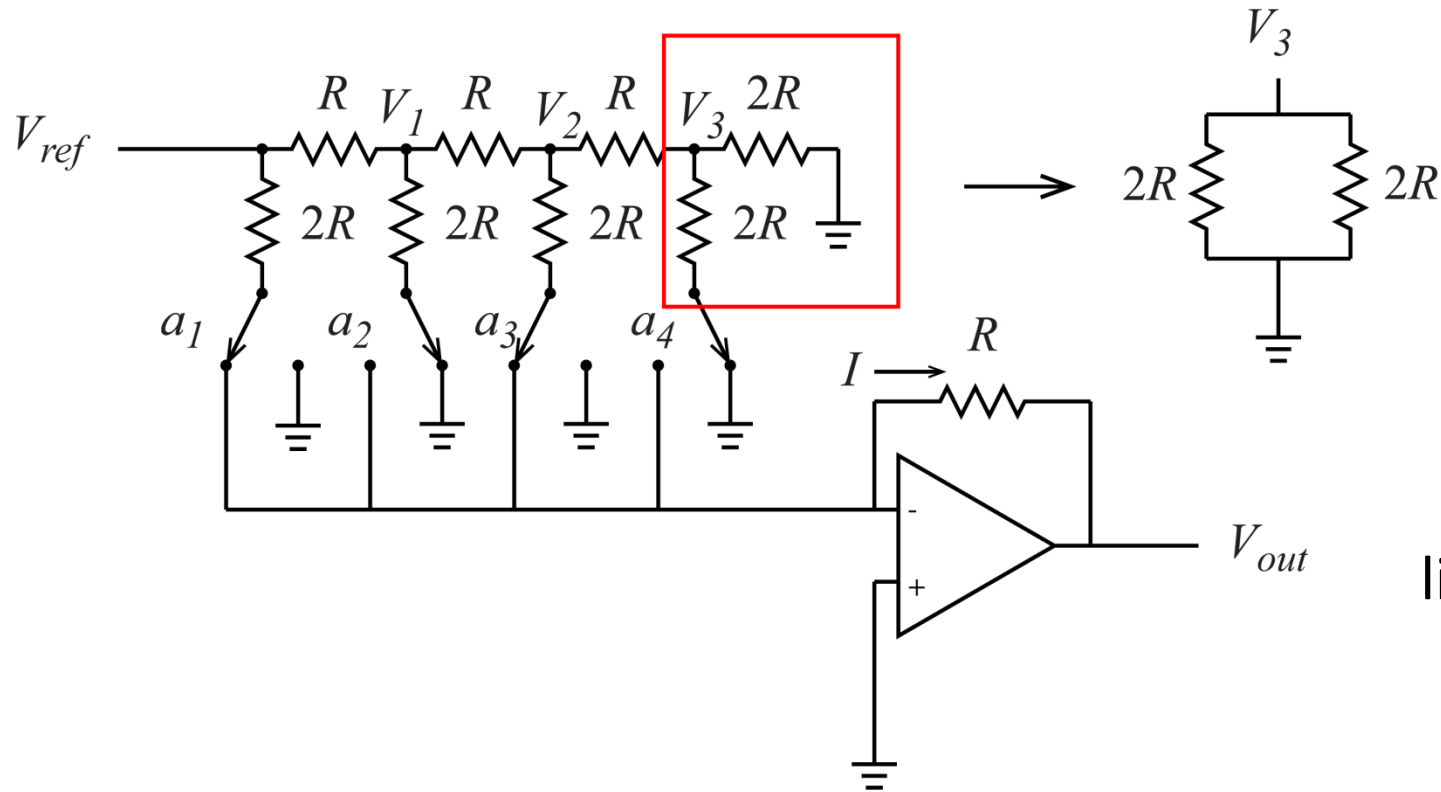
- needs a large range of resistors with high precision (2048:1 for 12-bit DAC)
- this limits it to 4-8 bit in practice

# R-2R resistor ladder



- only two resistor values ( $R$  and  $2R$ )
- does not require high precision resistors

# R-2R resistor ladder



$$V_3 = \frac{1}{2} V_2$$

likewise:

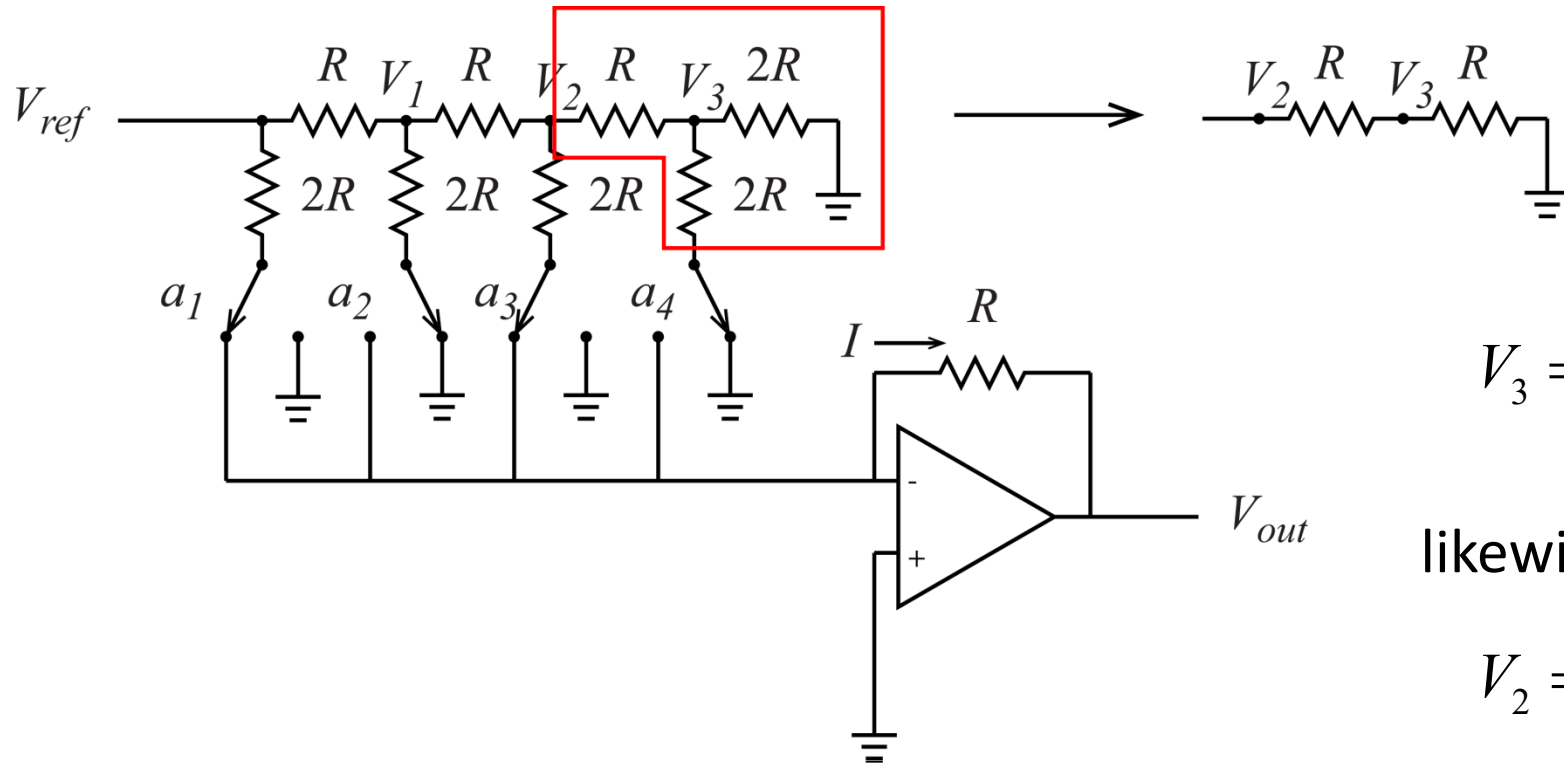
$$V_2 = \frac{1}{2} V_1$$

$$V_1 = \frac{1}{2} V_{ref}$$

$$V_{out} = -IR$$



# R-2R resistor ladder



$$V_3 = \frac{1}{2} V_2$$

