Signals and Signal Processing

- Signals play an important role in our daily life
- A signal is a function of independent variables such as time, distance, position, temperature, and pressure
- Some examples of typical signals are shown next

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- Speech and music signals Represent air pressure as a function of time at a point in space
- Waveform of the speech signal "I like digital signal processing" is shown below



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- Electrocardiography (ECG) Signal -Represents the electrical activity of the heart
- A typical ECG signal is shown below



- The ECG trace is a periodic waveform
- One period of the waveform shown below represents one cycle of the blood transfer process from the heart to the arteries



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• Electroencephalogram (EEG) Signals -Represent the electrical activity caused by the random firings of billions of neurons in the brain

- Anno anonomina

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- Seismic Signals Caused by the movement of rocks resulting from an earthquake, a volcanic eruption, or an underground explosion
- The ground movement generates 3 types of elastic waves that propagate through the body of the earth in all directions from the source of movement

• Typical seismograph record





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• Black-and-white picture - Represents light intensity as a function of two spatial coordinates



• Video signals - Consists of a sequence of images, called frames, and is a function of 3 variables: 2 spatial coordinates and time



Frame 1



Frame 3





Frame 5

Click on the video

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Signals and Signal Processing

- Most signals we encounter are generated naturally
- However, a signal can also be generated synthetically or by a computer

Signals and Signal Processing

- A signal carries information
- Objective of signal processing: Extract the useful information carried by the signal
- Method information extraction: Depends on the type of signal and the nature of the information being carried by the signal
- This course is concerned with the discretetime representation of signals and their discrete-time processing

- **Types of signal**: Depends on the nature of the independent variables and the value of the function defining the signal
- For example, the independent variables can be continuous or discrete
- Likewise, the signal can be a continuous or discrete function of the independent variables

- Moreover, the signal can be either a realvalued function or a complex-valued function
- A signal generated by a single source is called a scalar signal
- A signal generated by multiple sources is called a vector signal or a multichannel signal

- A one-dimensional (1-D) signal is a function of a single independent variable
- A multidimensional (M-D) signal is a function of more than one independent variables
- The speech signal is an example of a 1-D signal where the independent variable is time

- An image signal, such as a photograph, is an example of a 2-D signal where the 2 independent variables are the 2 spatial variables
- A color image signal is composed of three 2-D signals representing the three primary colors: red, green and blue (RGB)

• The 3 color components of a color image are shown below



• The full color image obtained by displaying the previous 3 color components is shown below



- Each frame of a black-and-white digital video signal is a 2-D image signal that is a function of 2 discrete spatial variables, with each frame occurring at discrete instants of time
- Hence, black-and-white digital video signal can be considered as an example of a 3-D signal where the 3 independent variables are the 2 spatial variables and time

- A color video signal is a 3-channel signal composed of three 3-D signals representing the three primary colors: red, green and blue (RGB)
- For transmission purposes, the RGB television signal is transformed into another type of 3-channel signal composed of a luminance component and 2 chrominance components

- For a 1-D signal, the independent variable is usually labeled as time
- If the independent variable is continuous, the signal is called a continuous-time signal
- If the independent variable is discrete, the signal is called a discrete-time signal

- A continuous-time signal is defined at every instant of time
- A discrete-time signal is defined at discrete instants of time, and hence, it is a sequence of numbers
- A continuous-time signal with a continuous amplitude is usually called an analog signal
- A speech signal is an example of an analog signal

- A discrete-time signal with discrete-valued amplitudes represented by a finite number of digits is referred to as the digital signal
- An example of a digital signal is the digitized music signal stored in a CD-ROM disk
- A discrete-time signal with continuousvalued amplitudes is called a sampled-data signal

- A digital signal is thus a quantized sampleddata signal
- A continuous-time signal with discretevalue amplitudes is usually called a quantized boxcar signal
- The figure in the next slide illustrates the 4 types of signals



