

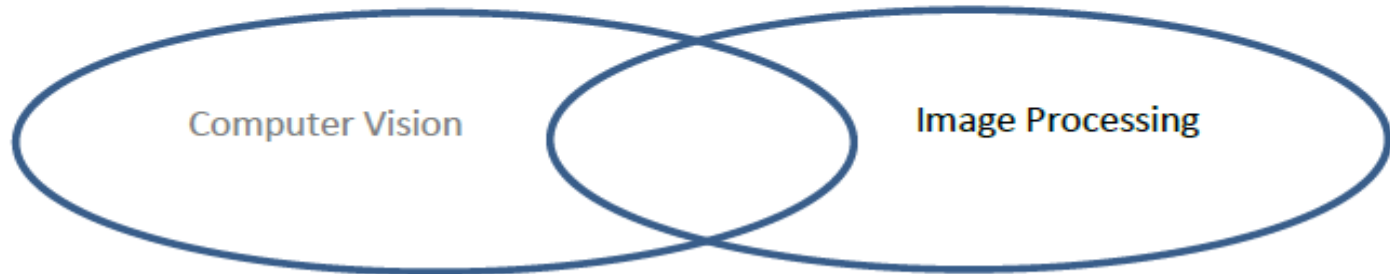


## Lec. 1

# Introduction to Computer Vision

Assist. Prof. Dr. Saad Albawi

## Computer Imaging

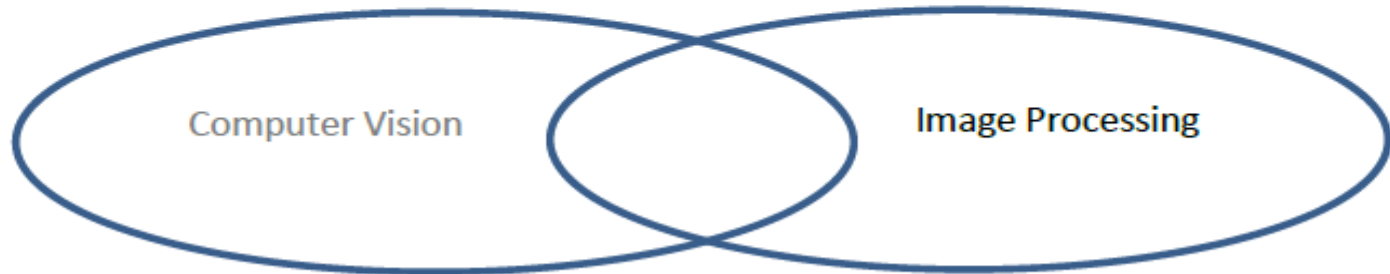


---

Computer vision has been around since the 1960s. Recent developments:

- Increasing availability of cheap, powerful cameras (e.g. digital cameras, webcams) and other sensors.
- Increasing availability of massive amounts of image and multimedia content on the web (e.g. face databases, streaming video or image-based communication).
- Increasing availability of cheap, powerful computers (processor speed and memory capacity).
- Introduction of techniques from machine learning and statistics (complex, data-driven models and algorithms).

## Computer Imaging



---

Computer vision has been around since the 1960s. Recent developments:

- Increasing availability of cheap, powerful cameras (e.g. digital cameras, webcams) and other sensors.
- Increasing availability of massive amounts of image and multimedia content on the web (e.g. face databases, streaming video or image-based communication).
- Increasing availability of cheap, powerful computers (processor speed and memory capacity).
- Introduction of techniques from machine learning and statistics (complex, data-driven models and algorithms).

# What is Computer Vision?

---

The goal of computer vision is to develop algorithms that allow computer to “see”.

Also called

- Image Understanding
- Image Analysis
- Machine Vision

Is a computer imaging where the application does not involve a human being in the visual loop. In other word, the image are examined and acted upon by a computer. Although people are involved in the devvelopment of the system, the final application requires a computer to use the visual information directly. One of the major topics within the filed of computer vision is image analysis.

# What is Computer Vision?

- Make computers understand images and videos.



- What kind of scene?
- Where are the cars?
- How far is the building?

# What is (computer) vision?

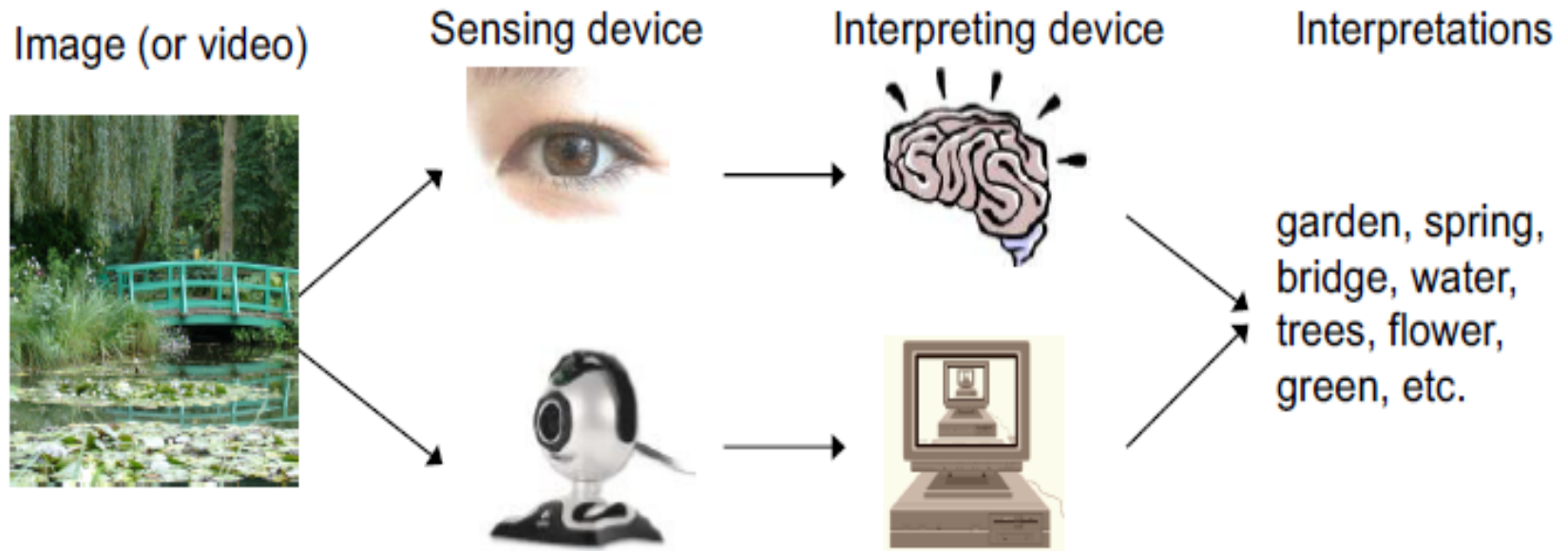


Image analysis involve the examination of the image data to facilitate solving a vision problem. The image analysis process involves two other topics: Feature extraction and pattern classification.

