

# Video Compression

# 視訊壓縮

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with slides by Wen-Hsiao Peng,

Shao-Yi Chien,

Hsueh-Ming Hang,

and Aggelos K. Katsaggelos

Week	Date	Topic	Assignments
1	2025-09-01		
2	2025-09-08	Introduction to Image and Video Processing	
3	2025-09-16	Signals and Systems	#1 – Color Transform, due: 2025-09-29 1:19pm
4	2025-09-22	Fourier Transform and Sampling	
5	2025-09-29	教師節補假	
6	2025-10-06	中秋節	
7	2025-10-13	Fourier Transform and Sampling	#2 – 2D-DCT, due: 2025-10-27 1:59pm
8	2025-10-20	Motion Estimation	Final project assigned (group together in fours)
9	2025-10-27	Lossless Compression	#3 – MEMC, due: 2025-11-10 1:59pm
10	2025-11-03	Image Compression	
11	2025-11-10	Video Compression	#4 – Entropy coding, due: 2025-11-24 1:59pm
12	2025-11-17	Learning-based Image/Video Compression	
13	2025-11-24	Paper Presentation	
14	2025-12-01	Guest Lecturer –   	
15	2025-12-08	Guest Lecturer –   	
16	2025-12-15	Final Project Presentation	

# Introduction to Image and Video Processing

with slides by Wen-Hsiao Peng, Shao-Yi Chien, Hsueh-Ming Hang, and Aggelos K. Katsaggelos



# Introduction to Image and Video Processing

- Analog v.s. Digital Signals
- Image and Video Signals



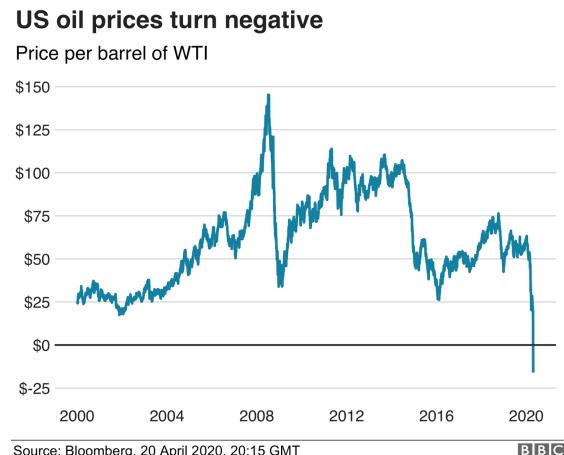
# Introduction to Image and Video Processing

- **Analog v.s. Digital Signals**
- Image and Video Signals

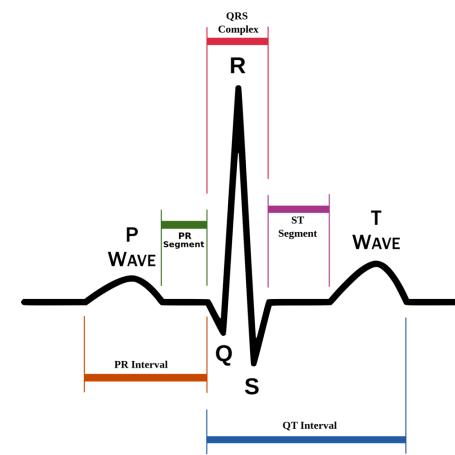


# Signals

- A **function** containing **information** about the behavior or the nature of some phenomenon of interest.
  - $X(t)$
  - $X(t_1, t_2)$
- In the physical world, any quantity exhibiting variation in time and/or space is potentially a signal.



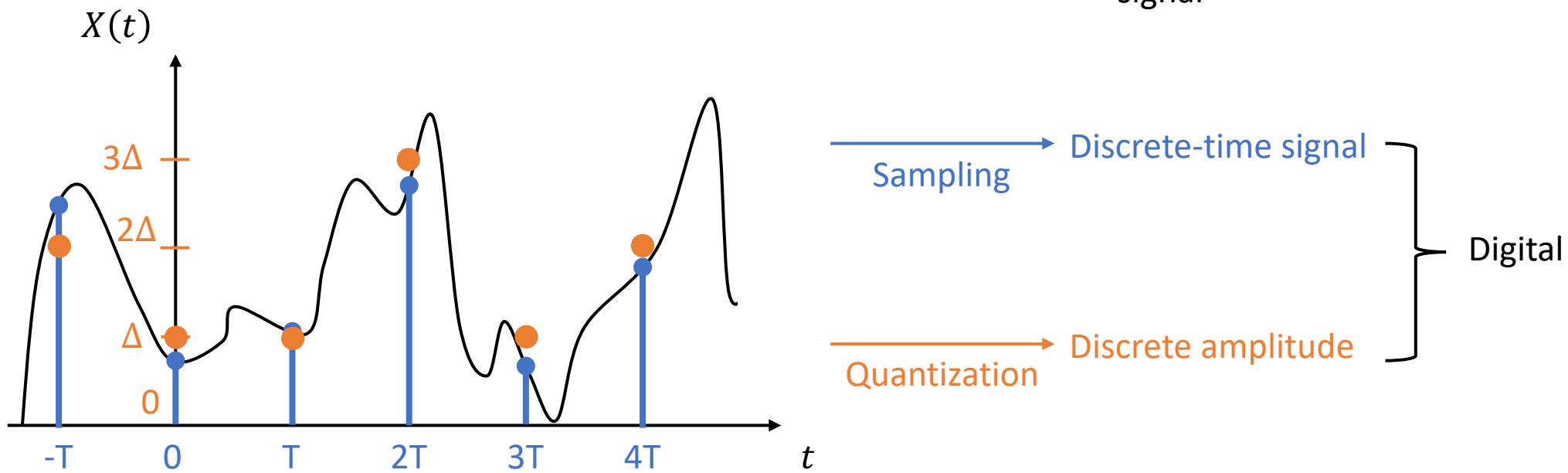
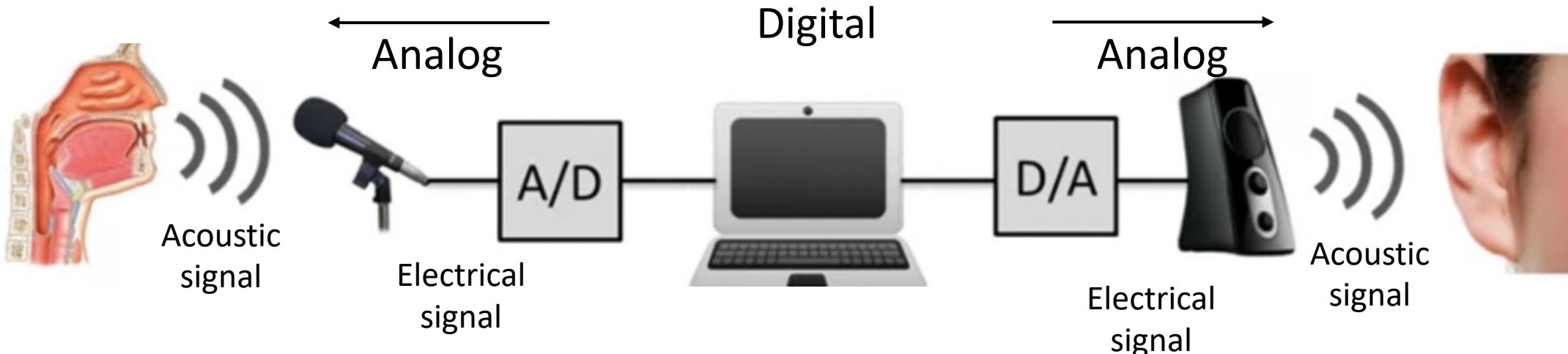
The price of the oil over the years.