- The functional dependence of a signal in its mathematical representation is often explicitly shown
- For a continuous-time 1-D signal, the continuous independent variable is usually denoted by *t*
- For example, *u*(*t*) represents a continuoustime 1-D signal

- For a discrete-time 1-D signal, the discrete independent variable is usually denoted by
 n
- For example, {*v*[*n*]} represents a discretetime 1-D signal
- Each member, *v*[*n*], of a discrete-time signal is called a sample

- In many applications, a discrete-time signal is generated by sampling a parent continuous-time signal at uniform intervals of time
- If the discrete instants of time at which a discrete-time signal is defined are uniformly spaced, the independent discrete variable *n* can be normalized to assume integer values

- In the case of a continuous-time 2-D signal, the 2 independent variables are the spatial coordinates, usually denoted by *x* and *y*
- For example, the intensity of a black-andwhite image at location (*x*,*y*) can be expressed as *u*(*x*,*y*)

- On the other hand, a digitized image is a 2-D discrete-time signal, and its 2 independent variables are discretized spatial variables, often denoted by *m* and *n*
- Thus, a digitized image can be represented as v[m,n]
- A black-and-white video signal is a 3-D signal and can be represented as u(x,y,t)

• A color video signal is a vector signal composed of 3 signals representing the 3 primary colors: red, green, and blue

$$\mathbf{u}(x, y, t) = \begin{bmatrix} r(x, y, t) \\ g(x, y, t) \\ b(x, y, t) \end{bmatrix}$$

- A signal that can be uniquely determined by a well-defined process, such as a mathematical expression or rule, or table look-up, is called a deterministic signal
- A signal that is generated in a random fashion and cannot be predicted ahead of time is called a random signal

Typical Signal Processing Applications

- Most signal processing operations in the case of analog signals are carried out in the time-domain
- In the case of discrete-time signals, both time-domain or frequency-domain operations are usually employed

- Three most basic time-domain signal operations are scaling, delay, and addition
- Scaling is simply the multiplication of a signal either by a positive or negative constant
- In the case of analog signals, the operation is usually called amplification if the magnitude of the multiplying constant, called gain, is greater than 1

- If the magnitude of the multiplying constant is less than 1, the operation is called attenuation
- If x(t) is an analog signal that is scaled by a constant α, then the scaling operation generates a signal y(t) = α x(t)
- Two other elementary operations are integration and differentiation

• The integration of an analog signal *x*(*t*) generates a signal

$$y(t) = \int_{-\infty}^{t} x(\tau) d\tau$$

• The differentiation of an analog signal *x*(*t*) generates a signal

$$w(t) = \frac{dx(t)}{dt}$$

- The delay operation generates a signal that is a delayed replica of the original signal
- For an analog signal x(t),

$$y(t) = x(t - t_0)$$

is the signal obtained by delaying x(t) by the amount of time t_0 which is assumed to be a positive number

• If t_0 is negative, then it is an advance operation
Elementary Time-Domain Operations

- Many applications require operations involving two or more signals to generate a new signal
- For example,

$$y(t) = x_1(t) + x_2(t) + x_3(t)$$

is the signal generated by the addition of the three analog signals, $x_1(t)$, $x_2(t)$, and $x_3(t)$

Elementary Time-Domain Operations

• The product of 2 signals, $x_1(t)$ and $x_2(t)$, generates a signal

$$y(t) = x_1(t) \cdot x_2(t)$$

- The elementary operations discussed so far are also carried out on discrete-time signals
- More complex operations operations are implemented by combining two or more elementary operations

- Filtering is one of the most widely used complex signal processing operations
- The system implementing this operation is called a filter
- A filter passes certain frequency components without any distortion and blocks other frequency components

- The range of frequencies that is allowed to pass through the filter is called the passband, and the range of frequencies that is blocked by the filter is called the stopband
- In most cases, the filtering operation for analog signals is linear

• The filtering operation of a linear analog filter is described by the convolution integral

$$y(t) = \int_{-\infty}^{\infty} h(t-\tau) x(\tau) d\tau$$

where x(t) is the input signal, y(t) is the output of the filter, and h(t) is the impulse response of the filter