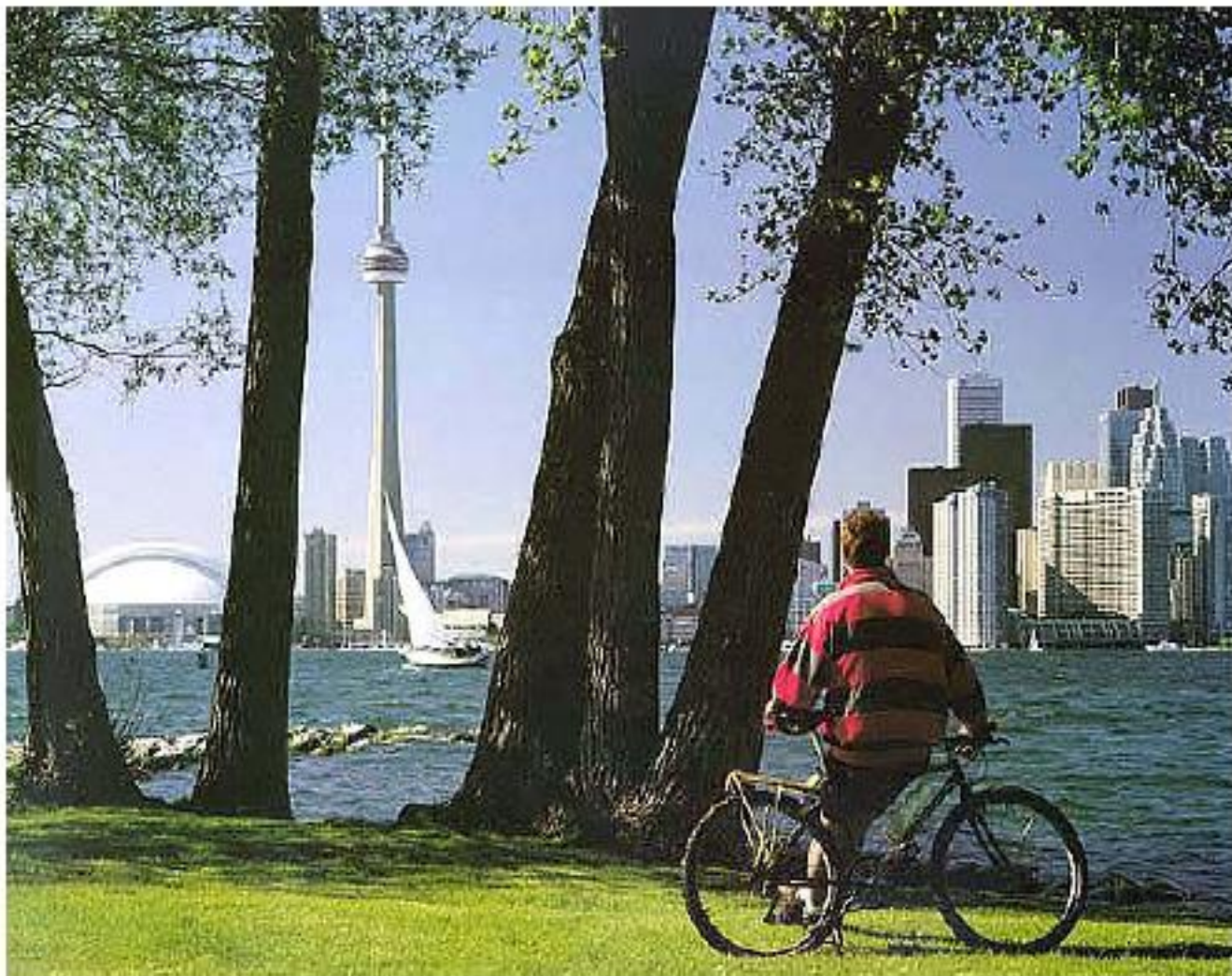
Features extraction is the process of acquiring higher level image information, such as shape or color information

Pattern classification is the act of taking this higher level information objects within the image.

Computer vision systems are used in many and various types of enviroments from manufacturing plants to hospital surgical suites to the surface of Mars. For example. In manufacturing systems, computer vision is often used for quality control. There, the computer vision system will scan manufactured items for defects and provide control signals to robotic manipulator to remove defective parts automatically.

# General visual perception is hard

---





# Digital Image

---

232 182 143 151 151 148 148 143 145 139 143 136 139 136 134 132 129 130 126 124 115 116 115 104 109 102 100 101  
244 218 160 149 145 147 145 143 139 142 140 139 134 134 130 131 125 120 120 116 110 110 107 100 100 97 95 97  
246 233 196 145 145 146 141 141 137 134 140 133 133 125 131 125 114 121 116 116 109 101 95 101 97 87 89 91  
248 242 222 161 142 140 145 137 138 135 129 127 127 122 124 118 116 113 102 110 99 102 98 94 91 88 91 90  
252 246 234 192 143 139 136 134 133 129 131 127 124 121 117 114 111 105 108 93 101 102 86 88 91 84 84 99  
252 249 242 215 151 137 134 134 129 126 126 121 120 116 113 111 108 104 99 94 102 93 89 96 79 87 92 112  
252 248 242 227 169 134 135 124 122 120 125 121 116 115 105 112 102 99 92 98 93 88 89 74 87 85 97 111  
253 246 244 236 192 134 125 123 119 120 118 116 112 107 110 95 104 94 89 96 84 86 79 77 65 79 105 119  
252 250 246 238 210 144 126 118 120 115 116 116 98 105 103 102 96 93 91 82 80 79 75 70 82 81 108 119  
250 251 247 239 219 161 127 117 117 109 105 107 100 104 99 100 98 79 98 70 73 80 72 65 86 83 113 124  
252 249 247 241 226 177 122 120 116 106 108 110 91 103 93 99 89 88 79 80 72 74 76 65 84 87 109 123  
249 249 247 241 231 191 131 116 110 109 106 98 95 90 102 83 78 86 85 80 70 75 69 81 79 96 122 121  
248 249 247 244 238 204 133 121 101 103 94 97 91 87 87 83 83 82 77 78 81 61 73 65 86 99 118 120  
247 250 248 244 237 215 149 115 102 105 91 94 80 81 79 83 81 70 71 73 74 71 78 74 76 108 117 119  
250 247 246 243 239 218 159 108 100 87 100 88 92 83 85 77 81 63 80 70 63 73 70 78 81 110 120 116  
248 245 244 241 239 224 170 113 103 94 89 86 84 83 74 81 68 78 74 64 66 70 73 65 92 108 115 123  
248 244 244 242 237 224 179 123 98 94 84 74 88 77 71 76 71 78 68 67 63 72 72 75 94 109 115 124  
247 244 245 241 238 221 183 123 95 87 89 73 77 79 71 65 78 56 69 66 62 61 70 69 90 113 118 118  
247 246 244 242 236 219 185 120 100 84 82 79 66 67 76 72 69 55 61 56 65 57 70 78 95 106 119 116  
246 245 244 241 231 216 190 126 91 86 77 77 72 71 76 60 69 60 57 52 66 55 62 75 87 110 110 117  
245 244 244 237 231 221 189 133 97 83 70 73 62 59 77 44 65 66 60 70 51 43 67 75 95 107 116 111  
244 244 241 237 230 222 188 133 90 83 77 77 59 78 60 67 62 61 66 72 62 51 62 71 96 105 115 108  
242 242 237 236 232 219 187 126 83 79 70 64 58 66 63 67 54 65 51 65 58 54 62 73 77 92 107 94  
241 241 238 236 229 216 186 125 85 77 70 66 64 53 63 55 56 53 67 39 52 25 23 9 11 51 66 77  
241 239 237 237 228 214 185 127 92 83 64 66 69 62 61 65 32 42 12 7 6 15 65 123 146 160 167 172  
240 239 237 236 225 208 178 123 89 67 72 67 49 54 27 10 7 23 103 142 162 167 169 168 171 172 172 178  
238 236 236 229 221 203 174 125 77 82 55 33 23 9 79 135 163 173 174 175 174 170 171 167 167 172 169 173  
235 235 231 228 215 198 165 122 84 43 14 57 132 166 176 175 179 177 176 178 178 173 169 172 167 168 171 162  
231 231 227 223 210 191 163 110 44 95 159 174 175 179 178 180 183 180 179 177 175 175 174 173 169 168 171 156  
230 226 225 220 202 187 169 151 175 180 182 177 182 182 183 184 184 181 182 181 178 182 179 172 161 160 155  
223 224 220 213 198 191 185 186 182 182 178 179 184 185 191 189 189 192 188 192 193 194 192 187 179 161 153 147  
220 219 213 203 191 182 181 177 176 173 175 180 182 184 192 192 193 195 200 203 203 206 205 202 192 164 150 151  
212 209 200 188 177 173 174 171 169 165 173 176 180 187 191 192 195 195 201 203 207 210 208 212 201 177 147 143

