

### Image Typology summary

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#### 2D data types: images



Spatial coordinates *x*, *y*.





#### 2D data types: images

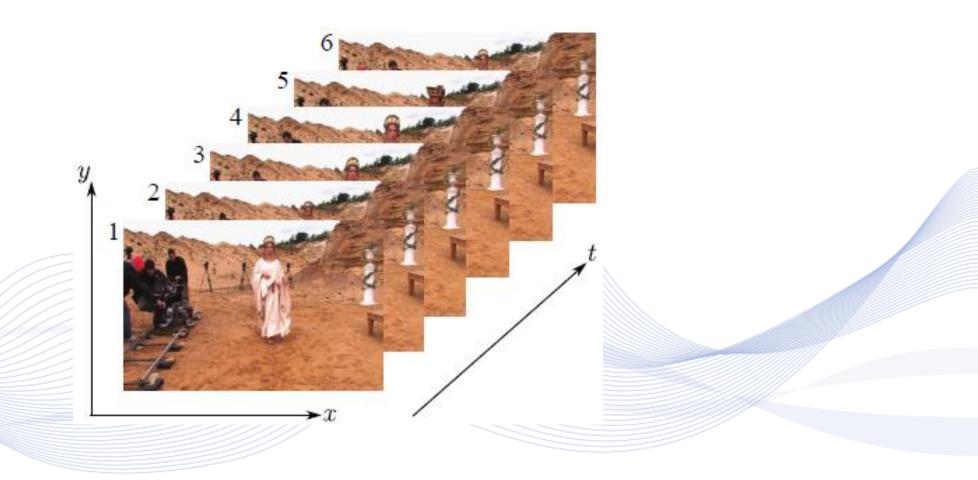
- Still images/pictures: spatial 2D signals of the form  $f(x, y): \mathbb{R}^2 \to \mathbb{R}$ , having:
  - domain  $\mathbb{R}^2$  and codomain  $\mathbb{R}$ .
  - two spatial coordinates x, y.
- Image sampling/digitization transforms continuous coordinates images to digital images:

 $f(i,j):\mathbb{Z}^2\to [0,\ldots,2^B-1].$ 





#### 3D data types: video





### 3D data types: video



- Moving images: spatiotemporal 3D signals of the form:  $f(x, y, t): \mathbb{R}^3 \to \mathbb{R}$ , having:
  - domain  $\mathbb{R}^3$  and codomain  $\mathbb{R}$ .
  - the time t coordinate has a different nature than the spatial coordinates x, y.
- *Video scanning*: the process for obtaining an 1D analog video signal, by sampling the time-varying images (luminance or RGB channels) along the vertical axis *y* and time *t*.



### 3D data types: video



- Analog video signal  $f(x, j\Delta y, k\Delta t)$ :  $\mathbb{R} \times \mathbb{Z}^2 \to \mathbb{R}$ .
  - discrete along y and t axes
  - continuous along *x* axis.
- Digital video signal  $f(i\Delta x, j\Delta y, k\Delta t)$ :  $\mathbb{Z}^3 \to \mathbb{R}$ .
- Spatial sampling intervals Δx, Δy define *image resolution*: the smaller they are, the smaller the pixel size is.
- Temporal sampling interval  $\Delta t$  defines the *video frame rate* in frames per second (fps).



#### 3D data types: volumetric images



- **3D** volumetric images: 3D signals of the form f(x, y, z):  $\mathbb{R}^3 \to \mathbb{R}$ .
- Discrete versions (defined on a Euclidean grid  $\mathbb{Z}^3$ ) :  $f(n_1, n_2, n_3): \mathbb{Z}^3 \to \mathbb{R}.$ 
  - $x = n_1 \Delta x$ ,  $y = n_2 \Delta y$ ,  $z = n_3 \Delta z$
  - $\Delta x, \Delta y, \Delta z$ : spatial sampling intervals defining 3D image resolution
  - each *voxel* is a real number.



