### Lecture 9

## Introduction of Computer Vision

Multimedia System

Spring 2020

## 컴퓨터 비전(computer vision,컴퓨터 視角)

#### ▶ 시각의 중요성

- 인간의 오감 중 시각으로 얻는 정보는 전체 감각기관으로 얻는 정보의 90%이상을 차지
- 인간은 태어나서 보기 시작한 모든 정보로부터 스스로 학습

### 컴퓨터(로봇) 비전

- 컴퓨터(로봇)에 인간의 시각 기능을 구현하고자 하는 노력에서 비롯된 학문 분야
- 카메라로 획득한 영상 정보에서 유용한 정보를 추출하기 위한 기술



## 컴퓨터비전

- 2차원 컴퓨터비전
  - 2차원 영상센서로부터 획득한 2차원 영상으로부터 다양한 응용분야에 적용할 수 있는 2차원 정보를 획득하기 위한 컴퓨터 기술
  - 문자인식, 얼굴인식, 물체추적 등
- > 3차원 컴퓨터비전
  - 2차원 영상정보로부터 3차원 정보를 획득하기 위한 컴퓨터 기술
  - 3차원 스캐닝, 3차원 TV, 3차원 로봇비전 등

### **Applications**

- Visual Inspection
- Robotics
- Intelligent Image Tools
- Image Compression (MPEG 1/2/4/7)
- Document Analysis (OCR)
- Image Libraries (DL)
- Virtual Environment Construction
- Environment
- Media and Entertainment
- Medicine
- Astronomy
- Law Enforcement
  - surveillance, security
- Traffic and Transportation
- Tele-Conferencing and e-Learning

## Recognition (1)

- Character recognition
- Car plate recognition



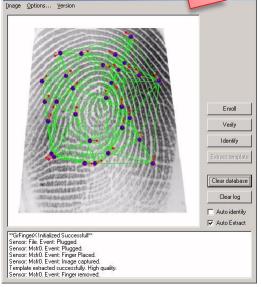


- "패턴인식" 은 확률, 통계와 밀접한 관련이 있음
- 일반적으로 별도의 과목으로 강의

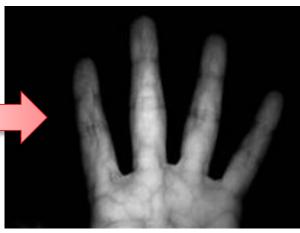
## Recognition (2)

Bio recognition (fingerprint, iris, palm vein ..)









## Face detection & recognition

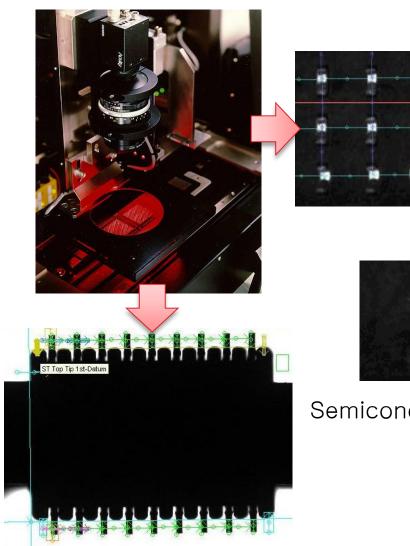
- Many application areas
  - Security
  - Smart device
  - Smile interface
  - Human robot interface

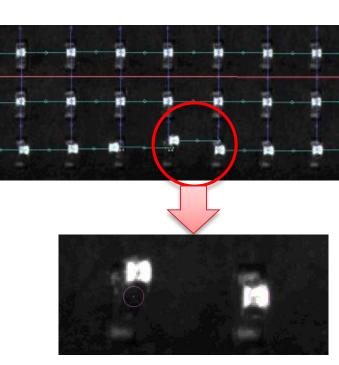


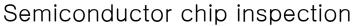
https://www.youtube.com/watch?v=sPmXZGSsiYM

## Inspection

### Defect inspection





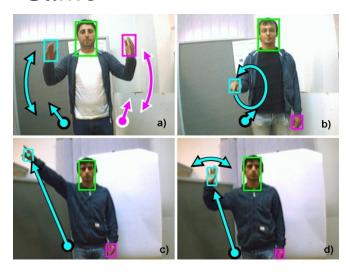




Bottle inspection

## **Gesture Recognition**

- Human computer(robot) interaction
- Smart wall
- Smart mobile device (phone, pad..)
- Game



University of Tsukuba, Japan

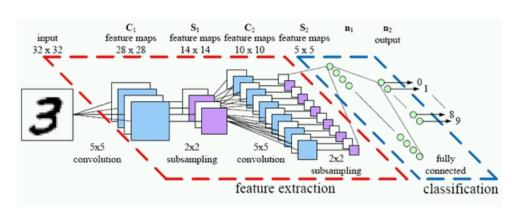


Interactive 3D TV and you're watching a Haynes manual?