# The goal of computer vision



What we see

ap k

0	3	2	5	4	7	6	9	8
3	0	1	2	3	4	5	6	7
2	1	0	3	2	5	4	7	6
5	2	3	0	1	2	3	4	5
4	3	2	1	0	3	2	5	4
7	4	5	2	3	0	1	2	3
6	5	4	3	2	1	0	3	2
9	6	7	4	5	2	3	0	1
8	7	6	5	4	3	2	1	0

What a computer sees

## Related fields

---

- Image Processing
- Pattern Recognition
- Photogrammetry
- Computer graphics

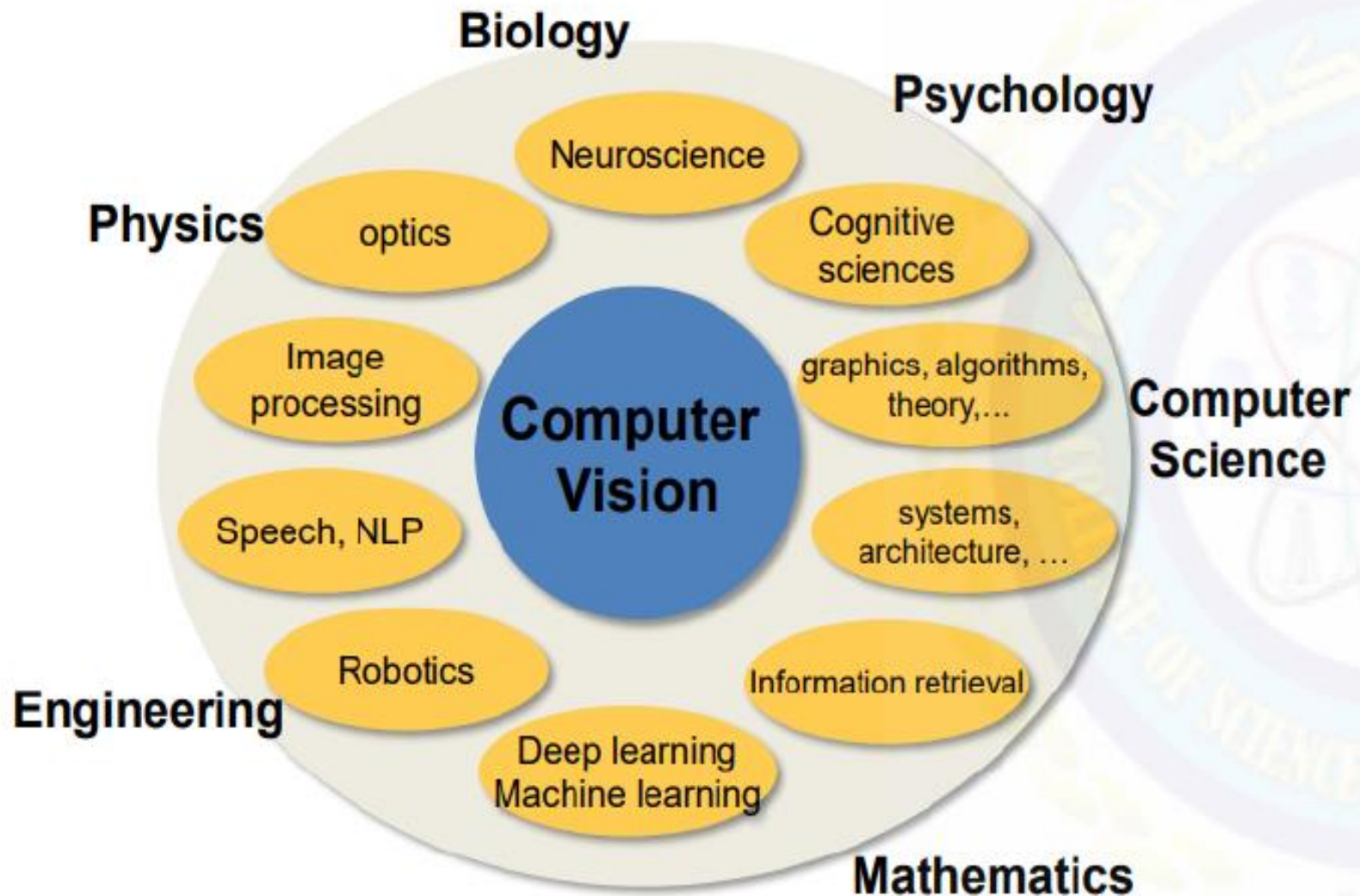
## Our Time

---

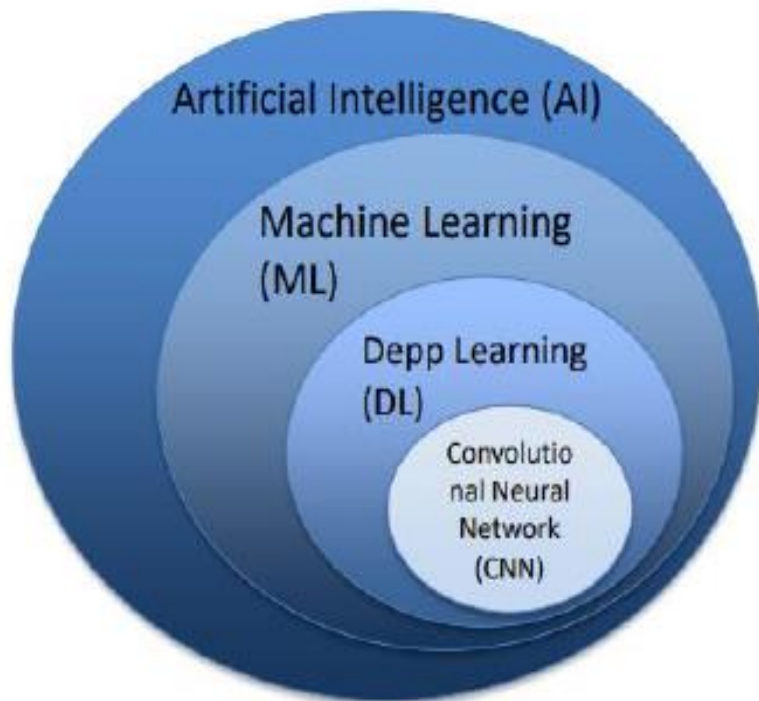
It is a good time to do computer vision now,  
because:

- Powerful computers
- Inexpensive cameras
- Algorithm improvements
- Understanding of vision systems

# What is Computer Vision?



# What is Computer Vision?



## Computer Vision

- Object detection
- Object classification
- Scene understanding
- Semantic scene segmentation
- 3D reconstruction
- Object tracking
- Human pose estimation
- Activity recognition
- VQA
- ....

# Computer Vision and Nearby Fields

Digital Image Processing  
Computational Photography

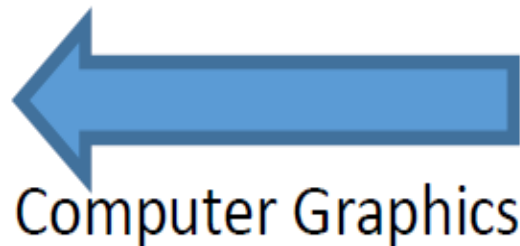


**Images (2D)**

Computer Vision



**Geometry (3D)**  
Shape



Computer Graphics

**Photometry**  
Appearance



Machine learning:

Vision = Machine learning applied to visual data

# Where did we come from?

- Edges, segmentation, and perception



D. Lowe. IJCV, 1992

# Low Level Topics in Computer Vision:

- Low level operations.
  - Image enhancement.
  - Feature detection.
  - Region segmentation.





