

# Computer Vision Tutorial

## basic introduction

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OptML, Sep 4, 2019

- 1 What is Computer Vision?
- 2 Related Fields of Computer Vision
- 3 Computer Vision Applications
- 4 Three-Level Paradigm
- 5 Types of CV Problems

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# What is Computer Vision?

## Objective of Computer Vision

The objective of computer vision is to make computers see and interpret the world like humans and possibly even better than us.

# What is Computer Vision?

Human vision performs multiple visual tasks quite effortlessly and effectively.

- How is visual information processed and understood in biological systems?
- What is the nature of computation involved in visual tasks?
- How might we build machines that can see?

# What is Computer Vision?

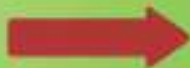


Figure: Ball Catch

# What is Computer Vision?

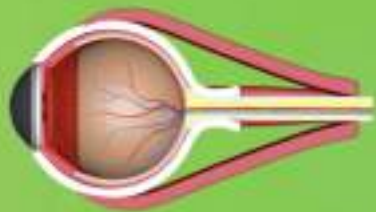


Light Rays



Pass through retina

# What is Computer Vision?



Pass through retina



Processing



# What is Computer Vision?



Processing



Eye

Optic nerve

Visual cortex

# What is Computer Vision?



# What is Computer Vision?



# What is Computer Vision?

Recreating human vision isn't just a hard problem, it's a set of them, each of which relies on the other.

## Definition of Computer Vision

Computer Vision is concerned with the automatic extraction, analysis and understanding of useful information from a single image or a sequence of images.

# Computer Vision

theoretical and algorithmic basis to  
achieve automatic visual understanding

# Computer Vision

high-level understanding from  
digital images or videos

From the biological science point of view,

## Computer Vision

computer vision aims to come up with  
computational models for human  
visual system

From the engineering point of view,

## Computer Vision

computer vision aims to build autonomous systems to perform some of the tasks which the human visual system can perform and even surpass it in many cases.



# What is Computer Vision?



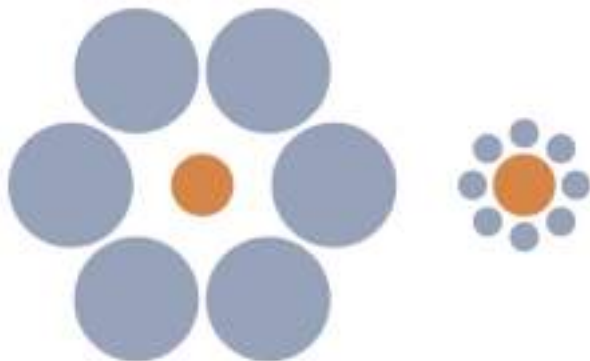
# What is Computer Vision?