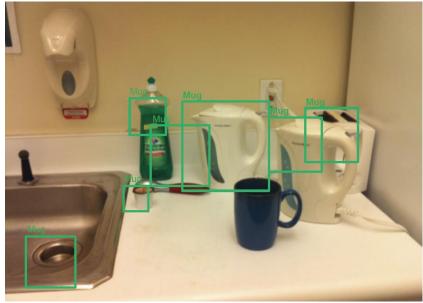


## Deep learning

- Neural network with specialized connectivity structure
- Stack multiple stages of feature extractors
- Higher stages compute more global, more invariant features
- Classification layer at the end

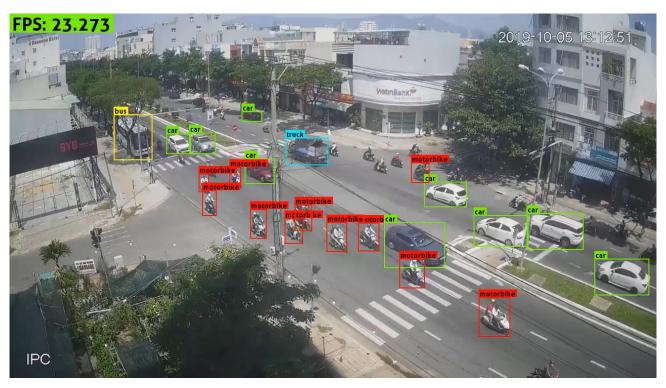


Example of Convolutional Neural Network



## **Detection and Tracking**

- Detection and tracking of objects in a video sequence is an important technique in computer vision
- Many application areas
  - Traffic monitoring
  - Security
  - Entertainment



https://www.youtube.com/watch?v=24ZjHGx4rdQ

## Detection and Tracking

- National defense is an important application area of the vision tracking technique
- UAV is a good application target of object tracking







Quadcopter



- Quadcopter examples
- http://www.youtube.com/watch?v=vHpw8zc7-JQ&list=UUrZt485fBMeNtCDlgEZAHVA&index=1
- http://www.youtube.com/watch?v=IMSozUpFFkU

## 3D Modeling

- 3D model generation one or more camera views.
- 3D models are saved in 3D graphic format such as PLY, OBJ, 3DM, OFF.

# High-Quality Streamable Free-Viewpoint Video

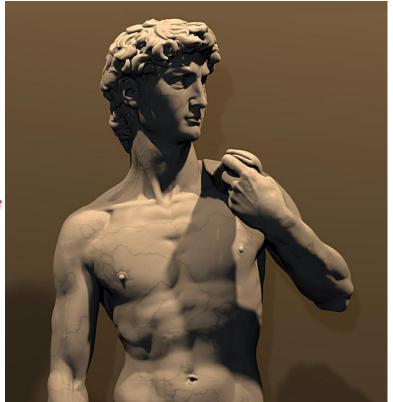
Alvaro Collet, Ming Chuang, Pat Sweeney, Don Gillett, Dennis Evseev, David Calabrese, Hugues Hoppe, Adam Kirk, Steve Sullivan



## 3D Modeling: Offline

- Accurate 3D model reconstruction
- Application: Reverse engineering, cultural heritage, city modeling...





The Michelangelo project by Stanford U.

## 3D Modeling: Online

- Real-time 3D modeling
- Application: Game, entertainment, security...