- A lowpass filter passes all low-frequency components below a certain specified frequency f_c , called the cutoff frequency, and blocks all high-frequency components above f_c
- A highpass filter passes all high-frequency components a certain cutoff frequency f_c and blocks all low-frequency components below

- A bandpass filter passes all frequency components between 2 cutoff frequencies, f_{c1} and f_{c2} , where $f_{c1} < f_{c2}$, and blocks all frequency components below the frequency f_{c1} and above the frequency f_{c2}
- A bandstop filter blocks all frequency components between 2 cutoff frequencies, f_{c1} and f_{c2} , where $f_{c1} < f_{c2}$, and passes all frequency components below the frequency f_{c1} and above the frequency f_{c2}

 Figures below illustrate the lowpass filtering of an input signal composed of 3 sinusoidal components of frequencies 50 Hz, 110 Hz, and 210 Hz



• Figures below illustrate highpass and bandpass filtering of the same input signal



- There are various other types of filters
- A filter blocking a single frequency component is called a notch filter
- A multiband filter has more than one passband and more than one stopband
- A comb filter blocks frequencies that are integral multiples of a low frequency

- In many applications the desired signal occupies a low-frequency band from dc to some frequency f_L Hz, and gets corrupted by a high-frequency noise with frequency components above f_H Hz with $f_H > f_L$
- In such cases, the desired signal can be recovered from the noise-corrupted signal by passing the latter through a lowpass filter with a cutoff frequency f_c where $f_L < f_c < f_H$

- A common source of noise is power lines radiating electric and magnetic fields
- The noise generated by power lines appears as a 6-Hz sinusoidal signal corrupting the desired signal and can be removed by passing the corrupted signal through a notch filter with a notch frequency at 60 Hz

- A signal can be real-valued or complexvalued
- For convenience, the former is usually called a real signal while the latter is called a complex signal
- A complex signal can be generated from a real signal by employing a Hilbert transformer

• The impulse response of a Hilbert transformer is given by

$$h_{HT}(t) = \frac{1}{\pi t}$$

Consider a real signal x(t) with a continuous-time Fourier transform (CTFT) X(jΩ) given by

$$X(j\Omega) = \int_{-\infty}^{\infty} x(t)e^{-j\Omega t}dt$$

- $X(j\Omega)$ is called the spectrum of x(t)
- The magnitude spectrum of a real signal exhibits even symmetry with respect to w while the phase spectrum exhibits odd symmetry
- The spectrum $X(j\Omega)$ of a real signal x(t) contains both positive and negative frequencies

• Thus we can write

 $X(j\Omega) = X_p(j\Omega) + jX_n(j\Omega)$ where $X_p(j\Omega)$ is the portion of $X(j\Omega)$ occupying the positive frequency range and $X_n(j\Omega)$ is the portion of $X(j\Omega)$ occupying the negative frequency range

- If x(t) is passed through a Hilbert transformer, its output y(t) is given by: $y(t) = \int_{-\infty}^{\infty} h_{HT}(t-\tau)x(\tau)d\tau$
- The spectrum $Y(j\Omega)$ of y(t) is given by the product of the CTFTs of $h_{HT}(t)$ and x(t)

- The CTFT $H_{HT}(j\Omega)$ of $h_{HT}(t)$ is given by $H_{HT}(j\Omega) = \begin{cases} -j, \ \Omega > 0 \\ j, \ \Omega < 0 \end{cases}$
- Therefore

$$Y(j\Omega) = H_{HT}(j\Omega)X(j\Omega)$$
$$= -jX_p(j\Omega) + jX_n(j\Omega)$$

As the magnitude and phase of Y(jΩ) are an even and odd function, respectively, it follows from

 $Y(j\Omega) = -j X_p(j\Omega) + j X_n(j\Omega)$ that y(t) is also a real function

• Consider the complex signal g(t):

g(t) = x(t) + j y(t)