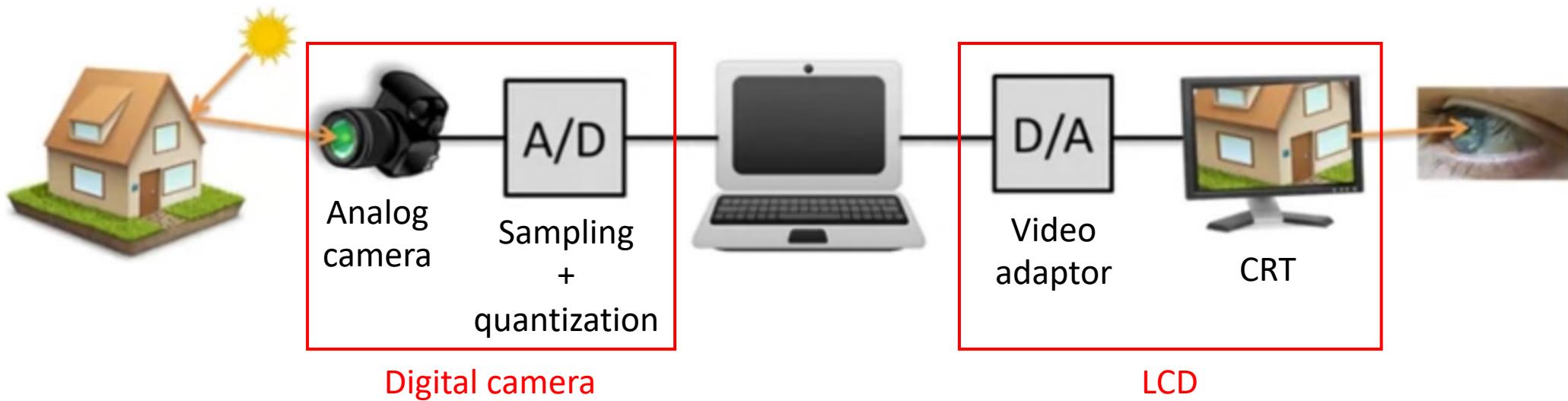
An EKG signal and electrocardiogram.