## Optical Illusions



# What is Computer Vision?

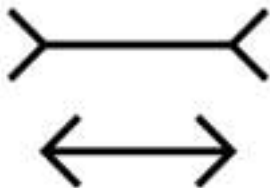


The Ebbinghaus illusion

# What is Computer Vision?

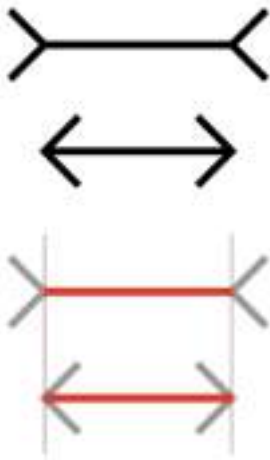


# What is Computer Vision?



The Müller-Lyer illusion

# What is Computer Vision?



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Digital Signal Processing



Neuroscience



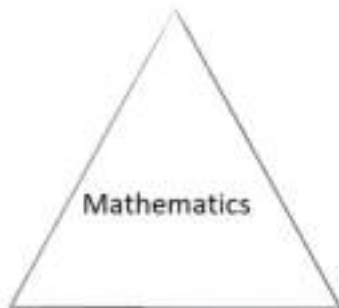
Computer Vision

Pattern Recognition  
Machine Learning

Artificial Intelligence

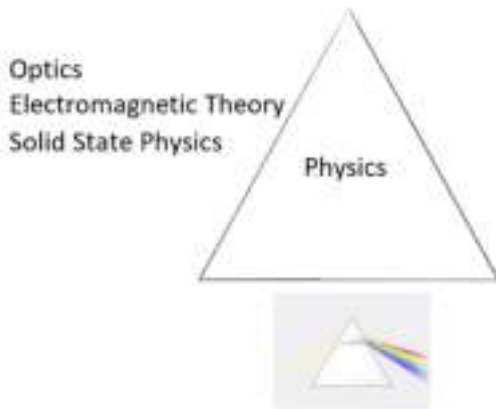
# Computer Vision

can be studied from a purely mathematical point of view



Statistics  
Optimization  
Geometry





Computer vision systems rely on image processing techniques to pre-process the image data for robust high-level analysis.

# Digital Image Processing

image compression

image restoration

image enhancement

The robust high-level analysis is the next major task in computer vision pipeline. It is the area where neuroscience plays an important role. Specifically, the study of the biological vision system.

# Neuroscience



(a) eye



(b) neuron



(c) brain structure

# Related Fields of Computer Vision



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Computer vision is transitioning from a nascent stage and is proving to be incredibly useful in several application areas.