#### 3D data types : volumetric images



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#### 3D data types: multispectral images



- Multispectral / multichannel (*n*-channel) images have the form:  $\mathbf{f}(x, y): \mathbb{R}^2 \to \mathbb{R}^n$ .
  - color images(n = 3):  $\mathbf{f}(x, y) = [f_R(x, y), f_G(x, y), f_B(x, y)]^T : \mathbb{R}^2 \to \mathbb{R}^3$ .
  - digital color images (assigning 8 bits per color channel to each voxel):  $f(n_1, n_2): \mathbb{Z}^2 \rightarrow \{0, ..., 255\}^3.$
  - Hyperspectral images :  $f(x, y, \lambda)$ :  $\mathbb{R}^3 \to \mathbb{R}$ 
    - $\lambda$  wavelength.





#### **Infrared images**

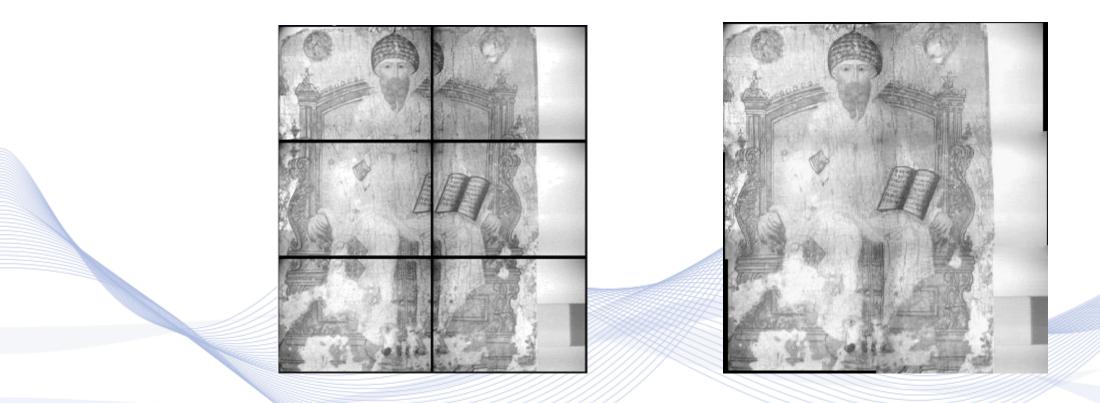


[www.Infrareddiagnostic.com]





#### Reflectography

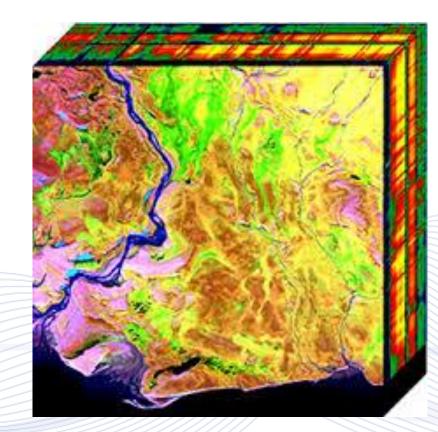


a) IR image tiles of a painting; b) mosaiced IR image.





#### Hyperspectral images



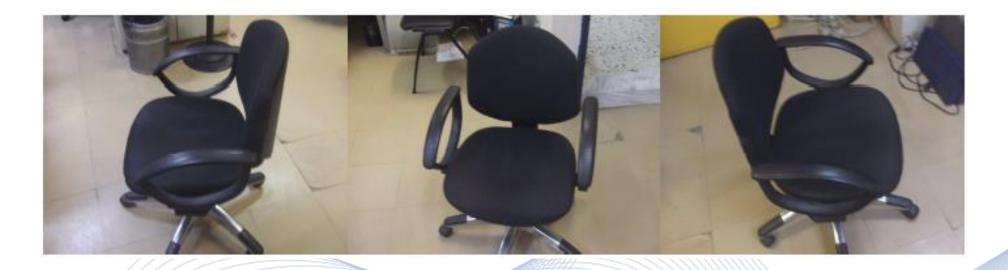
[Wikipedia]





- *Multiview* images: images of an object or set, taken from different view points, typically using different cameras.
  - Stereo images: a special case, employing only two cameras (left and right).
- They both carry only implicit geometrical information about the visualized 3D object.
  - They are not 3D data.
  - 3D object geometry can be derived using stereo or multiview 3D geometry reconstruction techniques.

