

OVERVIEW OF COMPUTER VISION

Introduction

The very likeable computer scientist, entrepreneur, and venture capitalist [Paul Graham](#) once mentioned, in his essay “Write Like you Talk”:

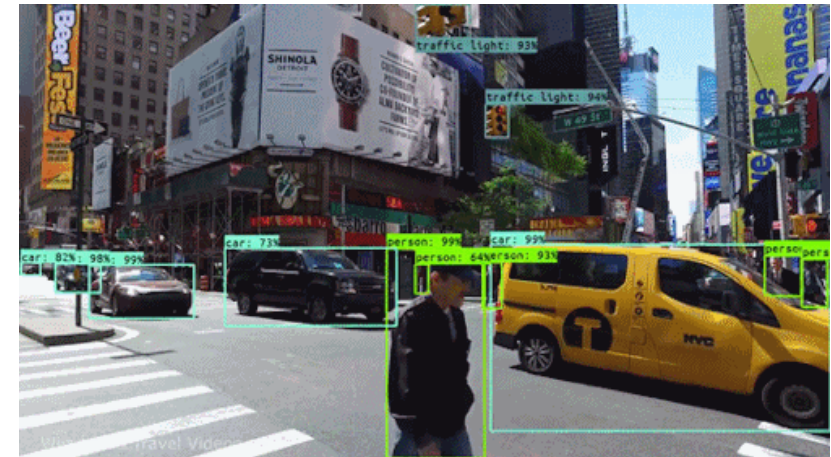
“Informal language is the athletics clothing of ideas”.

With that in mind, let’s discuss what Computer Vision *“even is”*, starting from not really knowing anything about it.



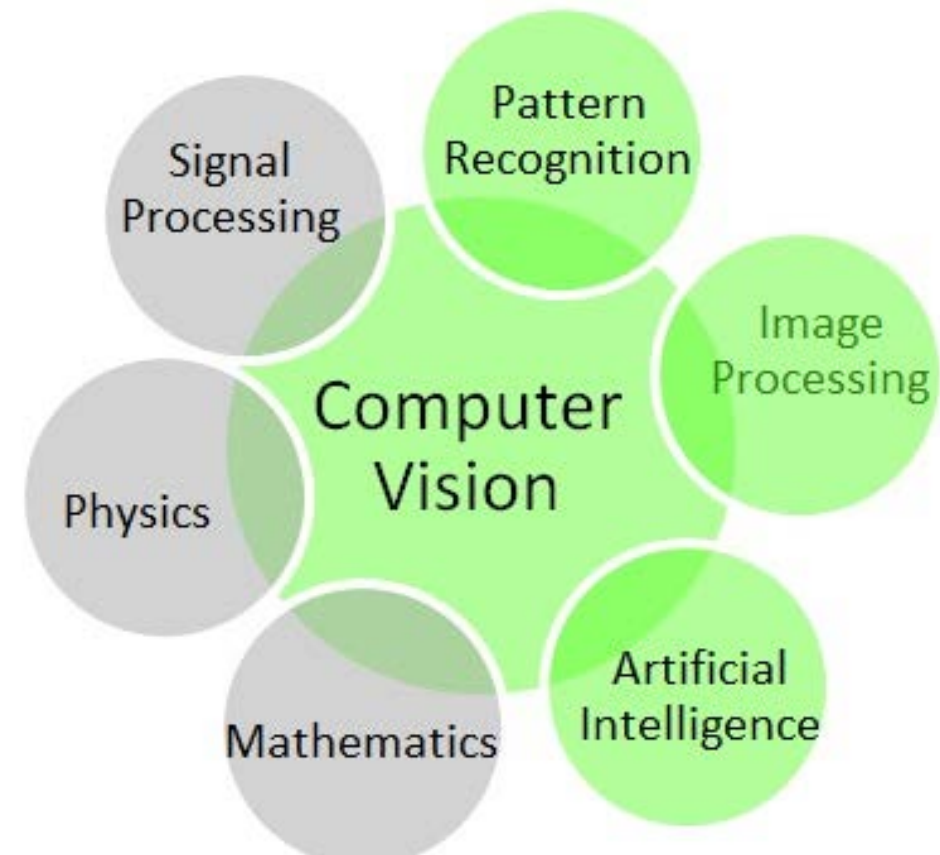
Definition

Computer vision is an **interdisciplinary** field that deals with how computer can be made to **gain** high-level understanding from **digital images or videos**.



Rough Translation

Computer vision is pretty much what it sounds like, with just a few little extra **consideration** and **distinctions** from other related field.



The Long and Storied History of CV

- People have been trying to give computers the [gift of vision](#) since right around the time Walt Disney.
- Suffice it to say that half a century of advances in [computing](#), [mathematics](#), and [related fields](#) have allowed us to make a lot of progress since then.

“First ever report
proposal on Computer
Vision by 1st year
Undergrad Computer
Science student at MIT
assigned by Minsky”

MASSACHUSETTS INSTITUTE OF TECHNOLOGY
PROJECT MAC

Artificial Intelligence Group
Vision Memo. No. 100.