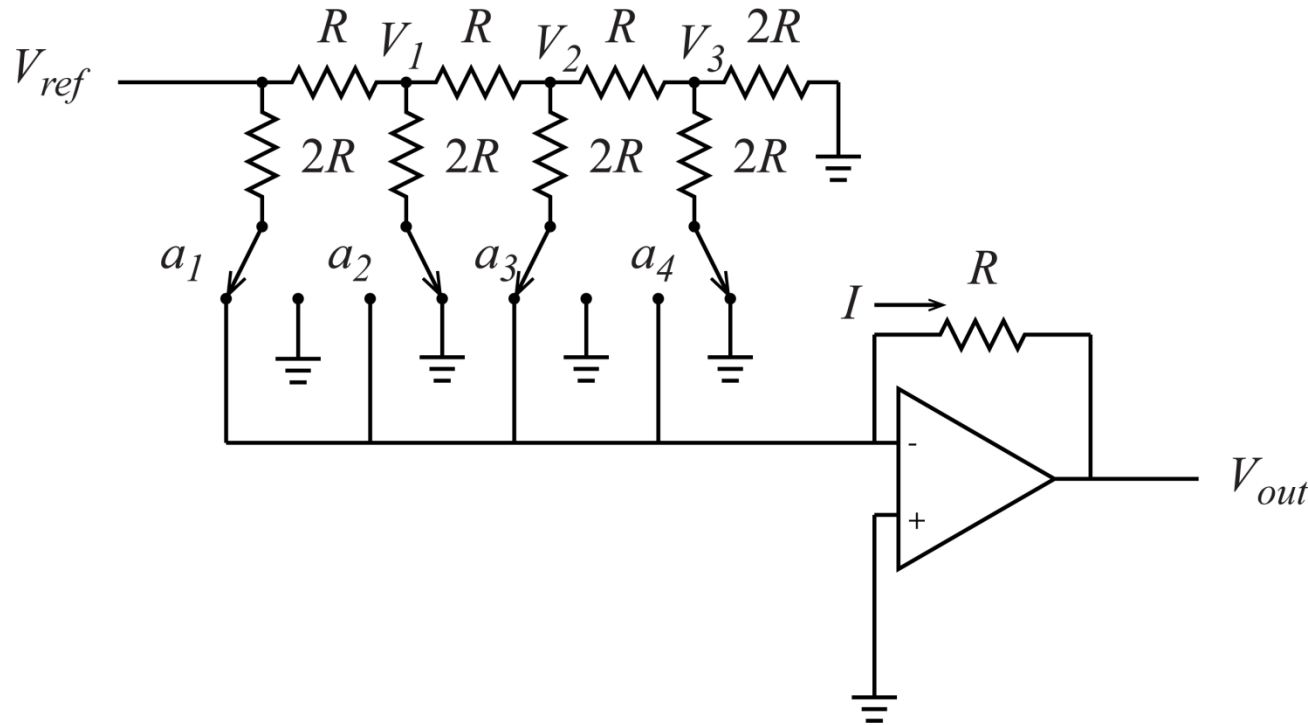
likewise:

$$V_2 = \frac{1}{2} V_1$$

$$V_1 = \frac{1}{2} V_{ref}$$

$$V_{out} = -IR$$

# R-2R resistor ladder



likewise:

$$V_2 = \frac{1}{2} V_1$$

$$V_1 = \frac{1}{2} V_{ref}$$

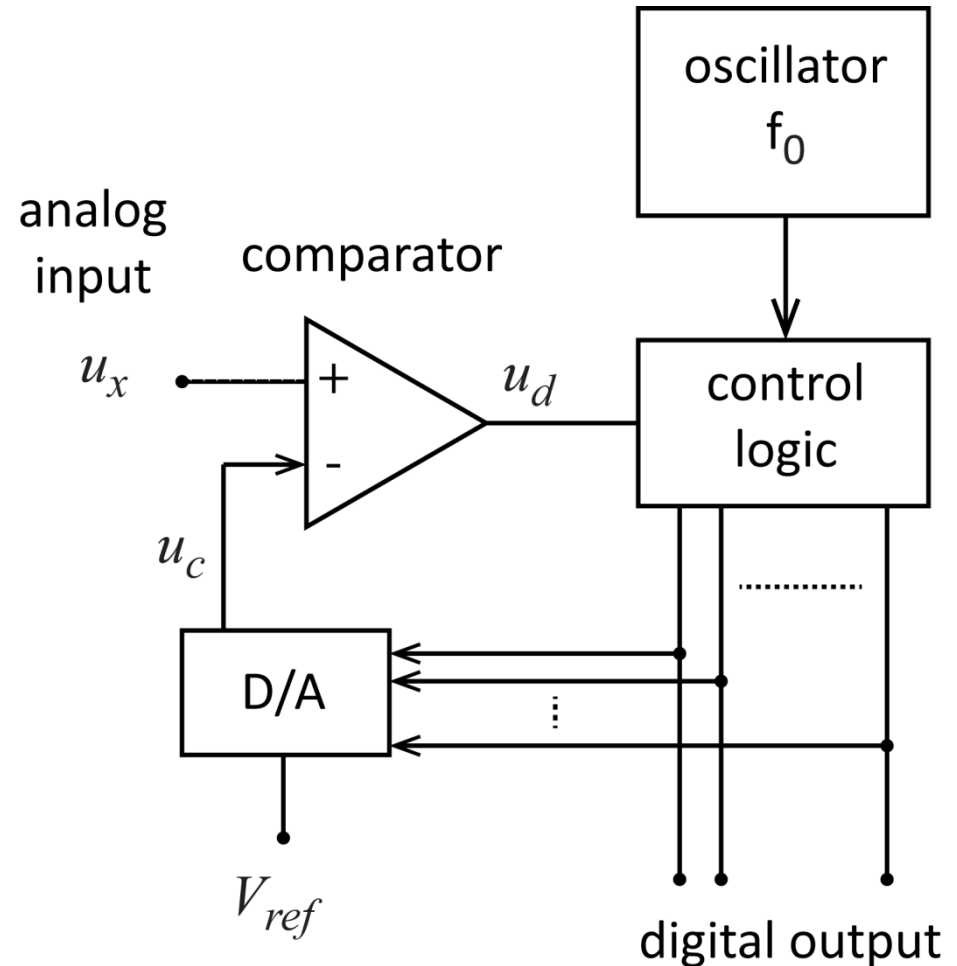
$$V_{out} = -IR$$

$$V_3 = \frac{1}{8} V_{ref}, V_2 = \frac{1}{4} V_{ref}, V_1 = \frac{1}{2} V_{ref}$$

$$V_{out} = -V_{ref} \left( \frac{a_1}{2} + \frac{a_2}{4} + \frac{a_3}{8} + \frac{a_4}{16} \right)$$

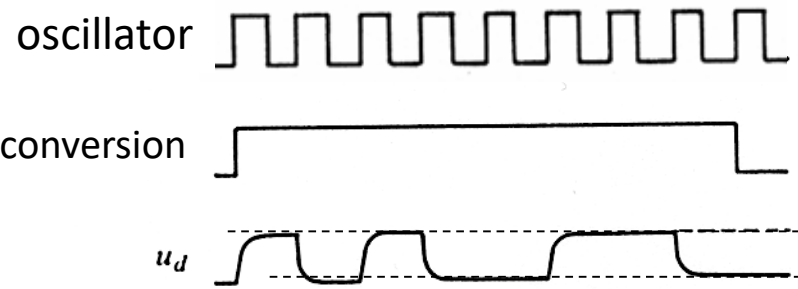
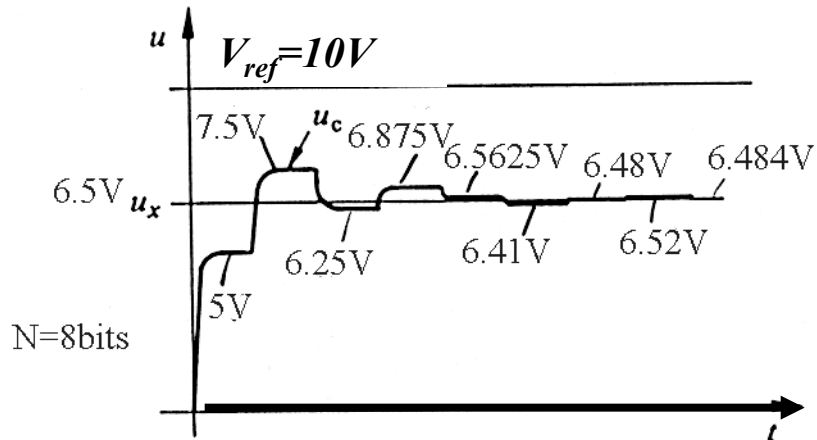
# Successive approximation ADC

- Basic elements
  - digital to analog converter
  - analog comparator
  - control logic module
  - register