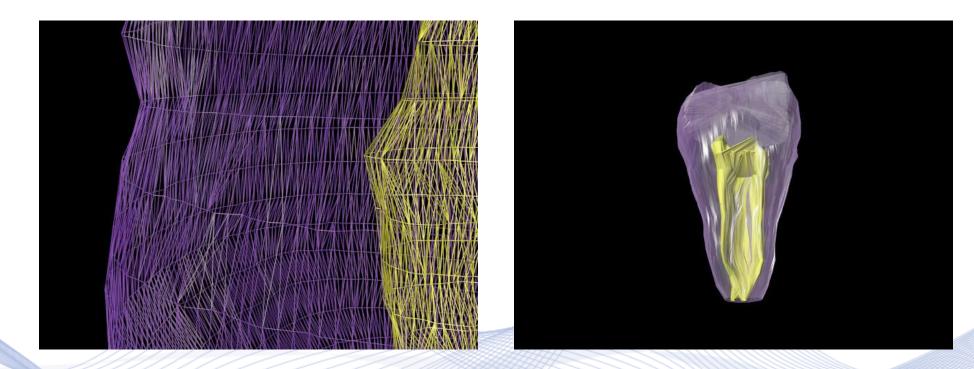




 Multiview (or stereo) video: captured by synchronized videocameras.



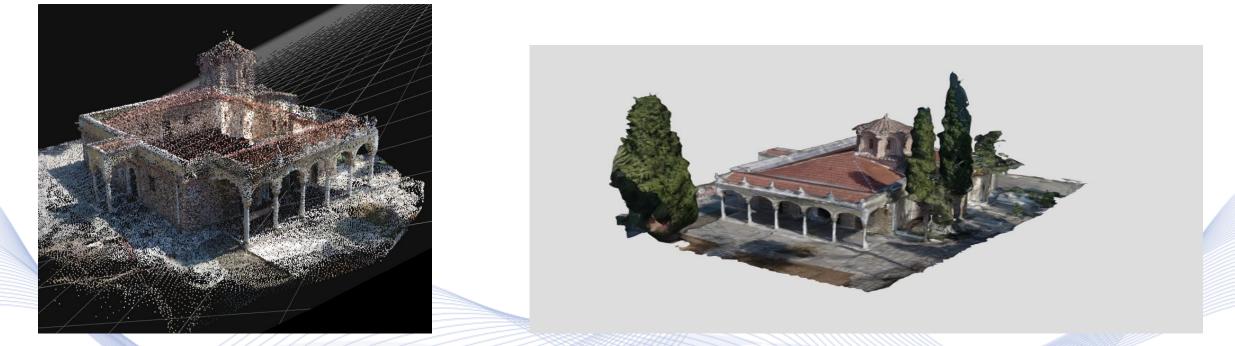




3D Type equation here.surface S ⊂ ℝ<sup>3</sup> (expressed, e.g., by a triangular mesh).

• 3D surface texture:  $\mathbf{f}(X,Y,Z)$ :  $\mathcal{S} \subset \mathbb{R}^3 \to \mathbb{R}^3$ .

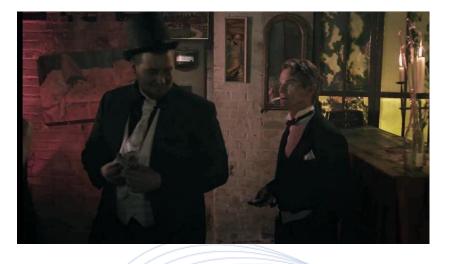




#### • 3D surface $S \subset \mathbb{R}^3$ (expressed, e.g., by a 3D point cloud). • 3D surface texture: $\mathbf{f}(X, Y, Z)$ : $S \subset \mathbb{R}^3 \to \mathbb{R}^3$ .









 RGB-D images have: a) RGB channels and b) D (depth) channel.