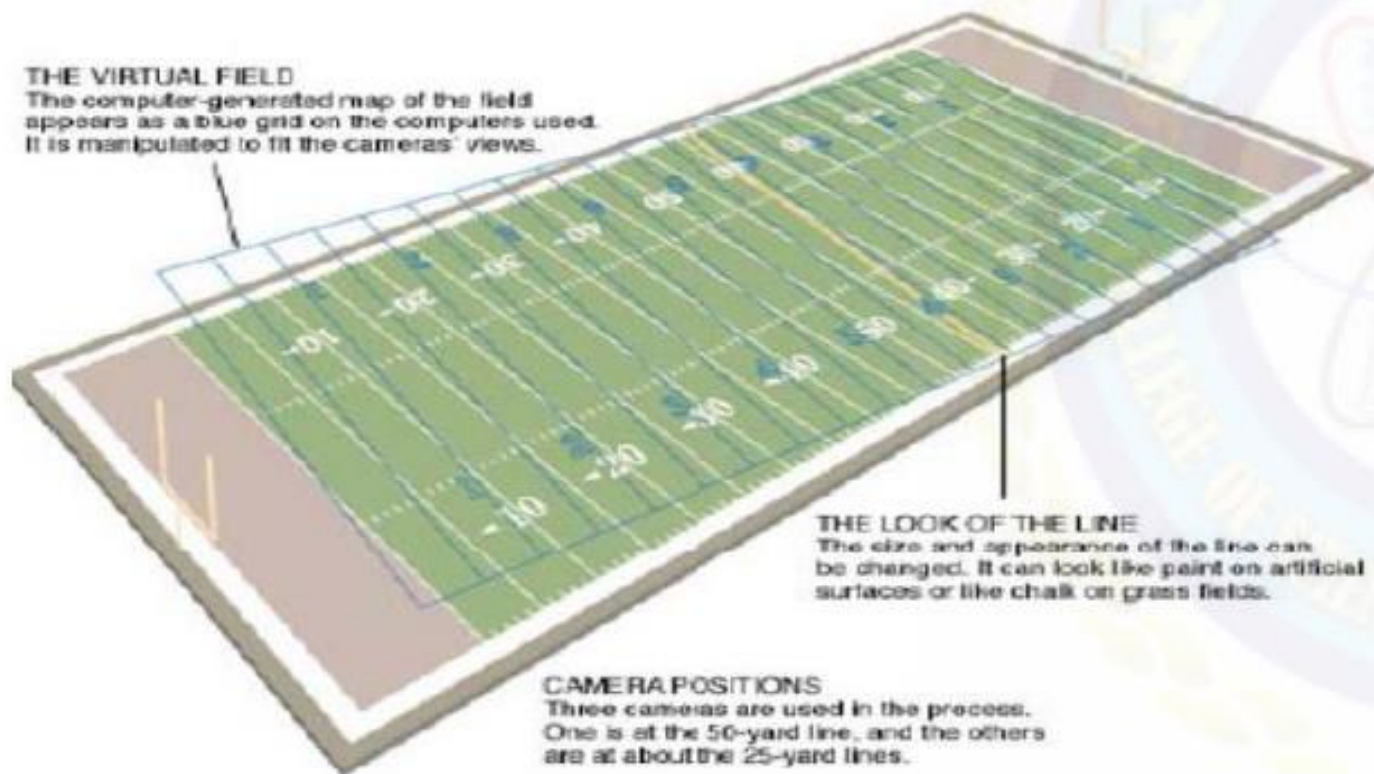
# Low Level Topics in Computer Vision:

- Low level operations.
  - Photo Stitching.



# Low Level Topics in Computer Vision:

- Low level operations.
  - 3D shape reconstruction, stereopsis, structure from motion



# Low Level Topics in Computer Vision:

- Detecting sharp edges by convolution.

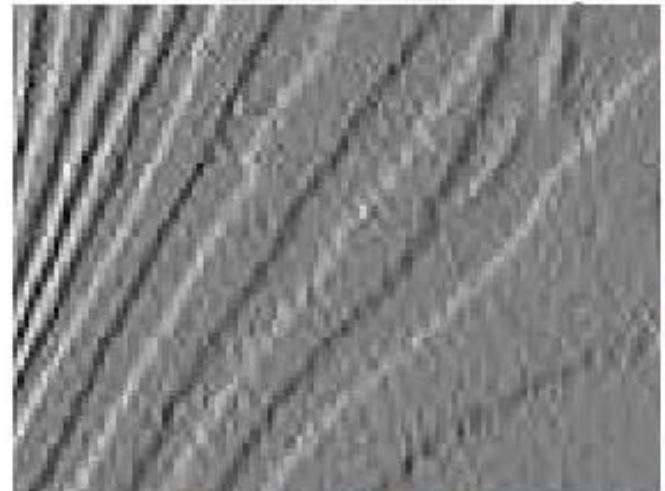
Convolve this image



With this kernel

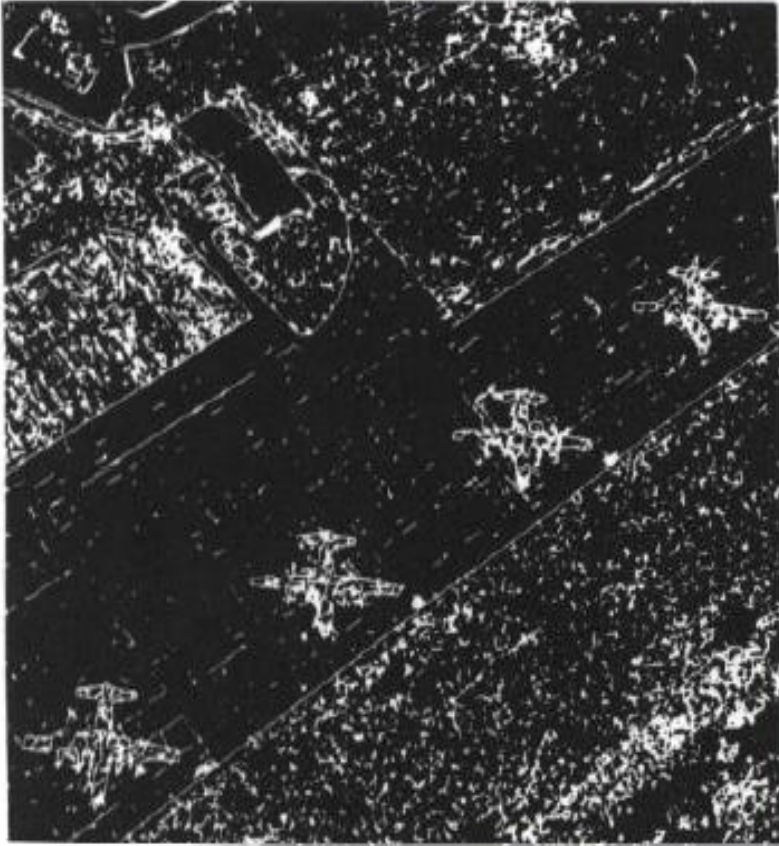


To get this



# Low Level Topics in Computer Vision:

- Edge Detection Results:



# Mid Level Topic in Computer Vision:

- Segmentation:

landscape: landscape query results: image #108019 (19071x1464)

File Edit View Go General: cabl Help

	feature importance:				
	overall	color	texture	location	shape
blob	very	very	somewhat	not	not
background	somewhat	very	not	not	not