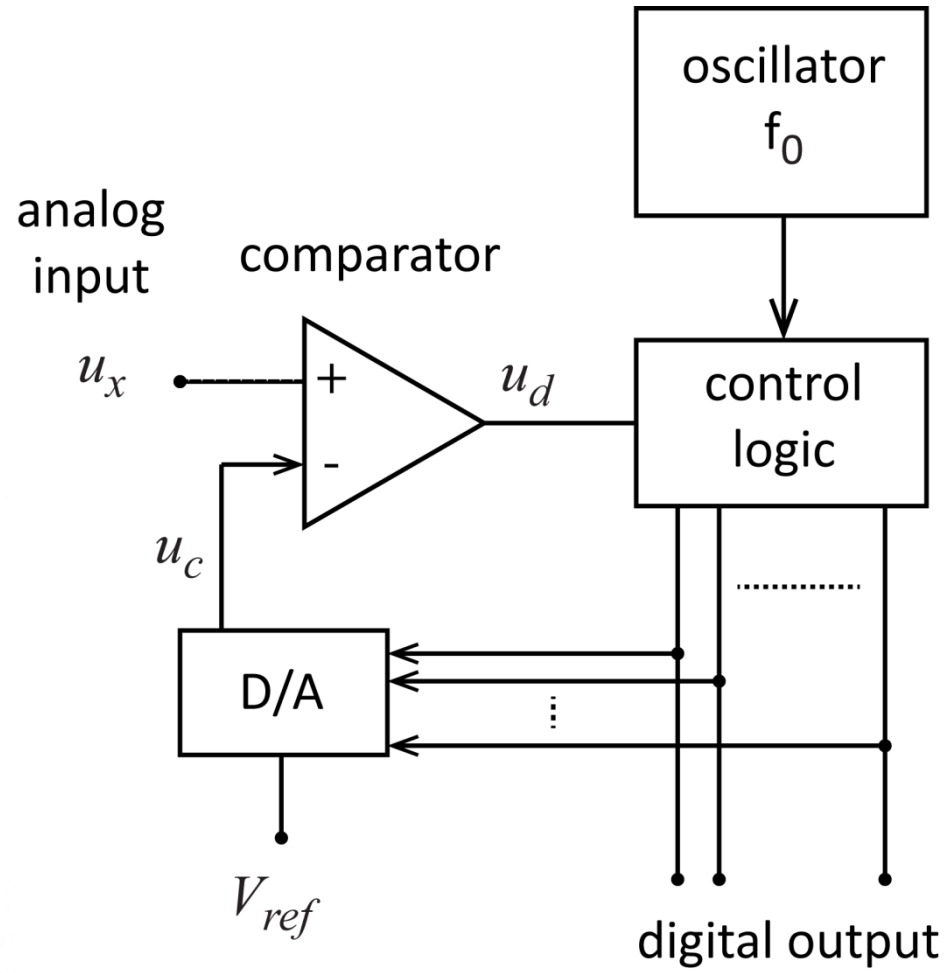


$$\text{conversion time} = n/f_0$$

# Successive approximation ADC



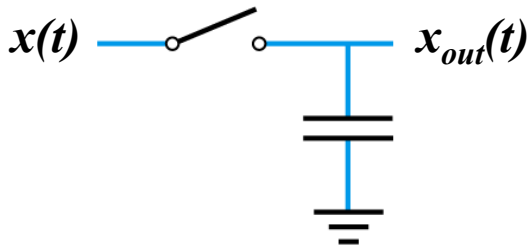
LSB	0	0	0	0	0	0	1	0
ADC reading	00000000	00000000	00000000	00000000	00000001	00000010	00000011	00000100
MSB	1	1	1	1	1	1	1	1



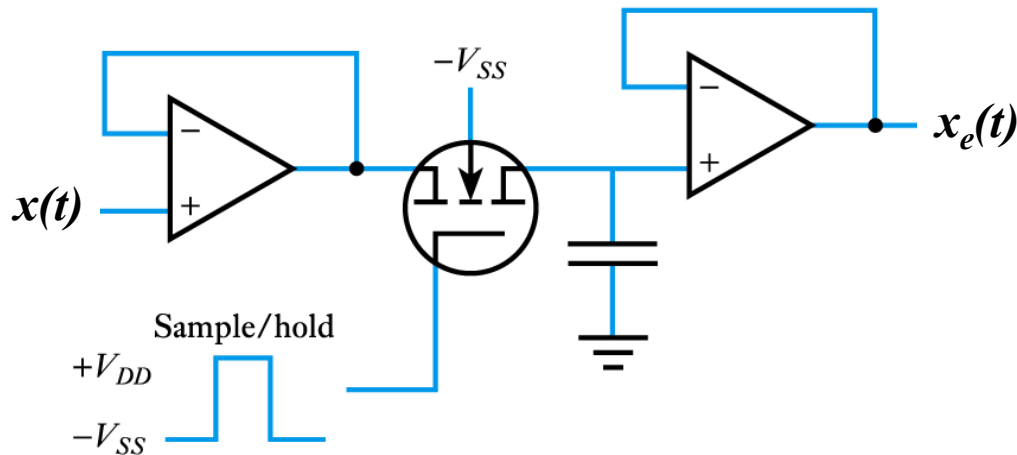
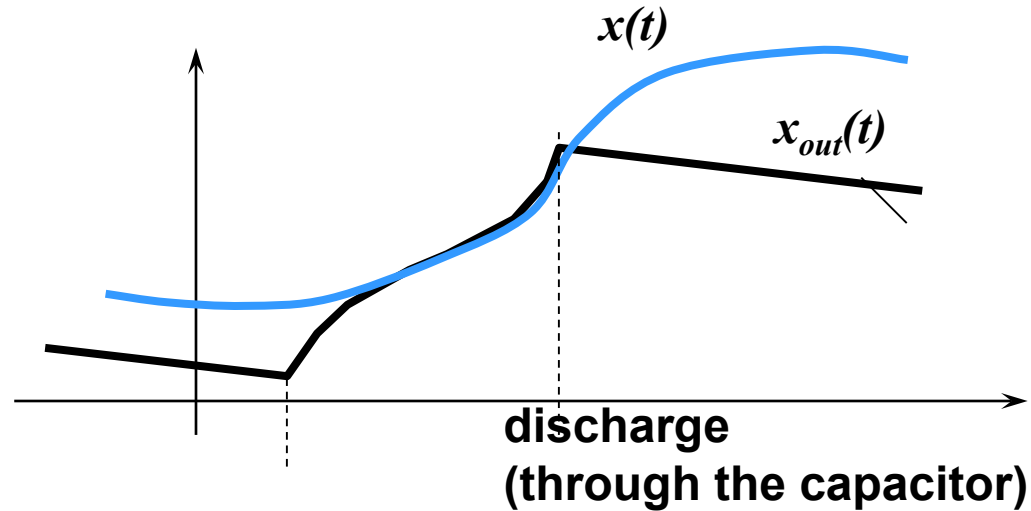
conversion time =  $n/f_0$