July 7, 1966

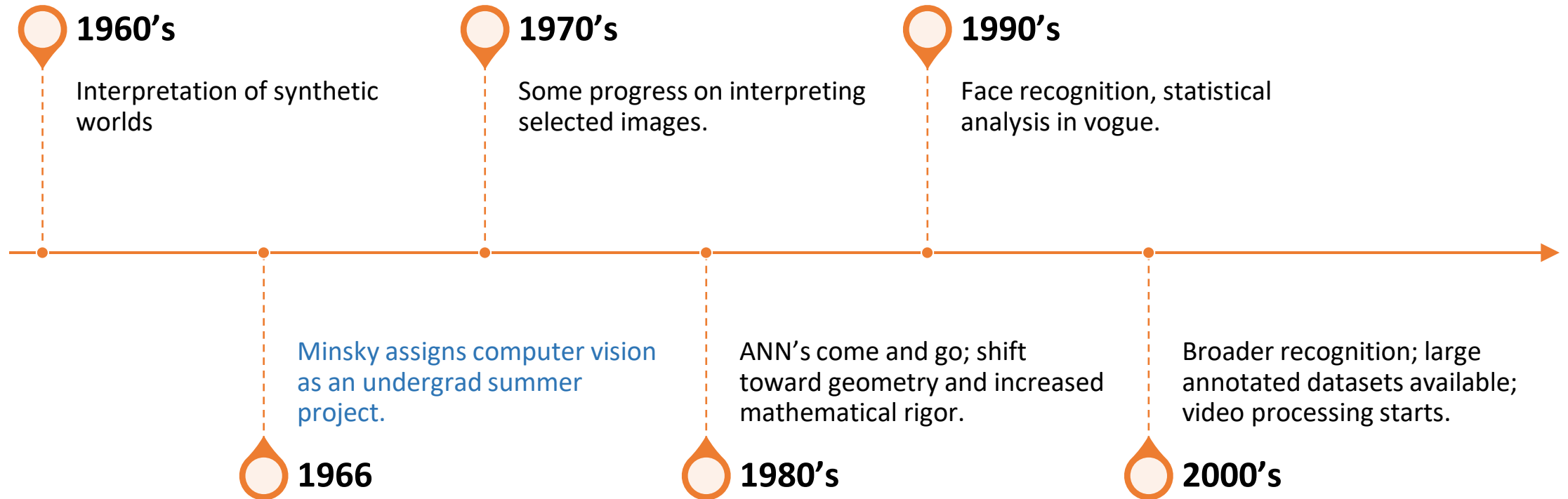
THE SUMMER VISION PROJECT
Seymour Papert

The summer vision project is an attempt to use our summer workers effectively in the construction of a significant part of a visual system. The particular task was chosen partly because it can be segmented into sub-problems which will allow individuals to work independently and yet participate in the construction of a system complex enough to be a real landmark in the development of "pattern recognition".

Goals - General

The primary goal of the project is to construct a system of programs which will divide a vidisector picture into regions such as

- likely objects
- likely background areas



Goal for CV:

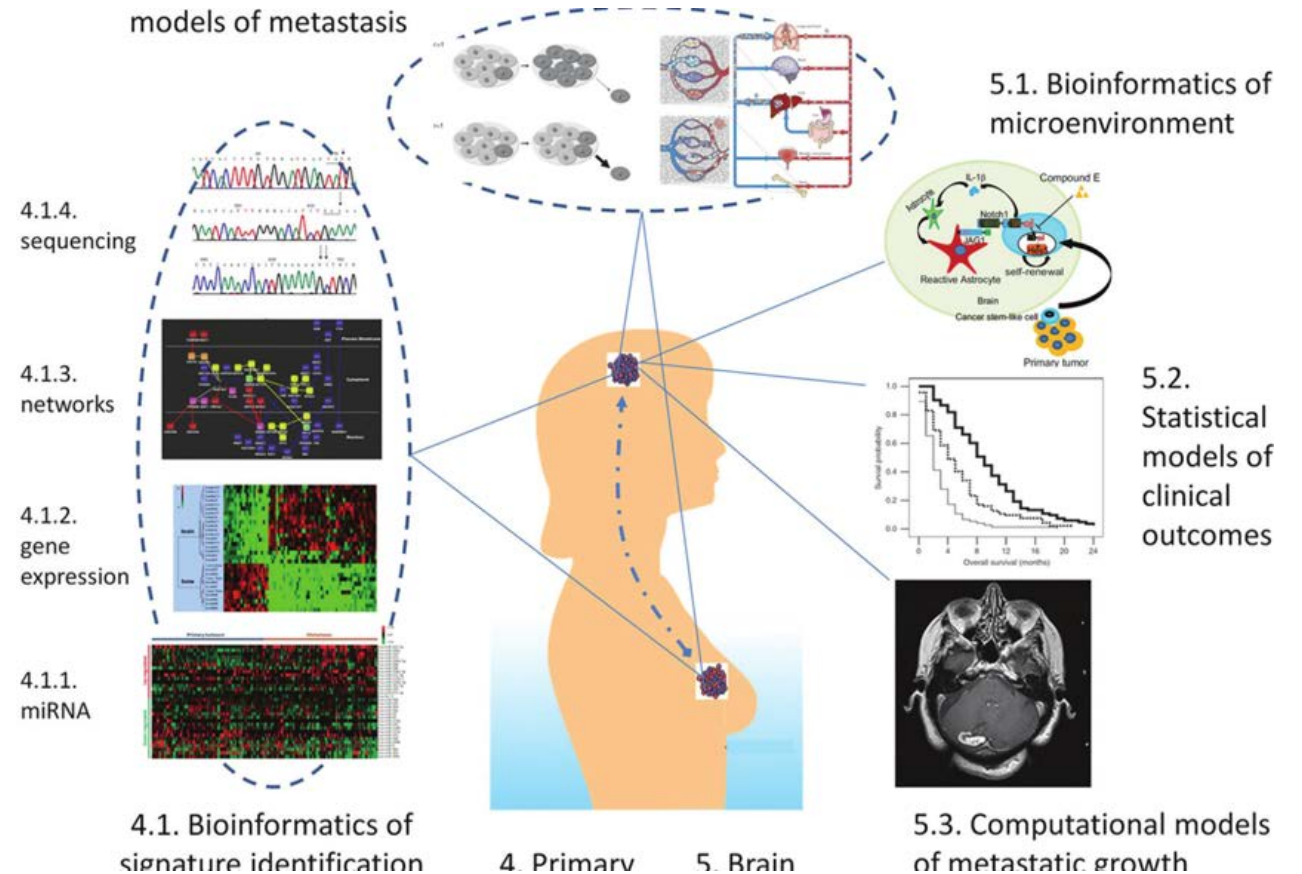
Computer vision has dual goals

- From biological point of view.
- From engineering point of view.