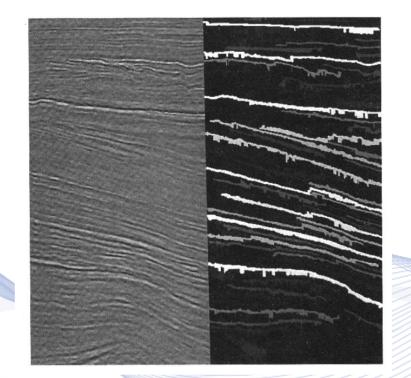


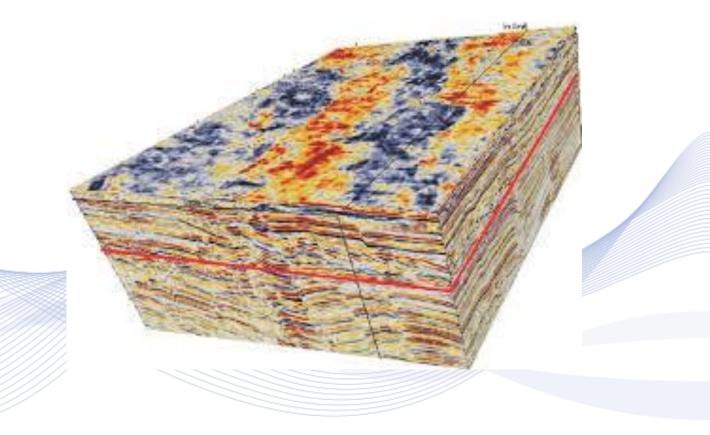


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## 3D data types : seismic images and volumes



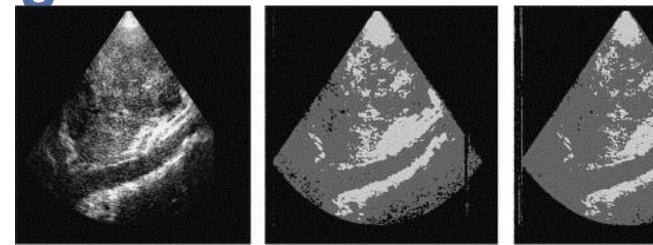


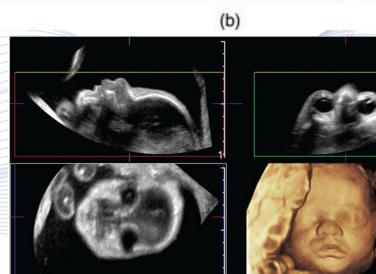




## 3D data types : ultrasound images and volumes







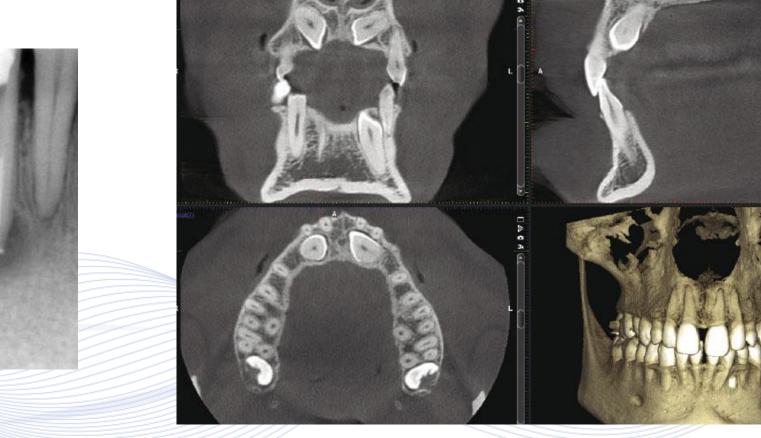
(c)

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## 3D data types : x-ray images

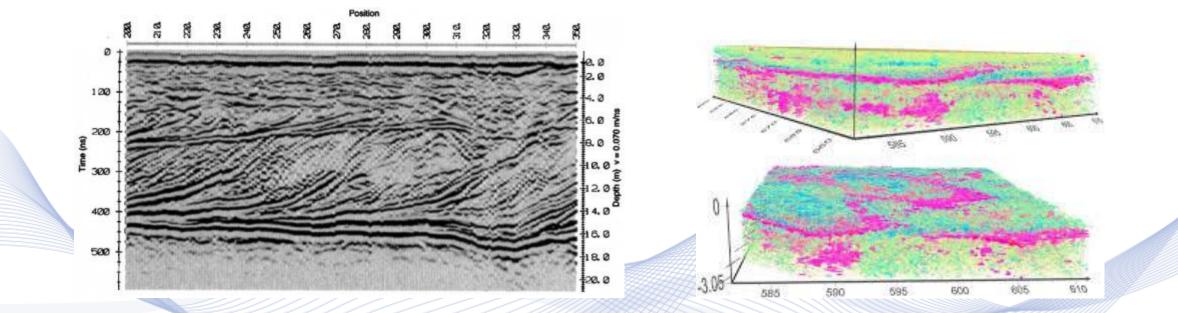




a) Tooth X-ray; b) CBCT volume.