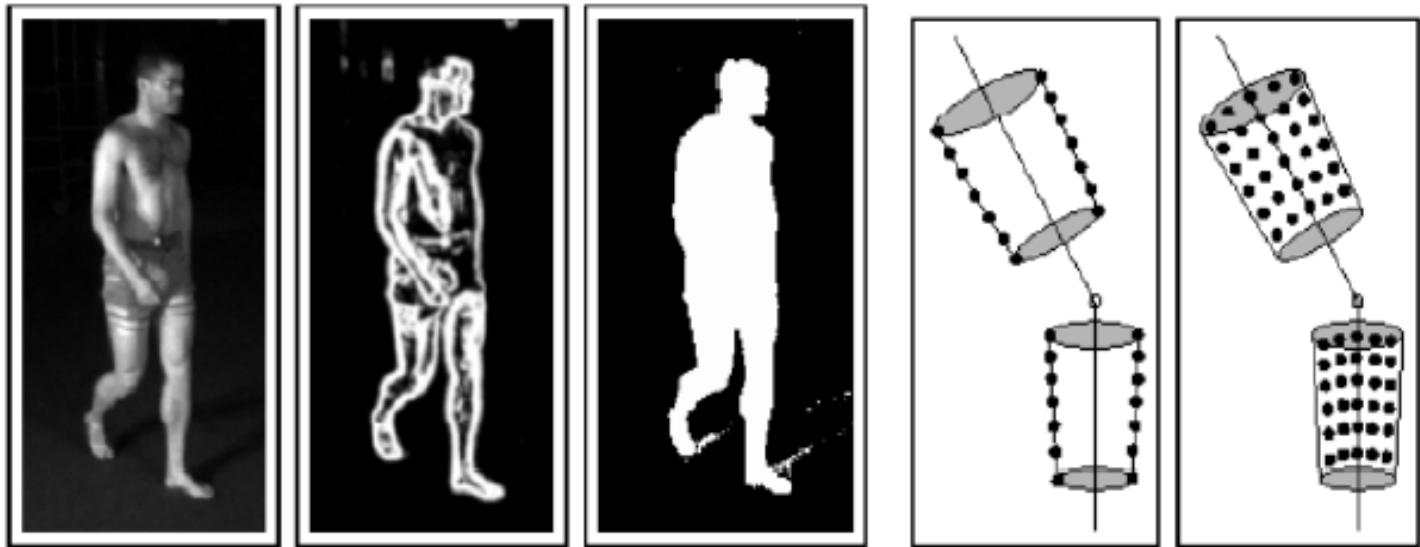
Query image: 108019 Query blob

Querying from 25000 images (2000 returned by the filter).


## Mid Level Topic in Computer Vision:

### Tracking:

- Use a model to predict next position and refine using next image.
- Model
  - Simple dynamic models (second order dynamics).
  - kinematic models.
  - etc.
- Face tracking and eye tracking now work rather well.



## Mid Level Topic in Computer Vision:

- Finding coherent structure so as to break the image or movie into big units.
  - Segmentation:
    - Breaking images and videos into useful pieces.
    - E.g., finding video sequences that correspond to one shot.
    - E.g., finding image components that are coherent in internal appearance.
  - Tracking:
    - Keeping track of a moving object through a long sequence of views

# High Level Topic in Computer Vision:

- Recognition of people, places, events.



**BBC NEWS**

UK version International version About the versions | [Log out](#)

Last Updated: Monday, 6 February 2006, 14:29 GMT

[E-mail this to a friend](#) [Printable version](#)

## Face-hunting cameras boost Nikon

**Japanese camera maker Nikon has tripled its profits on the back of strong sales of digital cameras that automatically focus on human faces.**



Face recognition cameras like the Coolpix L1 are popular

The screenshot shows a BBC News article from February 6, 2006. The article title is 'Face-hunting cameras boost Nikon'. The main text states that Nikon has tripled its profits due to strong sales of digital cameras that automatically focus on human faces. An image of a Nikon Coolpix L1 camera is shown, with a caption below it stating 'Face recognition cameras like the Coolpix L1 are popular'. The page includes a navigation menu on the left with categories like News, World, UK, and Business. The top of the page features the BBC News logo and version selection options.



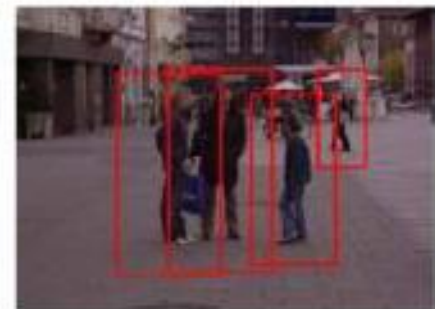
# High Level Topic in Computer Vision:

- Face Detection.



# High Level Topic in Computer Vision:

- Human Detection.



# High Level Topic in Computer Vision:

## Object Recognition and Detection.

- Object recognition:
  - Recognizing the object category.
- Object Detection:
  - Detecting whether certain type of object presents type of object presents and where it locates.
- Database and Challenges.
  - Pascal 2009, 2008.
  - Caltech 101, 256.



# High Level Topic in Computer Vision:

- Object Recognition:

## Caltech 101 images



Fei-Fei et al. 2004



## Visual Object Classes Challenge 2009 (VOC2009)



(click on an image to see the annotation)

