

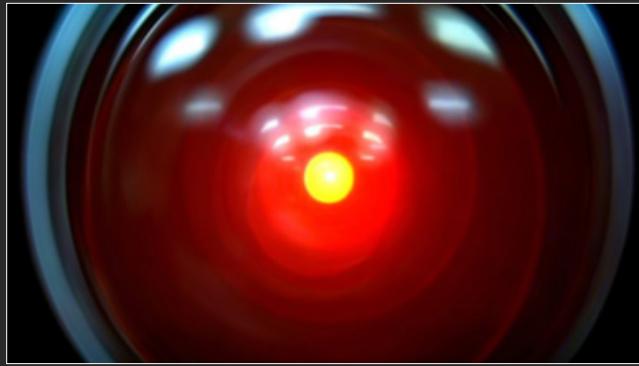
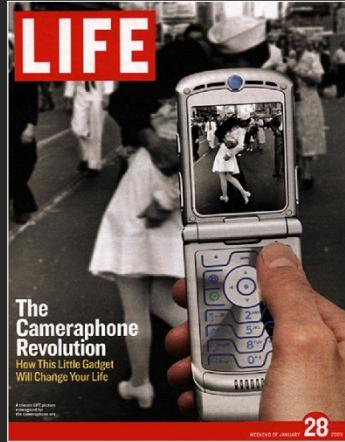
# Introduction

<Vision System>

Department of Robot Engineering  
Prof. Younggun Cho



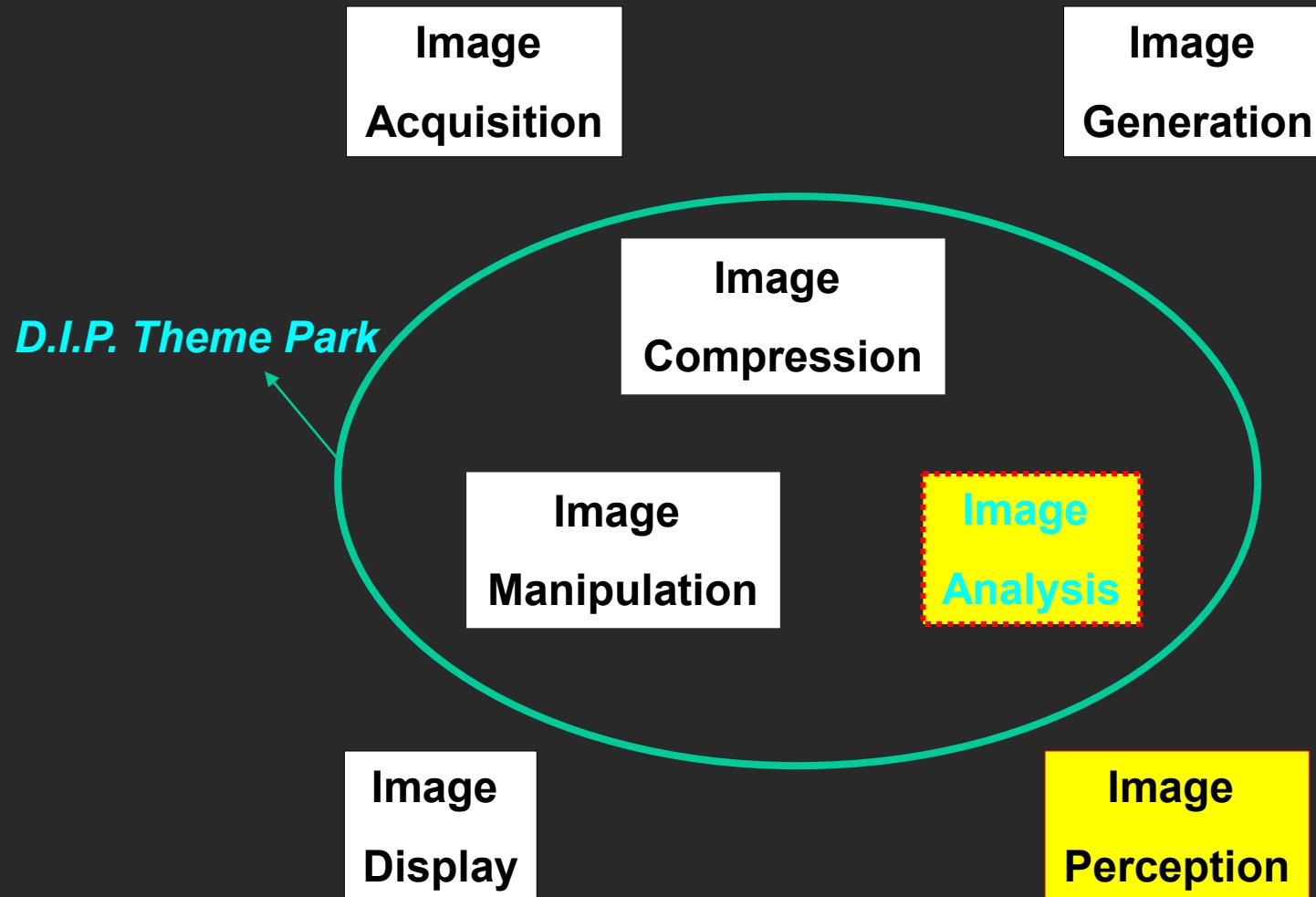
# Computer Vision - Introduction



# Today

- Introduction to computer vision
- Course overview

# cf. Digital Image Processing



# Scope of DIP

- Reasons for **compression**
  - Image data need to be accessed at a different time or location
  - Limited storage space and transmission bandwidth
- Reasons for **manipulation**
  - Image data might experience nonideal acquisition, transmission or display (e.g., **restoration, enhancement and interpolation**)
  - Image data might contain sensitive content (e.g., fight against piracy, counterfeit and forgery)
  - To produce images with artistic effect (e.g., pointellism)
- Reasons for **Analysis**
  - Image data need to be analyzed automatically in order to reduce the burden of human operators
  - To teach a computer to “see” in A.I. tasks

# The goal of computer vision

- To perceive the story behind the picture



La Gare Montparnasse, 1895

What we see

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

# The goal of computer vision

- To perceive the story behind the picture
- What exactly does this mean?
  - Vision as a source of metric 3D information
  - Vision as a source of semantic information

# The goal of computer vision



# Vision as measurement device

## Real-time stereo

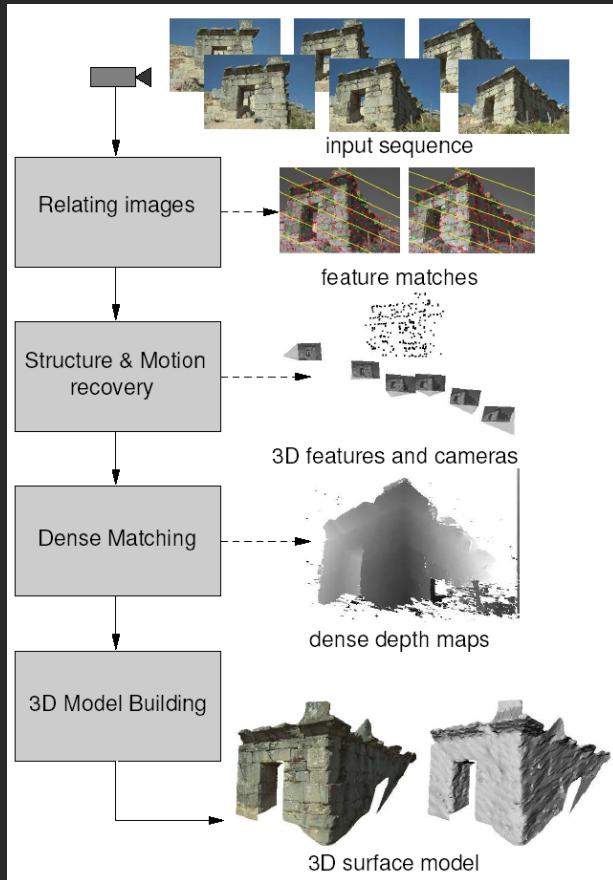


NASA Mars Rover

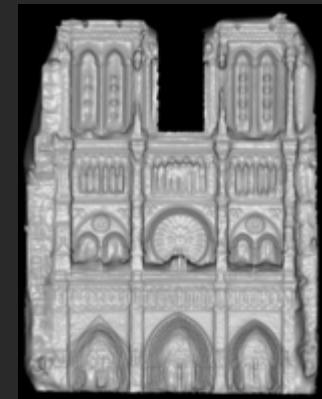


Pollefeys et al.

