



Digital Signal Processing

EE 453 / CE 352
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What is a Signal?

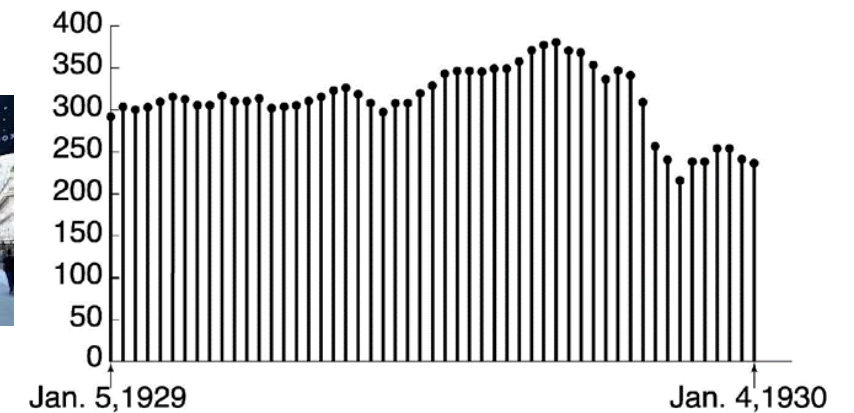
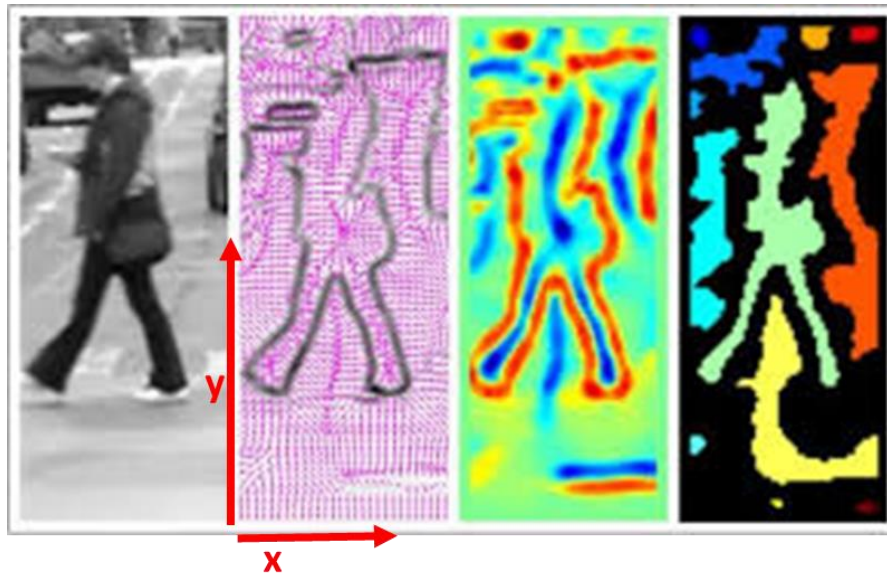
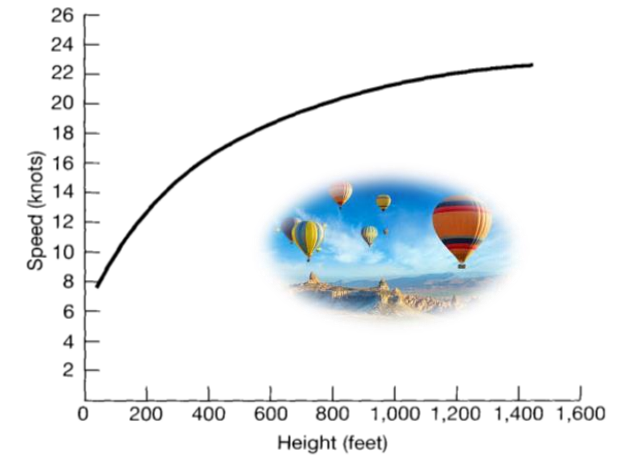
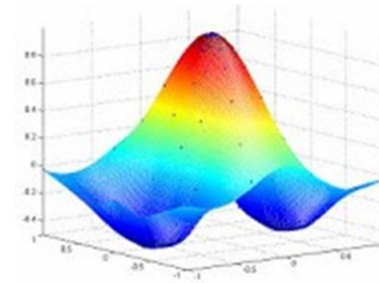
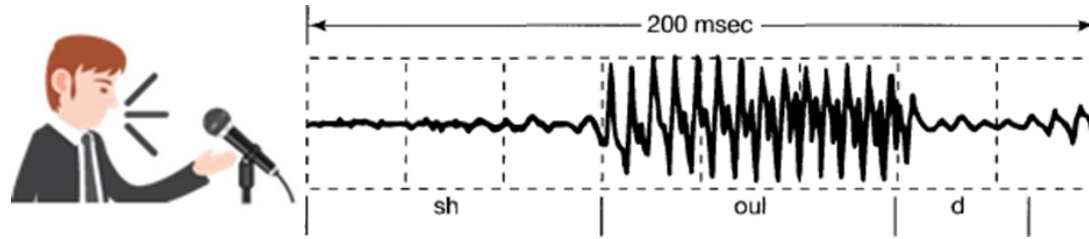
- A function of one or more independent variables.
- Contains information about the behavior/nature of some phenomenon.