# Computer Vision for Security



Figure: visual surveillance



Figure: fingerprint-based identification and authentication



Figure: iris identification and authentication



Figure: face recognition

# Computer Vision in Multimedia and Entertainment



Figure: face recognition





Figure: augmented reality game

# Computer Vision for Navigation



Figure: robot navigation



Figure: autonomous driving

## Computer Vision in Retail

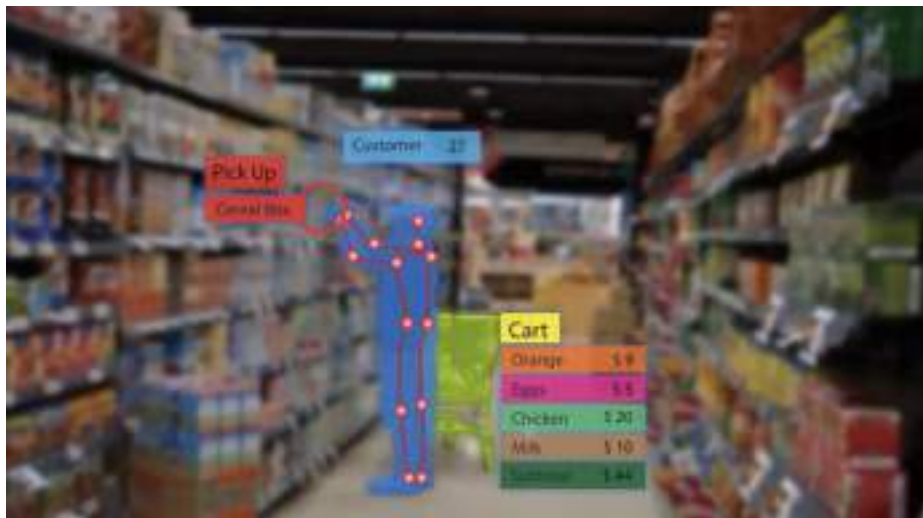


Figure: automated supermarket

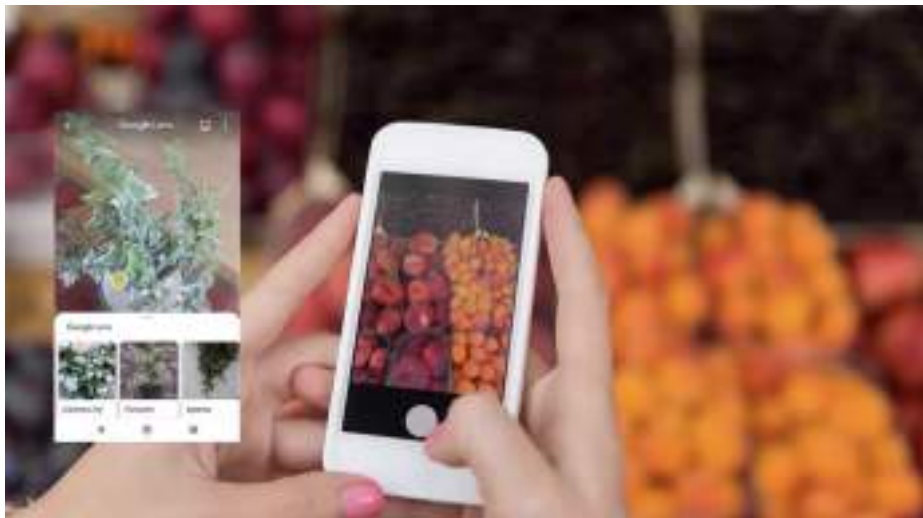


Figure: visual search on smartphone cameras

## Computer Vision in Industry



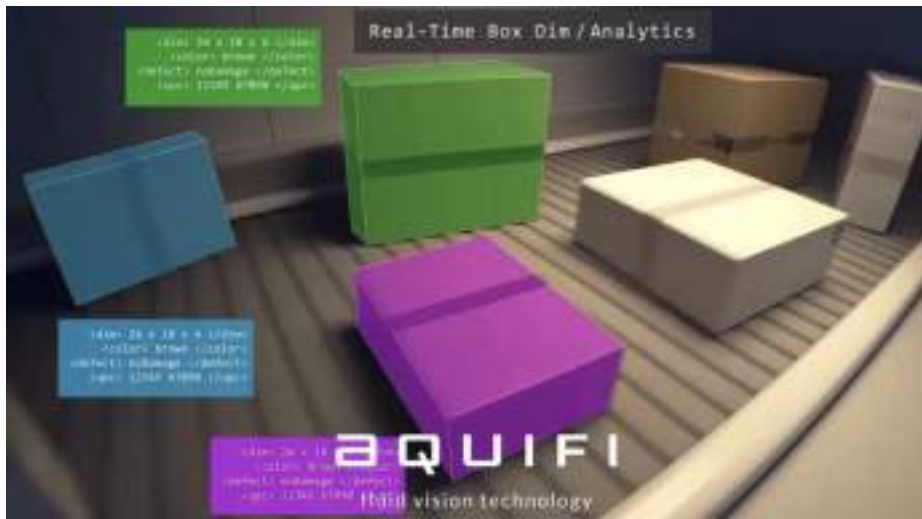


Figure: real-time box analytics



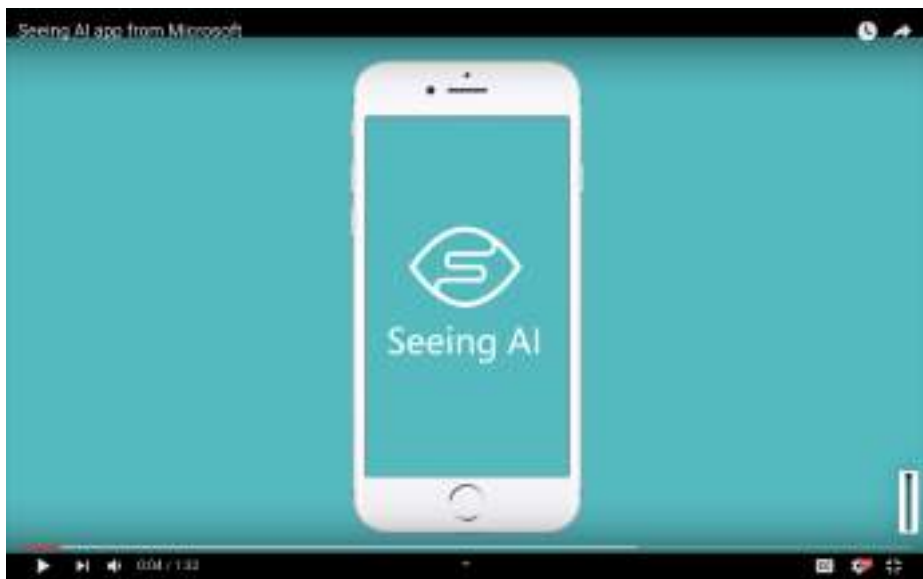
Figure: auto cycle counting



Figure: inspect products

# Computer Vision for Social Causes

# Computer Vision Applications



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Computer vision concepts  
can be broadly categorized as  
low, mid and high level vision techniques

## Low Level Vision

image processing techniques, feature detection and matching and early segmentation



# Three-Level Paradigm



Image features

# Three-Level Paradigm



## Mid Level Vision

image segmentation, things start to come together  
attributing meaning

# Three-Level Paradigm

## Soft Segmentation



Source: Seminar on Soft Segmentation, Yagel Alexey, Tam-Pyck (CS), Sylvain Paris, Marc Pollefeys and Wagner B. Maasli

# High Level Vision

Visual recognition and scene understanding, algorithms which makes sense of the visual content and make computer vision live up to the capabilities of human vision

## Visual Recognition

Detection: What objects does this image contain?



## Visual Recognition

Semantic Segmentation - Accurate Localization and Detection



Visual Recognition

Event Recognition





## Low-Level or Early Vision



Considers local properties of an image.

"There are several edges in this image!"