Everingham et al. 2006-2012

# High Level Topic in Computer Vision:



IMAGENET

22,000 categories

⋮

15,000,000 images

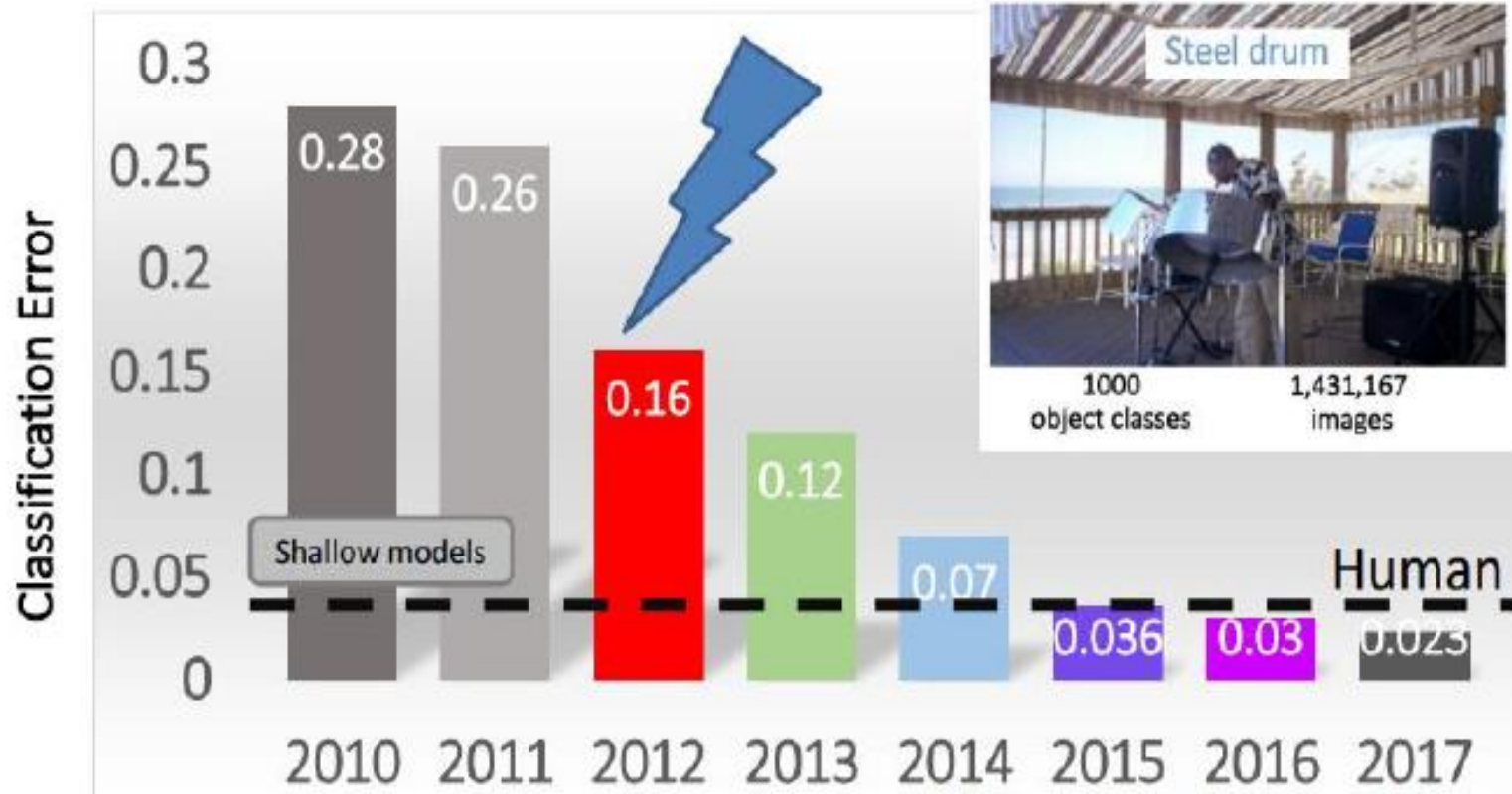


J. Deng, W. Dong, R. Socher, L.-J. Li, K. Li & L. Fei-Fei. CVPR, 2009.

# High Level Topic in Computer Vision:

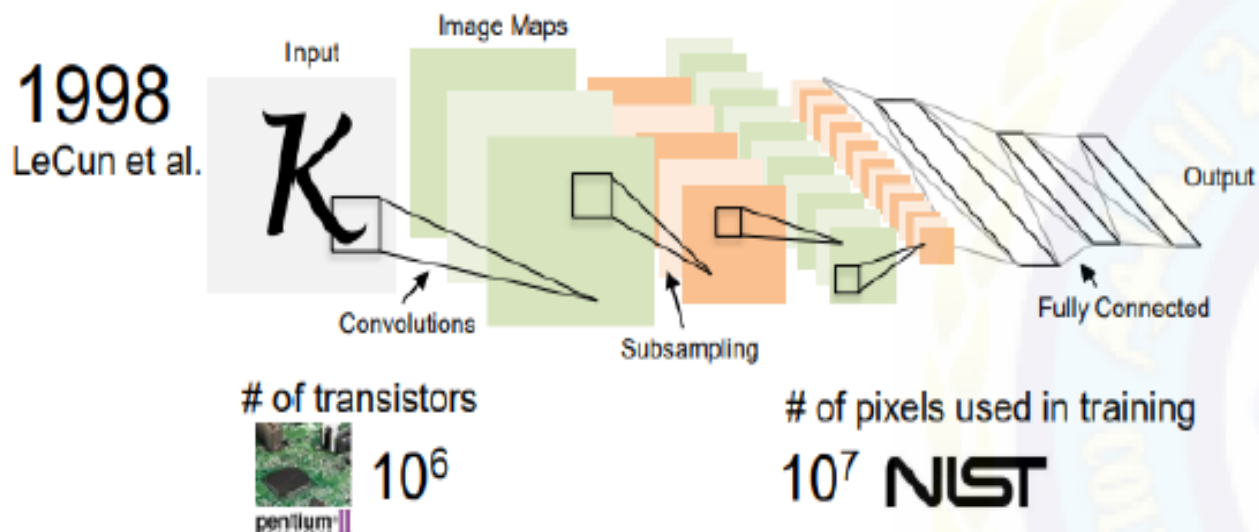
- Object Recognition:

## IMAGENET Classification Task

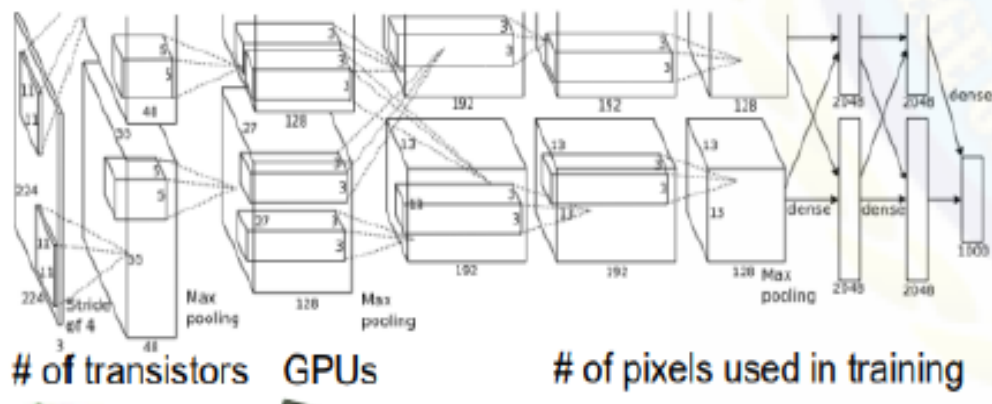


# High Level Topic in Computer Vision:

## Object Recognition:



2012  
Krizhevsky et al.



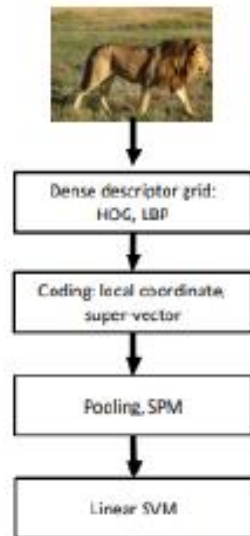
# High Level Topic in Computer Vision:

## Object Recognition:

### IMAGENET Large Scale Visual Recognition Challenge

#### Year 2010

NEC-UIUC

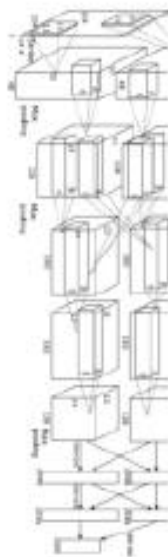


[Lin CVPR 2011]

License: by Swinborg

#### Year 2012

SuperVision

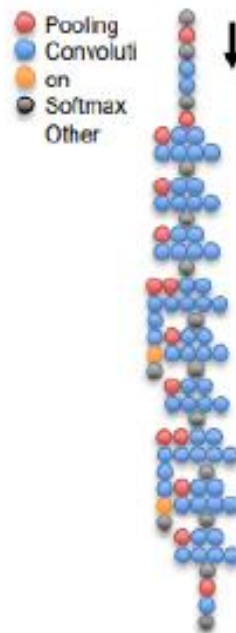


[Krizhevsky NIPS 2012]

Figure copyright Alex Krizhevsky, Ilya Sutskever, and Geoffrey Hinton, 2012

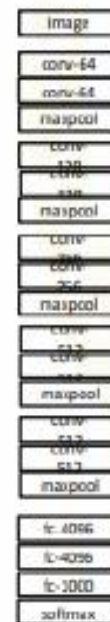
#### Year 2014

GoogLeNet



[Szegedy arxiv 2014]

VGG



[Simonyan arxiv 2014]