- The CTFT of g(t) is thus given by $G(j\Omega) = X(j\Omega) + jY(j\Omega) = 2X_p(j\Omega)$
- In other words, the complex signal *g*(*t*), called an analytic signal, has only positive frequency components

$$x(t) \longrightarrow \begin{array}{c} \text{Hilbert} \\ \text{Transformer} \end{array} y(t) \text{ imaginary part} \\ g(t) = x(t) + j y(t) \end{array}$$

Modulation and Demodulation

- For efficient transmission of a lowfrequency signal over a channel, it is necessary to transform the signal to a highfrequency signal by means of a modulation operation
- At the receiving end, the modulated highfrequency signal is demodulated to extract the desired low-frequency signal

Modulation and Demodulation

- There are 4 major types of modulation of analog signals:
 - (1) Amplitude modulation
 - (2) Frequency modulation
 - (3) Phase modulation
 - (4) Pulse amplitude modulation

- Amplitude modulation is conceptually simple
- Here, the amplitude of a high-frequency sinusoidal signal Acos(Ω₀t), called the carrier signal, is varied by the low-frequency signal x(t), called the modulating signal
- Process generates a high-frequency signal, called modulated signal, *y*(*t*) given by:

$$y(t) = Ax(t)\cos(\Omega_0 t)$$

- Thus, amplitude modulation can be implemented by forming the product of the modulating signal with the carrier signal
- To demonstrate the frequency translating property, let

$$x(t) = \cos(\Omega_1 t)$$

where

$$\Omega_1 \ll \Omega_0$$

• Then

$$y(t) = A\cos(\Omega_{1}t) \cdot \cos(\Omega_{0}t)$$
$$= \frac{A}{2}\cos((\Omega_{0} + \Omega_{1})t)\frac{A}{2}\cos((\Omega_{0} - \Omega_{1})t)$$

• The CTFT of $Y(j\Omega)$ of y(t) is given by $Y(j\Omega) = \frac{A}{2} X (j(\Omega - \Omega_0)) + \frac{A}{2} X (j(\Omega + \Omega_0))$

where $X(j\Omega)$ is the CTFT of x(t)

• Spectra of the modulating signal *x*(t) and the modulated signal *y*(*t*) are shown below



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- As can be seen from the figures on the previous slide, y(t) is a bandlimited high-frequency signal with a bandwidth of $2\Omega_m$ centered at Ω_0
- The portion of the amplitude-modulated signal between Ω_0 and $\Omega_0 + \Omega_m$ is called the upper sideband, whereas, the portion of the amplitude-modulated signal between Ω_0 and $\Omega_0 \Omega_m$ is called the lower sideband

- Because of the generation of two sidebands and the absence of a carrier component in the modulated signal, the process is called double-sideband suppress carrier (DSB-SC) modulation
- The demodulation of *y*(*t*) to recover *x*(*t*) is carried out in two stages

- First, y(t) is multiplied with a sinusoidal signal of the same frequency as the carrier: $r(t) = y(t)\cos\Omega_0 t = Ax(t)\cos^2\Omega_0 t$ $= \frac{A}{2}x(t) + \frac{A}{2}x(t)\cos(2\Omega_0 t)$
- The result indicates that r(t) is composed of x(t) scaled by a factor 1/2 and an amplitidemodulated signal with a carrier frequency $2\Omega_0$

• The spectrum $R(j\Omega)$ of r(t) is shown below



- Thus x(t) can be recovered from r(t) by passing it through a lowpass filter with a cutoff frequency at Ω_c satisfying the relation $\Omega_m < \Omega_c < 2\Omega_0 - \Omega_m$
- The modulation and demodulation schemes are as shown below:



- In general, it is difficult to ensure that the demodulating sinusoidal signal has a frequency identical to that of the carrier
- To get around the above problem, the modulation process is modified so that the transmitted signal includes the carrier signal