Biological point of View

It aims to come up with **computational models** of the human visual system.

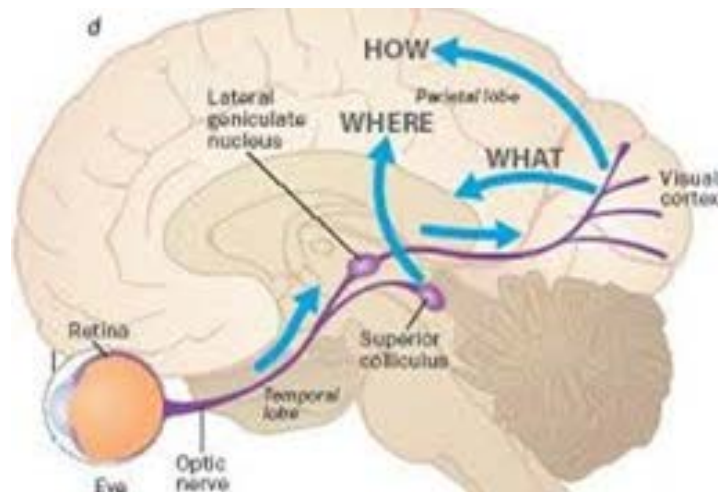


Engineering Point of View

It aims to build **autonomous system** which could perform some of the **task** which the **human visual system** can perform.



Visual System Representation



- It includes the **eyes**, the connecting pathways through to the **visual cortex and other parts of the brain**.
- The illustration shows the **mammalian** system.

What is Visual System?



PART OF THE CENTRAL NERVOUS SYSTEM WHICH GIVES ORGANISMS THE ABILITY TO PROCESS VISUAL DETAIL AS SIGHT, AS WELL AS ENABLING THE FORMATION OF SEVERAL NON-IMAGE PHOTO RESPONSE FUNCTIONS.



IT DETECTS AND INTERPRETS FORMATION OF SEVERAL NON-IMAGE PHOTO RESPONSE FUNCTIONS.



DETECTS AND INTERPRETS INFORMATION FROM VISIBLE LIGHT TO BUILD A REPRESENTATION OF THE SURROUNDING ENVIRONMENT.

AGENDA



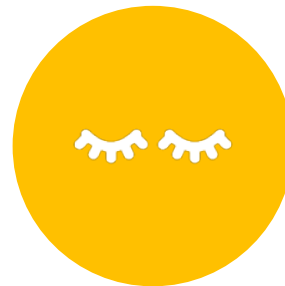
Brief walk into the world of Computer Vision



Common Problems that Computer Vision Solves



Few solutions by popular companies in Computer Vision Space



Advancement in the field of Computer Vision

How Computer Vision Works?