# 3D data types: Ground penetrating radar



#### Ground penetrating radar a) image; b) volume.



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### **Color theory**



- Visible light: an electromagnetic wave with wavelength  $\lambda$  varying in the range 380 780 nm.
- Perceived color: depends on the spectral content of the light.
  - Red light: a signal with energy concentrated around 700 nm.
  - White light: a signal with evenly distributed energy across the wavelength spectrum.
  - Monochromatic color: a color with a very narrow spectral content (typically single-wavelength).



### **Color theory**



- Multispectral / multichannel (*n*-channel) images have the form:  $\mathbf{f}(x, y): \mathbb{R}^2 \to \mathbb{R}^n$ .
  - color images(n = 3):  $\mathbf{f}(x, y) = [f_R(x, y), f_G(x, y), f_B(x, y)]^T : \mathbb{R}^2 \to \mathbb{R}^3$ .
  - digital color images (assigning 8 bits per color channel to each voxel):  $f(n_1, n_2): \mathbb{Z}^2 \rightarrow \{0, ..., 255\}^3.$
  - They can also be considered as 3D images:  $f(n_1, n_2, i), i = 1,2,3$ .
  - Hyperspectral images (3D images):  $f(x, y, \lambda)$ :  $\mathbb{R}^3 \to \mathbb{R}$ 
    - $\lambda$  wavelength.





#### **Color images**



RGB color image.





Digital image representation by an  $N \times M$  matrix *i*:

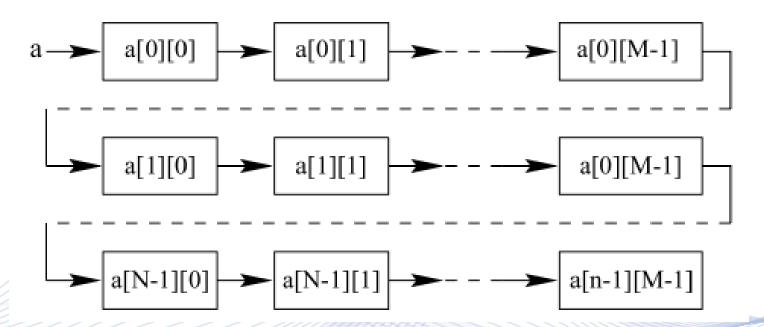
$$\mathbf{i} = \begin{bmatrix} i(1,1) & i(1,2) & \dots & i(1,M) \\ i(2,1) & i(2,2) & \dots & i(2,M) \\ \vdots & \vdots & \dots & \vdots \\ i(N,1) & i(N,2) & \dots & i(N,M) \end{bmatrix}$$

Matrix elements (image pixels):

• integers in the range [0, ..., 255] for 8 bit images.

unsigned character representation in the C language.

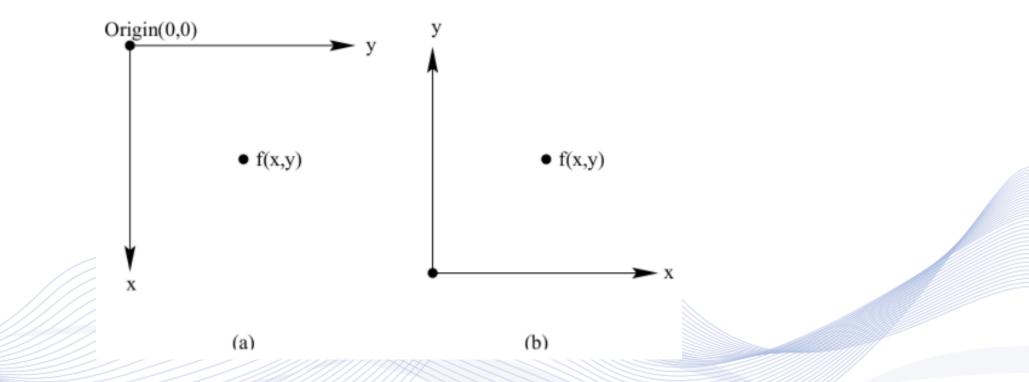




2D image storage.







a) 2D matrix coordinates; b) Cartesian coordinates.