For a function f :

$$y = f(x_1, x_2, \dots, x_n)$$

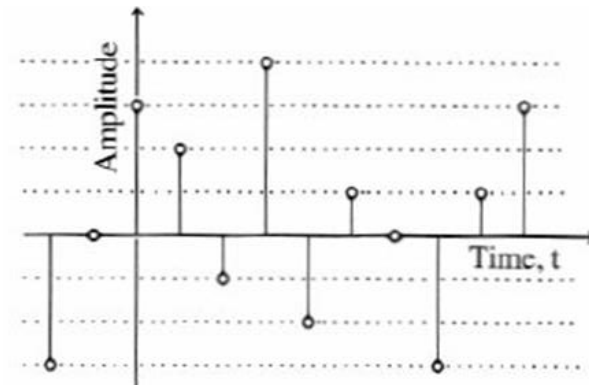
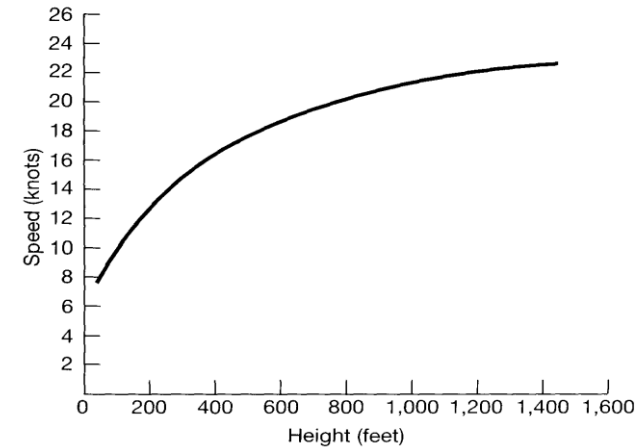
Each of x_1, x_2, \dots, x_n are called *independent variables*.
 y is a *dependent variable*.

What is a Signal?



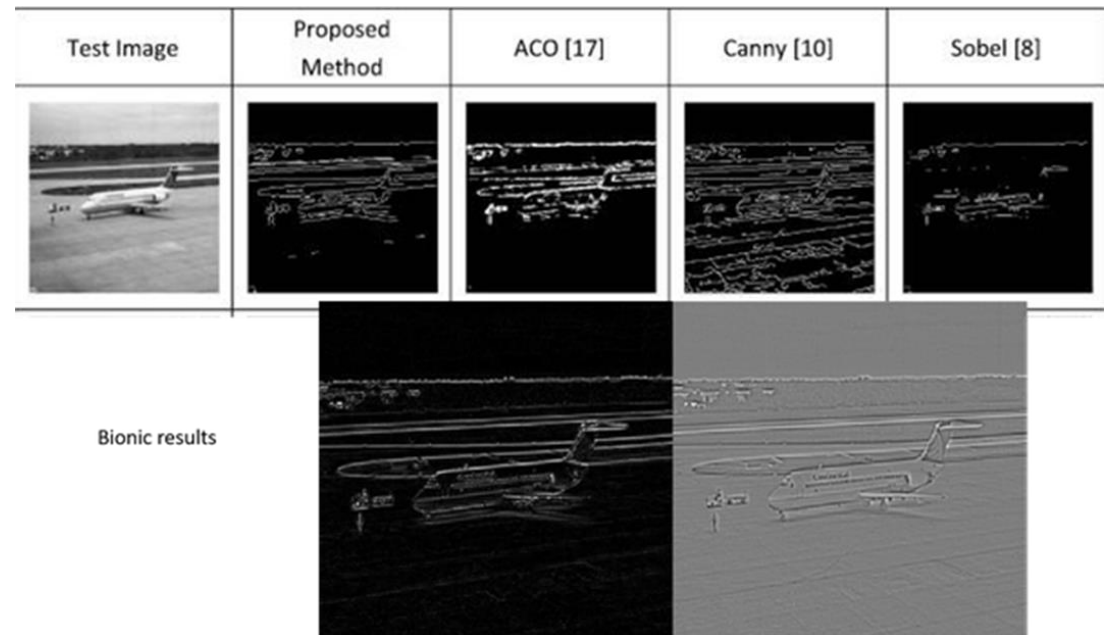
What is a Digital Signal?