## Structure from motion



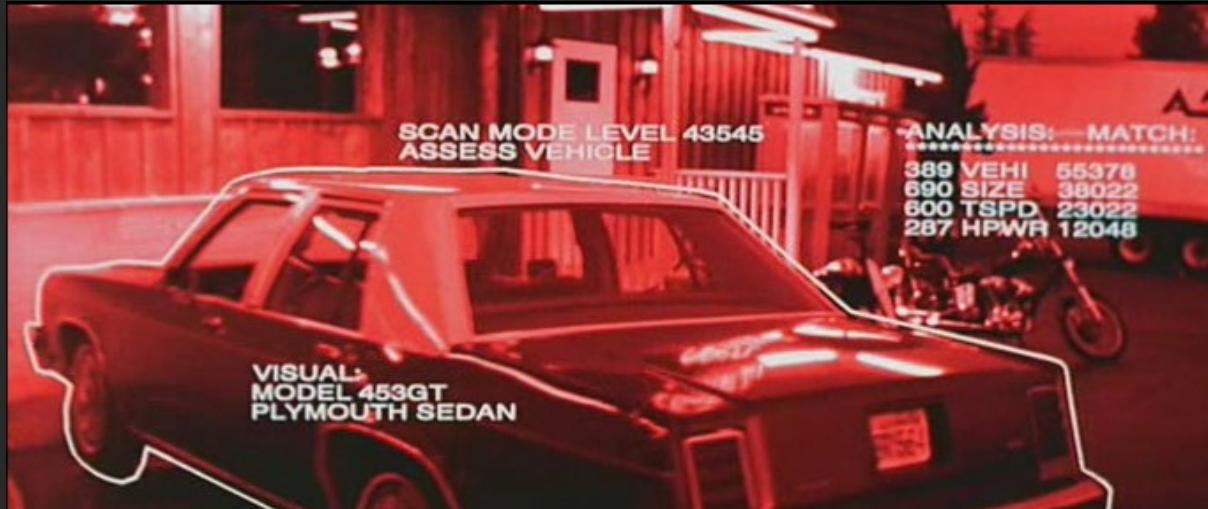
## Multi-view stereo for community photo collections



Goesele et al.

# The goal of computer vision

- Recognize objects and people



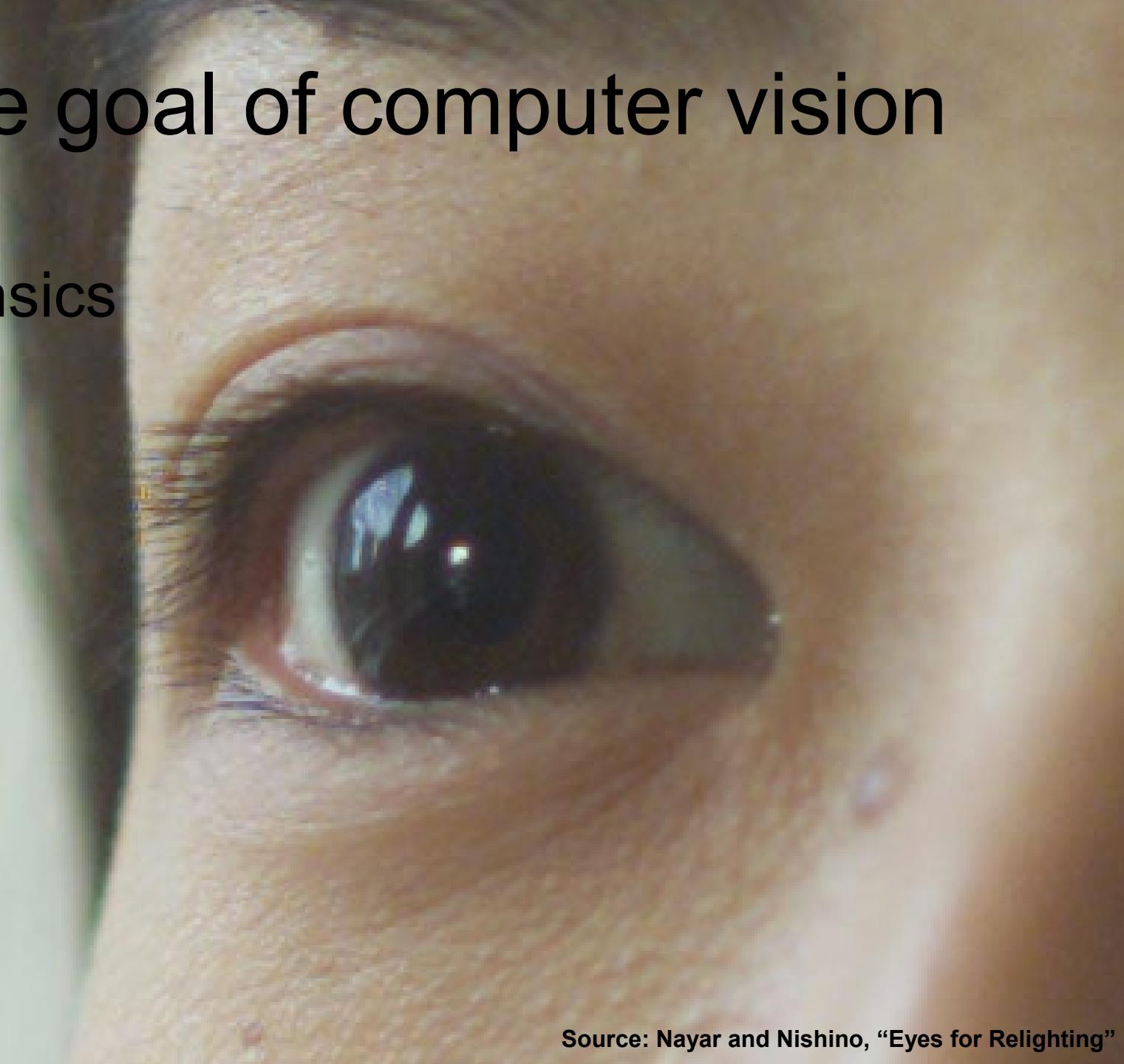
*Terminator 2, 1991*

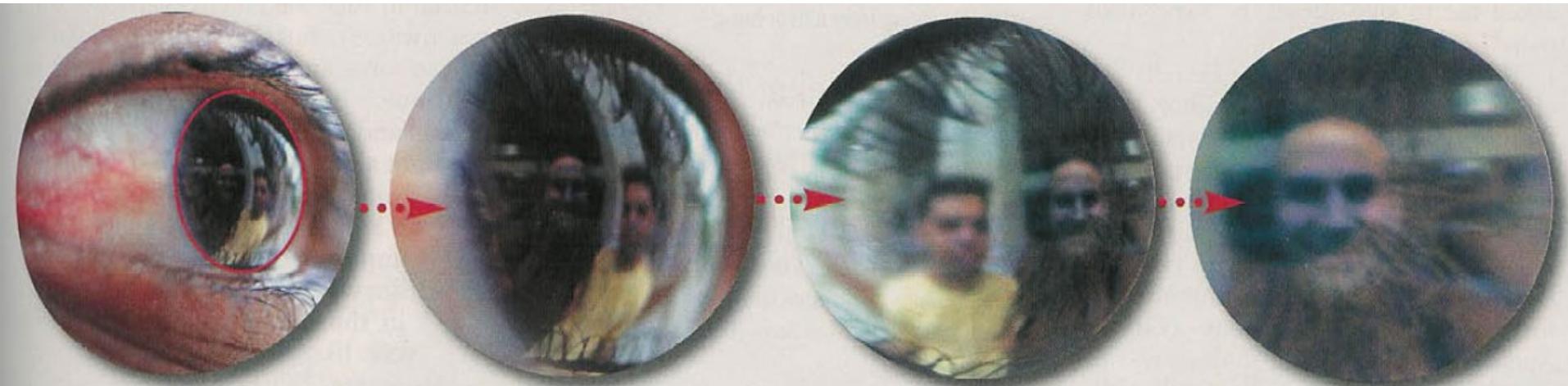
# Object categorization



# The goal of computer vision

- Forensics





Source: Nayar and Nishino, "Eyes for Relighting"