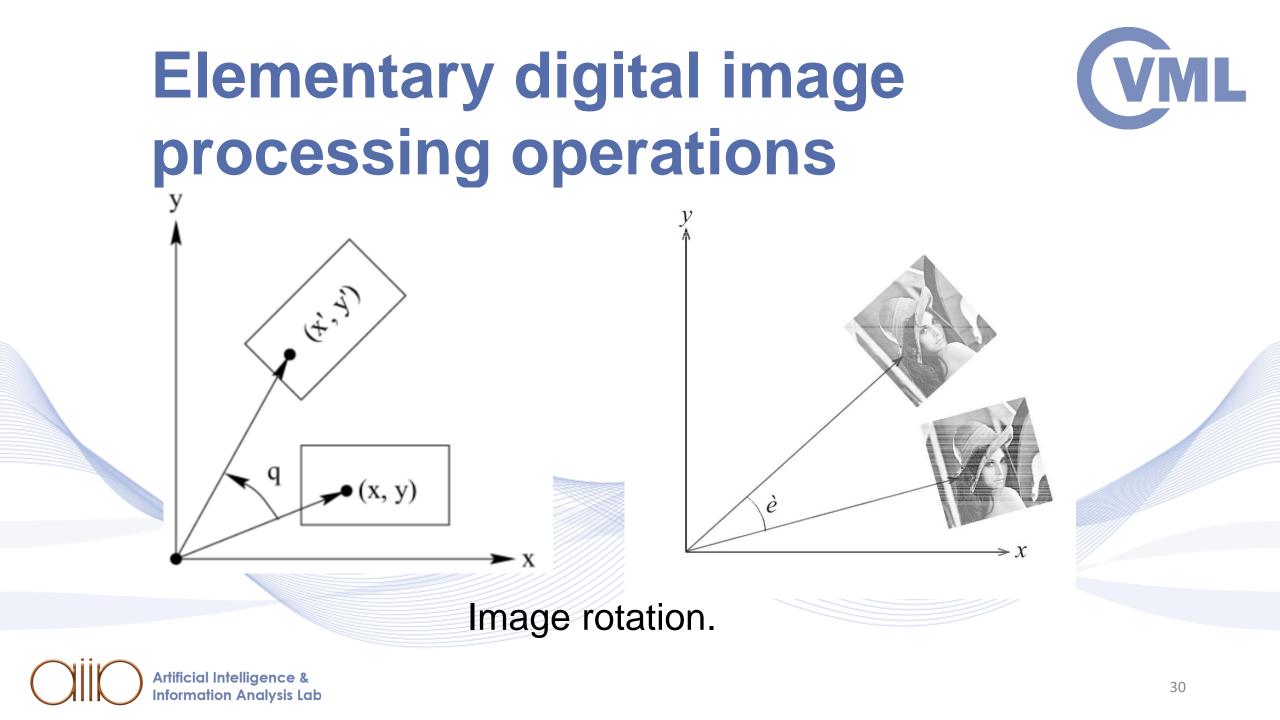
# Elementary digital image processing operations