- Analog Signal
 - Continuous-Time $\{x(t)\}$
AND
 - Continuous-Valued
- Digital Signal
 - Discrete-Time $\{x[n]\}$
AND
 - Discrete Valued



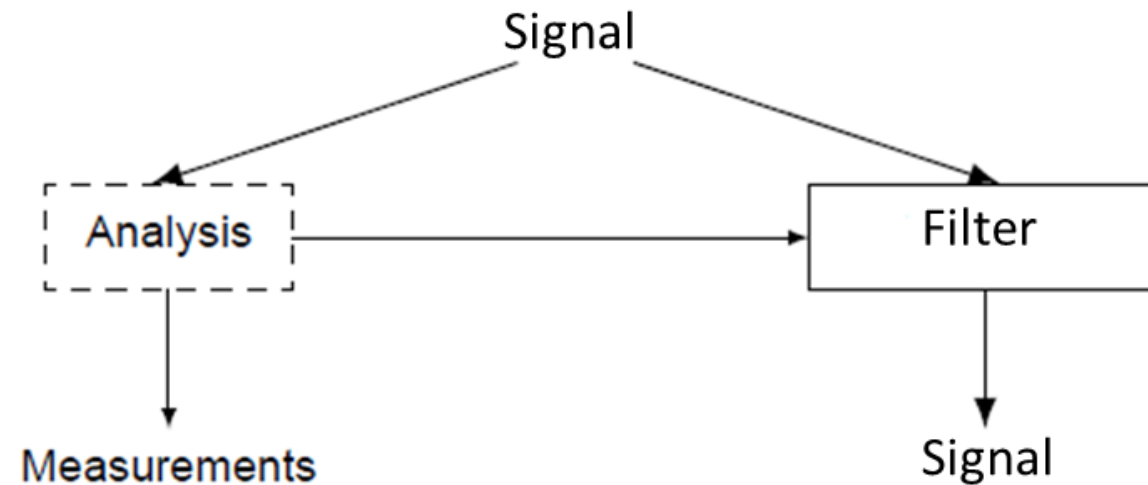
What is Signal Processing?

- Operations designed for:
 - Extracting useful information from a signal.
 - Transforming or enhancing the useful information in a signal.
- Examples
 - Speech recognition.
 - Speaker verification.
 - Target detection.
 - Image enhancement.
 - Noise removal



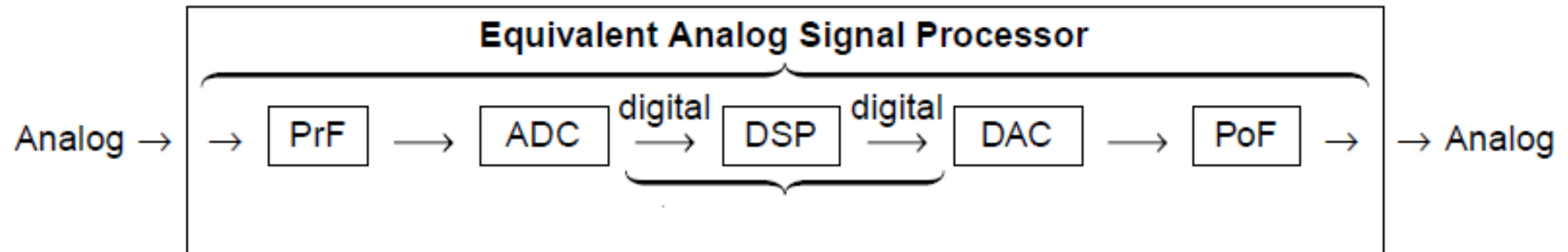
What is Signal Processing?

- Operations on signal that are designed for:
 - Extracting useful information from a signal ([Signal Analysis](#)).
 - Transforming or enhancing the useful information in a signal ([Signal Filtering](#)).

