

# Computer Vision and Machine Learning

(Introduction)

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## Outline

- Introduction
  - Motivation
    - Visual pattern recognition
  - Applications
  - Illusion
  - Image formation
    - Perspective projection
    - Photometric model

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## Motivation

- Introduction of digital computer in mid-20<sup>th</sup> century
- The machine turns out to be superior to human being in number crunching.
- If it can mimic the ability of human being in pattern recognition and decision making.
- Birth of new subjects like *computational intelligence, machine intelligence*.

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## Visual pattern recognition

- In real life, human beings perform the pattern recognition tasks based on the information acquired from the **environment** through sensors like ears, eyes, nose, tongue and skin.
- Most of the **information** is acquired through **eyes**.
- **Visual pattern recognition**, thus, turns out to be most important activity in this context.
- This leads to development of **Computer vision and Pattern recognition**.

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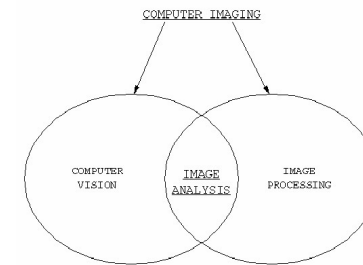
## Visual data processing

- Visual or pictorial data processing by digital computer may be grouped into three categories:
  - Input:** textual description; **Output:** an image  
Computer Graphics
  - Input:** an image; **Output:** an image  
Image Processing
  - Input:** an image; **Output:** textual description  
Image analysis and recognition \ Computer Vision

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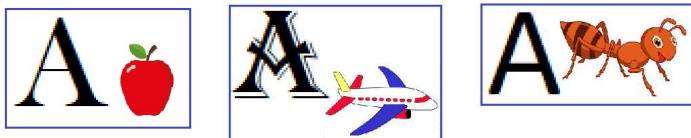
## Visual data analysis



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## Pattern recognition: Learning



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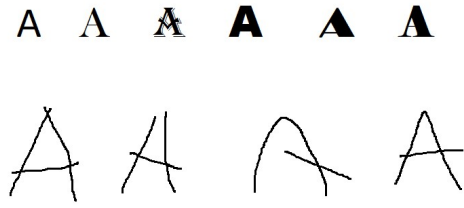
## Pattern recognition: Learning



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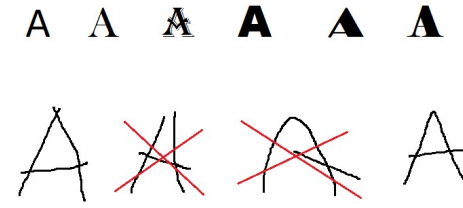
## Pattern recognition: Learning



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## Learning



Intro 2 ML

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## Natural images: examples



Outdoor scene



Indoor scene



Micrograph

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## Applications

- Intelligent machines (AI)
- Industrial inspection
- Automotive
- Security
- Image/video retrieval / Digital Library
- Robot navigation
- Activity analysis and so on ....

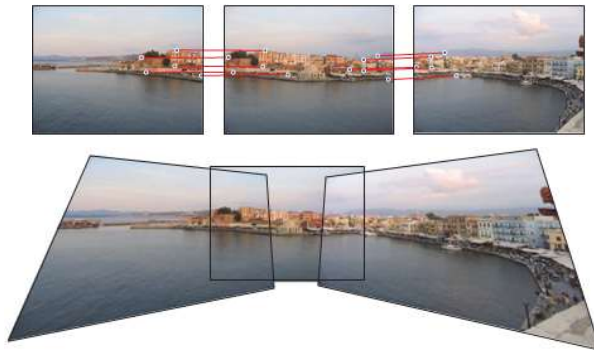


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## Panorama

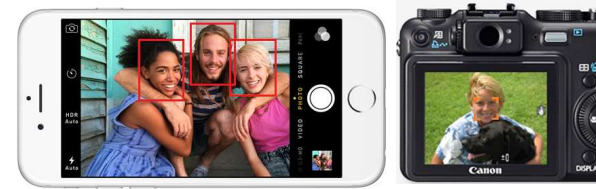


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## Face Detection



- Real-time face detection on most phones / cameras now
- Use to set exposure
- Also input for face *recognition* system