# Sample and hold (SH) circuits

- used in the input stage of A/D converters
- captures the voltage of a varying analog signal and keeps it at a constant level during the sampling time



(a) Basic arrangement



(b) A typical circuit

# Example

- We would like to convert a sinusoidal signal with the frequency  $f$  using a successive approximation converter with  $n$  bits and clock frequency  $f_o$ . Calculate a frequency above which we need to use a S/H circuit ( $n = 12$ ,  $f_o = 1\text{MHz}$ )
  - Conversion time  $t_c = n/f_o$
  - $u(t) = \hat{U} \cos(2\pi ft)$

**Condition** : change of  $u(t)$  during  $t_c \leq$  less than the quantization error

a smaller change of signal would not change the outcome of digitization

$$\Delta u(t)_{\max} \leq \frac{1}{2} \frac{FS}{2^n}$$

$$\Delta u(t)_{\max} = \frac{du(t)}{dt} \Delta t = \frac{du(t)}{dt} t_c = 2\pi f \hat{U}_{\max} t_c = 2\pi f \frac{FS}{2} t_c \leq \frac{1}{2} \frac{FS}{2^n}$$

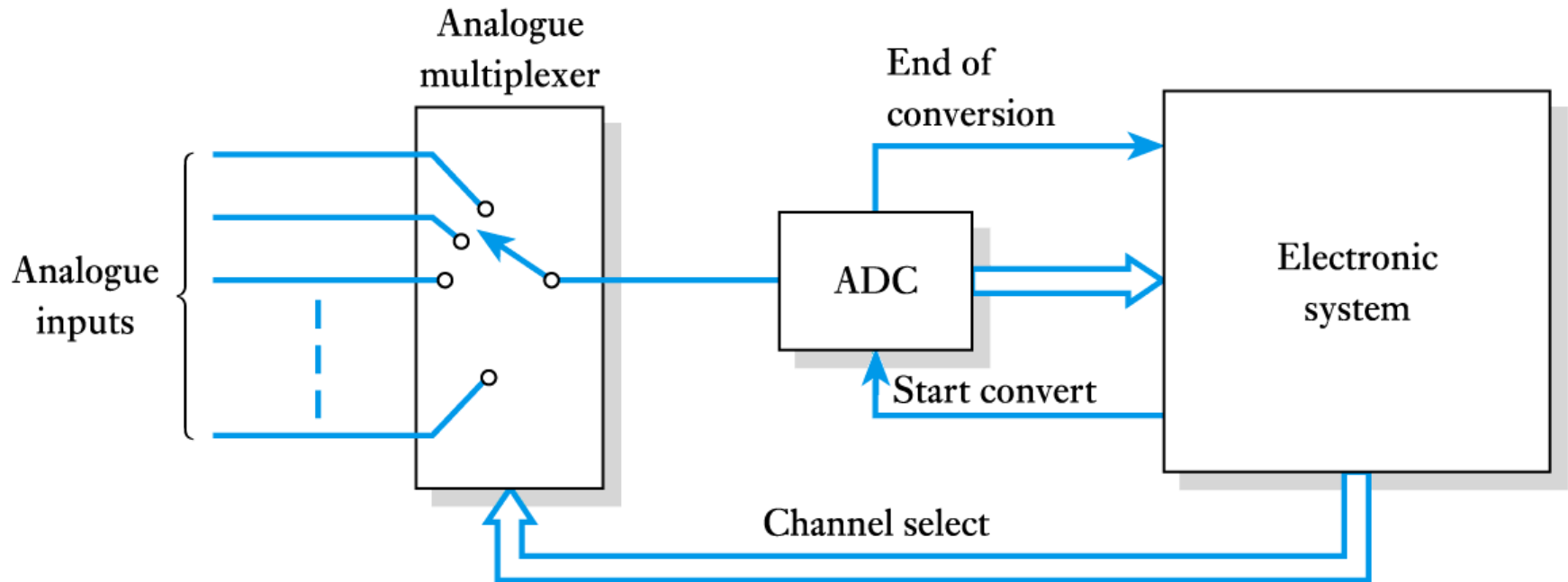
- Answer :  $t_c = 12\mu\text{s}$ ,  $f_{\text{limit}} = 3.2 \text{ Hz}$