## Mid-Level Vision

### Grouping and Segmentation



"There is an object and a background, let us try to identify which pixels belong to which one!"

## High-Level Vision



"It's an Aeroplane!"

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**Recognition** determining whether or not the image data contains some specific object, feature, or activity

**Motion Analysis** an image sequence is processed to produce an estimate of the velocity either at each points in the image or in the 3D scene, or even of the camera that produces the images

**Scene Reconstruction** computing a 3D model of the scene

**Image Restoration** The aim of image restoration is the removal of noise (sensor noise, motion blur, etc.) from images.

# Recognition: Object Recognition, Identification, Detection



**Figure: Object Recognition:** one or several pre-specified or learned objects or object classes can be recognized, usually together with their 2D positions in the image or 3D poses in the scene



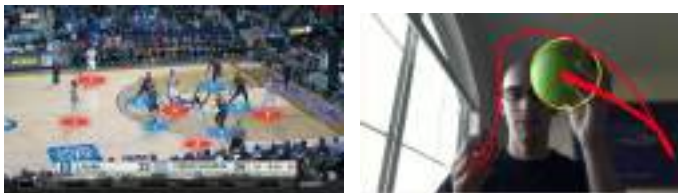
**Figure: Identification:** an individual instance of an object is recognized

**Detection:** the image data are scanned for a specific condition.

# Motion Analysis: Egomotion, Tracking, Optical flow



**Figure: Egomotion:** determining the 3D rigid motion (rotation and translation) of the camera from an image sequence produced by the camera. (visual odometry)



**Figure: Tracking:** following the movements of a (usually) smaller set of interest points or objects (e.g., vehicles, humans or other organisms) in the image sequence.



**Figure: Optical Flow:** to determine, for each point in the image, how that point is moving relative to the image plane, i.e., its apparent motion. This motion is a result both of how the corresponding 3D point is moving in the scene and how the camera is moving relative to the scene.





**Figure: Scene Reconstruction:** Given one or (typically) more images of a scene, or a video, scene reconstruction aims at computing a 3D model of the scene.



Image denoising

Compress sensing



(a) inpainting

Figure: Image Restoration