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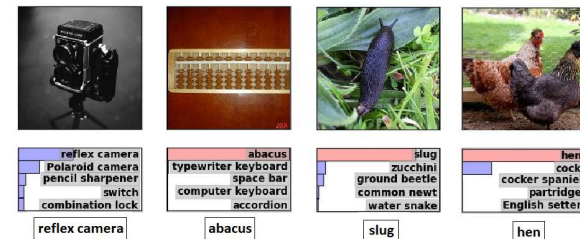
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## Object recognition

- Referred to by three tasks:
  - Image classification
    - Assigning a class label to an image.
    - May be multiple labels with confidence levels.
  - Object localization
    - Drawing a bounding box around the targeted object.
  - Object detection
    - Drawing a bounding box around each object of interest and assigning class label to those.

## Image (object) recognition

Pixels to class-label:



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## Optical character recognition (OCR)



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## Image to semantic information



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## Qualitative information



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## Object categorization



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## Scene and context categorization

- Outdoor
- City
- Traffic
- ...



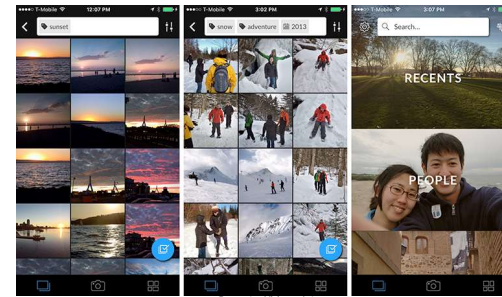
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## Advanced Photo Search

- Content-based image search
- that actually looks at image



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<http://clarifai-blog.s3.amazonaws.com/wp-content/uploads/2015/12/pic1.jpg>

## Data sources



Google Image Search Picasa flickr webshots picsearch YouTube

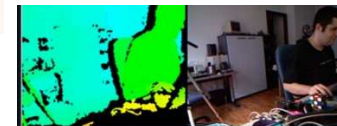
## Vision-based interaction (and games)



Microsoft Kinect



KINECT for XBOX 360



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## Virtual/Augmented Reality

- Tracking of user head with high accuracy
- Rendering realistic 3D scene in real-time
- Oculus / HTC / Hololens



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## Geometry: 3D reconstruction (cond.)



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## Geometry: 3D reconstruction



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## Motion detection and tracking



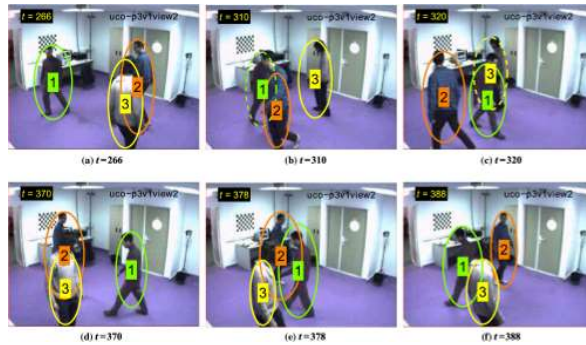
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## Activity analysis: tracking

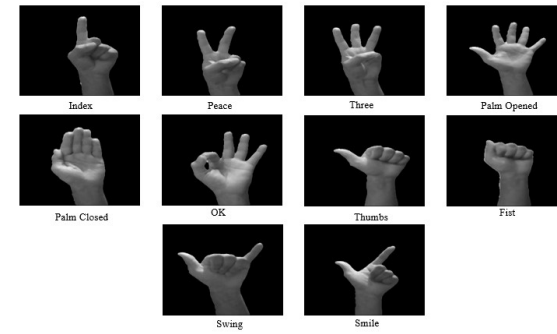


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## Activity analysis: hand gesture



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## Activity analysis: events