# The goal of computer vision

- Improve photos (“Computational Photography”)



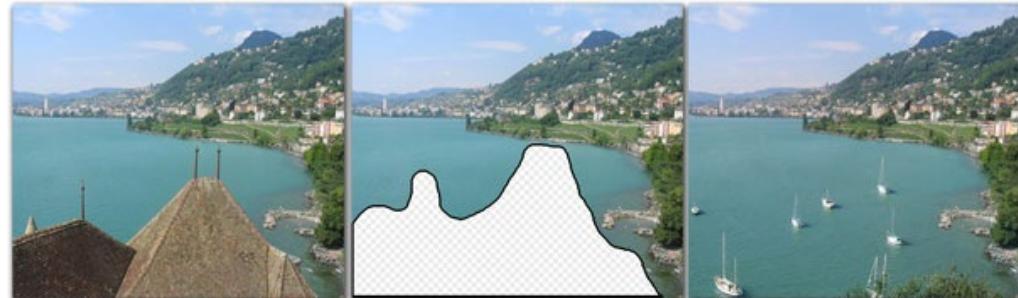
Super-resolution (source: 2d3)



Low-light photography  
(credit: [Hasinoff et al., SIGGRAPH ASIA 2016](#))



Depth of field on cell phone camera  
(source: [Google Research Blog](#))



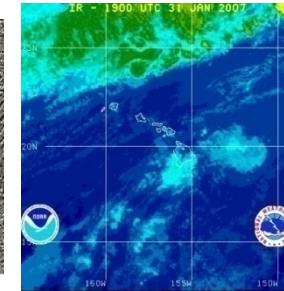
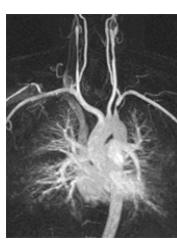
Inpainting / image completion  
(image credit: Hays and Efros)

# Why study computer vision?

- Billions of images/videos captured per day



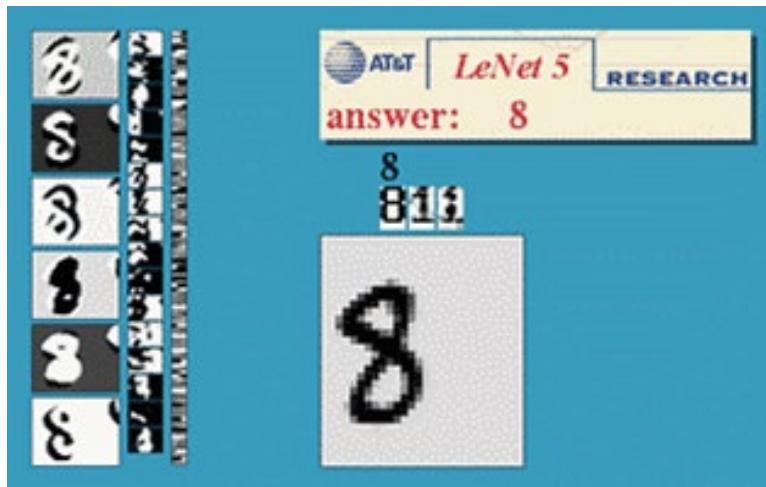
flickr



- Huge number of useful applications
- The next slides show the current state of the art

# Optical character recognition (OCR)

- If you have a scanner, it probably came with OCR software



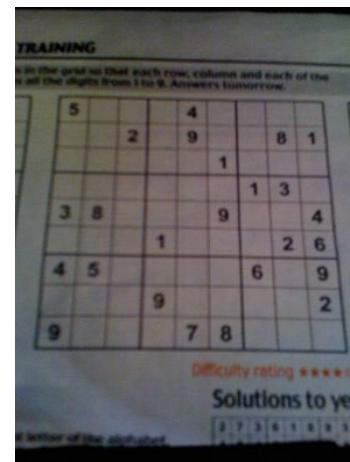
Digit recognition, AT&T labs (1990's)  
<http://yann.lecun.com/exdb/lenet/>



Automatic check processing

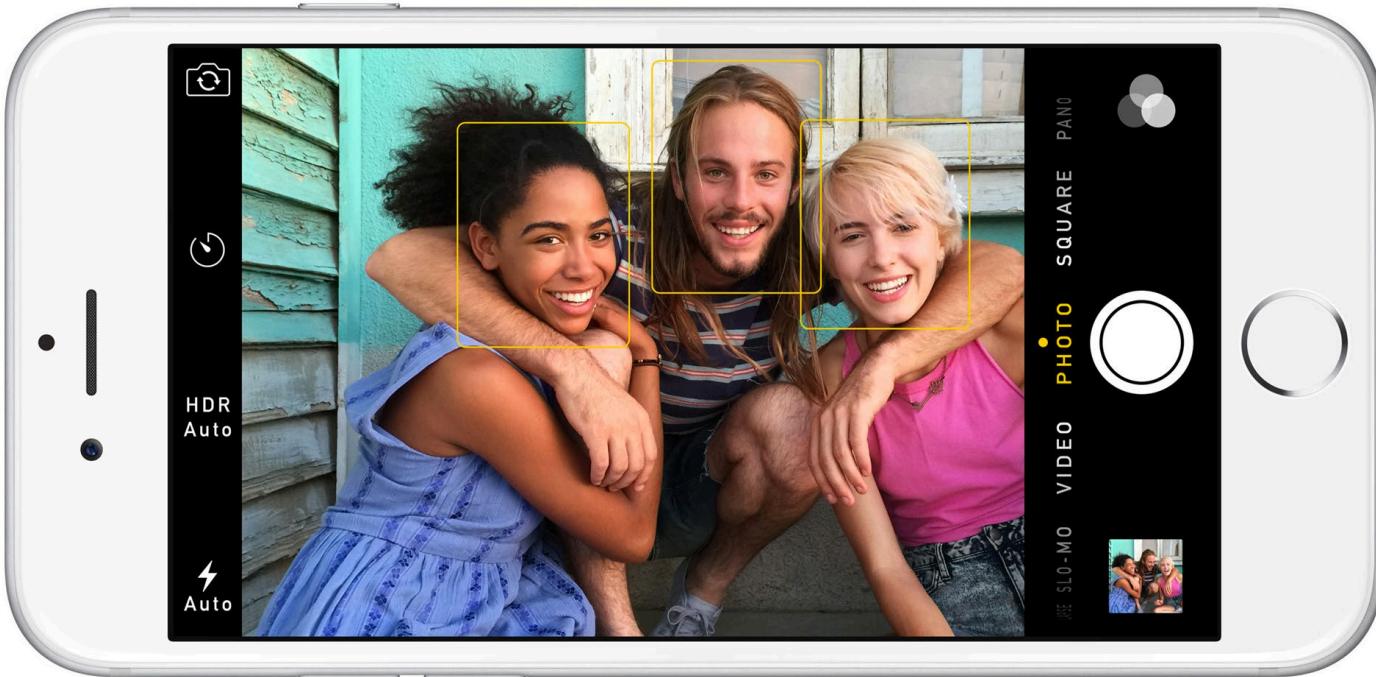


License plate readers  
[http://en.wikipedia.org/wiki/Automatic\\_number\\_plate\\_recognition](http://en.wikipedia.org/wiki/Automatic_number_plate_recognition)



Sudoku grabber  
<http://sudokugrab.blogspot.com/>

# Face detection



- Nearly all cameras detect faces in real time
  - (Why?)

# Face Recognition



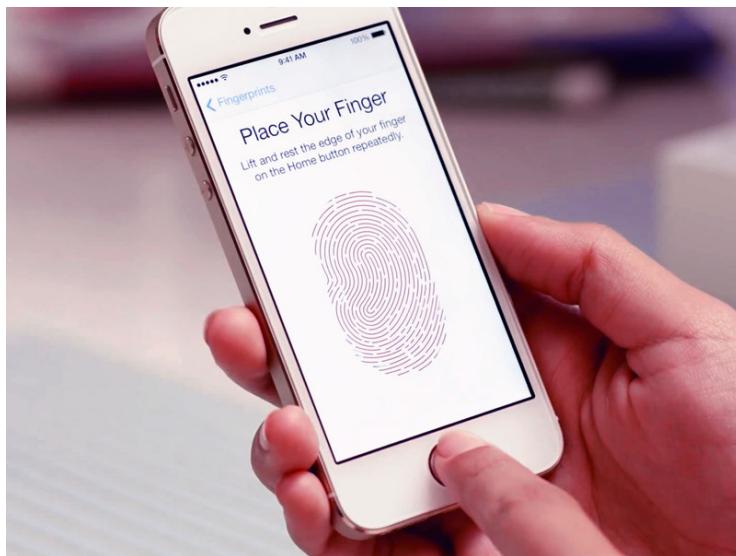
A screenshot of a mobile application interface for face recognition. It shows a man and a woman in profile. A callout bubble labeled "Learn" is visible. A black box with the name "Jack" and a delete icon is overlaid on the man's face. The bottom navigation bar includes icons for camera, photo, flash, and settings.