#### Year 2015

MSRA

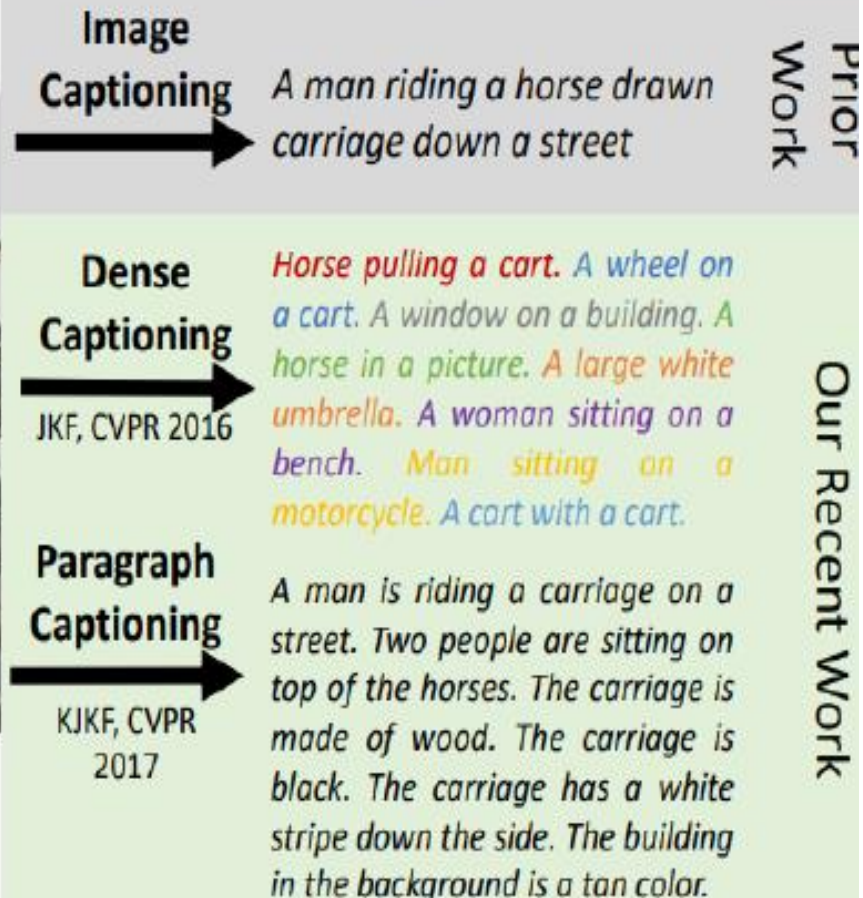


[He ICCV 2015]



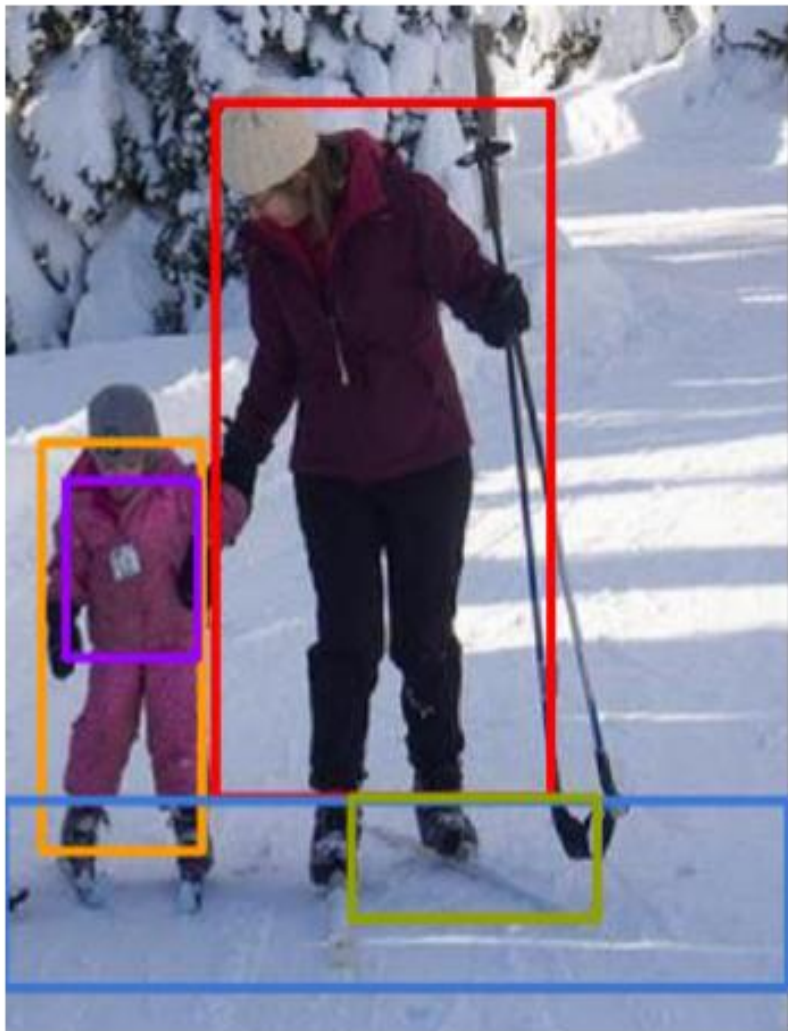
# High Level Topic in Computer Vision:

- Image Captioning: Richer Descriptions



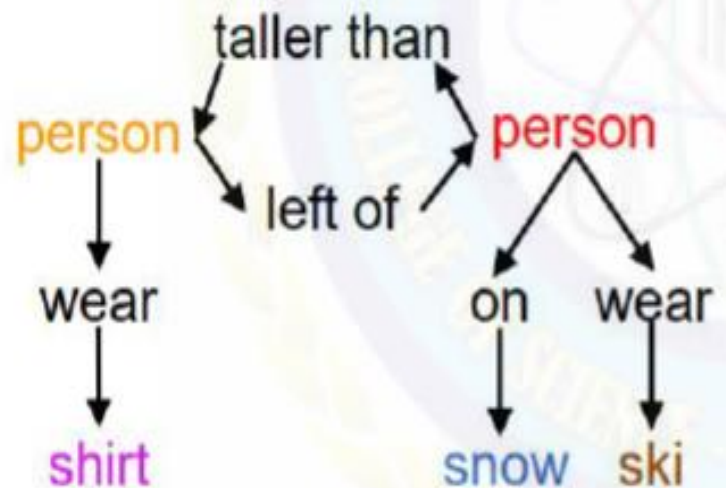
# High Level Topic in Computer Vision:

- Image Captioning: Richer Descriptions



## Results:

spatial, comparative, asymmetrical,  
verb, prepositional



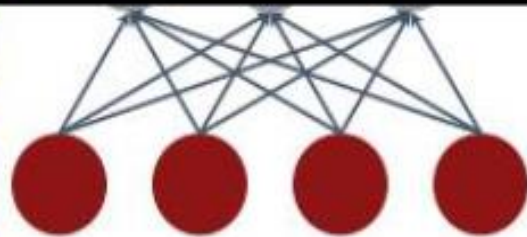
# High Level Topic in Computer Vision:



## The Deep Learning Revolution



Computation



Algorithms



Data

# High Level Topic in Computer Vision:

- Action Recognition and Activity Analysis
  - Action recognition:
    - Recognizing the action of a subject.
  - Activity Analysis:
    - Composition of several actions.
    - Multiple people involved.
  - Database and Challenge.
    - Trecvid 2009, 2008.
    - KTH, Weizmann

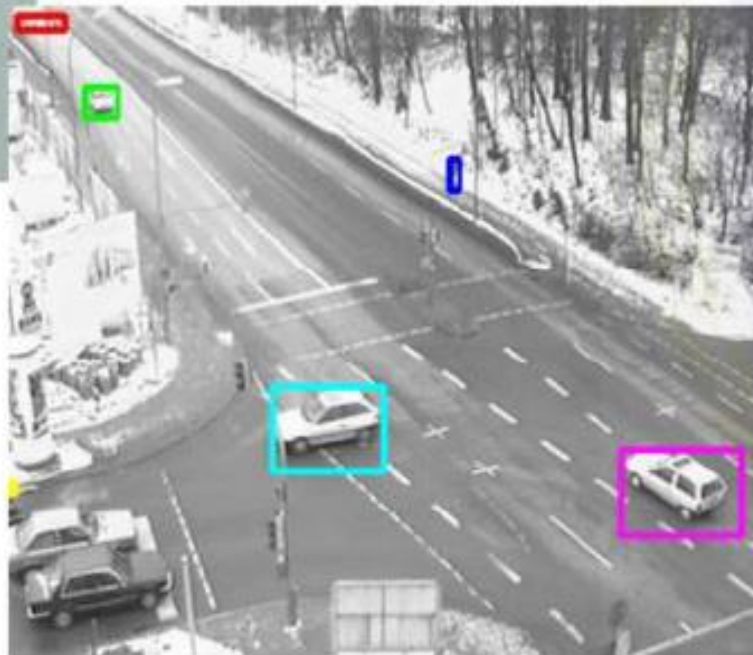


# High Level Topic in Computer Vision:

- What is Video Surveillance?