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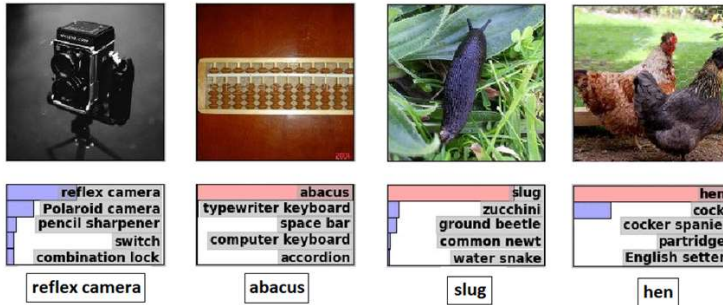
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Other applications with DL



## Image classification



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## Image generation



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## Image generation: Progress

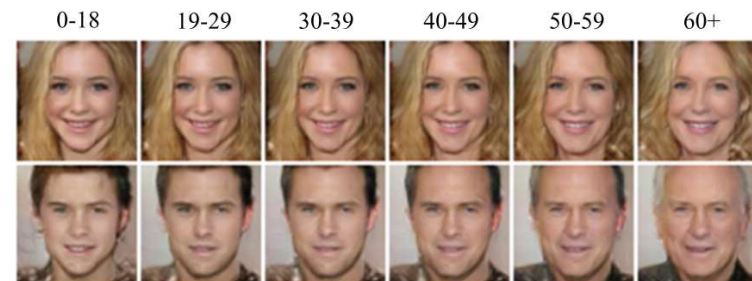


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## Aging face image



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## Image colorization

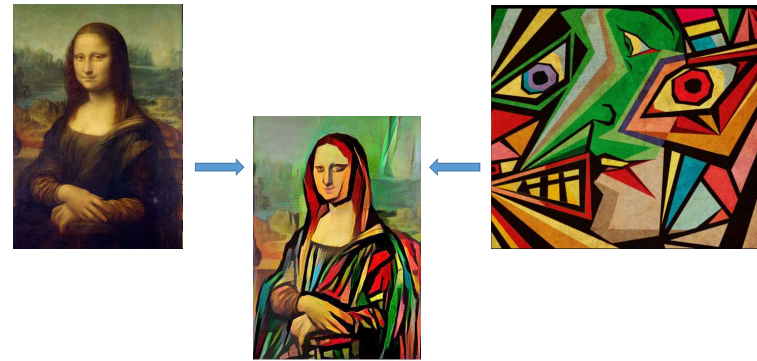


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## Style transfer

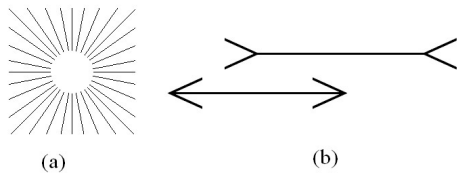


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## Illusion: Examples



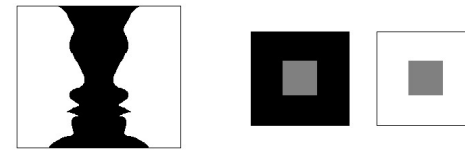
(a)

(b)

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## Illusion: Examples



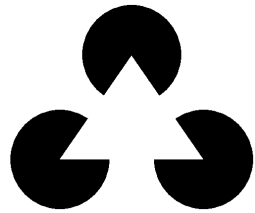
(c)

(d)

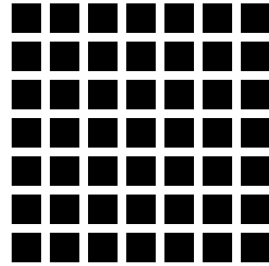
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# Illusion: Examples



(e)



(f)

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# Illusion: Examples



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# Illusion: Examples



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# Illusion: Examples



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## Scene types

**Scenes** are of two types:

- **3-D**, example: usual outdoor and indoor scenes
- **2-D**, example: document page, micrograph, satellite image, x-ray image, etc.