A screenshot of a mobile application interface for face recognition. It shows a man and a woman in profile. A callout bubble labeled "Roxanna" is visible. Below the image is a row of five small preview images labeled "No Filter", "Havok", "Fokus", and "Kross". The bottom navigation bar includes icons for camera, photo, flash, and settings.

A detailed view of a face recognition analysis for a man with spiky hair. A white rectangular box outlines his face, and small red dots mark specific facial features like the eyes, nose, and mouth. To the right, a sidebar displays the following information:

Attributes:	
age_est:	21 (66%)
age_min:	18 (66%)
age_max:	24 (66%)
face:	true (95%)
gender:	male (73%)
glasses:	false (96%)
lips:	sealed (98%)
mood:	angry (69%)
smiling:	false (92%)
Rotations:	
roll:	-7.05°
yaw:	2.56°
pitch:	-9.27°

# Login without a password

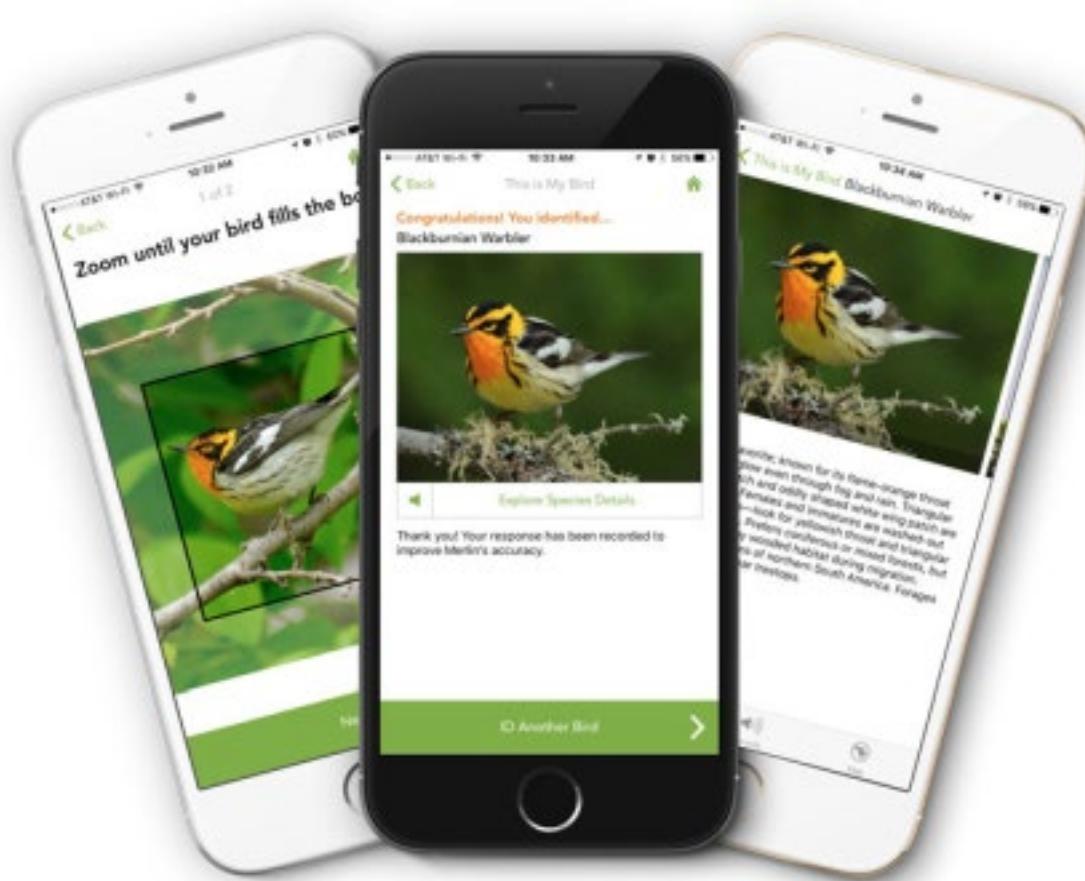


Fingerprint scanners on many new smartphones and other devices



Face unlock on Apple iPhone X  
See also <http://www.sensiblevision.com/>

# Bird Identification



Merlin Bird ID (based on Cornell Tech technology!)

# Special effects: camera tracking



Boujou, 2d3

# Special effects: shape capture



*The Matrix* movies, ESC Entertainment, XYZRGB, NRC

Source: S. Seitz

# Special effects: motion capture



*Pirates of the Caribbean*, Industrial Light and Magic

Source: S. Seitz

# 3D face tracking w/ consumer cameras



Snapchat Lenses

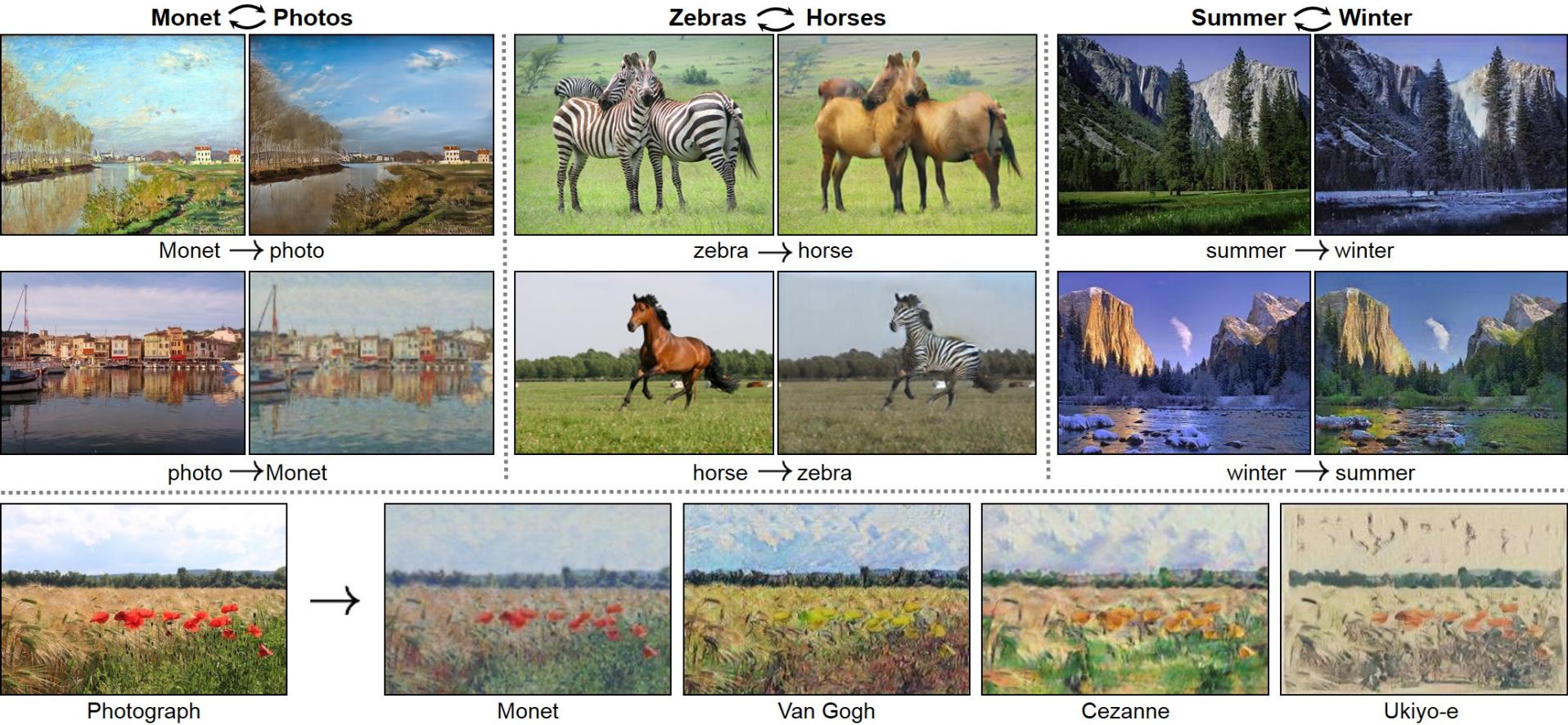


Face2Face system (Thies et al.)