• This is achieved by redefining the amplitude modulation operation as follows: $y(t) = A[1 + m x(t)]\cos(\Omega_0 t)$ where *m* is a number chosen to ensure that

where *m* is a number chosen to ensure that [1 + m x(t)] is positive for all *t*

• As the carrier is also present in the modulated signal, the process is called double-sideband (DSB) modulation

Figure below shows the waveforms of a modulating sinusoidal signal of frequency 20 Hz and the amplitude-modulated carrier with a carrier frequency 400 Hz obtained using the DSB modulation scheme and m = 0.5





- In the case of the conventional DSB amplitude modulation scheme, the modulated signal has a bandwidth of $2\Omega_m$, whereas the bandwidth of the modulating signal is Ω_m
- To increase the capacity of the transmission medium, either the upper sideband or the lower sideband of the modulated signal is transmitted

• The corresponding procedure is called single-sideband (SSB) modulation, a possible implentation of which is shown below $A\cos\Omega_0 t$



• The spectra of pertinent signals in the SSB modulation scheme are shown in the next slide
Amplitude Modulation



- The DSB amplitude modulation is half as efficient as SSB amplitude modulation
- The quadrature amplitude modualtion (QAM) method uses DSB modulation to modulate two different signals so that they both occupy the same bandwidth
- Hence, QAM takes up as much bandwidth as the SSB method

• Consider two bandlimited signals $x_1(t)$ and $x_2(t)$ with a bandwidth of Ω_m as indicated below



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• The two modulating signals are individually modulated by the two carrier signals $A\cos(\Omega_0 t)$ and $A\sin(\Omega_0 t)$, respectively, and are summed, resulting in

 $y(t) = Ax_1(t)\cos(\Omega_0 t) + Ax_2(t)\sin(\Omega_0 t)$

• The two carrier signals have the same carrier frequency Ω_0 but have a phase difference of 90°

- The carrier $A\cos(\Omega_0 t)$ is called the in-phase component and the carrier $A\sin(\Omega_0 t)$ is called the quadrature component
- The spectrum Y(jΩ) of the composite signal y(t) is given by

$$Y(j\Omega) = \frac{A}{2} \{ X_1 (j(\Omega - \Omega_0) + X_1 (j(\Omega + \Omega_0)) \}$$
$$+ \frac{A}{2j} \{ X_2 (j(\Omega - \Omega_0) - X_2 (j(\Omega + \Omega_0)) \}$$

- *y*(*t*) is seen to occupy the same bandwidth as the modulated signal obtained by a DSB modulation
- To recover x₁(t) and x₂(t), y(t) is multiplied by both the in-phase and the quadrature components of the carrier separately, resulting in

$$r_{1}(t) = y(t)\cos(\Omega_{0}t)$$
$$r_{2}(t) = y(t)\sin(\Omega_{0}t)$$

• Substituting the expression for *y*(*t*) in both of the last two equations, we obtain after some algebra

$$r_{1}(t) = \frac{A}{2}x_{1}(t) + \frac{A}{2}x_{1}(t)\cos(2\Omega_{0}t) + \frac{A}{2}x_{2}(t)\sin(2\Omega_{0}t)$$
$$r_{2}(t) = \frac{A}{2}x_{2}(t) + \frac{A}{2}x_{1}(t)\sin(2\Omega_{0}t) - \frac{A}{2}x_{2}(t)\cos(2\Omega_{0}t)$$

• Lowpass filtering of $r_1(t)$ and $r_2(t)$ by filters with a cutoff at Ω_m yields $x_1(t)$ and $x_2(t)$

• The QAM modulation and demodulation schemes are shown below



- For an efficient utilization of a wideband transmission channel, many narrowbandwidth low-frequency signals are combined for a composite wideband signal that is transmitted as a single signal
- The process of combining the lowfrequency signals is called multiplexing

- Multiplexing is implemented to ensure that a replica of each of the original narrowbandwidth low-frequency signal can be recovered at the receiving end
- The recovery process of the low-frequency signals is called demultiplexing

- One method of combining different voice signals in a telephone communication system is the frequency-division multiplexing (FDM) scheme
- Here, each voice signal, typically bandlimited to a low-frequency band of width Ω_m , is frequency-translated into a higher frequency band using the amplitude modulation method