$$f \leq \frac{1}{2\pi 2^n t_c} = f_{\text{limit}}$$

# Multiplexing

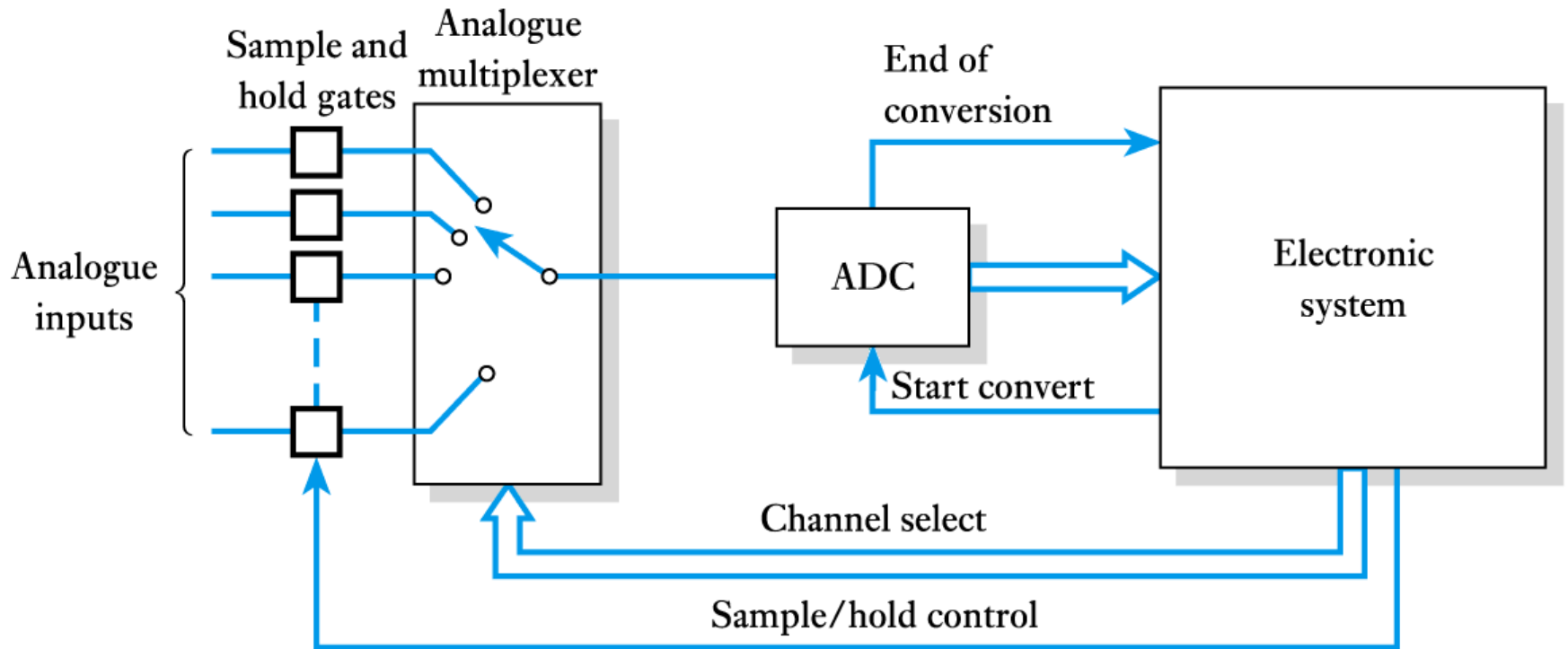
- Measurement instruments often have multiple inputs and outputs
- Instead of putting an A/D or D/A converter for every input/output, we can use multiplexing:
  - use an electronic switch for selecting input/output
  - antialiasing and reconstruction filters for each input/output