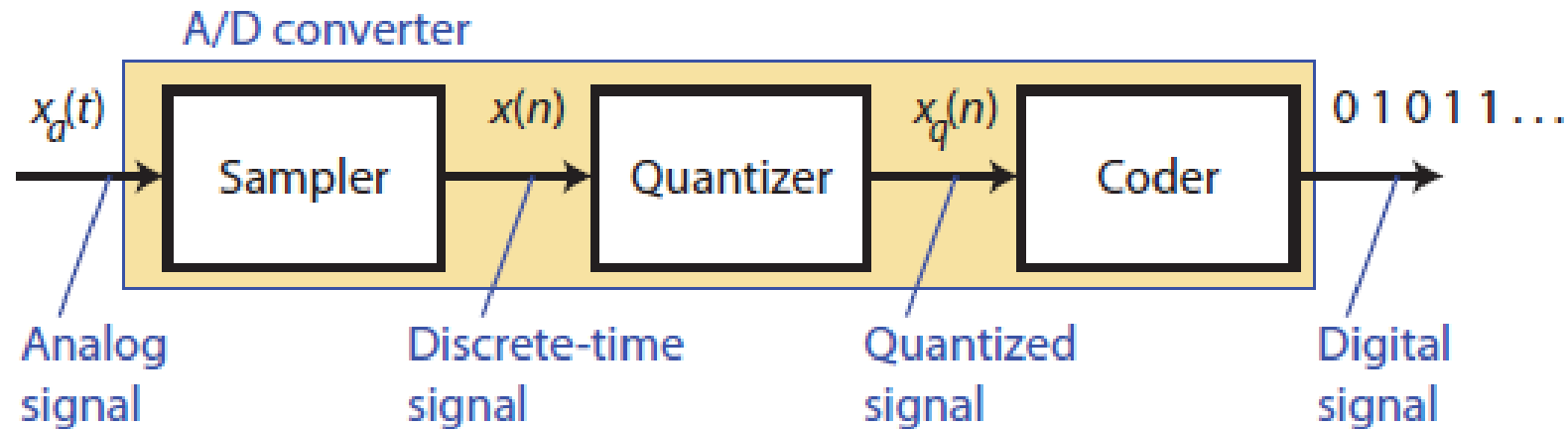
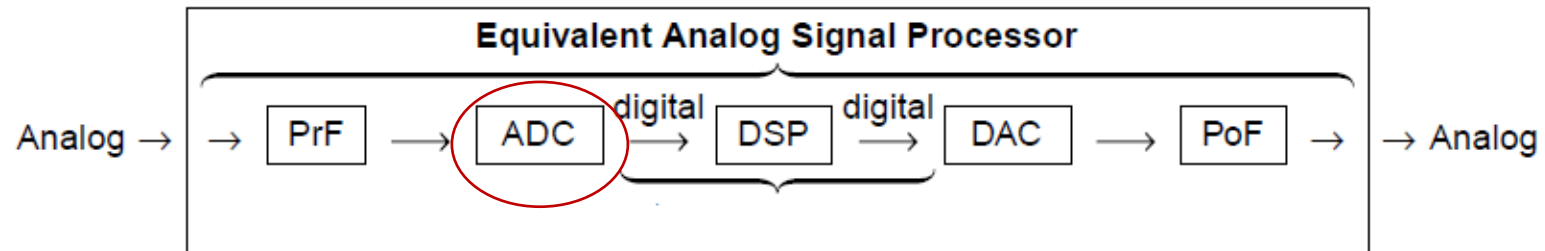