- The carrier frequency of adjacent amplitude-modulated signals is separated by Ω_0 , where $\Omega_0 > 2\Omega_m$ to ensure that there is no overlap in the spectra of the individual modulated signals after they are added to form the baseband composite signal
- The composite signal is then modulated onto the main carrier developing the FDM signal and transmitted



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- At the receiving end, the composite baseband signal is first recovered from the FDM signal by demodulation
- Then each individual frequency-translated signal is demultiplexed by passing the composite signal through a bank of bandpass filters

- The center frequency of each bandpass filter has a value same as that of its carrier frequency and bandwidth slightly greater than $2\Omega_m$
- The output of each bandpass filter is then demodulated to recover a scaled replica of its corresponding voice signal

- Absence of drift in the filter characteristics
 - Processing characteristics are fixed, e.g. by binary coefficients stored in memories
 - Thus, they are independent of the external environment and of parameters such as temperature
 - Aging has no effect

- Improved quality level
 - Quality of processing limited only by economic considerations
 - Arbitrarily low degradations achieved with desired quality by increasing the number of bits in data/coefficient representation
 - An increase of 1 bit in the representation results in a 6 dB improvement in the SNR

- Reproducibility
 - Component tolerances do not affect system performance with correct operation
 - No adjustments necessary during fabrication
 - No realignment needed over lifetime of equipment

- Ease of new function development
 - Easy to develop and implement adaptive filters, programmable filters and complementary filters
 - Illustrates flexibility of digital techniques

- Multiplexing
 - Same equipment can be shared between several signals, with obvious financial advantages for each function
- Modularity
 - Uses standard digital circuits for implementation

- Total single chip implementation using VLSI technology
- No loading effect

Limitations of DSP

- Lesser Reliability
 - Digital systems are active devices, and thus use more power and are less reliable
 - Some compensation is obtained from the facility for automatic supervision and monitoring of digital systems

Limitations of DSP

- Limited Frequency Range of Operation
 - Frequency range technologically limited to values corresponding to maximum computing capacities that can be developed and exploited
- Additional Complexity in the Processing of Analog Signals
 - A/D and D/A converters must be introduced adding complexity to overall system

DSP Application Examples

- Cellular Phone
- Discrete Multitone Transmission
- Digital Camera
- Digital Sound Synthesis
- Signal Coding & Compression
- Signal Enhancement

Cellular Phone Block Diagram



97 Courtesy : Texas Instruments

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Cellular Phone Baseband System on a Chip



- 100-200 MHz DSP + MCU
- ASIC Logic
- Dense Memory
- Analog

Discrete Multitone Transmission (DMT)

- Core technology in the implementation of the asymmetric digital subscriber line (ADSL) and very-high-rate digital subscriber line (VDSL)
- Closely related to: Orthogonal frequencydivision multiplexing (OFDM)

ADSL

- A local transmission system designed to simultaneously support three services on a single twisted-wire pair:
 - Data transmission downstream (toward the subscriber) at bit rates of upto 9 Mb/s
 - Data transmission upstream (away from the subscriber) at bit rates of upto 1 Mb/s
 - Plain old telephone service (POTS)

ADSL

• Band-allocations for an FDM-based ADSL system





- Asymmetry in the frequency band allocation:
 - to bring movies, television, video catalogs, remote CD-ROMs, corporate LANs, and the Internet into homes and small businesses

VDSL

- Optical network emanating from twisted pair provides data rates of 13 to 26 Mb/s downstream and 2 to 3 Mb/s upstream over short distances less than about 1 km
- Allows the delivery of digital TV, super-fast Web surfing and file transfer, and virtual offices at home

Discrete Multitone Transmission

- Advantages in using DMT for ADSL and VDSL
 - The ability to maximize the transmitted bit rate
 - Adaptivity to changing line conditions
 - Reduced sensitivity to line conditions