# Image synthesis



# Image synthesis



# Sports



*Sportvision* first down line  
Nice [explanation](#) on [www.howstuffworks.com](http://www.howstuffworks.com)



Highlights of the men's 4x200m relay final on Day 5.

# Smart cars

▷ manufacturer products      consumer products ◀◀

## Our Vision. Your Safety.

rear looking camera      forward looking camera      side looking camera

**EyeQ** Vision on a Chip

> read more

**Vision Applications**

Road, Vehicle, Pedestrian Protection and more

> read more

**AWS** Advance Warning System

> read more

- Mobileye
- Tesla Autopilot
- Safety features in many high-end cars

News

> **Mobileye Advanced Technologies Power Volvo Cars World First Collision Warning With Auto Brake System**

> **Volvo: New Collision Warning with Auto Brake Helps Prevent Rear-end**

> all news

Events

> **Mobileye at Equip Auto, Paris, France**

> **Mobileye at SEMA, Las Vegas, NV**

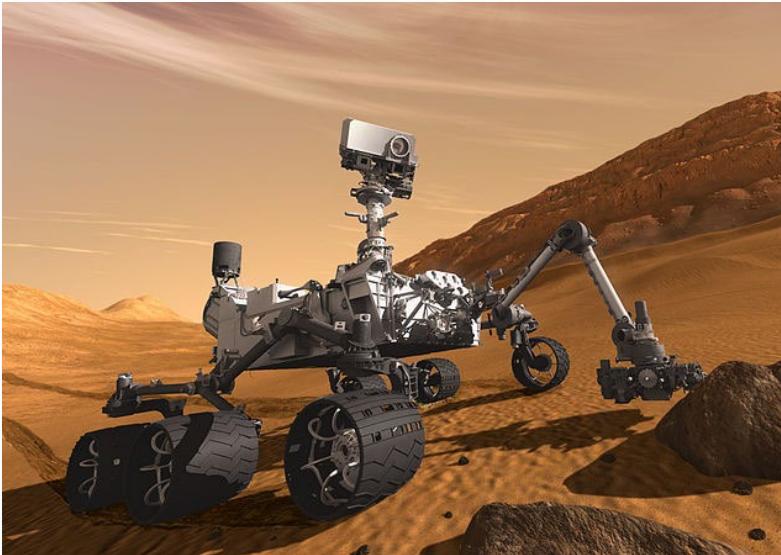
> read more

# Self-driving cars



Google Waymo

# Robotics



NASA's Mars Curiosity Rover  
[https://en.wikipedia.org/wiki/Curiosity\\_\(rover\)](https://en.wikipedia.org/wiki/Curiosity_(rover))

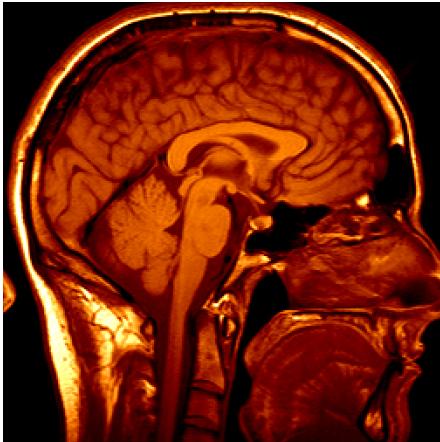


Amazon Picking Challenge  
<http://www.robocup2016.org/en/events/amazon-picking-challenge/>

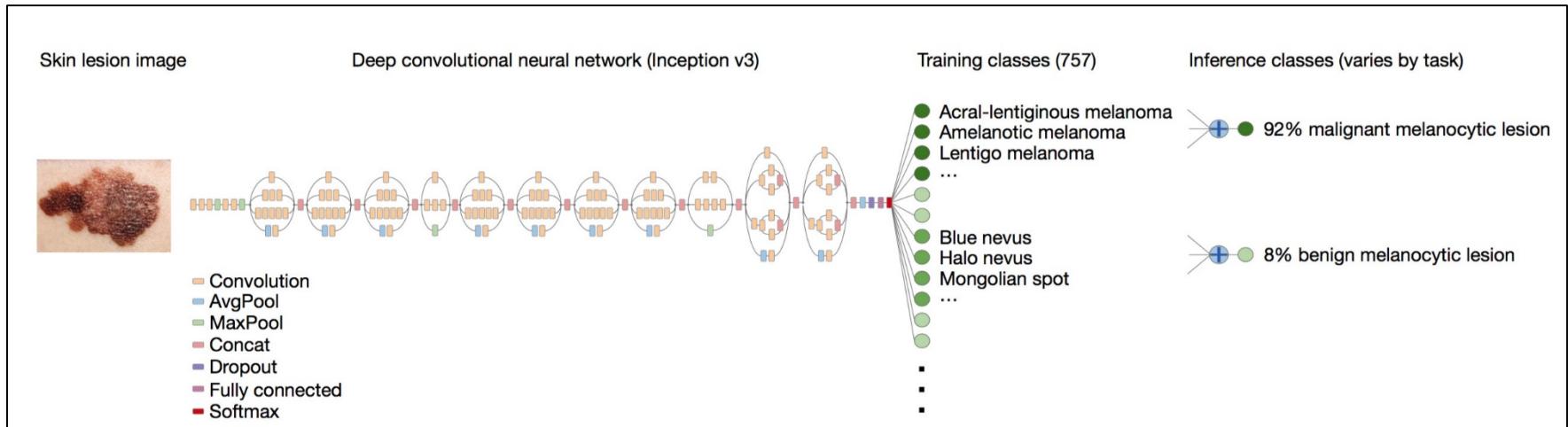


Amazon Prime Air

# Medical imaging



3D imaging  
(MRI, CT)



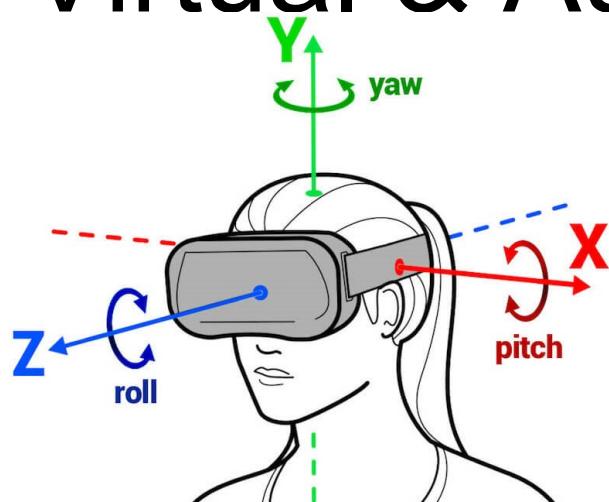
Skin cancer classification with deep learning  
<https://cs.stanford.edu/people/esteva/nature/>

# Facebook Buys Oculus, Virtual Reality Gaming Startup, For \$2 Billion

[+ Comment Now](#)   [+ Follow Comments](#)