# Analog vs Digital Signals



# Analog vs Digital Signals

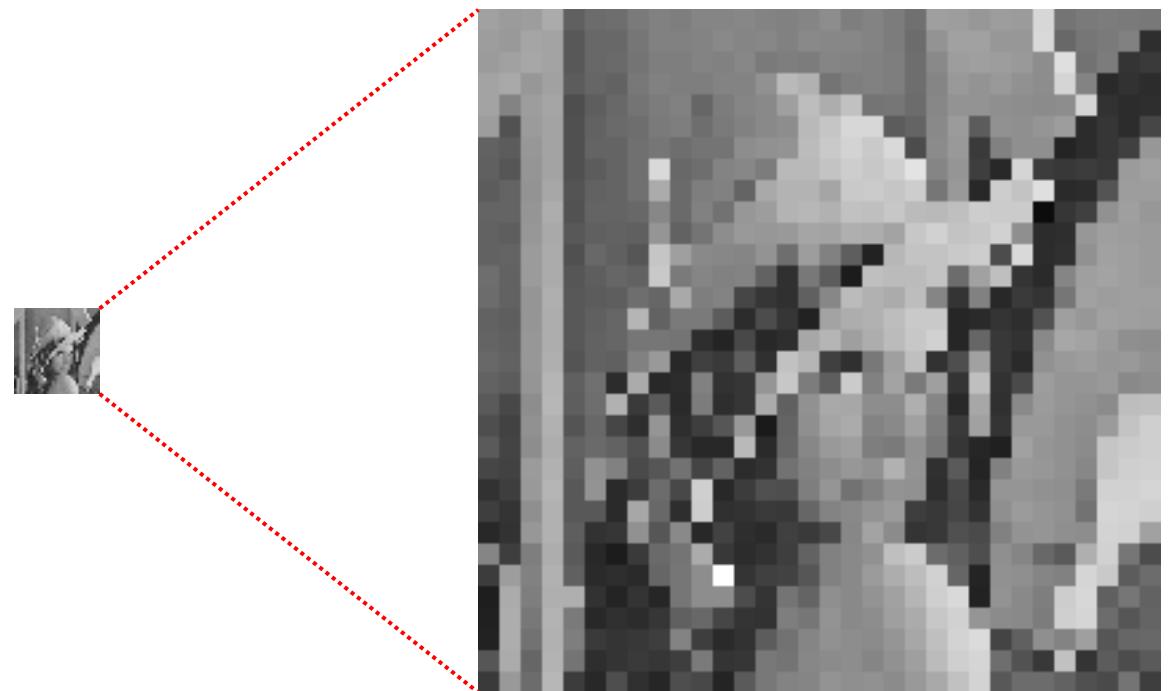


# Sampling

256



Pixel: picture element  
 $2^8$  levels

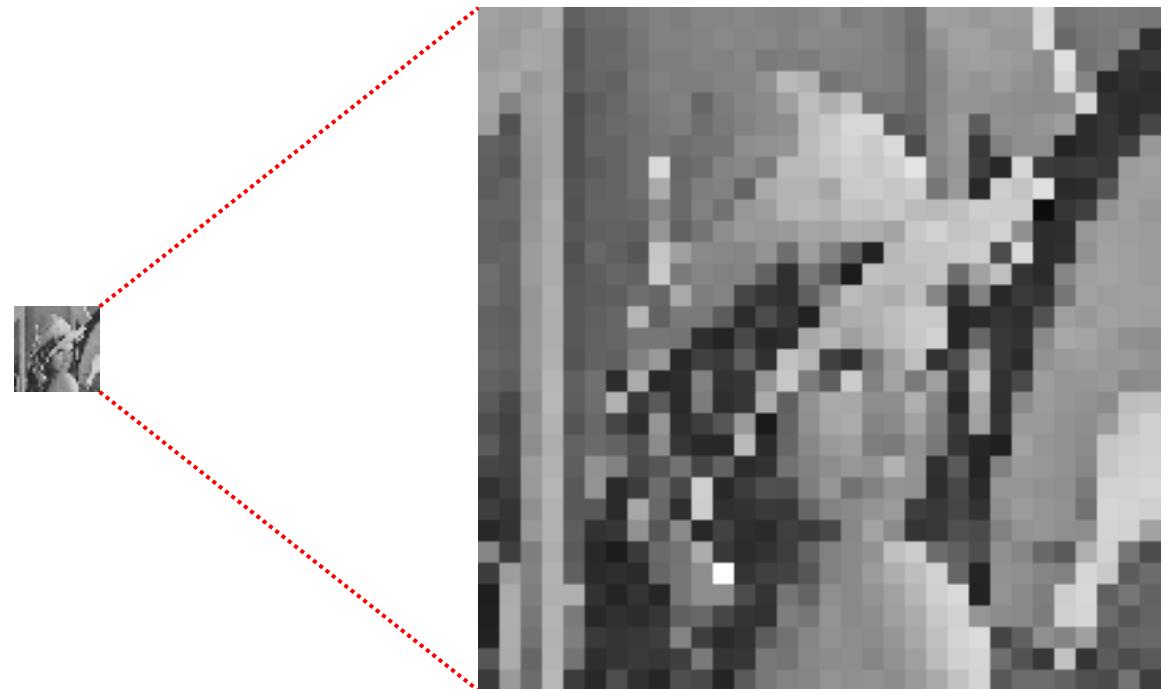


# Sampling

256



Pixel: picture element  
 $2^8$  levels



# Quantization



8 bits per pixel  
 $2^8 = 256$



4 bits per pixel  
 $2^4 = 16$



2 bits per pixel  
 $2^2 = 4$



# Introduction to Image and Video Processing

- Analog v.s. Digital Signals
- **Image and Video Signals**

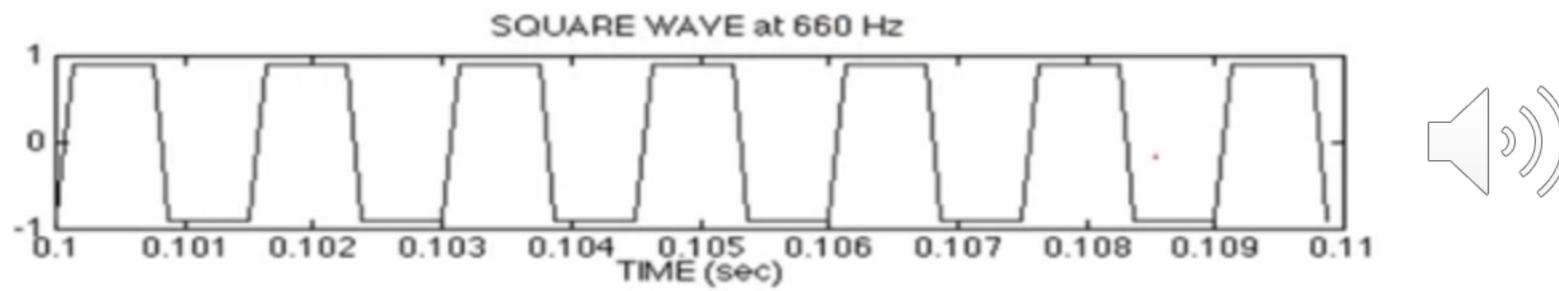
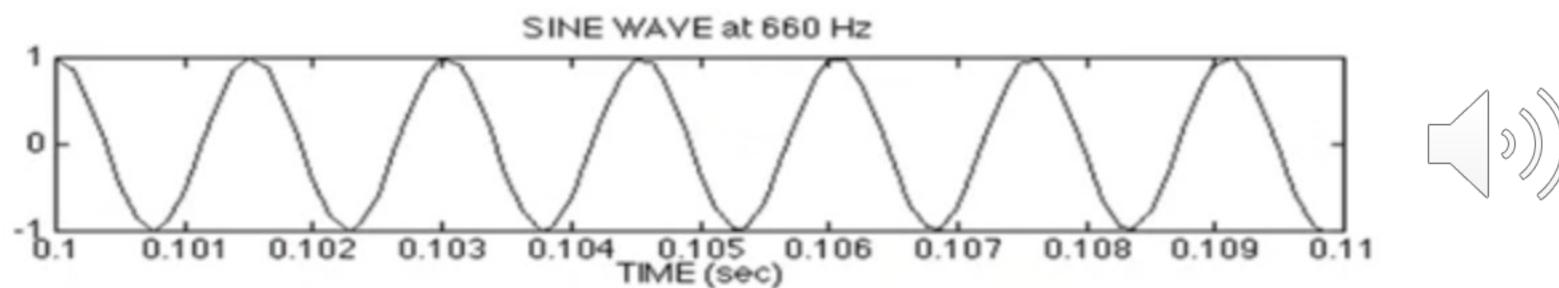


# Images and Videos

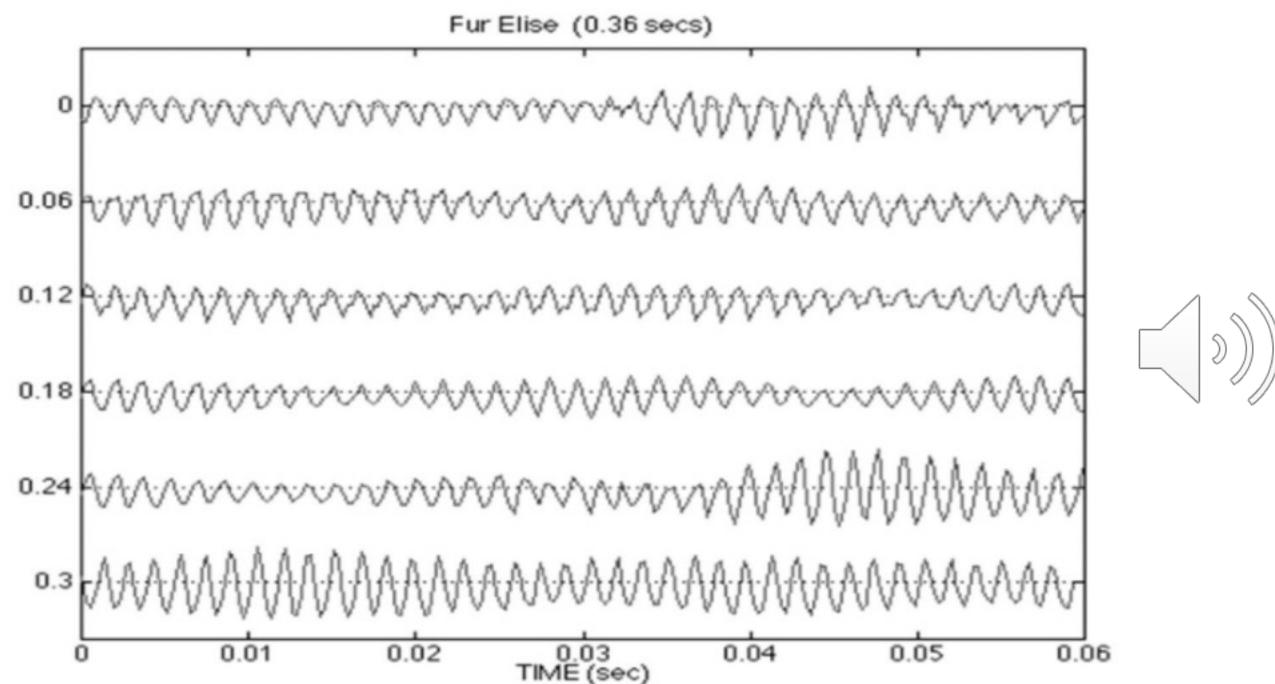
- **1D**: tones, speech, audio, biomedical, remote sensing, etc.
  - $S(t)$
  - $S(n)$
- **2D**: text, grayscale, color, multispectral, hyperspectral, images, etc.
  - $S(x, y)$
- **3D**: video, 3D volume, etc.
  - $S(x, y, t)$
  - $S(x, y, z)$
- **MD**: video of a volume, etc.
  - $S(x, y, z, t)$