Signal Processing: Analog vs Digital

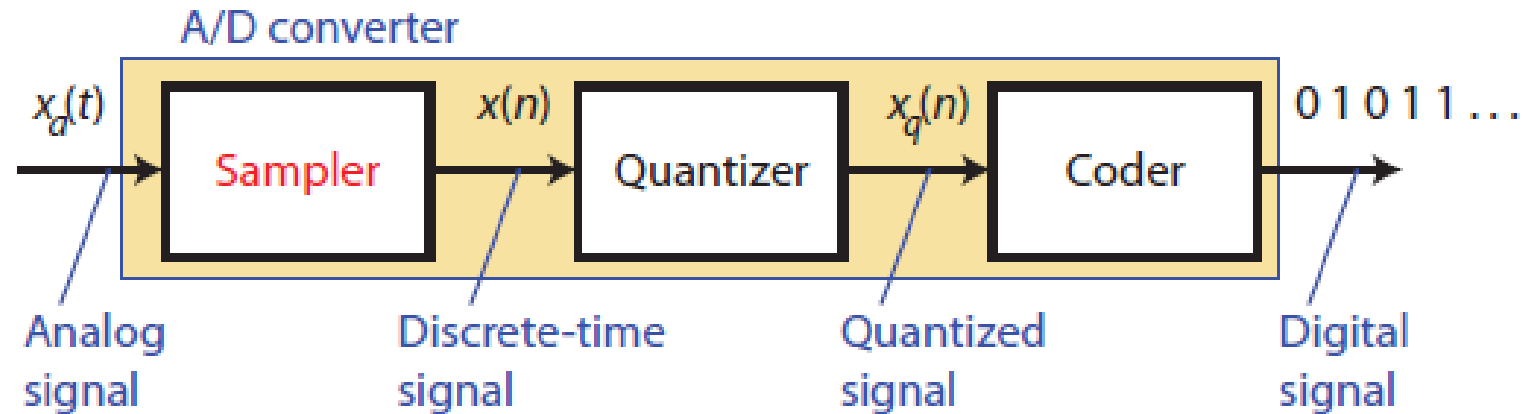
Analog signal: $x_a(t)$ \longrightarrow Analog signal processor $\longrightarrow y_a(t)$:Analog signal



Digital Signal Processing



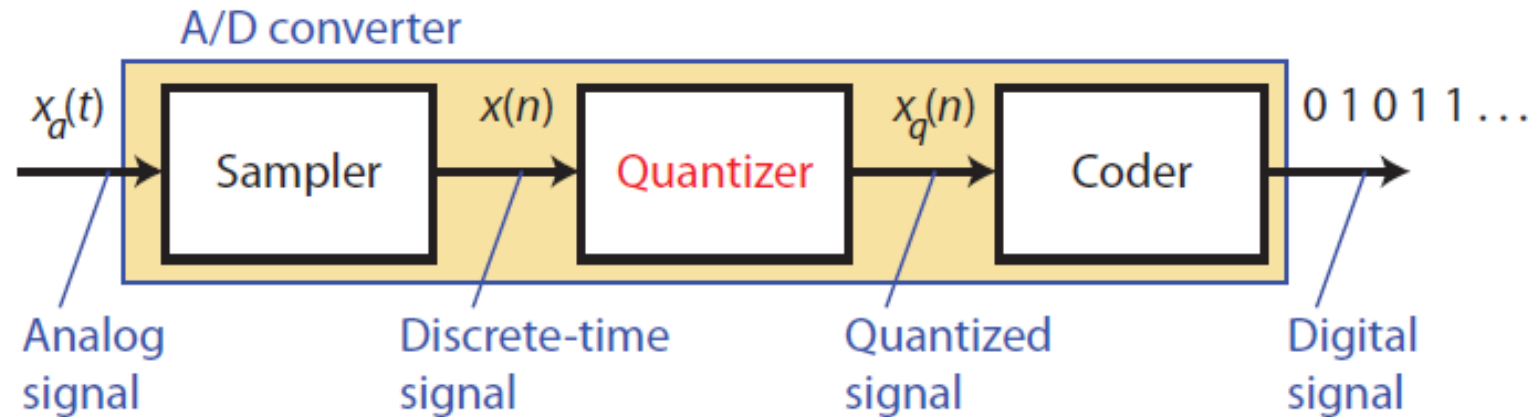
Analog-to-Digital Conversion



- Sampling

- Conversion from continuous-time to discrete-time by taking “samples” at discrete time instants.
- E.g., uniform sampling: $x(n) = x_a(nT)$
 - Where T is the sampling period and $n \in \mathbb{Z}$