## Fusion4D

#### **Real-time Performance Capture of Challenging Scenes**

Mingsong Dou, Sameh Khamis, Yury Degtyarev, Philip Davidson\*, Sean Ryan Fanello\*, Adarsh Kowdle\*, Sergio Orts Escolano\*, Christoph Rhemann\*, David Kim, Jonathan Taylor, Pushmeet Kohli, Vladimir Tankovich, Shahram Izadi

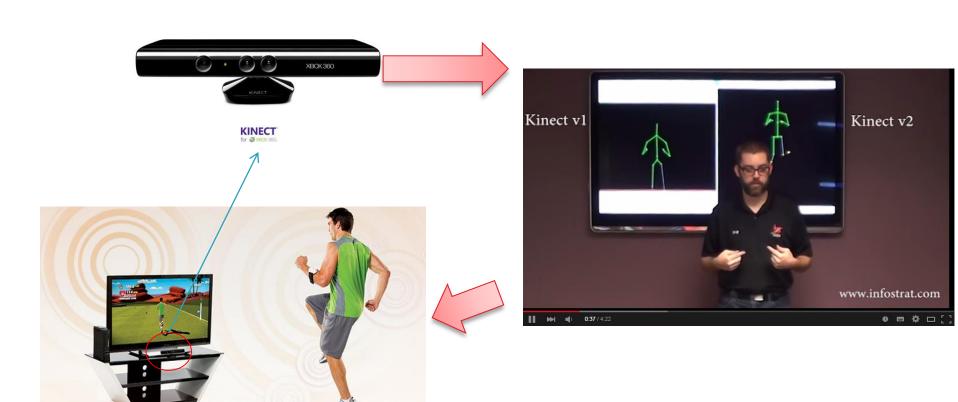
\*equal contribution

#### MICROSOFT RESEARCH

contact: shahrami@microsoft.com

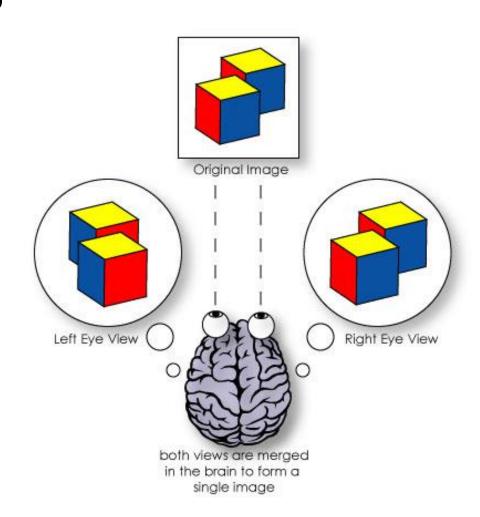
# 3D modeling: Kinect

▶ Microsoft의 Xbox용 motion recognition device



### Stereo Vision

- Human beings have two eyes positioned side by side.
- Each eye has a view of the same area from a slightly different angle.
- The brain takes the information from each eye and unites them into one picture, interpreting the slight differences between each view as **depth**.



### Stereo Vision

- Stereo vision is a part of the field of computer vision
- Stereo vision technique compares two or more images to find the shift between the correspondences in the images. The shifted amount is called the disparity.