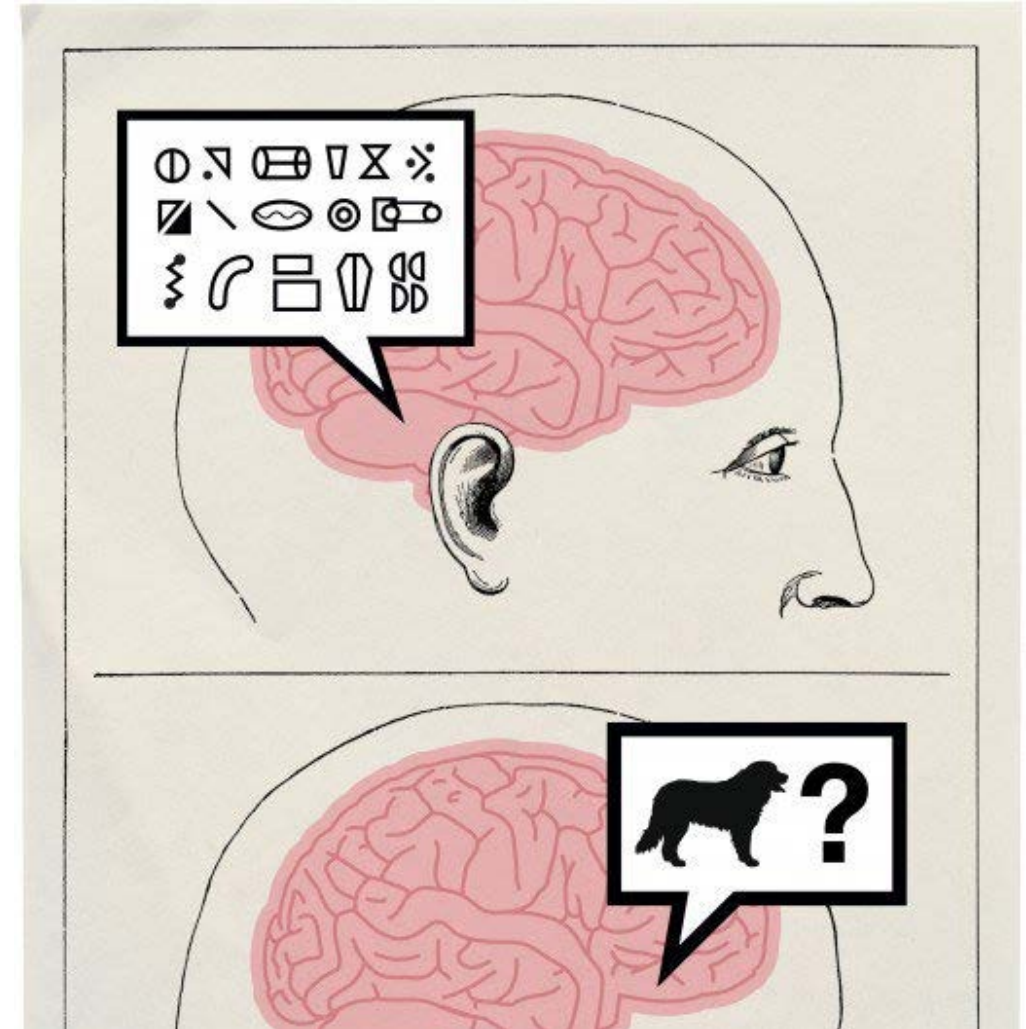


One of the **major open questions** in both Neuroscience and Machine Learning is:



How exactly do our **brains work**, and how can we **approximate that with our own algorithms**?

Since we are **not decided** on how the brain and eyes process images, its **difficult to say** how all the algorithms used in production approximate our own internal mental processes.



Machines interpret images very simply: as a **series of pixels**, each with their own set of **color values**.

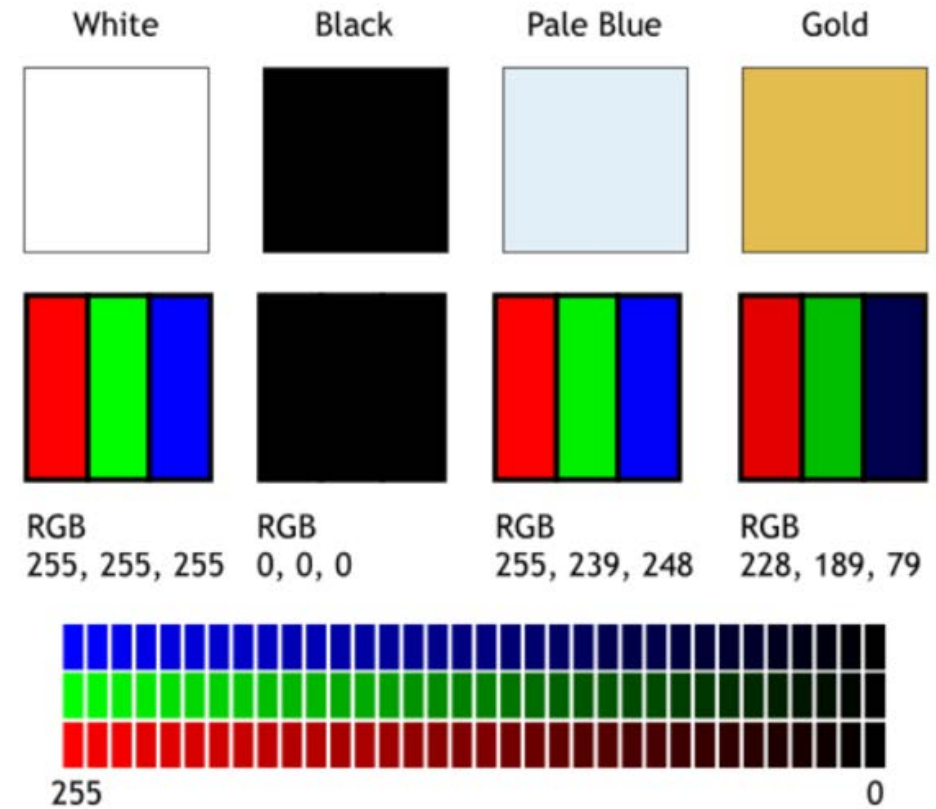
Consider the simplified image adjacent, and how **greyscale values** are converted into a **simple array of numbers**:



| | | | | | | | | | | | |
|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|
| 157 | 153 | 174 | 168 | 150 | 152 | 129 | 151 | 172 | 161 | 155 | 156 |
| 155 | 182 | 163 | 74 | 75 | 62 | 33 | 17 | 110 | 210 | 180 | 154 |
| 180 | 180 | 50 | 14 | 34 | 6 | 10 | 33 | 48 | 106 | 159 | 181 |
| 206 | 109 | 5 | 124 | 131 | 111 | 120 | 204 | 166 | 15 | 56 | 180 |
| 194 | 68 | 137 | 251 | 237 | 239 | 239 | 228 | 227 | 87 | 71 | 201 |
| 172 | 106 | 207 | 233 | 233 | 214 | 220 | 239 | 228 | 98 | 74 | 206 |
| 188 | 88 | 179 | 209 | 185 | 215 | 211 | 158 | 139 | 75 | 20 | 169 |
| 189 | 97 | 165 | 84 | 10 | 168 | 134 | 11 | 31 | 62 | 22 | 148 |
| 199 | 168 | 191 | 193 | 158 | 227 | 178 | 143 | 182 | 106 | 36 | 190 |
| 205 | 174 | 155 | 252 | 236 | 231 | 149 | 178 | 228 | 43 | 95 | 234 |
| 190 | 216 | 116 | 149 | 236 | 187 | 85 | 150 | 79 | 38 | 218 | 241 |
| 190 | 224 | 147 | 108 | 227 | 210 | 127 | 102 | 36 | 101 | 255 | 224 |
| 190 | 214 | 173 | 66 | 103 | 143 | 96 | 50 | 2 | 109 | 249 | 215 |
| 187 | 196 | 235 | 75 | 1 | 81 | 47 | 0 | 6 | 217 | 255 | 211 |
| 183 | 202 | 237 | 145 | 0 | 0 | 12 | 108 | 200 | 138 | 243 | 236 |
| 195 | 206 | 123 | 207 | 177 | 121 | 123 | 200 | 175 | 13 | 96 | 218 |