# Virtual & Augmented Reality



6DoF head tracking



Hand & body tracking



3D scene understanding



3D-360 video capture

# Photosynth

Microsoft® Live Labs™



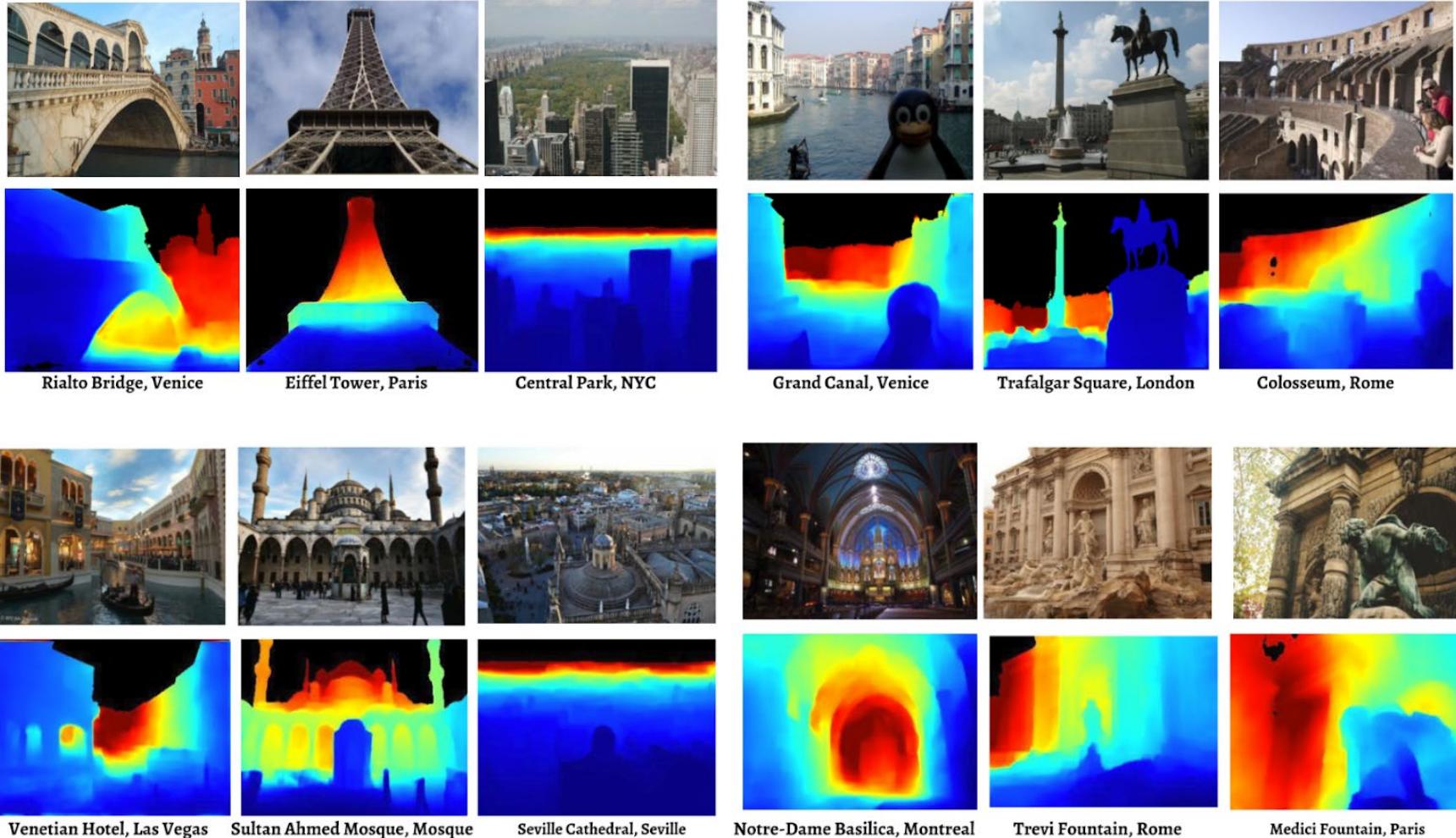
Photosynth™



# City-scale reconstruction

Reconstruction of Dubrovnik, Croatia, from ~40,000 images

# Depth from a single image



# Current state of the art

- You just saw many examples of current systems.
  - Many of these are less than 5 years old
- This is a very active research area, and rapidly changing
  - Many new apps in the next 5 years
  - Deep learning powering many modern applications
- Many startups across a dizzying array of areas
  - Deep learning, robotics, autonomous vehicles, medical imaging, construction, inspection, VR/AR, ...

# Why is computer vision difficult?



Viewpoint variation



Illumination



Scale

# Why is computer vision difficult?



Intra-class variation



Background clutter

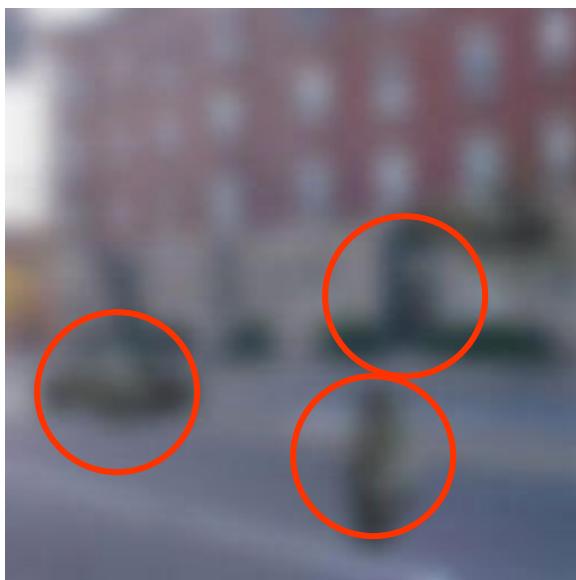
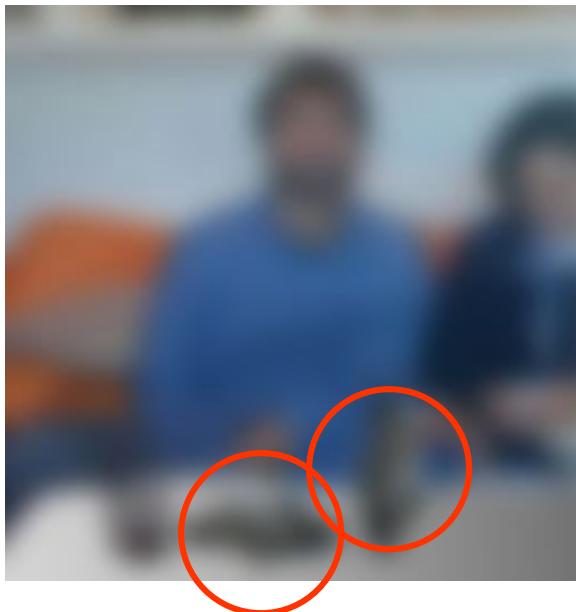


Motion (Source: S. Lazebnik)