Left image



Right image



Disparity image

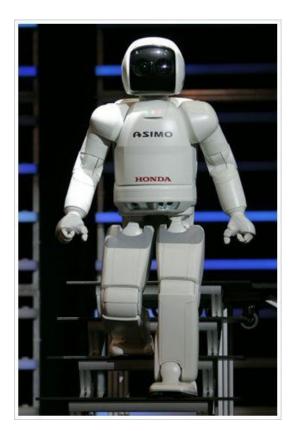
## **Robot Vision**



Path finder

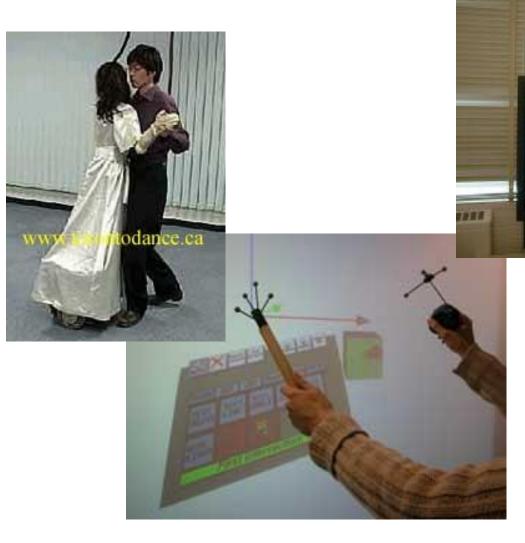


KAIST Hubo



Honda Asimo

# HCI, HRI







# **Digital Special Effects**





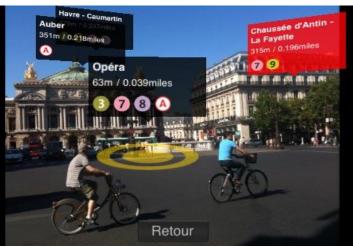


https://www.youtube.com/watch?v=NKZUo0NaKT4

# **Augmented Reality**





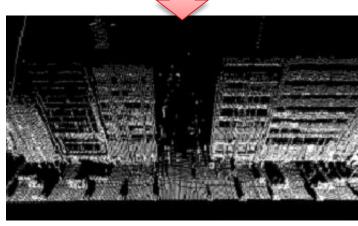




# City modeling

> 3차원 센서를 사용한 도시 규모의 모델링



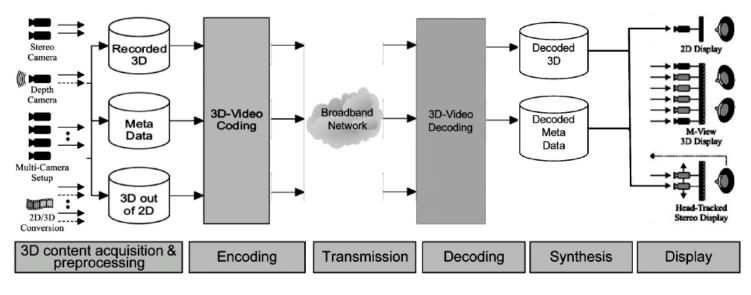




### 3DTV





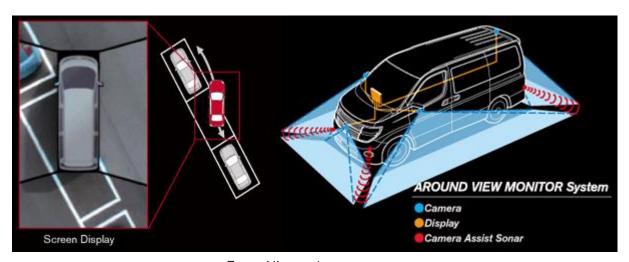


- Vehicle vision is a hot research topic in computer vision
- Vehicle in the future will be equipped with several vision, IR and Lidar sensors
- Google car

https://www.youtube.com/watch?v=X\_d3MCklvg8



- Around view (Bird-eye view ) monitoring
  - Transformation of different camera views to a common (top) view
  - Assists drivers to park more easily by better understanding the vehicle's surroundings
  - Example
    - http://www.youtube.com/watch?v=ScyMY7eqzXs



From Nissan homepage

- LDWS (Lane Departure Warning system)
- A mechanism designed to warn a driver when the vehicle begins to move out of its lane
- Example
  - http://www.youtube.com /watch?v=PvnGG673ZPo



- On-road vehicle detection
- Alert a driver about driving environments and possible collision with other vehicles
- Robust and reliable vehicle detection is needed

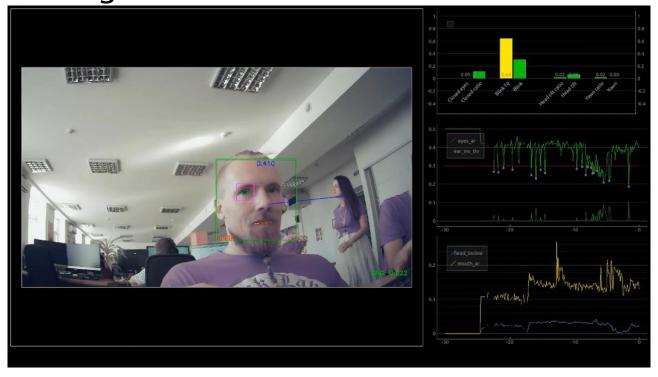


- Pedestrian detection
  - Pedestrian detection is vert important for safety issue
  - HOG (Histogram of Gradient) feature
  - Deep learning