Warn me if there is a mugging in the grove



## High Level Topic in Computer Vision:

- Background Subtraction, Human Detection and Tracking in a Video and Tracking in a Video.



# High Level Topic in Computer Vision:

- Real Surveillance video for an accident.



# High Level Topic in Computer Vision:

- Face Detection
  - Almost all digital cameras detect faces.
  - Snapchat face filters.





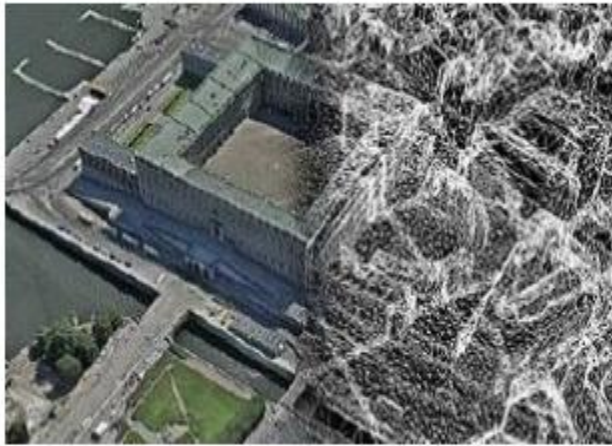
# High Level Topic in Computer Vision:

- Smile Detection:



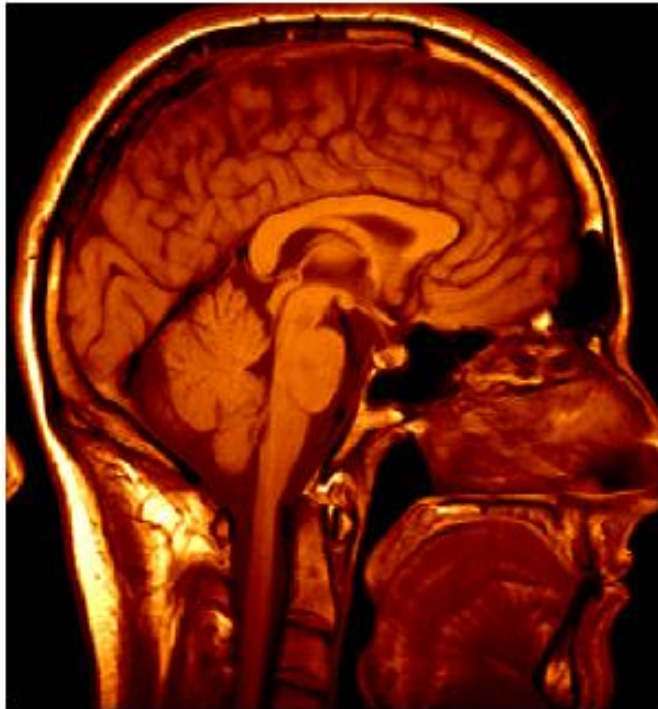
# High Level Topic in Computer Vision:

- 3D from Images



# High Level Topic in Computer Vision:

- Medical Imaging:



3D imaging  
MRI, CT



Image guided surgery  
[Grimson et al., MIT](#)

## High Level Topic in Computer Vision:

- AutoCars - Uber bought CMU's lab:



# High Level Topic in Computer Vision:

- Mobile robots



NASA's Mars Spirit Rover

[http://en.wikipedia.org/wiki/Spirit\\_rover](http://en.wikipedia.org/wiki/Spirit_rover)



<http://www.robocup.org/>

**amazon**  
*Prime Air*

# 2020's: autonomous vehicles



# Optical Character Recognition (OCR)

- Technology to convert scanned docs to text
  - If you have a scanner, it probably came with OCR software



Digit recognition, AT&T labs

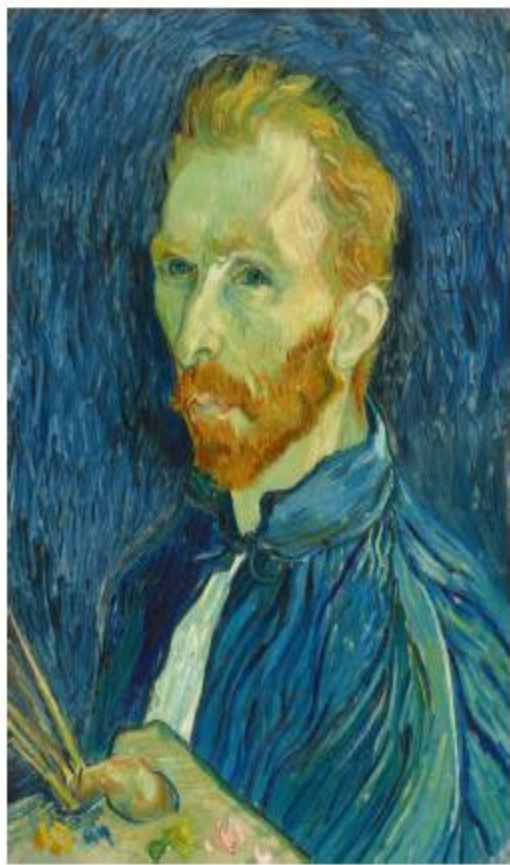
<http://www.research.att.com/~yann/>



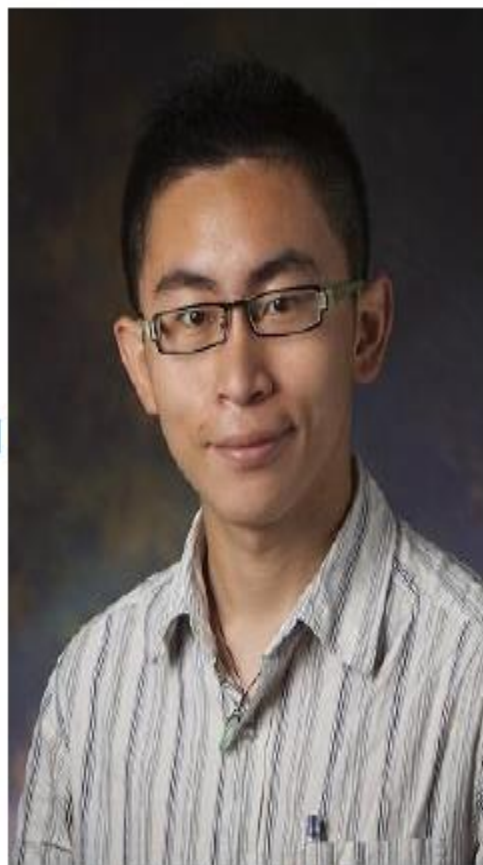
License plate readers

[http://en.wikipedia.org/wiki/Automatic\\_number\\_plate\\_recognition](http://en.wikipedia.org/wiki/Automatic_number_plate_recognition)

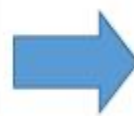
# Style transfer



Source image (**Style**)



Target image (**Content**)



Output (deepart)



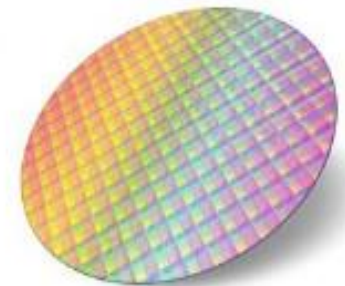
# Panoramic Mosaics

---



# Machine vision

Automated visual inspection



# Deep Face