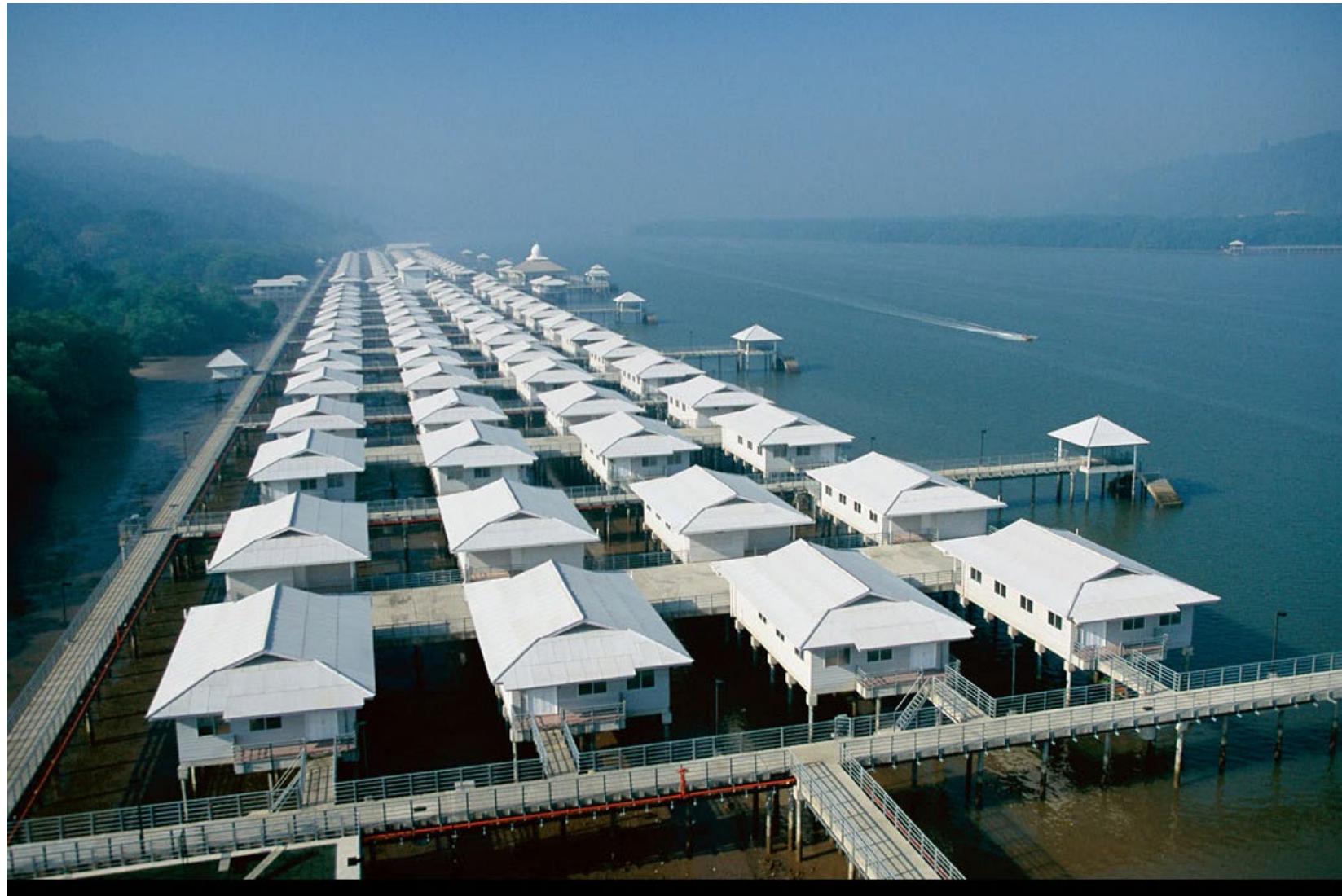


Occlusion

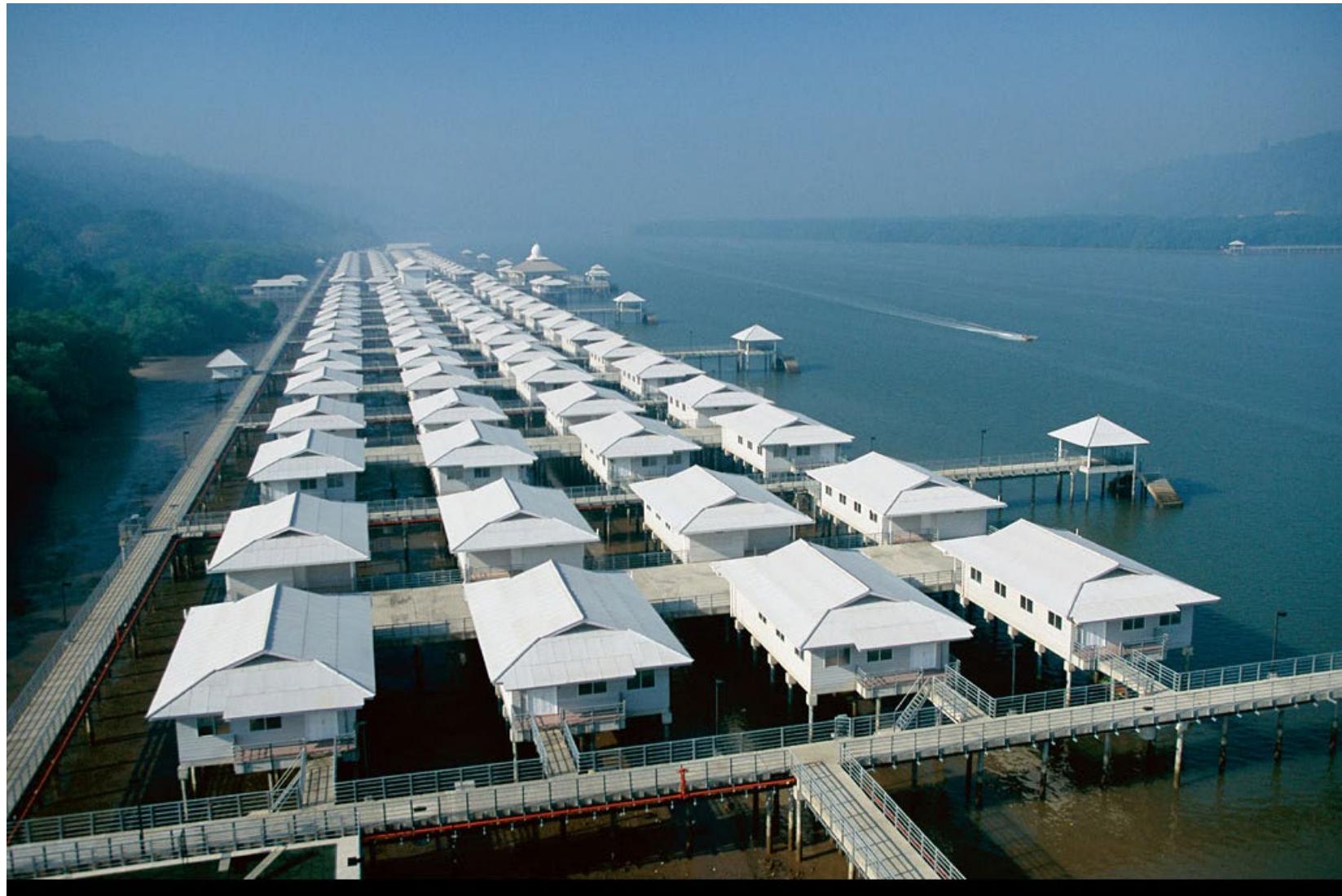
# Challenges: local ambiguity



# But there are lots of cues we can exploit...



# But there are lots of cues we can exploit...



# Depth cues: Aerial perspective



# Depth ordering cues: Occlusion



Source: J. Koenderink

# Shape cues: Texture gradient



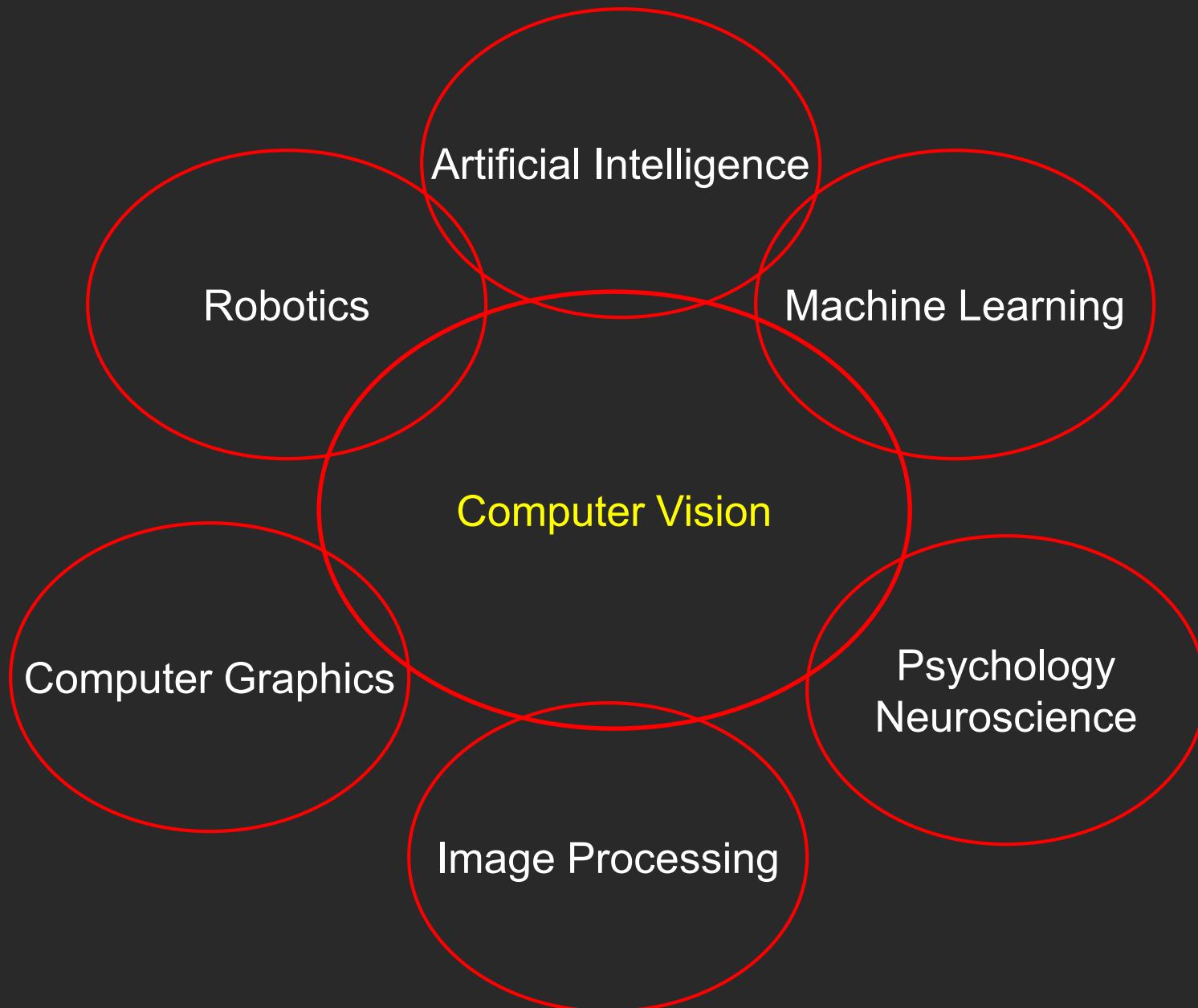
# Bottom line

- Perception is an inherently ambiguous problem
  - Many different 3D scenes could have given rise to a particular 2D picture