https://www.youtube.com/watch?v=0hWW6FVcFAo

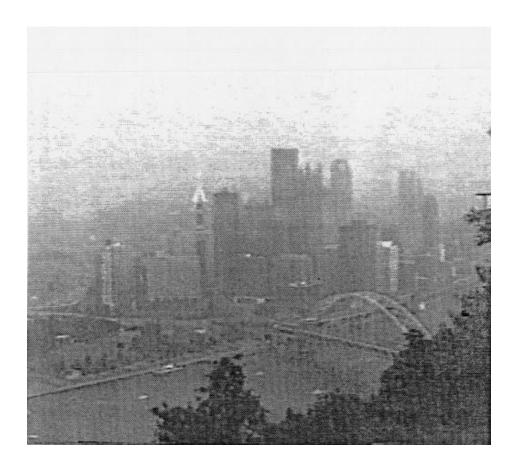
- Driver Drowsiness Monitoring
- Driver drowsiness is responsible for about 30% of severe traffic accidents
- Based on face/eye detection and eye opening monitoring



https://www.youtube.com/watch?v=4QCtDyUK2RY

# Why computer vision?

## **Image**



Foggy golden triangle in Pittsburgh

### **But** ...

```
123 121 119 127 116 114 118 116 154 201 134
                                                 133
                                                      99 123
             255 111
    157
        123
                      116
                          114
                               112
                                    99
                                        128
                                            131
                                                 125
                                                      137
                                                          137
                                                                   116
137 116
        198
             122
                  152
                      127
                           203
                               117
                                    155 161
                                            167
                                                 149
                                                      143
                                                          159
    157
         123
             255
                 111
                      116
                          114
                               112
                                    99
                                        128
                                             131
                                                 125
                                                      137
                                                          137
    103 111
             238
                  172
                      154 110
                               108
                                   134 162
                                            129
                                                 119
                                                     137
                                                          141
                                                                   125
123 121 119
             127
                  116
                      114
                          118
                               116
                                   154
                                        201
                                            134
                                                 133
                                                      99
                                                          123
                                                                   131
    133
        176
              98
                  128
                      111
                          173
                               201
                                    152
                                       172
                                            165
                                                  97 113
                                                          125
                                                                   129
172 103
        111 238
                 172 154 110
                                   134
                               108
                                       162
                                            129
                                                 119
                                                     137
                                                          141
                                                                   125
134 175 132
             255
                 111
                      161
                          114
                              112
                                    99
                                        128
                                            131
                                                 125
                                                      137
                                                          137
                                                                   116
171 121
        119
             127
                 116 114 118
                               116
                                   154
                                        201
                                            134
                                                 133
                                                      99
                                                          123
152 172
        165
              97
                 113
                     125
                          122
                               129
                                   165
                                        133
                                            176
                                                  98
                                                     128
                                                         111
117 155
        161 167
                  149
                      143
                          159
                              116
                                    93
                                       137 116
                                                 198
                                                     122
                                                         152
                                                              127
116 114
        118 116
                  154
                      201
                          134
                               133
                                    99
                                       123
                                            123
                                                 131
                                                     171
                                                          121
                                                              119
                                                                   127
110 108
        134
            162
                  129
                      119
                          137
                               141
                                   109
                                        125
                                            149
                                                 103
                                                     111
                                                         238
119 127
        116
            114
                 118 116
                          123 121
                                       201
                                   154
                                            134
                                                133
                                                      99
                                                         123
                                                              123
159 116
        93
             137
                     198
                 116
                          122 152
                                   127
                                        203
                                            117
                                                 155
                                                     161
                                                         167
                                                                   143
123 121 119 127
                 116 114 118 116
                                   154
                                       201
                                            134
                                                133
                                                      99
                                                         123
                                                                   131
143 157 123
            255 111 116 114 112
                                    99
                                        128
                                            131
                                                125
                                                     137
                                                         137
137 116 198
            122
                     127 203 117 155
                 152
                                            167
                                       161
                                                149
                                                     143
                                                         159
143 157 123 255
                 111 116 114 112
                                       128
                                    99
                                            131 125
                                                     137
                                                         137
                                                              129
                                                                  116
    103 111 238
                 172
                      154
                          110
                              108
                                   134
                                       162
                                            129
                                                119
                                                     137
                                                         141
                                                              109
                                                                  125
123 121 119 127
                     114 118 116
                 116
                                   154
                                       201
                                            134
                                                133
                                                      99
                                                         123
                                                              123
165 133 176
             98
                 128
                     111 173
                              201
                                   152
                                       172
                                            165
                                                 97
                                                     113
                                                         125
                                                              122
172 103
        111
            238
                 172
                      154 110
                              108
                                   134
                                       162
                                            129
                                                119
                                                     137
                                                         141
                                                                  125
134 175 132
            255
                 111
                      161
                          114
                              112
                                    99
                                        128
                                            131
                                                 125
                                                     137
                                                          137
                                                                  116
171 121 119 127 116
                     114 118
                              116
                                  154
                                       201
                                            134
                                                133
                                                      99
                                                         123
152 172
        165
                     125 122
             97 113
                              129
                                   165
                                       133
                                           176
                                                 98
                                                     128
                                                         111
117 155 161 167 149 143 159 116
                                    93 137 116
                                                198 1002 132 127 203
116 114 118 116 154 201 134 133
                                    99 123 123
                                                 131 171 121 119 127
             162 129 119
110 108
         134
                          137 141 109
                                        125 149
                                                 103
                                                     111 238 172 154
119 127
             114 118 116 123 121 154 201 134 133
        116
                                                      99 123 123 131
159 116
         93 137 116 198 122 152 127 203 117 155 161 167 149 143
```