Types of **images**:

- Static image (single frame)
  - Black and white, colour
- Sequence of images (video/movies)

## Types of digital image

### Black-and-white image

- Binary (two-tone) image
- Gray level (gray-tone) image

### Color image

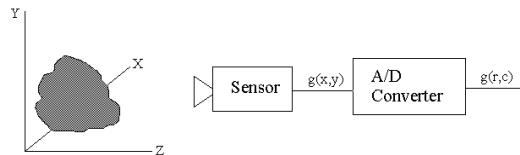
Another way of classifying images:

- Static image (single image)
- Image sequence (movie)

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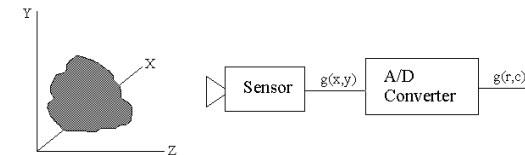
## Image formation



Sensor grabs and forms two-dimensional intensity map  $g(x,y)$  of the 3D scene, which is continuous in space and value.

Example: **Camera, Scanner, Ultrasound sensor, Infra-red sensor, MRI, CT, etc.**

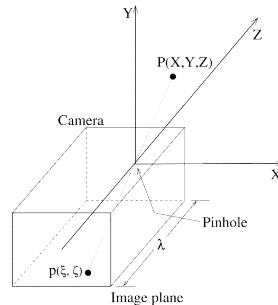
## Image formation



- There are two transformations that simultaneously take place in the camera
  - Geometric transformation (perspective projection)
  - Photometric transformation (light transportation)

## Geometric transformation

- Consider pinhole camera model.
- Camera coordinate system coincides with world coordinate system.
- Origin  $(0,0,0)$  is at pinhole (optical centre)
- z-axis is same as optical axis of the camera and is perpendicular to image plane.
- $\lambda$  is the focal length of the camera.
- $P(X,Y,Z)$  and  $p(\xi, \zeta)$  are world points and image points respectively.



## Geometric transformation (perspective projection)

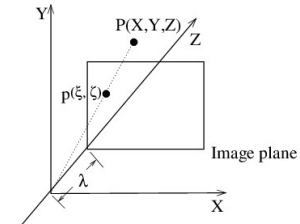
- Consider image plane in front of the pinhole (to avoid negative coordinate)

$$\xi = \frac{\lambda X}{Z} \text{ and } \zeta = \frac{\lambda Y}{Z}$$

- In matrix-vector form:

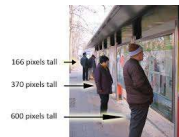
$$\begin{bmatrix} X \\ Y \\ Z/\lambda \end{bmatrix} = \begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1/\lambda \end{bmatrix} \begin{bmatrix} X \\ Y \\ Z \end{bmatrix}$$

- $(X, Y, Z/\lambda)$  is homogeneous coordinate in image plane, to get Cartesian coordinate divide first two ( $X$  and  $Y$ ) by the third ( $Z/\lambda$ ).



## Properties of perspective projection

- Straight lines in 3D scene (world) map into straight lines in image.
- Distant objects (in scene) appear smaller in the image.
- A set of parallel lines in 3D, not perpendicular to z-axis maps to a set of concurrent lines in 2d image.
  - Point through which the concurrent lines pass is called *vanishing point*.
  - All the vanishing points lie on a straight line, called *horizon*.



## Photometric model

- Suppose light intensity  $\mathcal{I}$  is transported ideally to image plane  $(\xi, \zeta)$ .
- Scene reflectance  $\mathcal{R}$  is also transferred appropriately to image plane.
- Thus image intensity mapped is ideal one and is given by
 
$$f(\xi, \zeta) = \mathcal{R}(\xi, \zeta) \mathcal{I}(\xi, \zeta)$$

- However, light energy transport to real image plane undergoes some transformation. This may be modeled by photometric transformation.
 
$$g(x, y) = T[f(x, y)]$$

that satisfies the condition:  $f(x, y) \geq 0$  and  $g(x, y) \geq 0$

**Thank you!**

*Any question?*