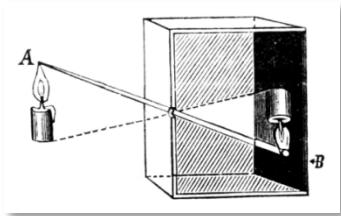


- Possible solutions
  - Bring in more constraints (more images)
  - Use prior knowledge about the structure of the world
- Need a combination of different methods

# Connections to other disciplines

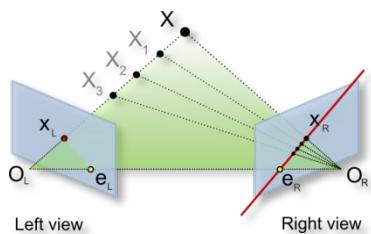


# Course overview



## 1. Low-level vision

- image processing, edge detection, feature detection, cameras, image formation

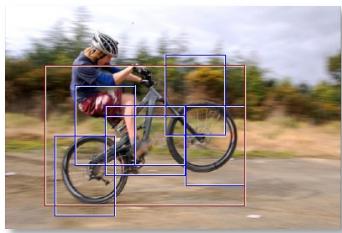


## 2. Geometry and algorithms

- projective geometry, stereo, structure from motion, optimization

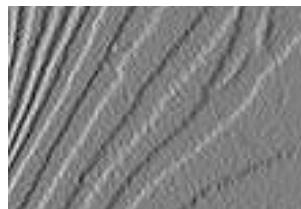
## 3. Recognition

- face detection / recognition, category recognition, segmentation

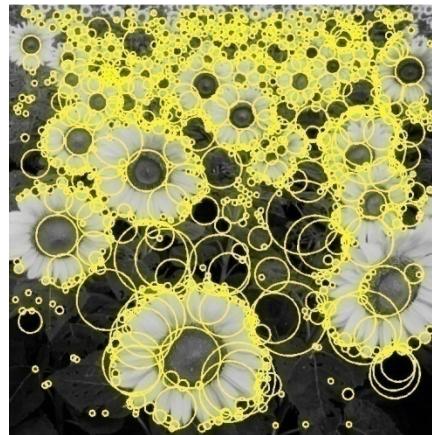


# 1. Low-level vision

- Basic image processing and image formation



Filtering, edge detection



Feature extraction

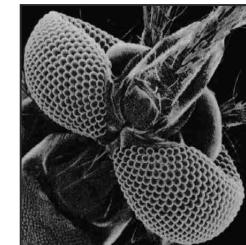
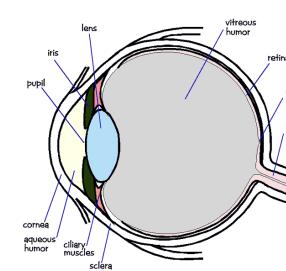
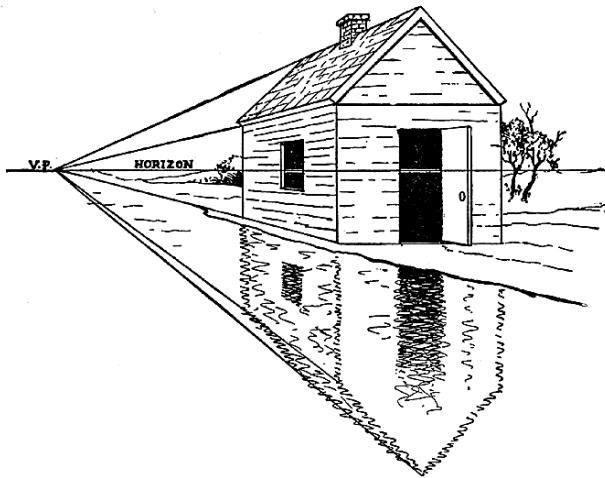
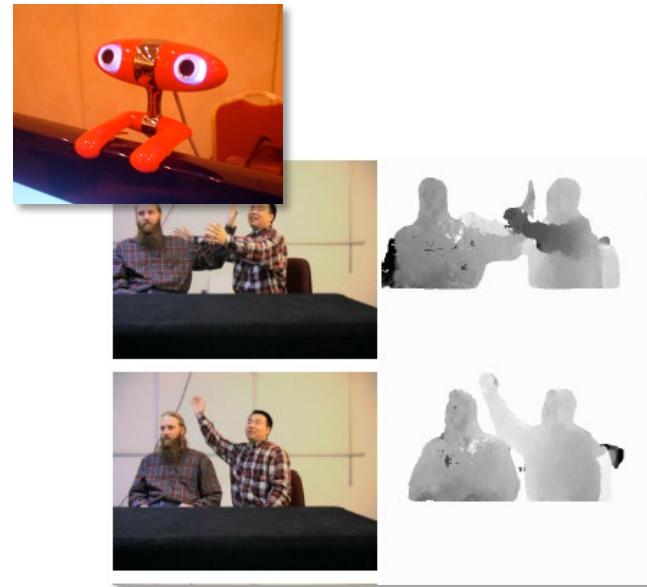


Image formation

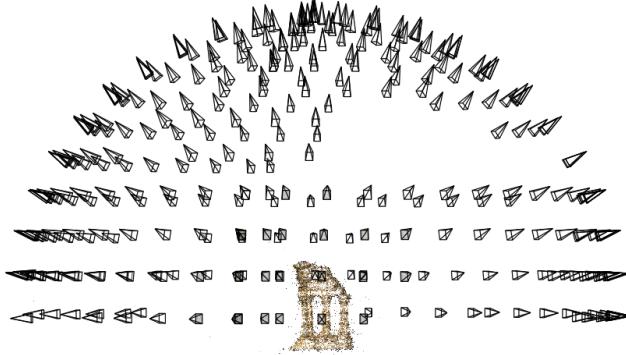
# 2. Geometry



Projective geometry



Stereo

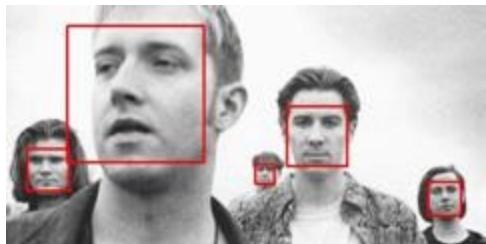


Multi-view stereo

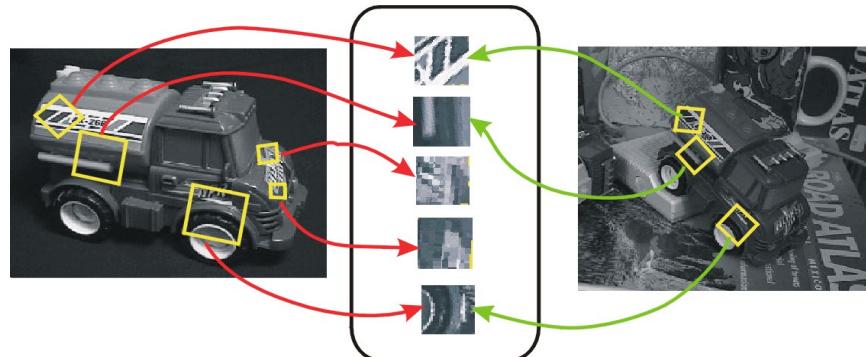


Structure from motion

# 3. Recognition



Face detection and recognition



Single instance recognition



Category recognition