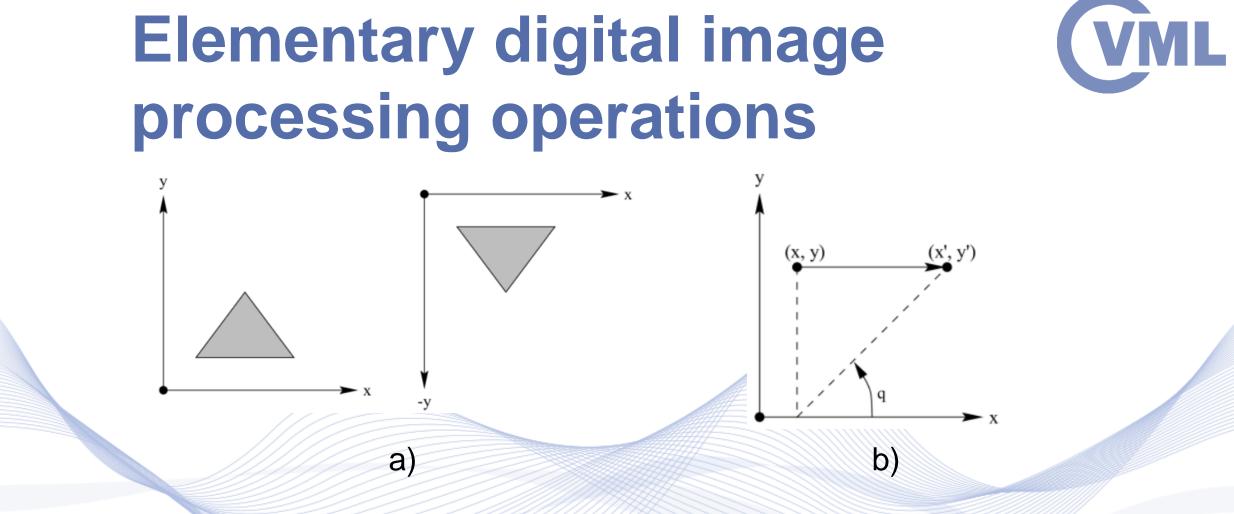




Subtractive radiography.







a) Geometrical reflection on the *x*-axis; b) Shear along the horizontal axis.





#### **Image Noise Generation**

Artificial noise generation is primarily needed for simulations.

• Additive/multiplicative image noise generators:

g(i,j) = f(i,j) + n(i,j),

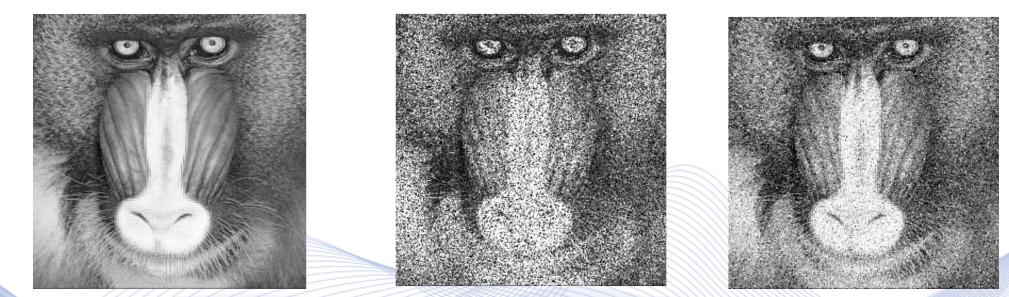
g(i,j) = f(i,j)n(i,j).

Random number generators: they produce uniform noise in





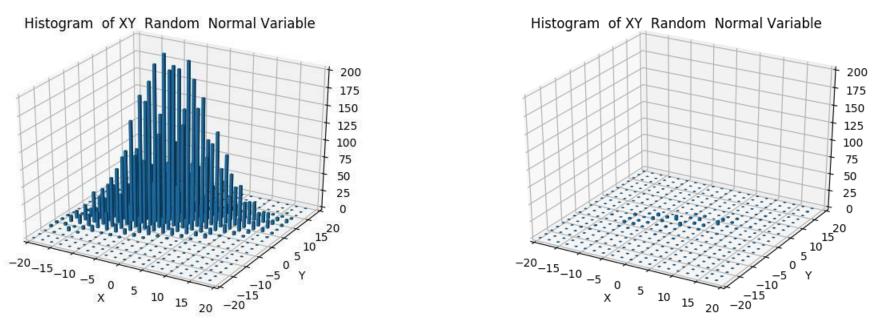




a) Original image; b) Image corrupted by multiplicative Gaussian noise;c) image corrupted by additive Laplacian noise.



#### 2D Gaussian Image Noise Generation



a) 2D Gaussian random number generator histogram; b) Its animation vs the number of generated samples.



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

### More material in http://icarus.csd.auth.gr/cvml-web-lecture-series/

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