# 1D Signals: Tones



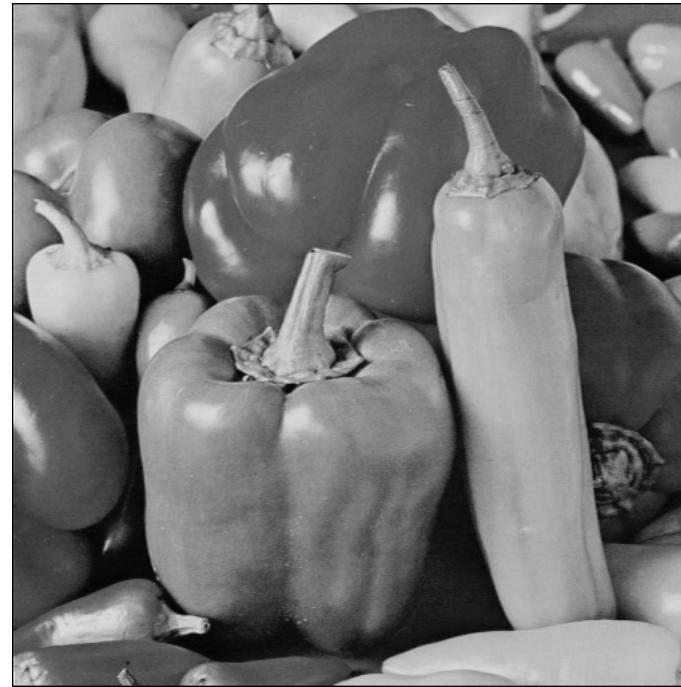
# 1D Signals: Piano Piece



# Images



1 bit per pixel



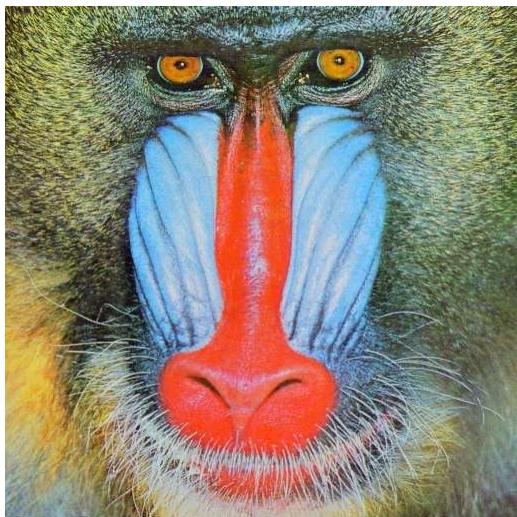
8 bits per pixel



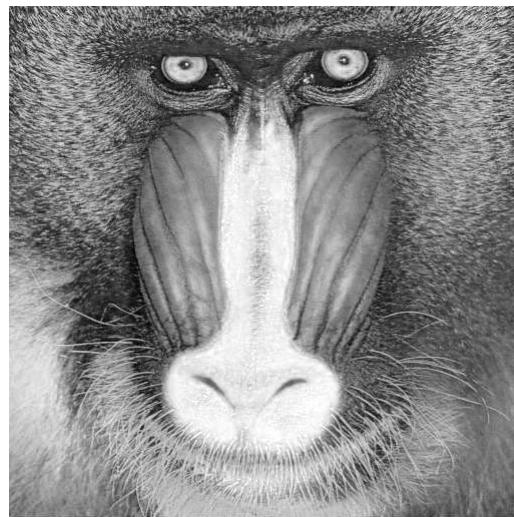
24 bits per pixel



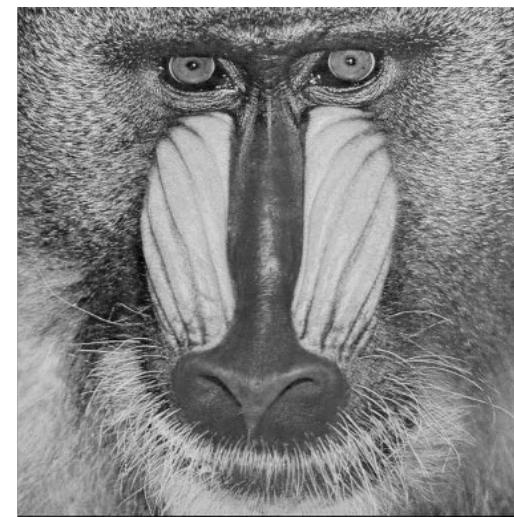