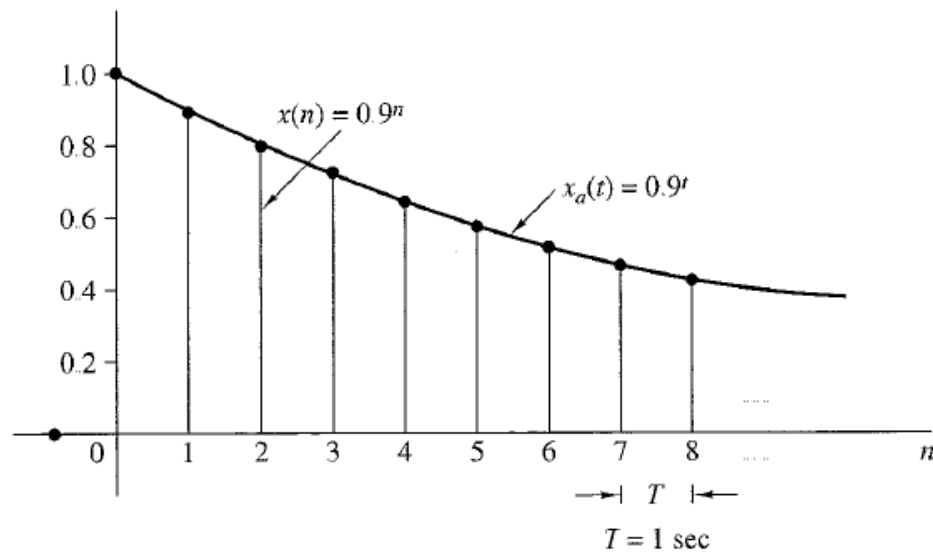
Analog-to-Digital Conversion



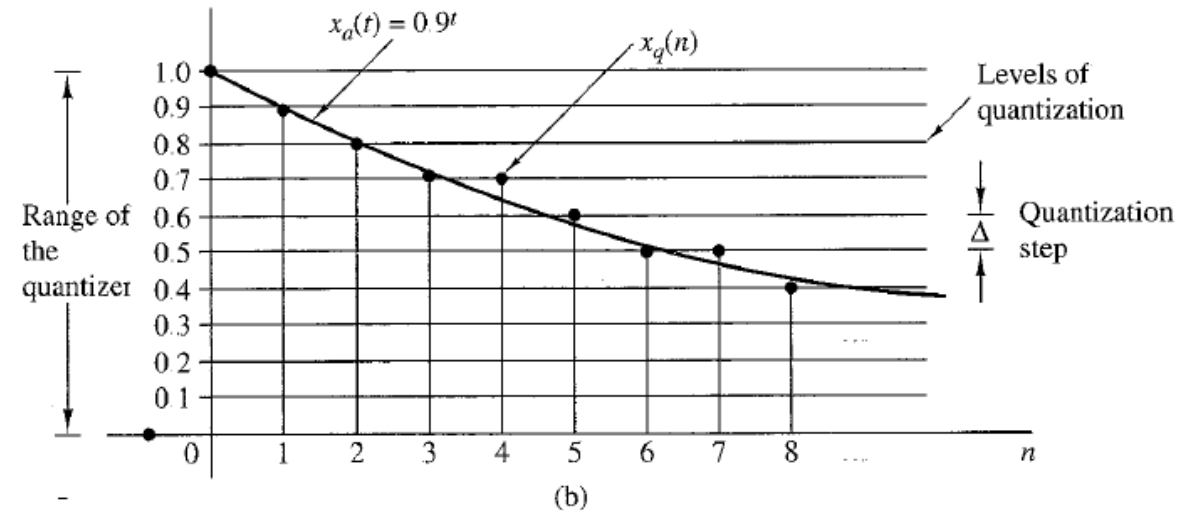
- Quantization

- Conversion from discrete-time, continuous-valued signal to discrete-time, discrete-valued signal by taking “samples” at discrete time instants.
- Quantization error: $e_q(n) = x_q(n) - x(n)$ for all $n \in \mathbb{Z}$

Analog-to-Digital Conversion



(a)