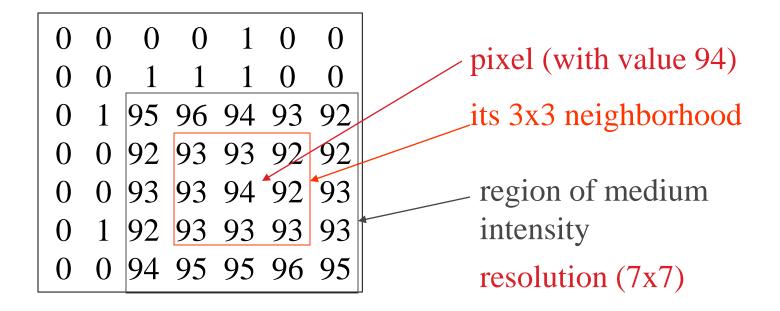
### A lot of data

- Landsat image
  - 1 scene: 3300 x 2300 x 4 = 30000000 bytes
  - 200 scenes/ day
- Color TV image
  - $\circ$  512 x 512 x 3 x 30 = 25000000 bytes/sec

## Why difficult?

- A lot of data
- Ambiguity
  - Projection of a 3D world to a 2D image
- Many factors to influence the image
  - Illumination condition
  - Object shape
  - Camera characteristics

## Digital Image Terminology:



- binary image
- gray-scale (or gray-tone) image
- color image
- multi-spectral image
- range image
- labeled image

## Three Stages of Computer Vision

• low-level

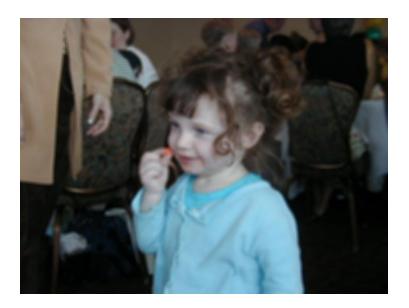
• mid-level

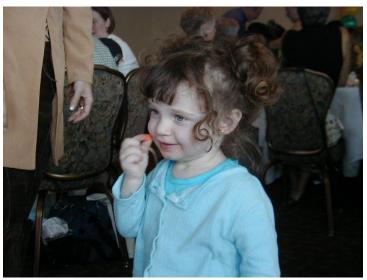
high-level

```
features — analysis
```

## Low-Level

#### sharpening





blurring

### Low-Level



original image



edge image

#### Mid-Level



Canny



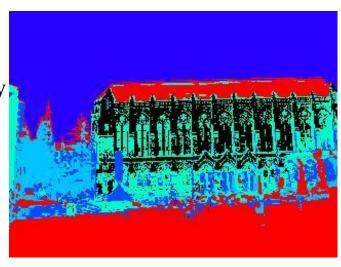
circular arcs and line segments

edge image

## Mid-Level



K-means clustering
(followed by connected component analysis)



original color image

data structure

regions of homogeneous color

## Low- to High-Level