| | | | | | | | | | | | |
|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|
| 157 | 153 | 174 | 168 | 150 | 152 | 129 | 151 | 172 | 161 | 155 | 156 |
| 155 | 182 | 163 | 74 | 75 | 62 | 33 | 17 | 110 | 210 | 180 | 154 |
| 180 | 180 | 50 | 14 | 34 | 6 | 10 | 33 | 48 | 106 | 159 | 181 |
| 206 | 109 | 5 | 124 | 131 | 111 | 120 | 204 | 166 | 15 | 56 | 180 |
| 194 | 68 | 137 | 251 | 237 | 239 | 239 | 228 | 227 | 87 | 71 | 201 |
| 172 | 106 | 207 | 233 | 233 | 214 | 220 | 239 | 228 | 98 | 74 | 206 |
| 188 | 88 | 179 | 209 | 185 | 215 | 211 | 158 | 139 | 75 | 20 | 169 |
| 189 | 97 | 165 | 84 | 10 | 168 | 134 | 11 | 31 | 62 | 22 | 148 |
| 199 | 168 | 191 | 193 | 158 | 227 | 178 | 143 | 182 | 106 | 36 | 190 |
| 205 | 174 | 155 | 252 | 236 | 231 | 149 | 178 | 228 | 43 | 95 | 234 |
| 190 | 216 | 116 | 149 | 236 | 187 | 85 | 150 | 79 | 38 | 218 | 241 |
| 190 | 224 | 147 | 108 | 227 | 210 | 127 | 102 | 36 | 101 | 255 | 224 |
| 190 | 214 | 173 | 66 | 103 | 143 | 96 | 50 | 2 | 109 | 249 | 215 |
| 187 | 196 | 235 | 75 | 1 | 81 | 47 | 0 | 6 | 217 | 255 | 211 |
| 183 | 202 | 237 | 145 | 0 | 0 | 12 | 108 | 200 | 138 | 243 | 236 |
| 195 | 206 | 123 | 207 | 177 | 121 | 123 | 200 | 175 | 13 | 96 | 218 |

- When we start to add in color, things get more complicated.
- Computers usually read color as a series of 3 values
 - Red
 - Green
 - Blue
 - On that same 0 – 255 scales.





For some perspective on how computationally expensive this is, consider this tree:



$8 \text{ bits} * 3 \text{ colors per pixel} = 24 \text{ bits per pixel}$



Each color value is stored in 8 bits.



A normal sized $1024 * 768$ image * 24 bits per pixel = almost 19M bits, or about 2.36 megabytes.

Implications of Computer Vision



Broad parent name for any computations involving visual content - which includes



Images,



Videos,



Icons, and

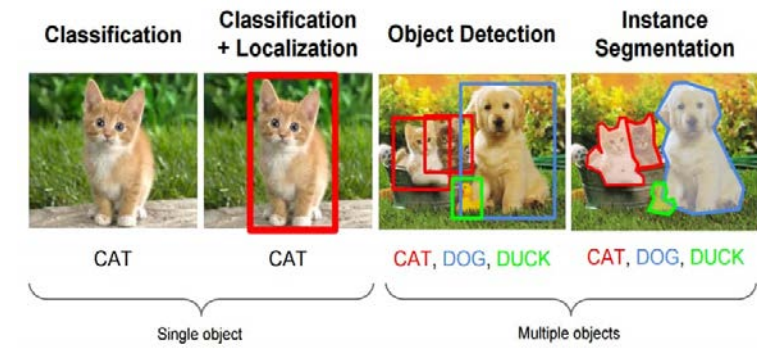


anything else with pixels involved.

But within this parent idea, there are a few specific tasks that are core building blocks:

- Object classification
- Object Identification

Computer Vision Tasks



A classical application of computer vision is
 handwriting recognition for digitizing
 handwritten context.

| | | | |
|------------------------|---------------|--------------|-------------|
| my alarm | clock | dish | not |
| my alarm | code | soil | rout |
| | circle | raid | hot |
| | shute | risk | riot |
| | clock | visit | not |
| | | did | must |

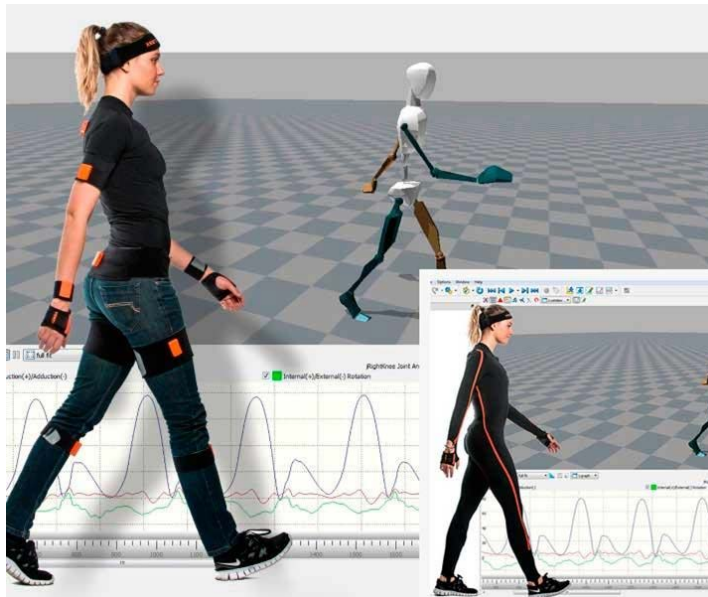
| | |
|-----------------------|-------------------------------------|
| Wake me | up this morning |
| wake me | up thai moving |
| | taxis having |
| | this running |
| | tier morning |
| | loving |