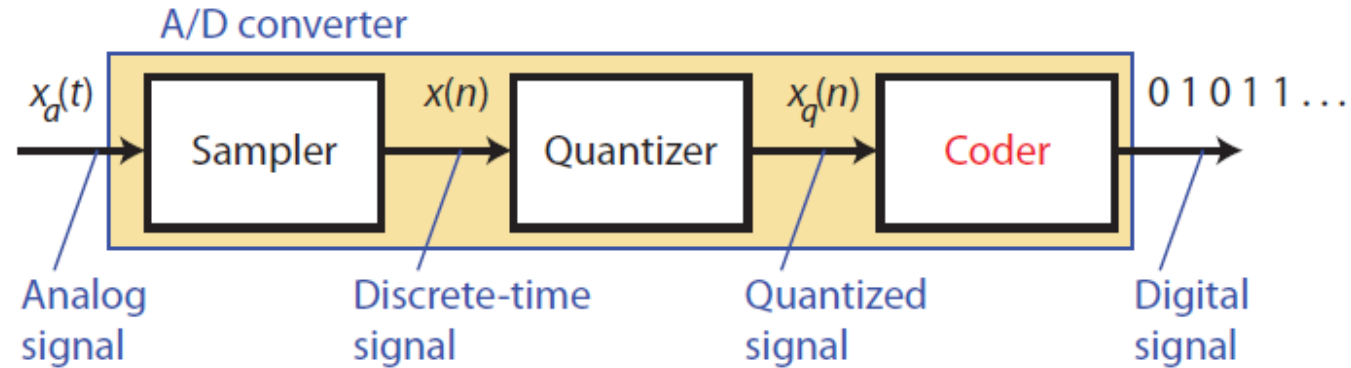


(b)

Analog-to-Digital Conversion

n	$x(n)$ Discrete-time signal	$x_q(n)$ (Truncation)	$x_q(n)$ (Rounding)	$e_q(n) = x_q(n) - x(n)$ (Rounding)
0	1	1.0	1.0	0.0
1	0.9	0.9	0.9	0.0
2	0.81	0.8	0.8	-0.01
3	0.729	0.7	0.7	-0.029
4	0.6561	0.6	0.7	0.0439
5	0.59049	0.5	0.6	0.00951
6	0.531441	0.5	0.5	-0.031441
7	0.4782969	0.4	0.5	0.0217031
8	0.43046721	0.4	0.4	-0.03046721
9	0.387420489	0.3	0.4	0.012579511

Analog-to-Digital Conversion



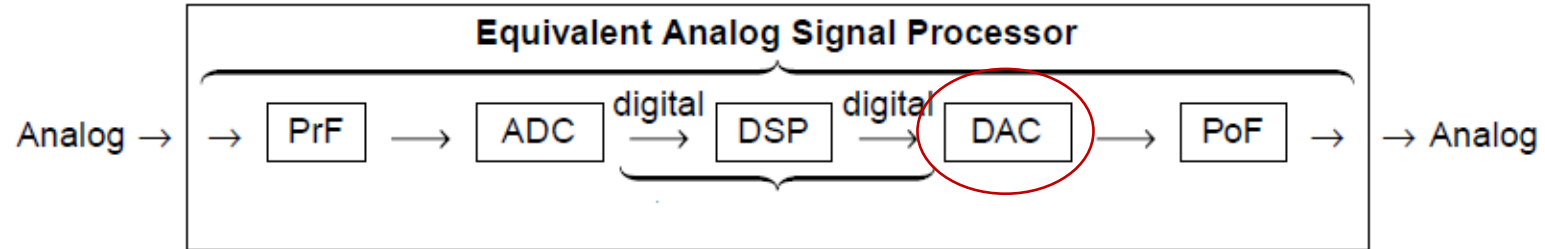
• Coding:

- Representation of each discrete-value $x_q(n)$ by a b -bit binary sequence
- If for any n , $x_q(n) \in \{0, 1, \dots, 6, 7\}$, then the coder may use the following mapping to code the quantized amplitude:

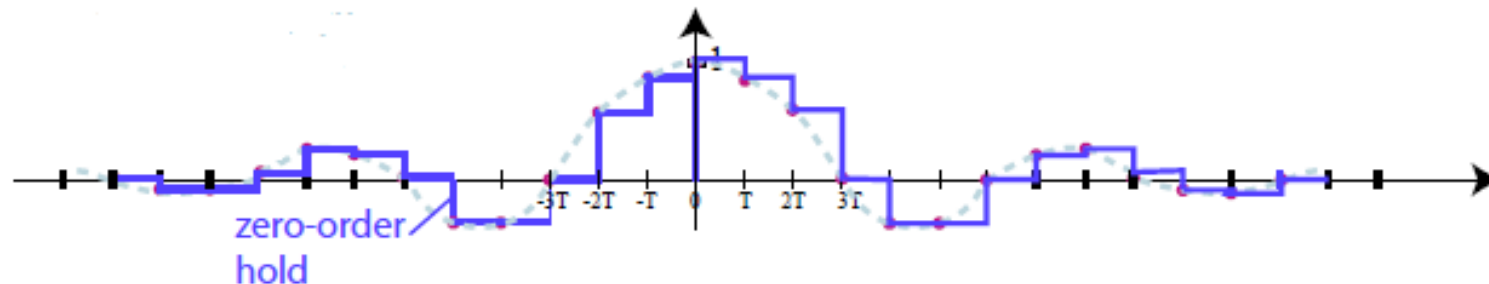
Example coder:

0	000	4	100
1	001	5	101
2	010	6	110
3	011	7	111

Digital-to-Analog Conversion

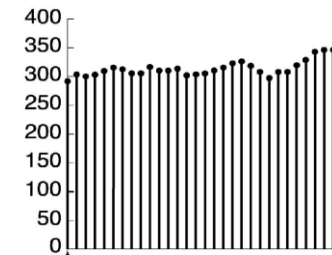


- Common Interpolation Approaches:
 - Zero-order hold, linear interpolation, higher-order interpolation.
 - In practice, “cheap” interpolation along with a smoothing filter is employed.



DSP: Without A/D Conversion

- Digital signal processing is not always applied in conjunction with A/D conversion.
- For Example: Stock analysis computer program



Advantages of Digital Signal Processing?

- Flexibility in reconfiguration
- Accuracy
 - Tolerances in analog circuit components
 - A digital system provides much better control of accuracy requirements by choosing appropriate A/D converter and the digital signal processor.
- More sophisticated signal processing algorithms
 - Difficult to perform precise mathematical operations in analog form (through active and passive circuit components).
- Cost
- Size/Weight

Limitations of Digital Signal Processing?

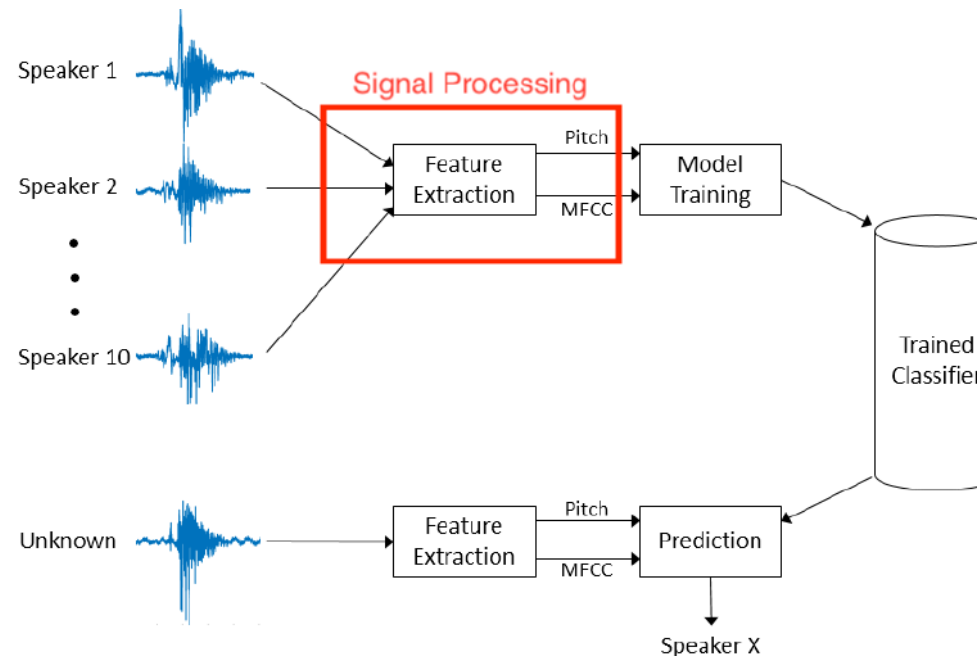
- Signals having extremely wide bandwidth require fast sampling-rate A/D converters and digital signal processors.
 - Example: Terahertz communication and sensing
- Digital signals take on values from a finite set of possible values, dictated by the word length (8, 16, 32 bit) of a digital computer, which causes complications in the analysis.
 - Finite-precision arithmetic effect
 - To avoid these complications, we initially neglect the quantized nature of digital signals and consider them as discrete time, continuous valued signals.

Application Domains of DSP

- Speech Processing
- Image and Video Processing
- Telecommunication
- Biomedical Signal Processing
- Financial Signal Processing

DSP and Machine Learning

- Signal processing and machine learning techniques work together in many applications.
 - Example: Speaker Identification



DSP Landscape: Three “Axes”

- Theory/algorithms
 - Fourier Analysis
 - Z-Transform
 - Filter Design
- Application domains
 - Speech processing
 - Image/video processing
 - Financial signal processing
- Implementation platforms
 - General purpose computers
 - Microcontrollers
 - Digital signal processors
 - FPGAs



The TX-2 Computer, Circa 1967