# RGB Color Image



R



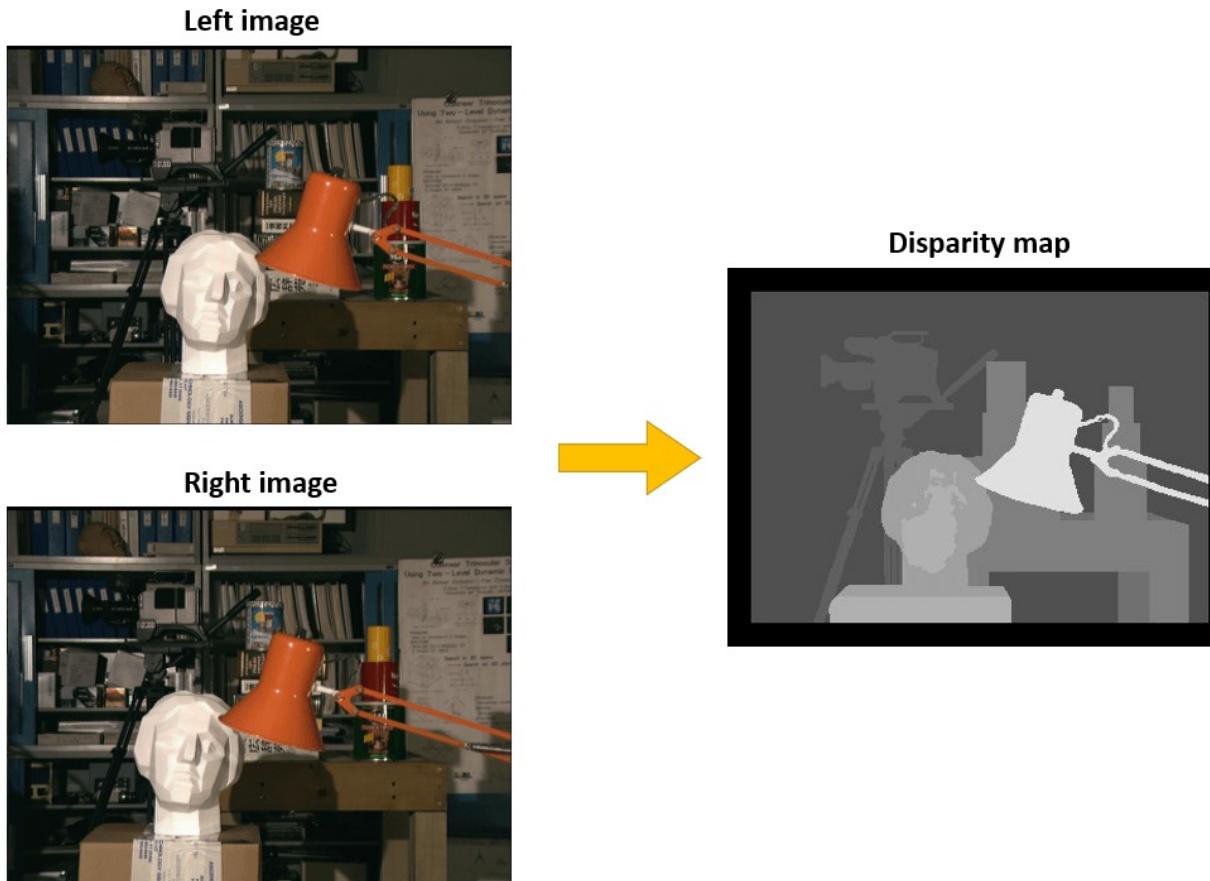
G



B



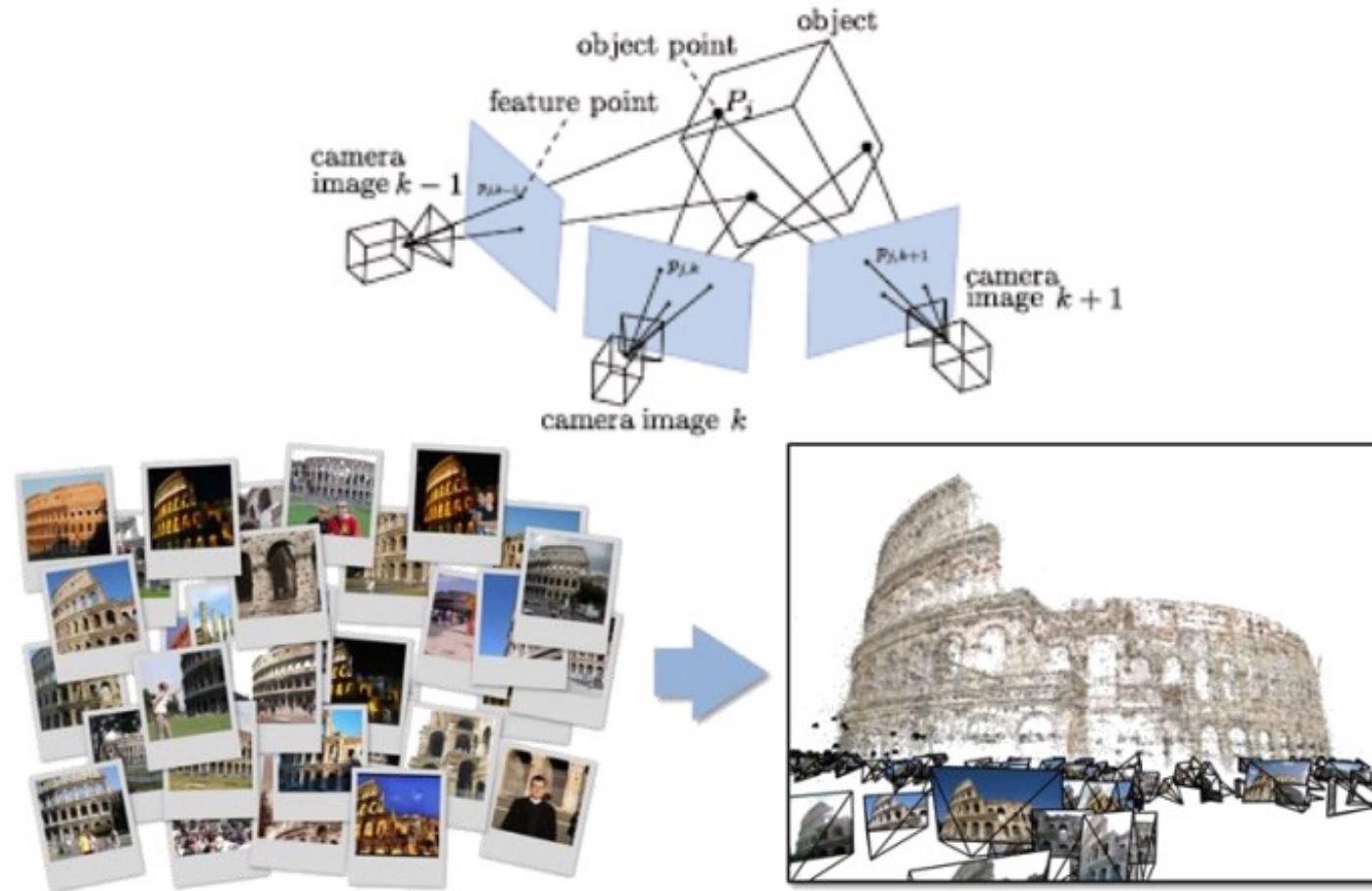
# Stereo Images and Disparity



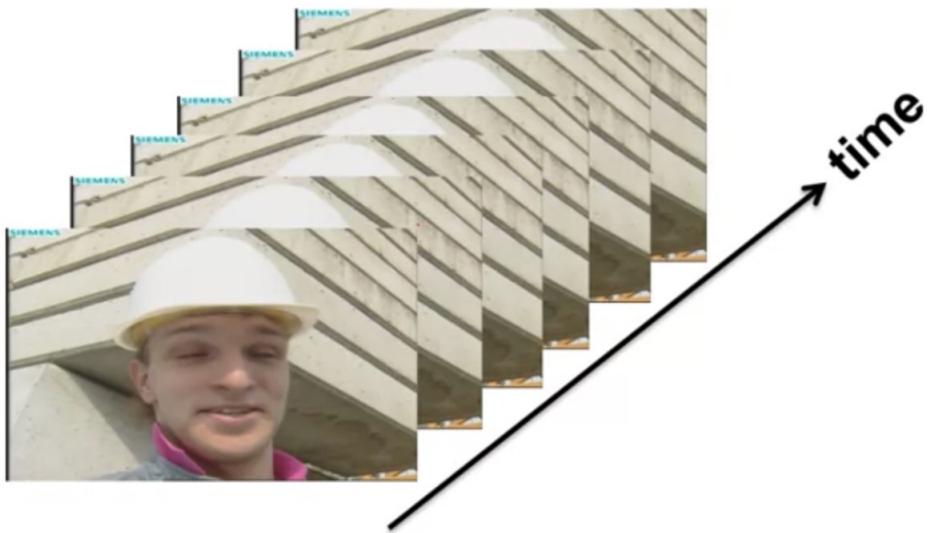
# Kinect Images



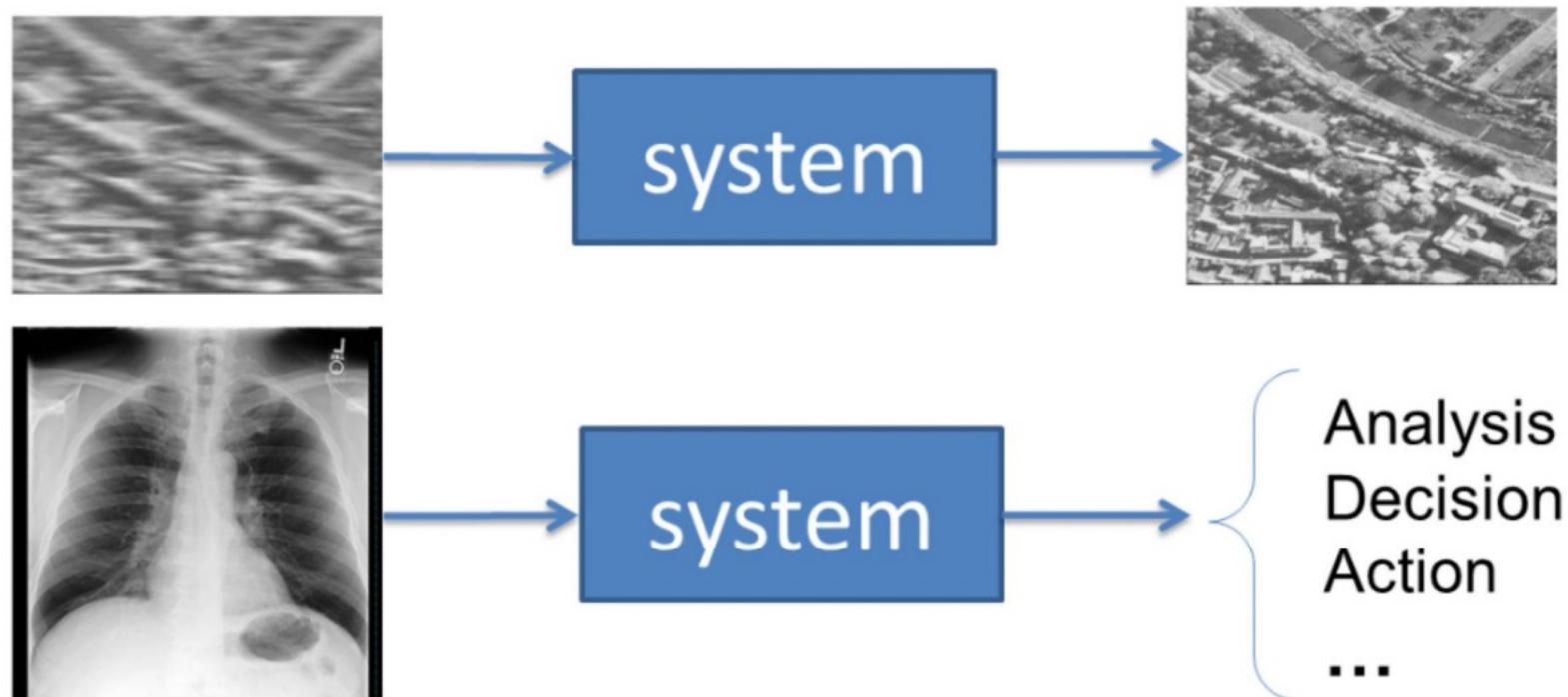
# Multi-Camera Imaging



# Video



# Image and