# Input multiplexing

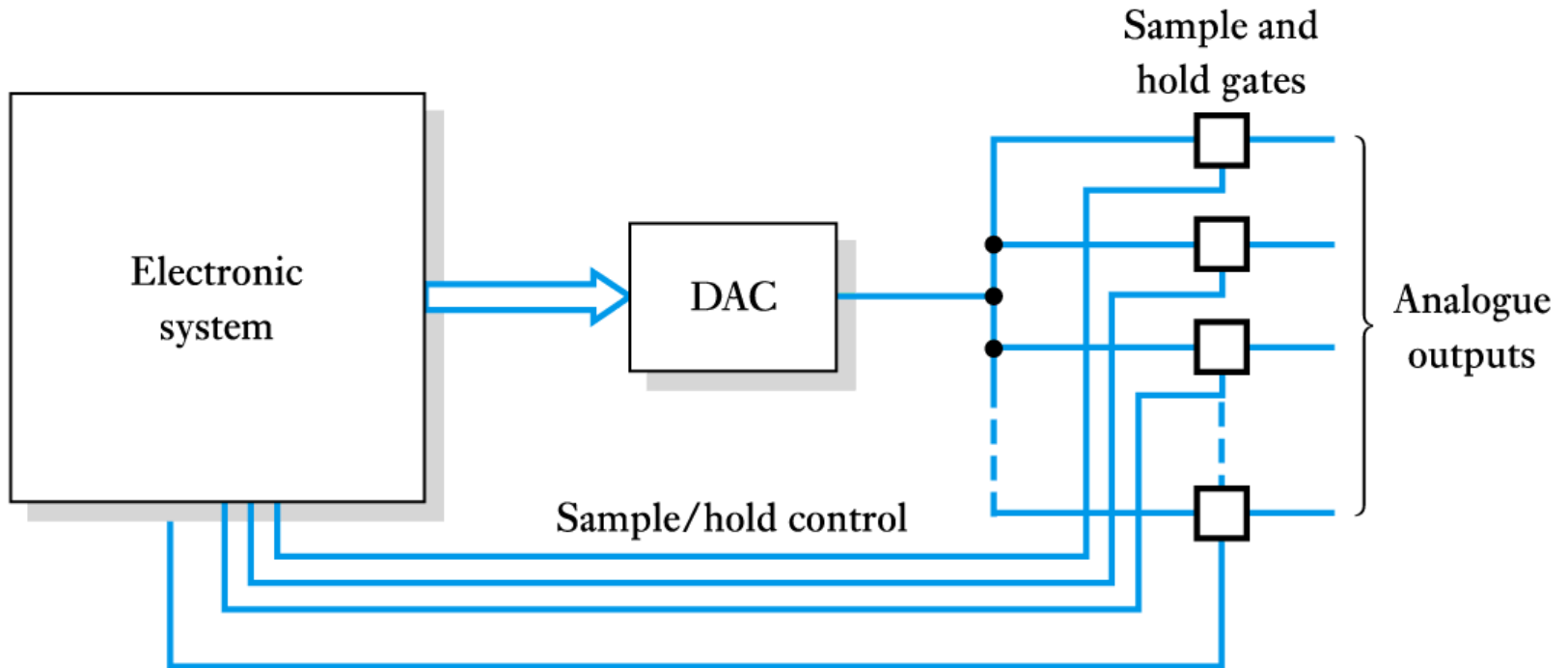




# Input multiplexing with SH



# Output multiplexing



# Key points

- The conversion from analog to digital forms requires sampling
- Sampling frequency  $f_s > 2f_{\max}$
- In order to eliminate components with undesired frequencies, the signal can be filtered using a low-pass filter (antialiasing filter) with a cut-off frequency  $f_c < f_s/2$
- Another low-pass filter allows us to reconstruct the signal by removing the high-frequency components due to sampling
- AD/DA converters
- SH circuits reduce conversion errors
- Multiplexing reduces the number of A/D and D/A converters and saves money