Outside of just recognition, other method of analysis include:

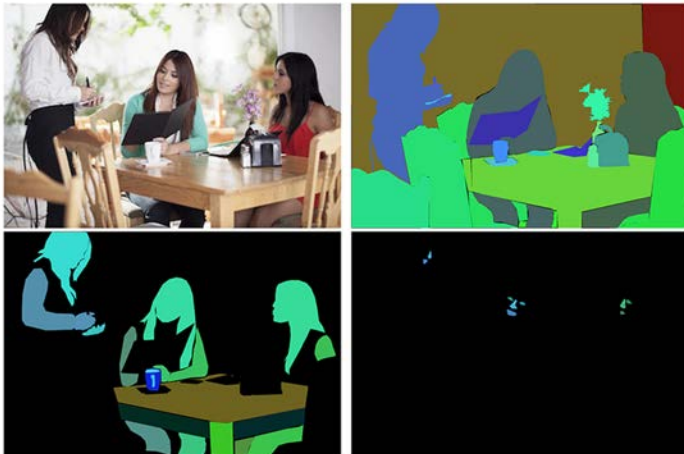
1. Motion Analysis
2. Image restoration
3. Scene reconstruction
4. Image restoration

Motion Analysis



Uses Computer vision to estimate the **velocity of objects** in a video, or camera itself

Image Segmentation



Algorithms partition images into multiple set of views.

Scene Reconstruction



Creates **3D model** of the scene inputted through images or videos.

Image Restoration



Before



After

Noise such as blurring is removed from photos using Machine learning filters.

Why do we need CV anyway?



CV ALLOWS COMPUTERS, AND
THUS ROBOTS, OTHER
COMPUTER-CONTROLLED
VEHICLES, AND

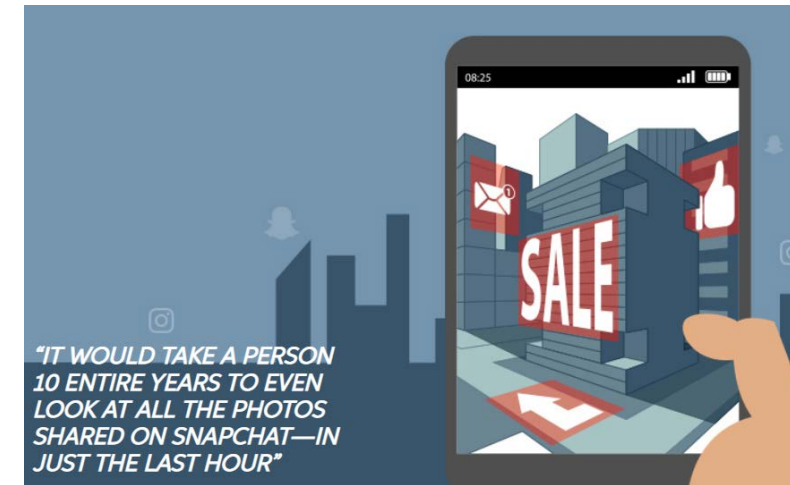


EVERYTHING FROM FACTORIES
AND FARM EQUIPMENT TO
SEMI-AUTONOMOUS CARS AND
DRONES,



TO RUN MORE EFFICIENTLY AND
INTELLIGENTLY AND EVEN
SAFELY.

Simply put, our world has become increasingly filled with digital images and we need computers to make sense of it all- it's already well past human capabilities to keep up



AGENDA



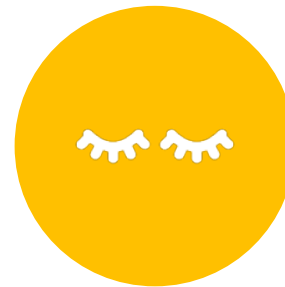
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Common Problems that
Computer Vision Solves



Few solutions by popular
companies in Computer
Vision Space



Advancement in the
field of Computer Vision

Market Leaders Using CV



- Today, top technology companies such as [Amazon](#), [Google](#), [Microsoft](#) and [Facebook](#) are investing billions of dollars in computer vision research and product development.

Computer Vision, an AI technology that allows computers to **understand and label images**, is now used in:



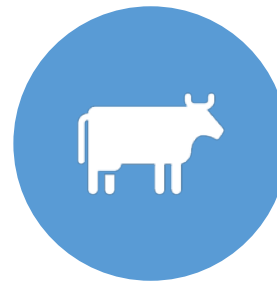
Convenience stores



Driverless car testing



Daily medical
diagnostics



Monitoring the health of
crops and livestock.