Video Processing



# Introduction to Image and Video Processing

- Analog v.s. Digital Signals
- Image and Video Signals
- **Color Space**

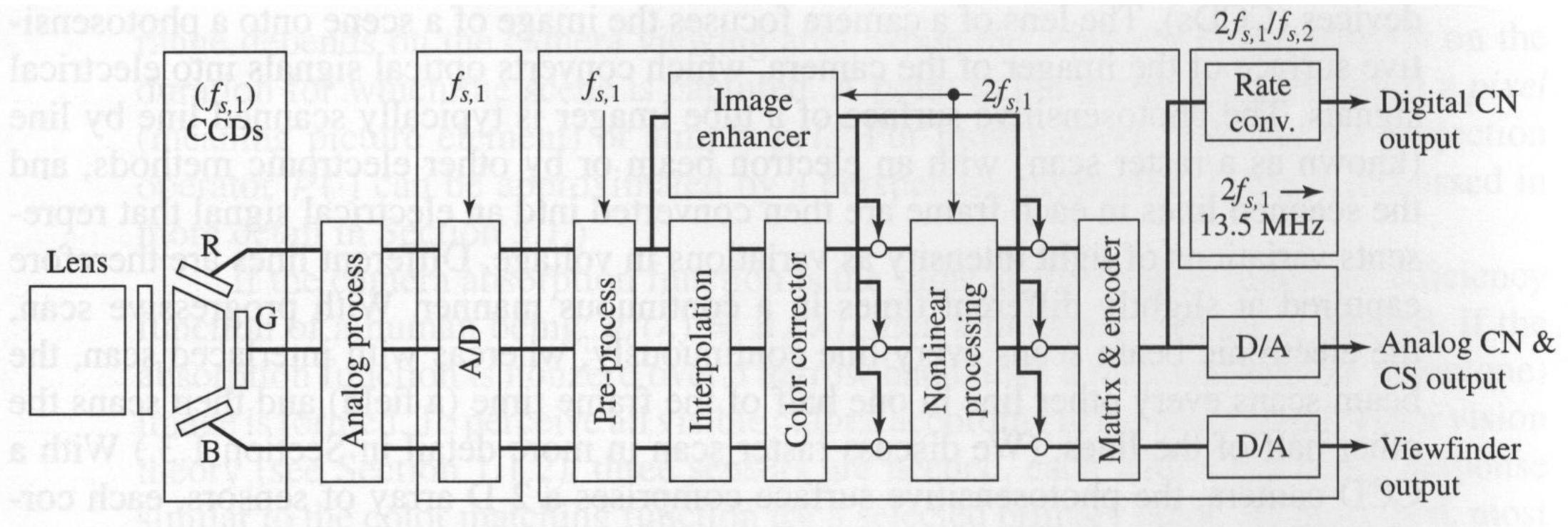
# Video Signals

- A sequence of 2-D images captured from the projection of a 3-D scene onto an image plane