OFDM

- Applications:
 - Wireless communications an effective technique to combat multipath fading
 - Digital audio broadcasting
- Uses a fixed number of bits per subchannel while DMT uses loading for bit allocation

OFDM

- Basic differences with DMT architecture
 - Signal constellation encoder does not include a loading algorithm for bit allocation
 - In the transmitter, an upconverter included after the D/A converter to translate the transmitted frequency
 - In the receiver, a downconverter included before the A/D converter to undo the frequency translation

Digital Camera

- CMOS Imaging Sensor
 - Increasingly being used in digital cameras
 - Single chip integration of sensor and other image processing algorithms needed to generate final image
 - Can be manufactured at low cost
 - Less expensive cameras use single sensor with individual pixels in the sensor covered with either a red, a green, or a blue optical filter

Digital Camera

- Image Processing Algorithms
 - Bad pixel detection and masking
 - Color interpolation
 - Color balancing
 - Contrast enhancement
 - False color detection and masking
 - Image and video compression
Digital Camera

• Bad Pixel Detection and Masking



Digital Camera

• Color Interpolation and Balancing



- Four methods for the synthesis of musical sound:
 - Wavetable Synthesis
 - Spectral Synthesis
 - Nonlinear Synthesis
 - Synthesis by Physical Modeling

Wavetable Synthesis

- Recorded or synthesized musical events stored in internal memory and played back on demand

- Playback tools consists of various techniques for sound variation during reproduction such as **pitch shifting**, **looping**, **enveloping** and **filtering**

- Example: Giga Sampler 🍕

Spectral Synthesis

- Produces sounds from frequency domain models
- Signal represented as a superposition of basis functions with time-varying amplitudes
- Practical implementation usually consist of a combination of **additive synthesis**, **subtractive synthesis** and **granular synthesis**
- Example: Kawaii K500 Demo 🐗

- Nonlinear Synthesis
 - **Frequency modulation method**: Timedependent phase terms in the sinusoidal basis functions
 - An inexpensive method frequently used in synthesizers and in sound cards for PC
 - Example: Variation modulation index complex algorithm (Pulsar)

- Physical Modeling
 - Models the sound production method
 - Physical description of the main vibrating structures by partial differential equations
 - Most methods based on wave equation describing the wave propagation in solids and in air
 - Examples: (CCRMA, Stanford)
 - Guitar with nylon strings 🍕
 - Marimba 🍕
 - Tenor saxophone 🍕

Signal Coding & Compression

 Concerned with efficient digital representation of audio or visual signal for storage and transmission to provide maximum quality to the listener or viewer

Signal Compression Example 16-bit, sampled at 44.1 kHz rate

-1

0

Original speech (
 Data size 330,780 bytes (0.5)



- Sampled at 22.050 kHz, Data size 16,896 bytes

- Compressed speech (Lernout & Hauspie CELP 4.8kbit/s)
- 117 Sampled at 8 kHz, Data size 2,302 bytes

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3

2

Time. sec.

Signal Compression Example

 Original music Audio Format: PCM 16.000 kHz, 16 Bit (Data size 66206 bytes)

 Compressed music Audio Format: GSM 6.10, 22.05 kHz (Data size 9295 bytes)

Courtesy: Dr. A. Spanias

Signal Compression Example





Original Lena 8 bits per pixel Compressed Image Average bit rate - 0.5 bits per pixel

Signal Enhancement

- Purpose: To emphasize specific signal features to provide maximum quality to the listener or viewer
- For speech signals, algorithms include removal of background noise or interference
- For image or video signals, algorithms include contrast enhancement, sharpening and noise removal

 Noisy speech signal (10% impulse noise)



• Noise removed speech 🍕



EKG corrupted with 60 Hz interference

EKG after filtering with a notch filter



• Original image and its contrast enhanced version





Original

Enhanced Copyright © 2002 S. K. Mitra

• Original image and its contrast enhanced version



Enhanced Copyright © 2002 S. K. Mitra

• Noise corrupted image and its noise-removed version







Noise-removed version