Use Cases of Computer Vision



Retail and Retail
Security



Automotive



Healthcare



Agriculture



Banking



Industrial

Retail and Retail Security

AMAZON

- Amazon recently opened to the public the **Amazon Go** store where shoppers **need not wait** in line at the checkout counter to pay for their purchases.
- <https://youtu.be/uoKsY9HDk6o>



In Retail Fashion

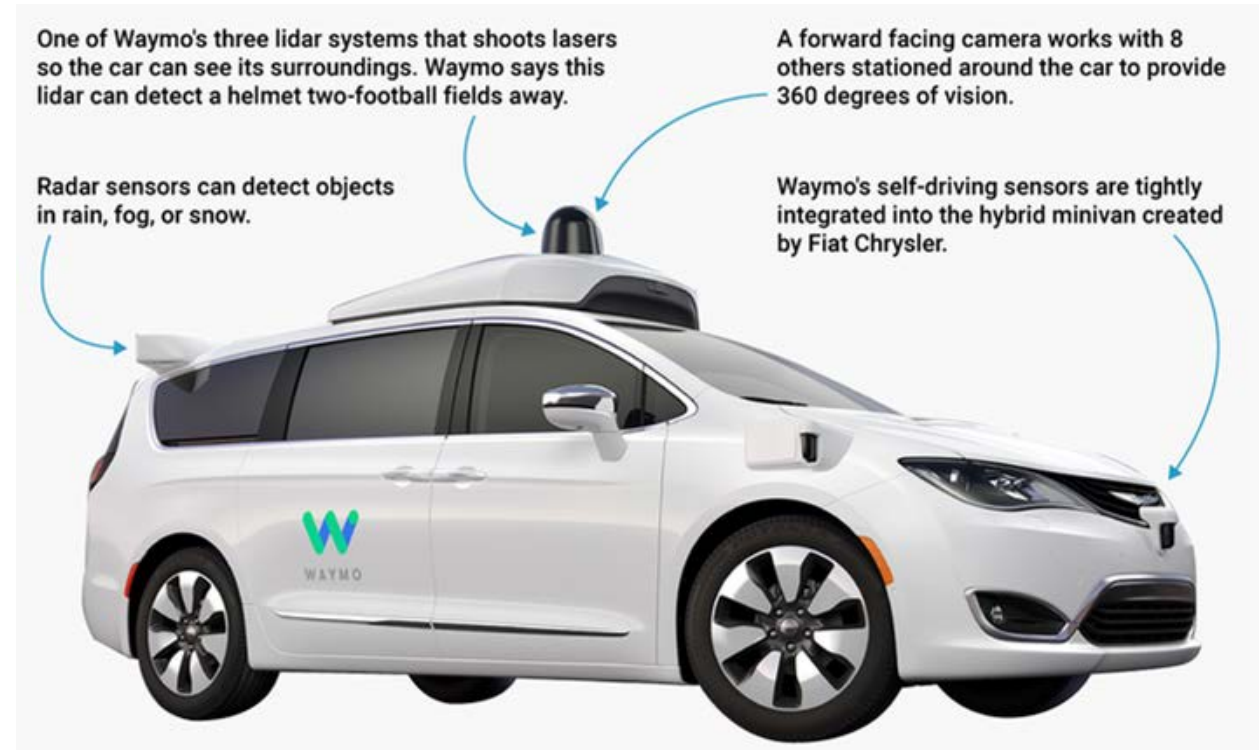
- Amazon has applied for a patent for a **virtual mirror**.
- The Virtual mirror technology, is described as a **blended-reality display** that puts a shopper's image into an augmented scene and **puts the individual in a virtual dress**.
- <https://youtu.be/Mr71jrkzWq8>



AUTOMOTIVE

WAYMO

- Formerly known as [Google self-driving car](#).
- Equipped with sensors and software that can detect [360 degrees of movements](#) of [pedestrians](#), [cyclists](#), [vehicles](#), road work and other objects from [up to three football fields away](#).
- <https://youtu.be/TsaES--OTzM>



TESLA

- Claims all 3 Autopilot car models are equipped for full self-driving capability.
- Fitted with 8 cameras for 360-degree visibility around the car with a viewing distance of 260 meters around.
- 12 ultrasonic sensors enable the car to detect both hard and soft objects.
- They claim that a forward-facing radar enables the car to see through heavy rain, fog, dust and even the car ahead.
- <https://youtu.be/UgNhYGAgmZo>



HEALTHCARE

GAUSS SURGICAL

- Developed **blood monitoring solutions**.
- The solution, the website reports, maximizes **transfusions** and **recognizes hemorrhage** better than the human eye.
- Monitoring solution include Triton OR which uses an iPad-based app to capture **images of blood on surgical sponges and suction canisters**.
- <https://youtu.be/cBzJ43zU4FY>



DeepLens and DermLens

- Developed by Amazon Web Services(AWS).
- DermLens aims to assist patients to monitor and manage a skin condition called [psoriasis](#).
- DermLens app is intended as a [continuous care service](#) where the reported data is available for the physician and care team.
- <https://youtu.be/-JDLpSsO45A>



AGRICULTURE

SLANTRANGE:

- Claims to offer computer vision – [equipped drones](#) that are connected to what the company calls [intelligence system](#).
- Consists of sensors, processors, storage devices, networks, an artificial intelligence software.
- At [120 meters above](#) ground level.
- Camera has a resolution of [4.8 cm/pixel](#).
- https://youtu.be/EbdwUg_MU-U



CAINTHUS

- It offers **animal facial recognition**.
- Uses **predictive imaging** analysis to monitor the health and well-being of crops and livestock.
- <https://www.youtube.com/watch?v=022XsKEBMmA&t=11s>



BANKING

MITEK SYSTEMS

- Offers **image recognition** application
- Use machine learning to **classify**, **extract data**, and **authenticate documents** such as passports, ID cards, driver's licenses and checks.
- The application works by having customers **take a photo of an ID or a paper check using their mobile devices** and sent the user's bank where CV software on the bank's side **verifies authenticity**.
- <https://youtu.be/sGD49ybxS2Q>