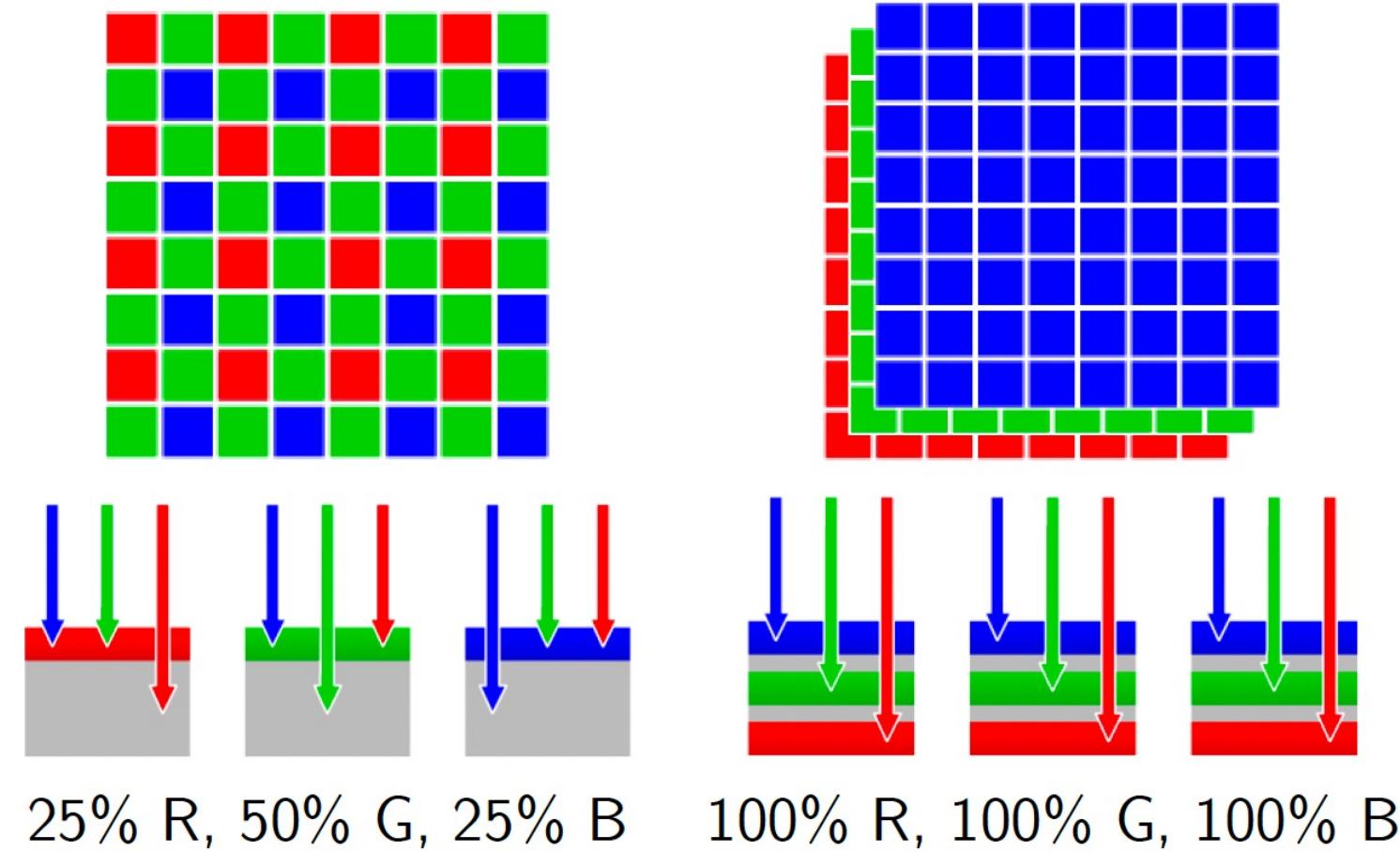
Artist Albrecht Durer's Perspective Projection

# Color Video Camera



# Image Sensors

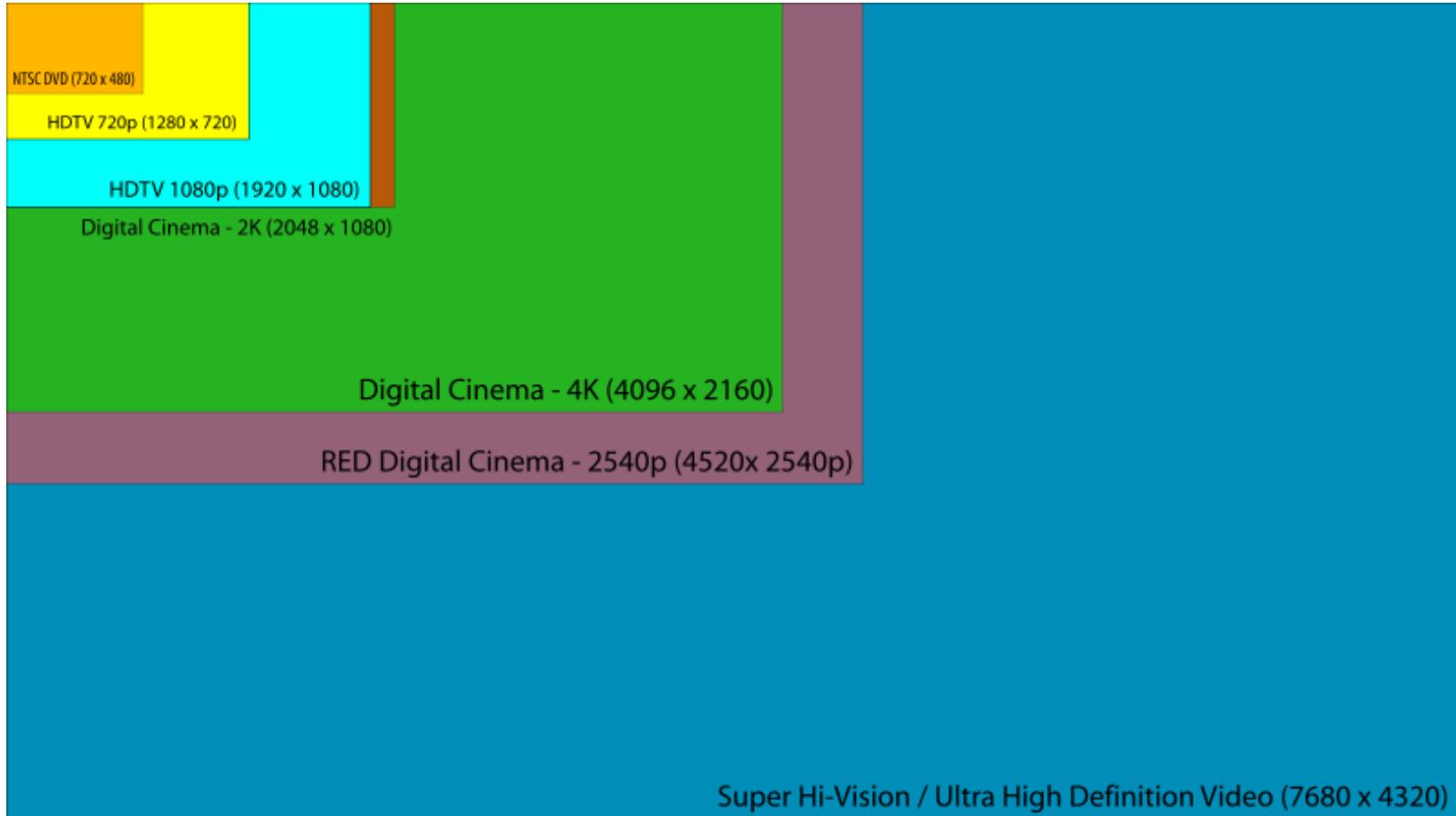
- CCD/CMOS Sensors



# Digital Video Format

Video format	Y size	Color sampling	Frame rate	Raw data (mbps)
HDTV over air, cable, satellite, MPEG-2 video 20–45 mbps				
SMPTE 296M	1280 × 720	4:2:0	24P/30P/60P	265/332/664
SMPTE 295M	1920 × 1080	4:2:0	24P/30P/60I	597/746/746
Video production, MPEG-2, 15–50 mbps				
BT.601	720 × 480/576	4:4:4	60I/50I	249
BT.601	720 × 480/576	4:2:2	60I/50I	166
High-quality video distribution (DVD, SDTV), MPEG-2, 4–8 mbps				
BT.601	720 × 480/576	4:2:0	60I/50I	124
Intermediate-quality video distribution (VCD, WWW), MPEG-1, 1.5 mbps				
SIF	352 × 240/288	4:2:0	30P/25P	30
Videoconferencing over ISDN/Internet, H.261/H.263, 128–384 kbps				
CIF	352 × 288	4:2:0	30P	37
Video telephony over wired/wireless modem, H.263, 20–64 kbps				
QCIF	176 × 144	4:2:0	30P	9.1

# High Definition and Ultra High Definition



# Color Space

- Mixture of luminance and chrominance
  - RGB & CMY primaries
- Separation of luminance and chrominance
  - XYZ - fundamental measurements
  - YUV - PAL
  - YIQ - NTSC
  - YCbCr - digital video
  - HSI - hue, saturation, brightness
- Color space conversion – better representation for processing or data reduction

# Color Space Conversion

- $(R, G, B) \rightarrow (Y, U, V)$ 
  - $Y$ : brightness
  - $U = 0.492(B - Y), V = 0.877(R - Y)$ : color differences

$$\begin{bmatrix} Y \\ U \\ V \end{bmatrix} = \begin{bmatrix} 0.299 & 0.587 & 0.114 \\ -0.147 & -0.287 & 0.436 \\ 0.615 & -0.515 & -0.100 \end{bmatrix} \begin{bmatrix} R \\ G \\ B \end{bmatrix}$$

- Brightness contribution ( $G > R > B$ )

$$Y = 0.299R + 0.587G + 0.114B$$

- Coefficients of the first row add up to 1, those of the other rows to 0
  - $R = G = B \rightarrow$  gray images ( $U = V = 0$ )

# Color Space Conversion

- $Y, Cb, Cr$ : scaled, shifted version of  $Y, U, V$

$$\begin{bmatrix} Y \\ Cb \\ Cr \end{bmatrix} = \begin{bmatrix} 0.257 & 0.504 & 0.098 \\ -0.148 & -0.291 & 0.439 \\ 0.439 & -0.368 & -0.071 \end{bmatrix} \begin{bmatrix} R \\ G \\ B \end{bmatrix} + \begin{bmatrix} 16 \\ 128 \\ 128 \end{bmatrix}$$

- $R, G, B$  take values in 0-255
- $Y$  takes values in 16-235,  $Cb, Cr$  in 16-240

# RGB vs. YCbCr



Original



R



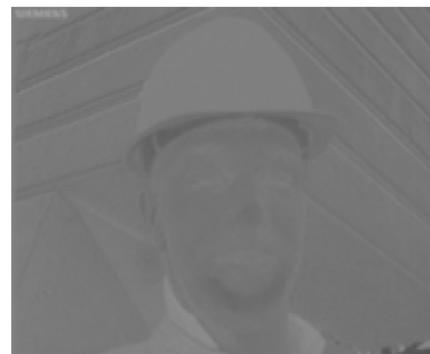
G



B



Y



Cb



Cr

# Objective Quality Measure

- Mean Squared Error (MSE)

$$MSE = \sigma_e^2 = \frac{1}{N} \sum_k \sum_{m,n} (\Psi_1(m, n, k) - \Psi_2(m, n, k))^2$$

- $m, n$  pixel coordinates;  $k$  frame index;  $N$  total number of pixels.

- Peak Signal-to-Noise Ratio (PSNR)

$$PSNR = 10 \log_{10} \frac{\psi_{\max}^2}{\sigma_e^2} \text{ (dB)}$$

- $\psi_{\max}$  the maximum (or peak) signal value; 255 for 8-bit video.

- Average per-frame PSNR

$$\overline{PSNR} = \frac{1}{K} \sum_K PSNR_K$$

- $k$  frame index;  $K$  number of frame compared.

# PSNR & MSE

- Excellent (>40), Good (30-40), Poor (<30)



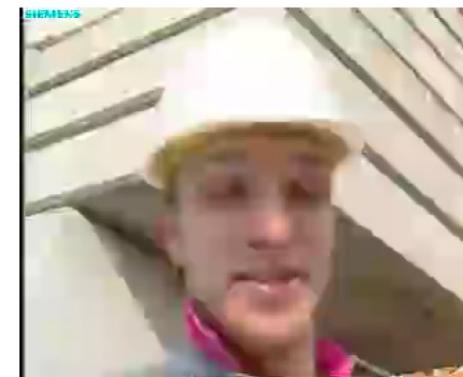
Original



42.6



35.5



28.7

# PSNR & MSE

- Both do not correlate well with human perception

MSE = 27.10



MSE = 21.26



# Subjective Quality Evaluation

- Mean opinion score
  - Human observers' judgement of visual quality
- Methods (defined in ITU-R BT.500-11)
  - **Double Stimulus Continuous Quality Scale (DSCQS)**
    - Reference and impaired sequences graded in a randomized order.
    - Scores converted into a number indicating the relative quality.
  - **Double Stimulus Impairment Scale (DSIS)**
    - Reference first and then the impaired sequence.
    - Grade the impaired sequence relative to its reference.
  - **Single Stimulus Continuous Quality Evaluation (SSCQE)**
    - Grade the impaired sequence in a continuous manner without a reference.

# Perceptual Similarity Metric

- The Unreasonable Effectiveness of Deep Features as a Perceptual Metric [CVPR 2018]

	Patch 0	Reference	Patch 1		Patch 0	Reference	Patch 1		Patch 0	Reference	Patch 1
Humans				✓				✓			
L2/PSNR, SSIM, FSIM	✓				✓				✓		
Random Networks	✓								✓		
Unsupervised Networks			✓			✓					
Self-Supervised Networks			✓			✓			✓		
Supervised Networks			✓			✓			✓		