INDUSTRIAL

OSPREY INFORMATICS

- Used to monitor the **status of critical infrastructure** such as **remote wells, industrial facilities, work activity and site security.**
- <https://youtu.be/WHhCmmZnAfg>



AGENDA



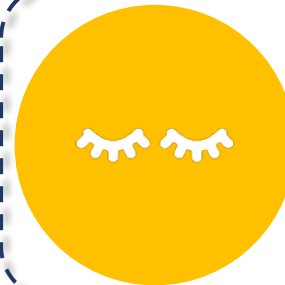
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Advancement in the field of Computer Vision

Advancement in Computer Vision

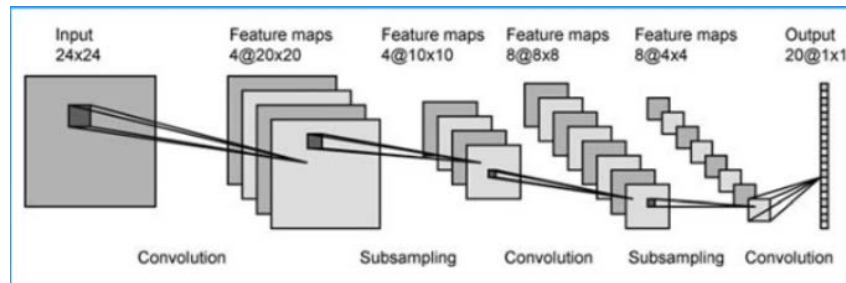


Much of the progress made in computer vision accuracy over the past few years is due in part to a **special type of algorithm**.



Convolution Neural network are a **subset of Deep Learning** with a few extra added operations, and they have been shown to **achieve impressive accuracy on image-associated tasks**.

Convolution Neural Network



- Utilizes the **same concepts** of Neural Networks, but add in some steps before the normal architecture
- These steps are focused on **feature extraction**.

ConvNet Operations

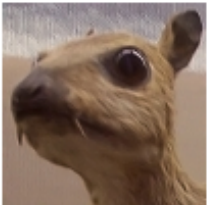


Convolution Neural Net comprises of 3 operations:

- Convolution
- Rectified Linear Unit (ReLU)
- Pooling

Convolution

Input image



Convolution
Kernel

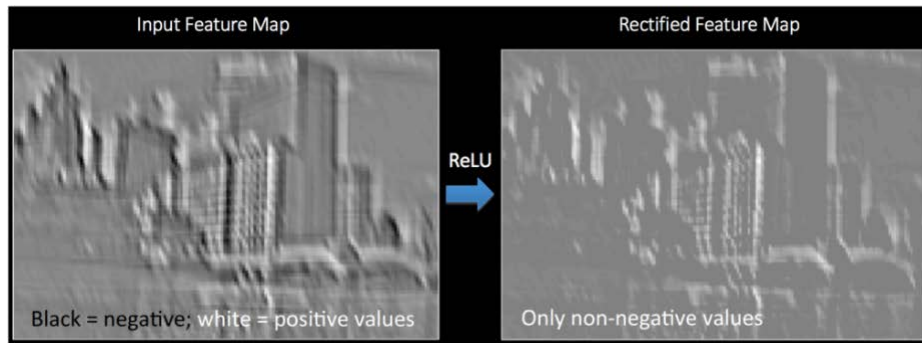
$$\begin{bmatrix} -1 & -1 & -1 \\ -1 & 8 & -1 \\ -1 & -1 & -1 \end{bmatrix}$$

Feature map



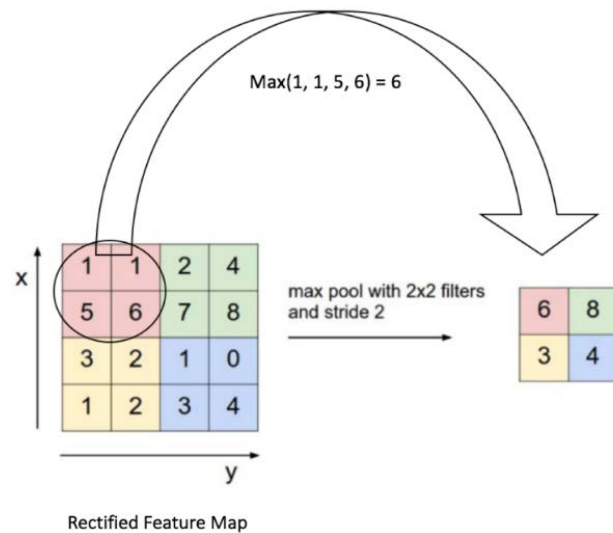
- The input image pixels are **modified by a filter**.
- This is just a **matrix** that we multiply different pieces of the input image by.
- The output often called as **Feature Map** – will usually be smaller than the original image, and theoretically be more informative.

ReLU



- Stands for **Rectified Linear Unit**.
- Function to introduce non-linearity into the feature map.
- All negative values are simply changed to zero, removing all black from the image.
- The formal function is $y = \max(0, x)$.

Pooling



- The image is scanned over by a **set width of pixels**, and either the **max**, **sum**, or **average** of those pixels is taken as a representation of that portion of the image.
- Further **reduces the size** of the feature maps(s) by a factor of whatever size is pooled.

Summing up the CNN

All of these operations – Convolution, ReLU, and Pooling – are often **applied twice in a row** before concluding the process of the feature extraction.

- The output of this whole process are then **passes into a neural net for classification.**
- The final architecture looks as follow:

