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# CSE 6239

# Computer Vision

## Introduction

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# Computer Vision

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Make computers understand images and video.

- Computing properties of the 3D world from visual data (*measurement*)
- Algorithms and representations to allow a machine to recognize objects, people, scenes, and activities. (*perception and interpretation*)



What kind of scene?

Where are the cars?

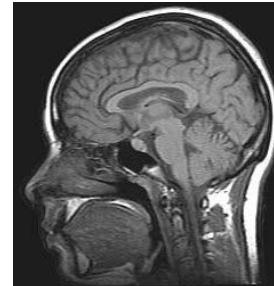
How far is the building?

...

# What is Computer Vision?

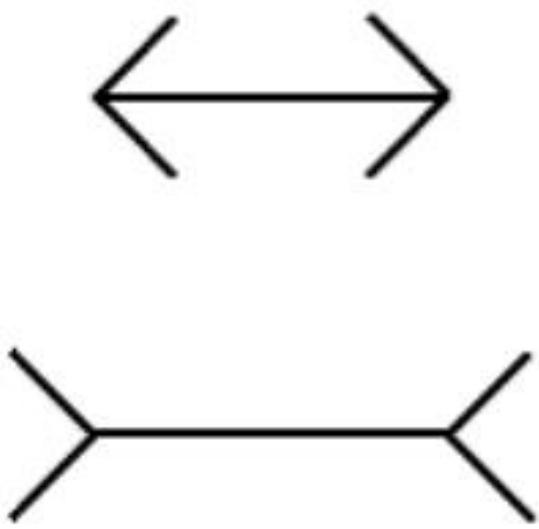
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- **Computer vision** is the science and technology of machines that see.
- Concerned with the theory for building artificial systems that obtain information from images.
- The image data can take many forms, such as a video sequence, depth images, views from multiple cameras, or multi-dimensional data from a medical scanner



# Vision is Challenging

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Edward H. Adelson

(a)

(b)

Important note:

**In general, computer vision does not work**  
(except in certain situations/conditions)

# What is an image?

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We can think of an **image** as a function,  $f$ , from  $\mathbf{R}^2$  to  $\mathbf{R}$ :

- $f(x, y)$  gives the **intensity** at position  $(x, y)$
- Realistically, we expect the image only to be defined over a rectangle, with a finite range:
  - $f: [a,b] \times [c,d] \rightarrow [0,1]$

A color image is just three functions pasted together.  
We can write this as a “vector-valued” function:

$$f(x, y) = \begin{bmatrix} r(x, y) \\ g(x, y) \\ b(x, y) \end{bmatrix}$$

# Digital Image

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A digitized image is one in which:

- Spatial and grayscale values have been made discrete.
- Intensities measured across a regularly spaced grid in x and y directions are sampled to
  - 8 bits (256 values) per point for black and white,
  - 3x8 bits per point for color images.
- Stored as a 2D arrays of gray-level values. The array elements are called pixels and identified by their x, y coordinates.



151	145	136	126	113	149	151	154	156	161	165	169	159	151
149	149	149	149	149	133	148	143	149	149	148	148	149	149
146	145	141	138	148	145	143	136	136	138	138	136	135	133
121	121	120	120	120	126	140	142	146	128	128	129	126	120
123	121	120	120	120	120	120	120	120	120	120	120	120	123
127	120	096	096	096	094	120	120	120	124	124	120	120	123
126	124	126	126	126	126	120	127	126	126	126	127	126	122
102	102	107	124	113	108	108	108	127	128	128	128	127	120
159	157	157	159	156	103	120	120	121	121	126	147	156	163
165	165	162	162	162	168	120	121	120	128	149	149	154	163
166	168	170	168	168	170	173	148	143	147	148	163	169	169
166	173	173	175	173	173	170	175	177	178	153	151	153	156
171	170	170	177	177	178	170	174	174	178	177	178	177	177
162	162	165	176	168	160	162	160	160	176	178	178	180	180

# Every Picture Tells a Story

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Black and white photo by H Roger-Viollet of a train accident at La Gare Montparnasse station in Paris on 22 October, 1895 when engine 120-721 failed to stop at the platform, went through a first-floor window and crashed down onto the street.

Goal of computer vision is to write computer programs that can interpret images.

# Can computers match (or beat) human vision?

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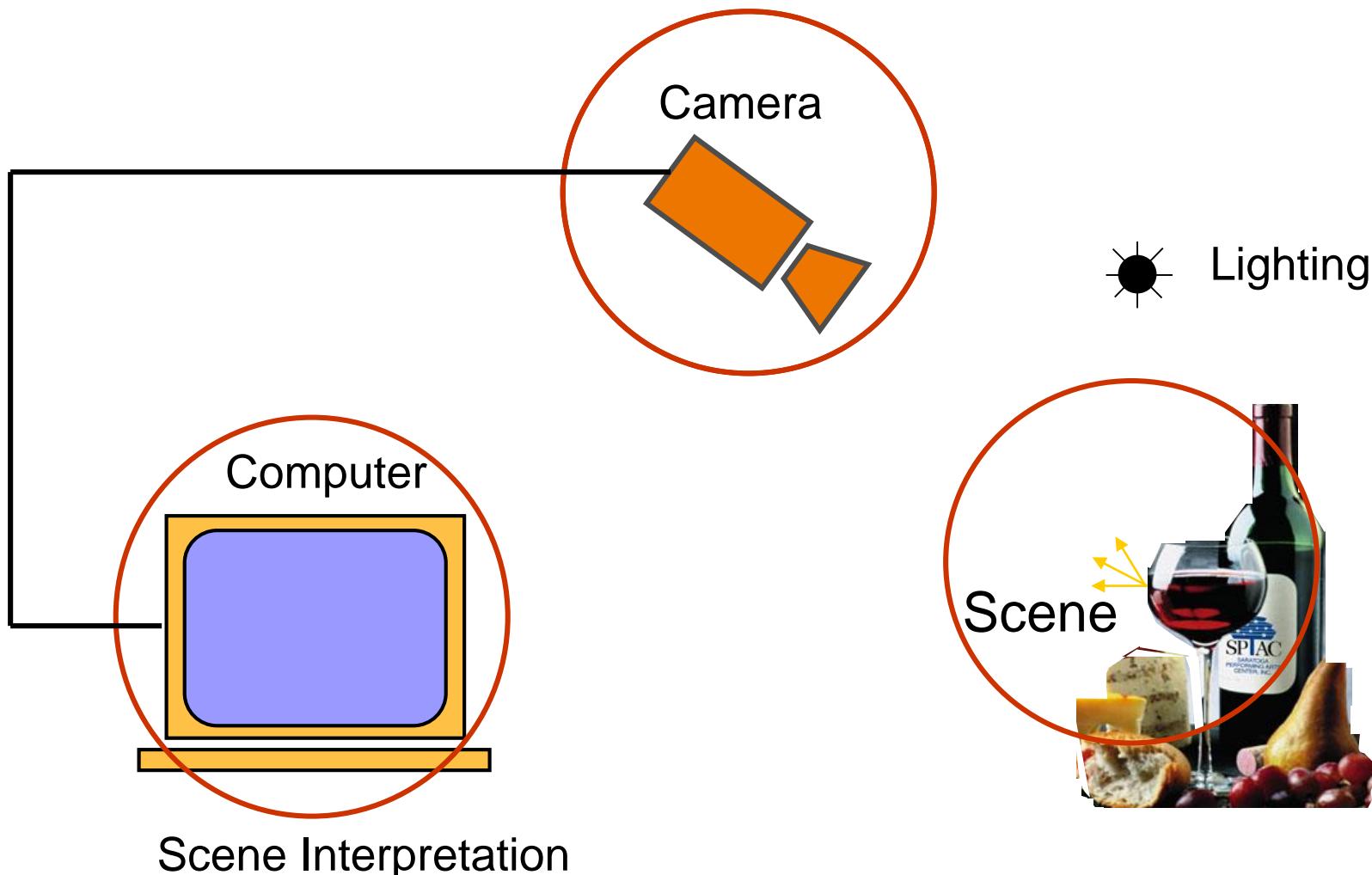


Yes and no (but mostly no!)

- humans are much better at “hard” things
- computers can be better at “easy” things

# Components of a computer vision system

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# Computer vision vs human vision

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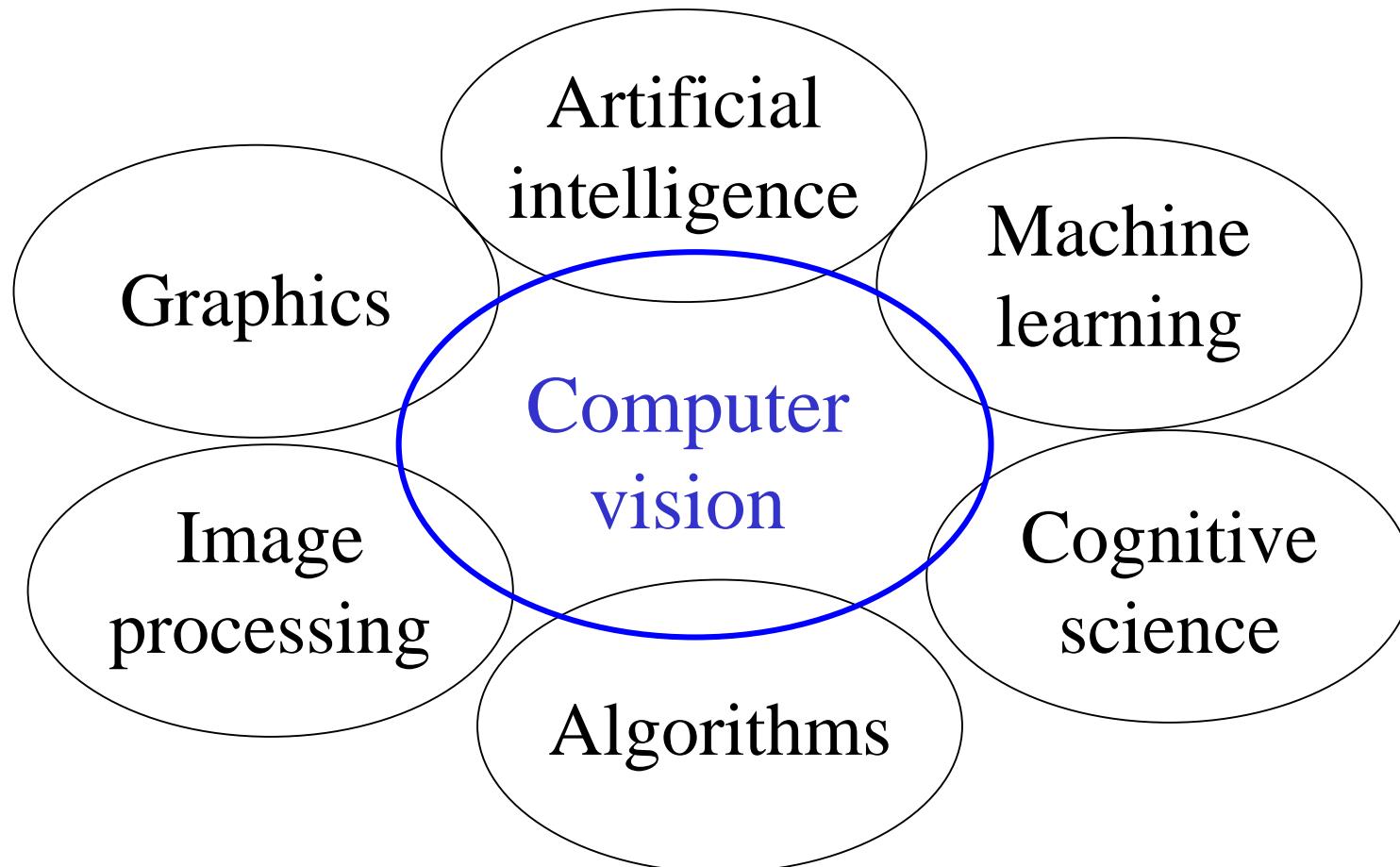


What we see

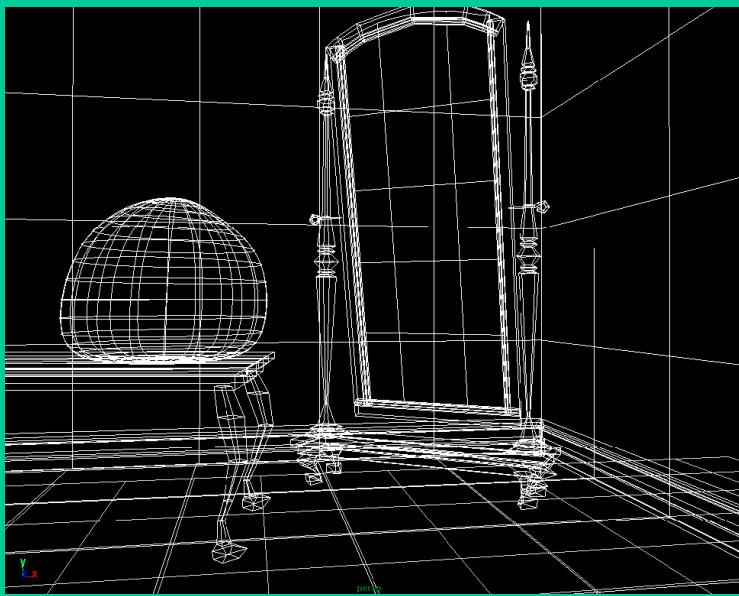
0	3	2	5	4	7	6	9	8
3	0	1	2	3	4	5	6	7
2	1	0	3	2	5	4	7	6
5	2	3	0	1	2	3	4	5
4	3	2	1	0	3	2	5	4
7	4	5	2	3	0	1	2	3
6	5	4	3	2	1	0	3	2
9	6	7	4	5	2	3	0	1
8	7	6	5	4	3	2	1	0

What a computer sees

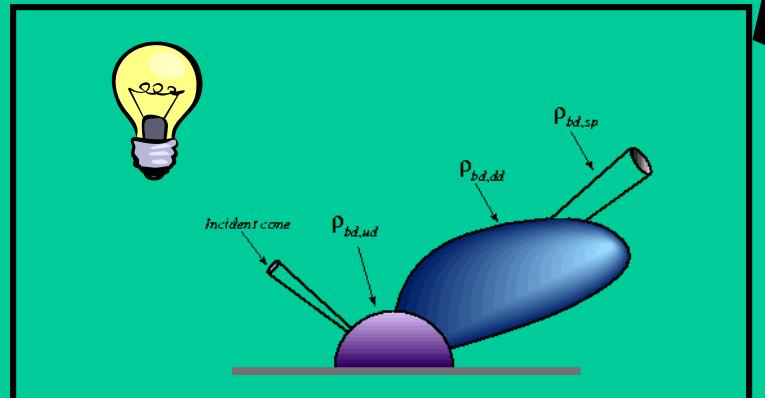
# Related disciplines



# What is computer vision? (2D->3D)



3D geometry



physics

Estimation

# Current state of the art

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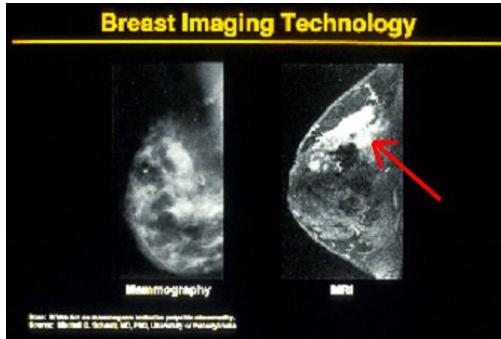
The next slides show some examples of what current vision systems can do

# Why computer vision matters

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Safety



Health



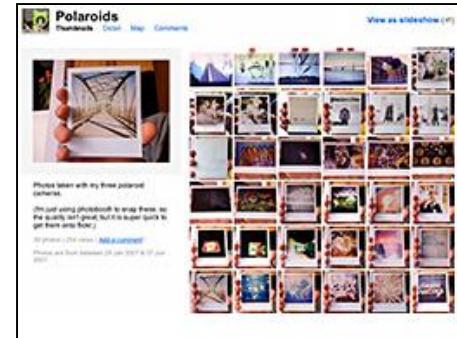
Security



Comfort



Fun



Access

# Current state of the art

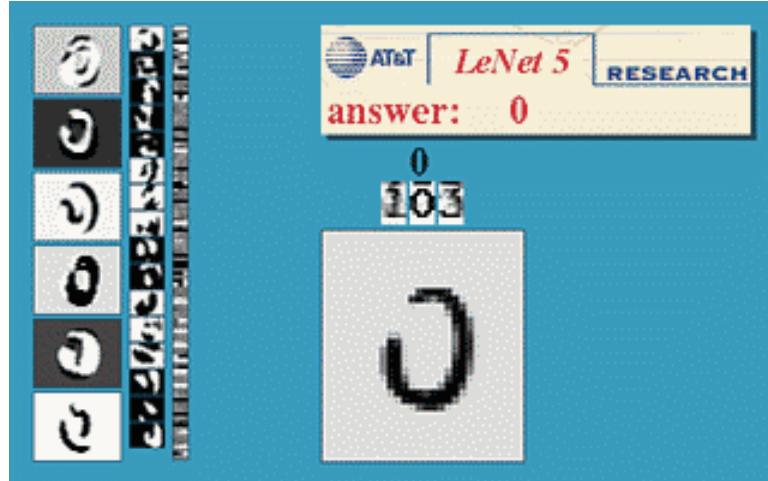
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The next slides show some examples of what current vision systems can do

# 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/>

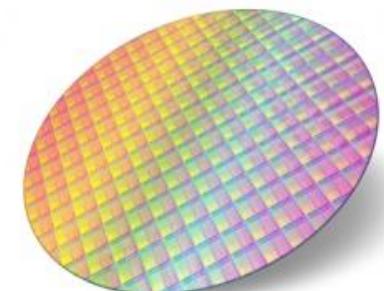


License plate readers

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

# Machine vision

Automated visual inspection



# Face detection

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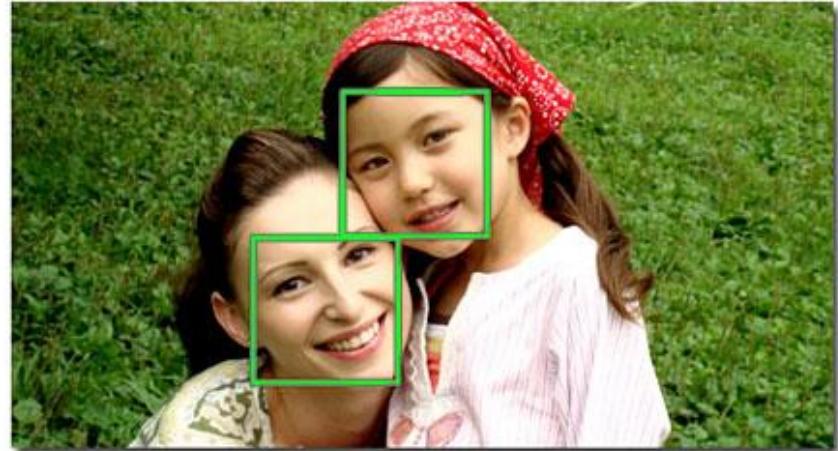


Many new digital cameras  
now detect faces

- Canon, Sony, Fuji, ...



Age recognition



Smile recognition

# Face makeovers

**TAAZ**  
THE BRAINS BEHIND THE BEAUTY

NEW iPhone Hair Try On App   License TAAZ technology for web, mobile, in-store

HOME START MAKEOVER BROWSE LOOKS TRENDS ADVICE ABOUT

Creating your own new look is easy ➤

1. Upload your photo   2. Apply some makeup   3. Choose a hairstyle ➤ try it now!

TODAY'S FEATURED MAKEOVER  
**rtyjukilop.l,kmujnny**  
By: audreyrose26  
14 ❤ 3 💬

Create your own perfect look.  
Try on hairstyles, colors & makeup  
in the TAAZ Virtual Makeover. ➤

TODAY'S FEATURED ADVICE QUESTION  
**which look is better?**  
Asked by: KKsu  
1 ❤ 1 💬

Ask your burning beauty question.  
Our community and experts are here  
to help! ➤

# Object Recognition



Toshiba Tech IS-910T

2013



DataLogic LaneHawk LH4000 2012

# 3D from thousands of images

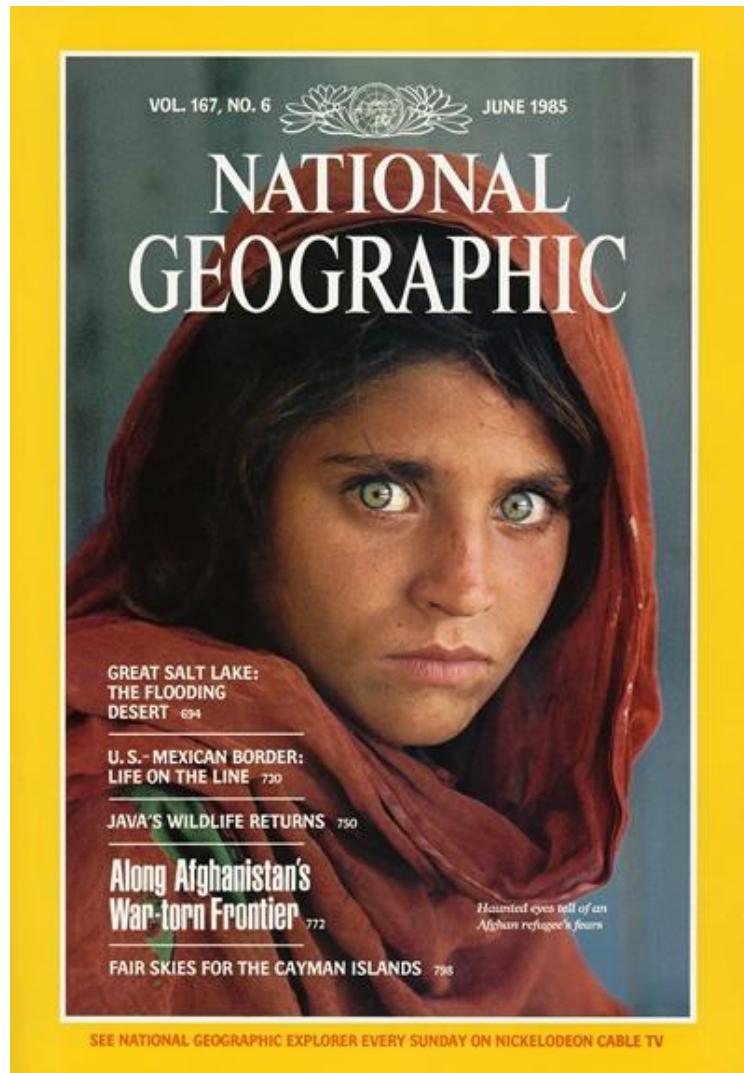
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Building Rome in a Day: Agarwal et al. 2009

# Face recognition

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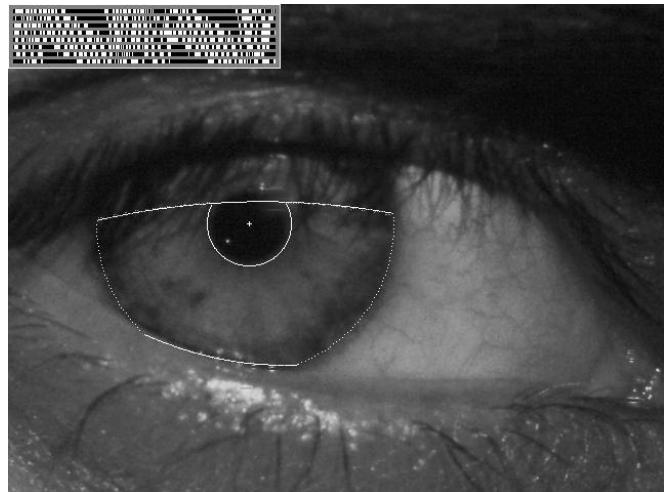
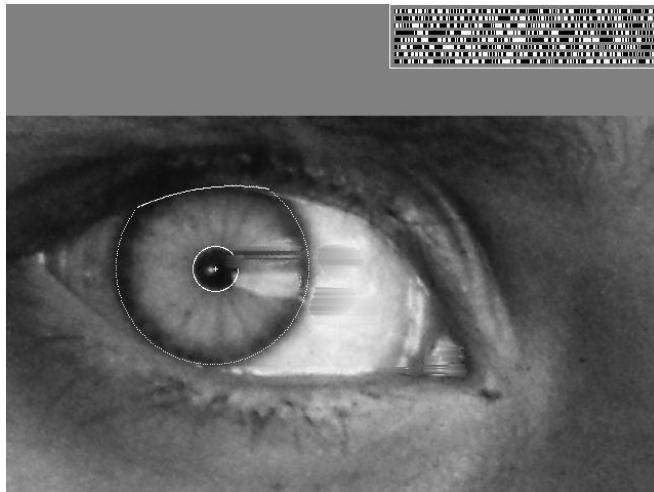
Who is she?

# Vision-based biometrics

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*“How the Afghan Girl was Identified by Her Iris Patterns”* Read the [story](#)



# Object recognition (in mobile phones)

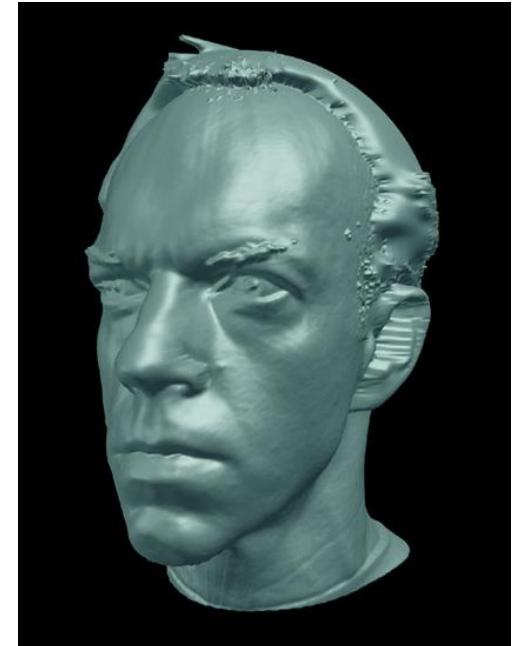


This is becoming real:

- **Lincoln** Microsoft Research
- [Point & Find](#), [Nokia](#)

# Special effects: shape capture

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

# Special effects: motion capture

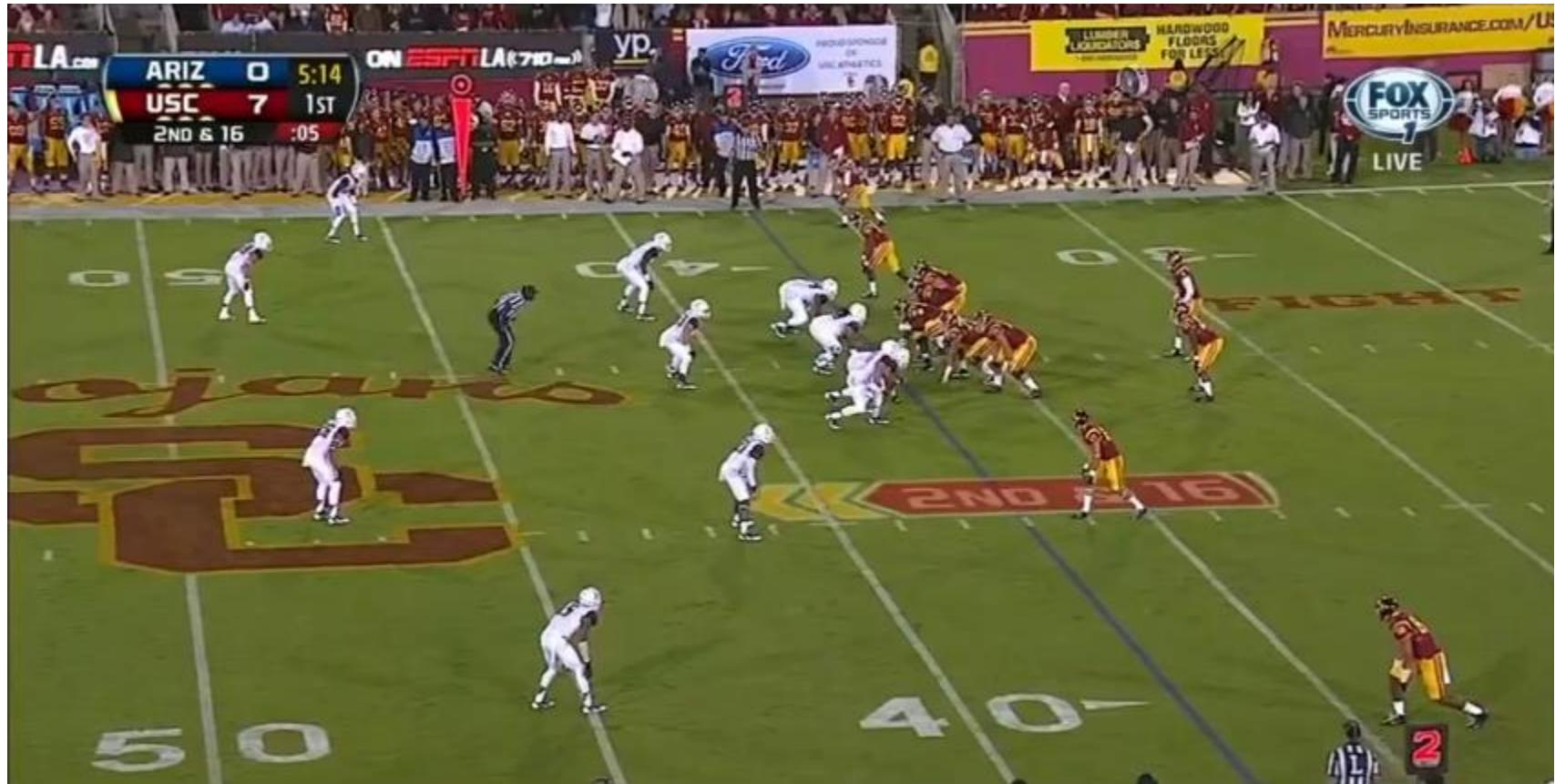
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*Pirates of the Caribbean*, Industrial Light and Magic  
[Click here for interactive demo](#)

# Sports

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

# Smart cars

Slide content courtesy of Amnon Shashua

▶▶ manufacturer products      consumer products ◀◀

## Our Vision. Your Safety.

rear looking camera      forward looking camera      side looking camera

**> EyeQ** Vision on a Chip

**> Vision Applications** Road, Vehicle, Pedestrian Protection and more

**> AWS** Advance Warning System

[> read more](#)      [> read more](#)      [> read more](#)

**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](#)

## Mobileye

- Vision systems currently in high-end BMW, GM, Volvo models
- By 2010: 70% of car manufacturers.
- [Video demo](#)



BMW 5 series

BMW night vision



# Vision-based interaction (and games)

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Nintendo Wii has camera-based IR tracking built in. See [Lee's work at CMU](#) on clever tricks on using it to create a [multi-touch display](#)!



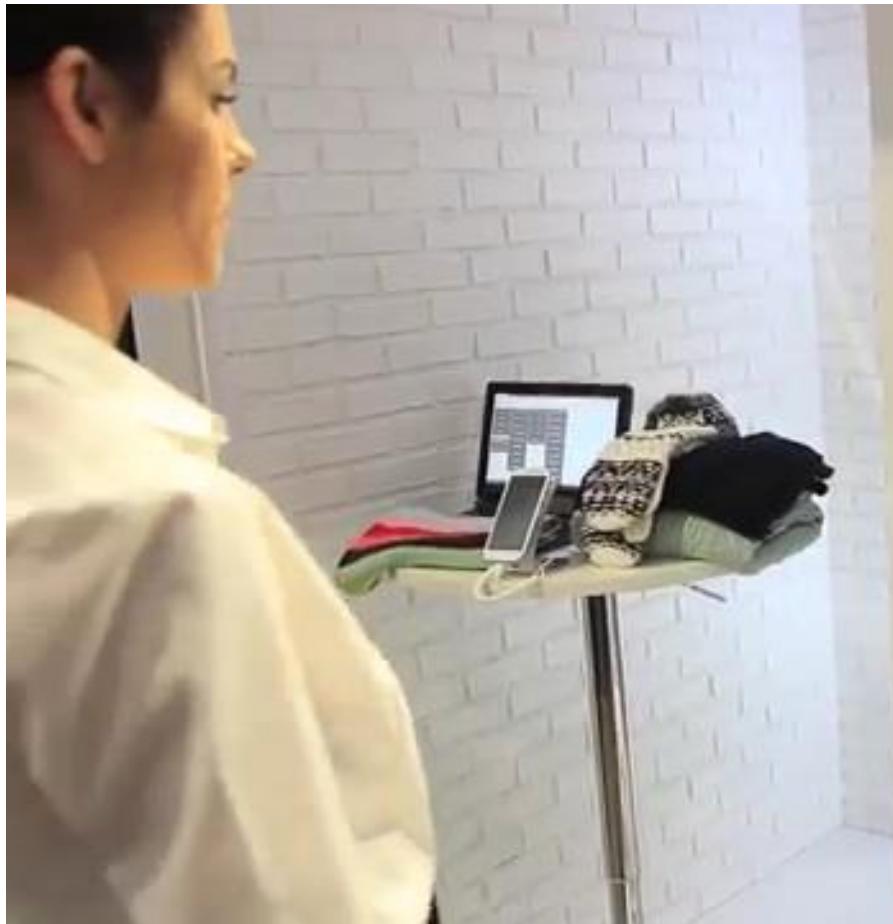
[Digimask](#): put your face on a 3D avatar.



["Game turns moviegoers into Human Joysticks"](#), CNET  
Camera tracking a crowd, based on [this work](#).

# Virtual Fitting

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2015

# Interactive Games: Kinect

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Object Recognition:

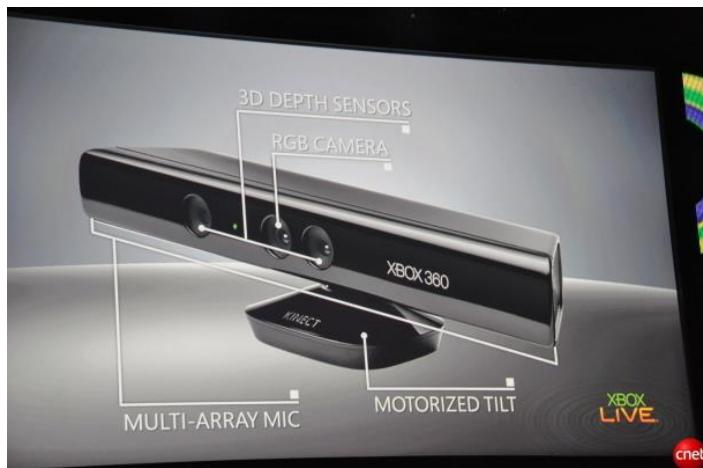
<http://www.youtube.com/watch?feature=iv&v=fQ59dXOo63o>

Mario: <http://www.youtube.com/watch?v=8CTJL5IUjHg>

3D: <http://www.youtube.com/watch?v=7QrnwoO1-8A>

Robot:

<http://www.youtube.com/watch?v=w8BmgtMKFbY>



# Vision in space

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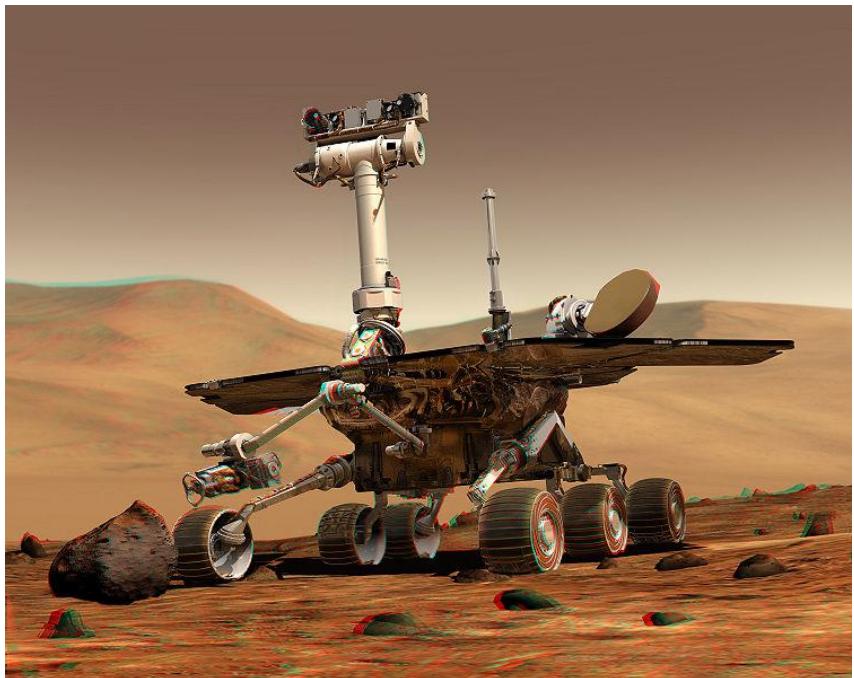
[NASA'S Mars Exploration Rover Spirit](#) captured this westward view from atop a low plateau where Spirit spent the closing months of 2007.

## Vision systems (JPL) used for several tasks

- Panorama stitching
- 3D terrain modeling
- Obstacle detection, position tracking
- For more, read "[Computer Vision on Mars](#)" by Matthies et al.

# Robotics

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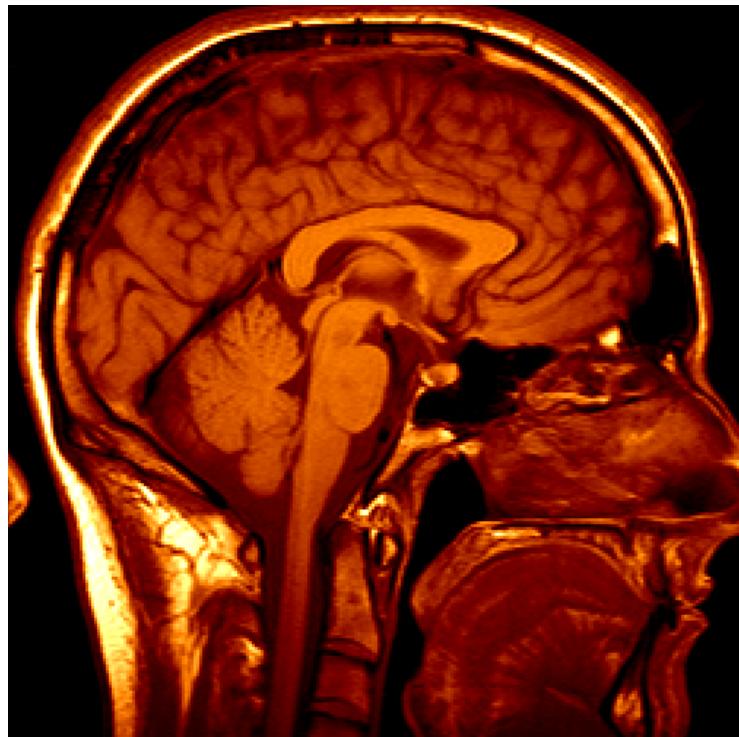
NASA's Mars Spirit Rover  
[http://en.wikipedia.org/wiki/Spirit\\_rover](http://en.wikipedia.org/wiki/Spirit_rover)



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

# Medical imaging

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3D imaging  
MRI, CT



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

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# Challenges

# Challenges: viewpoint variation

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Michelangelo 1475-1564

slide credit: Fei-Fei Li

# Challenges: illumination

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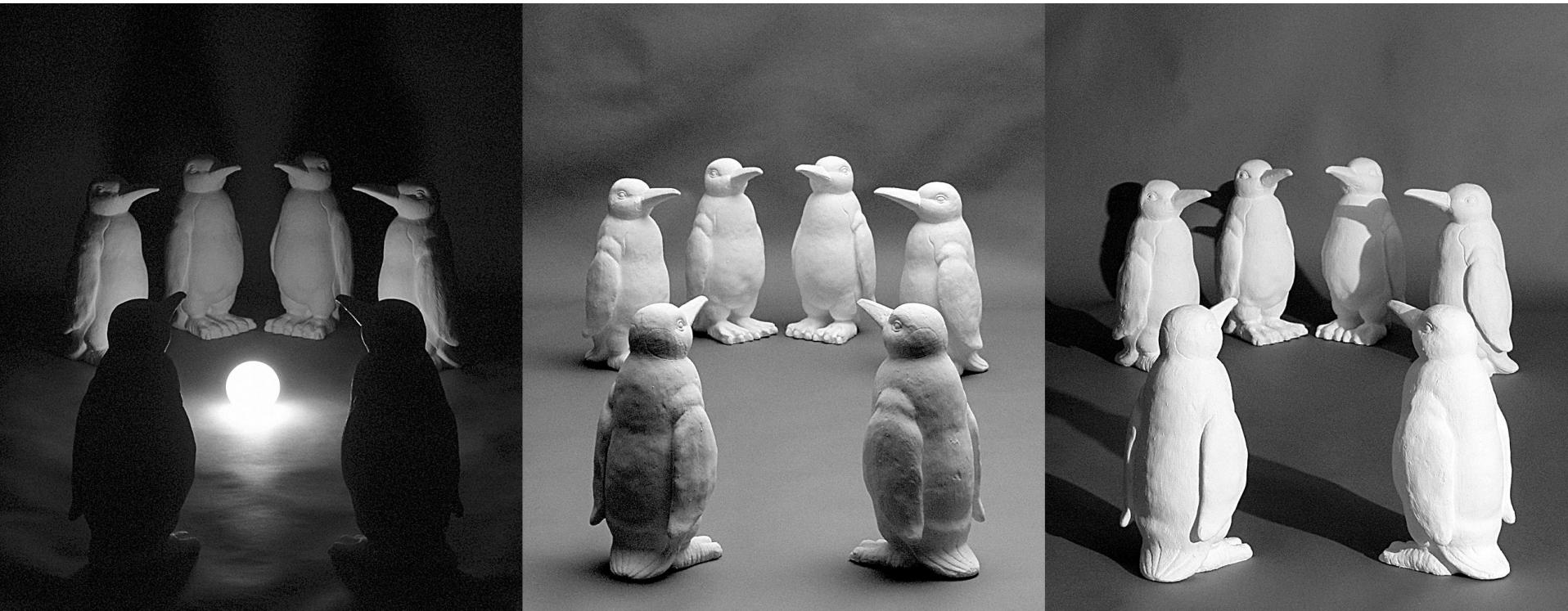


image credit: J. Ko

# Challenges: scale

and small things

from Apple.

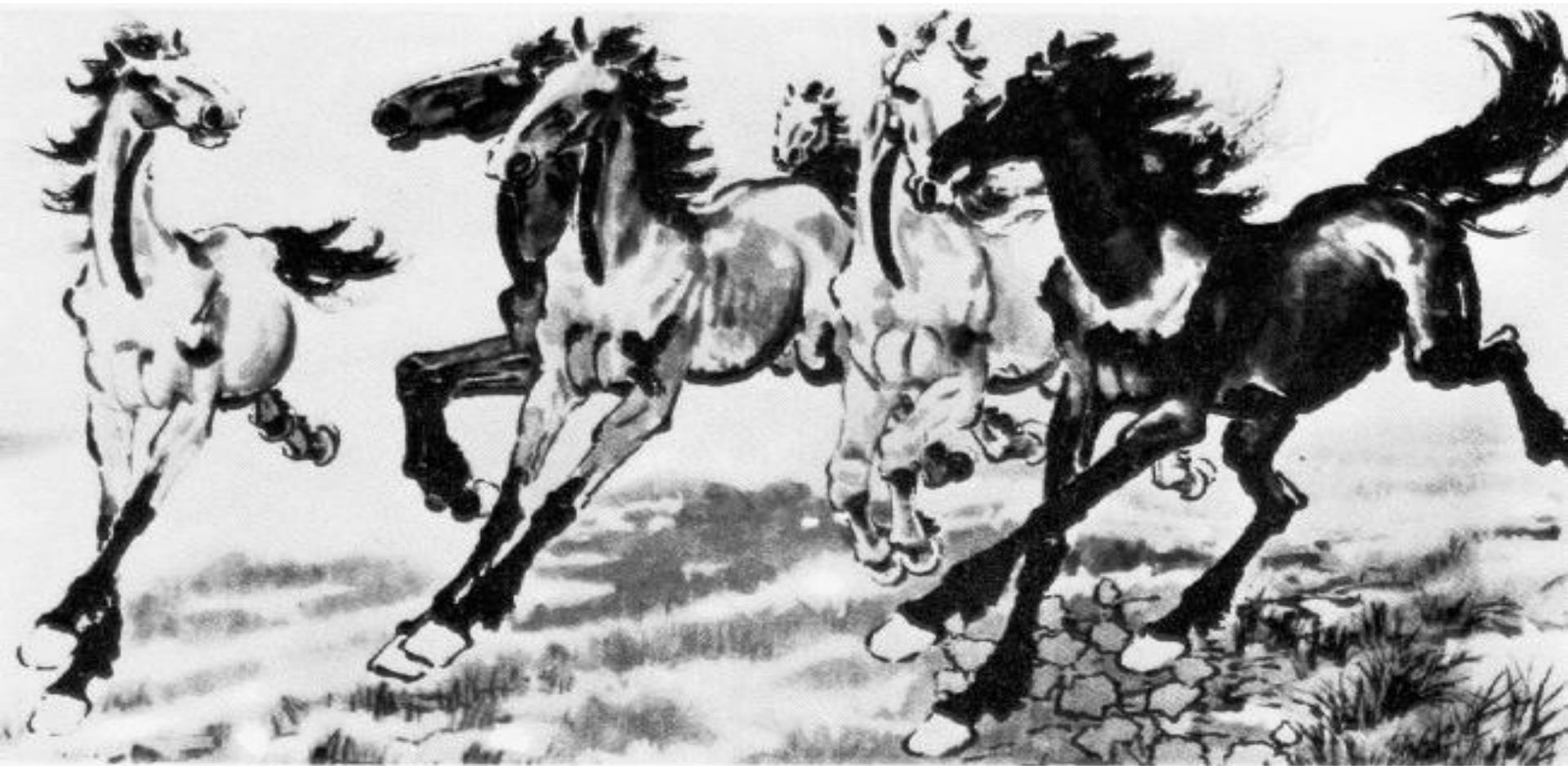
(Actual size)



slide credit: Fei-Fei

# Challenges: deformation

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Xu, Beihong 1943

# Challenges: occlusion

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Magritte, 1957

slide credit: Fei-Fei Li

# Challenges: background clutter

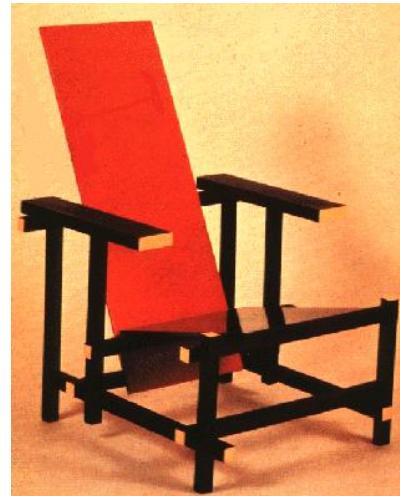


Emperor shrimp and commensal crab on a sea cucumber in Fiji  
Photograph by Tim Laman

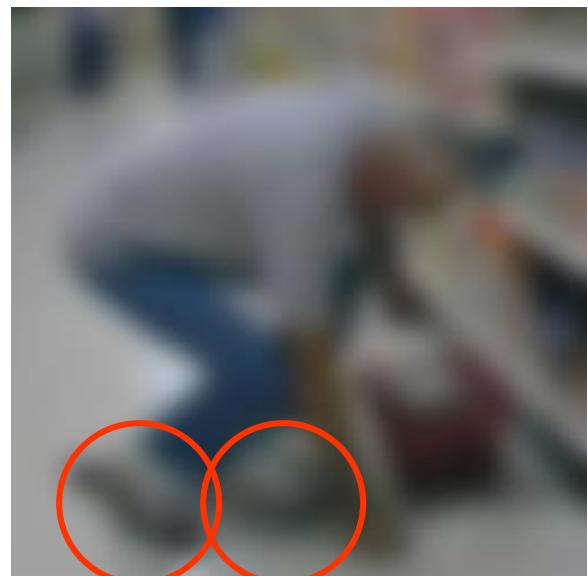
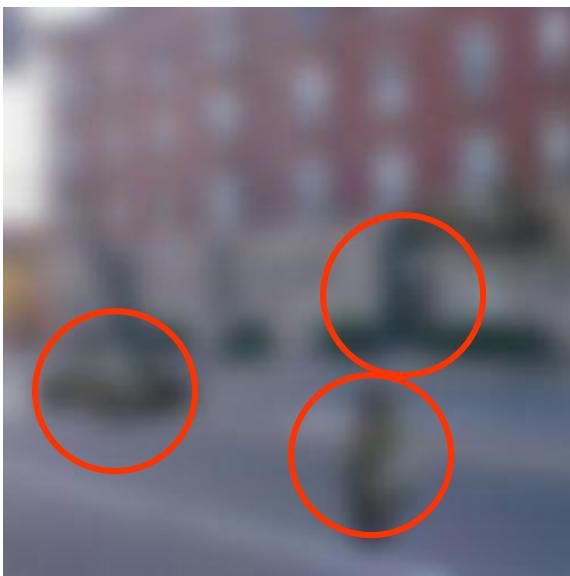
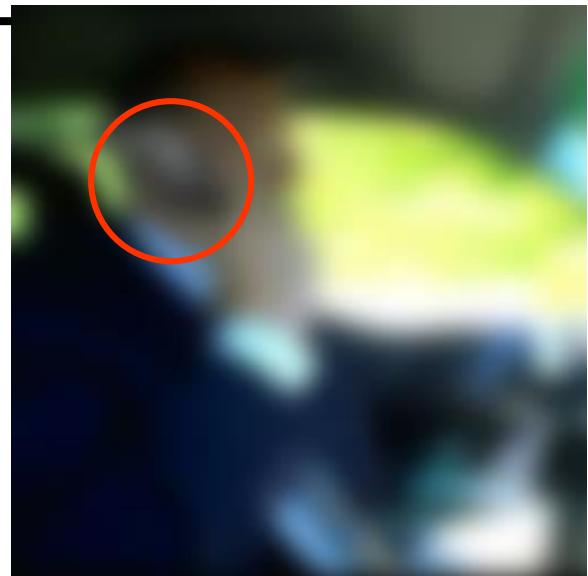
NATIONAL  
GEOGRAPHIC

# Challenges: object intra-class variation

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# Challenges: local ambiguity



# Challenges or opportunities?

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- Images are confusing, but they also reveal the structure of the world through numerous cues
- Our job is to interpret the cues!



# Bottom line

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- 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 ( or more images)
  - Use prior knowledge about the structure of the world
- Need both exact measurements and statistical inference!

It's a good time to do  
computer vision

# Industry aggressively hiring CV faculty from universities



NYU



UW



NYU



Oculus VR™

CMU



CMU



CMU



CMU



CMU



Stanford



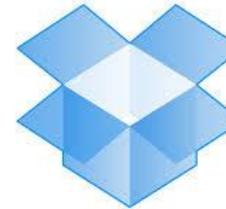
Toronto



UW



lid) already out of date by at least 2 CMU faculty)



Dropbox



UCSD Columbia

Google™



# aggressively hiring CV graduates, or even students!

facebook research      Research Areas      Publications      People      Programs      Downloads      Careers      Blog      Q

JULY 21, 2017

## Advancing computer vision technologies at CVPR 2017

By: Facebook Research

 Google Research Blog

The latest news from Research at Google

Google at CVPR 2017

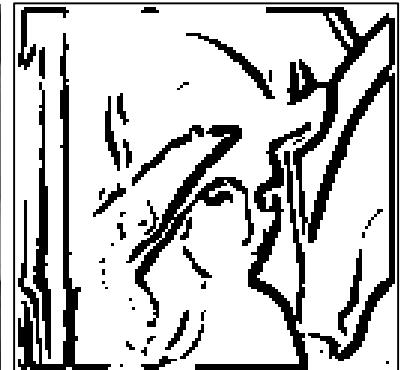
Friday, July 21, 2017

Microsoft Research @ CVPR 2017

# Topics to be covered

Image processing:

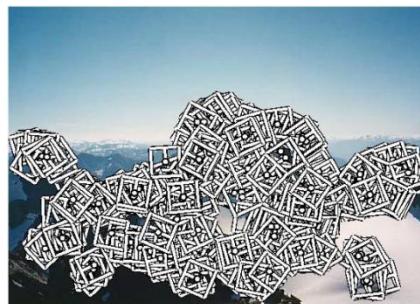
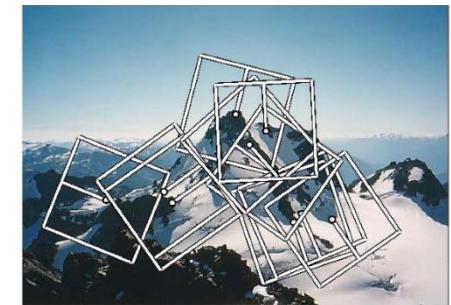
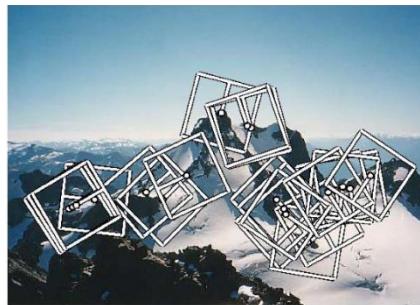
- Basics of filtering.
- Image pyramids.
- Gradients and lines.
- Hough transforms.



# Topics to be covered

Feature detection and correspondences:

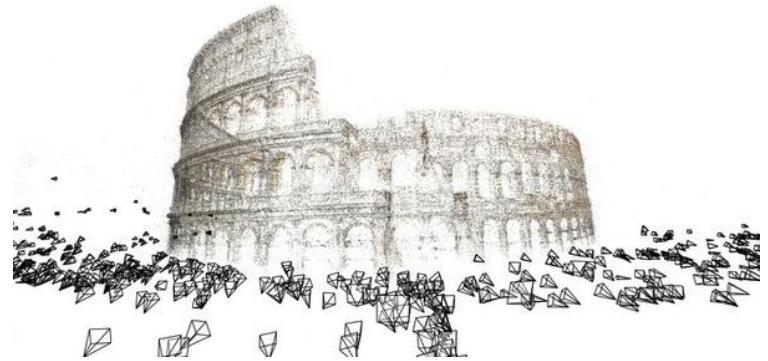
- Corner detection.
- SIFT et al.
- Feature descriptors.
- RANSAC.



# Topics to be covered

Transformations and geometry:

- Homographies and image alignment.
- Camera models.
- Fundamental matrix.
- Epipolar geometry and stereo.
- Structure from motion.



# Topics to be covered

Physics-based vision:

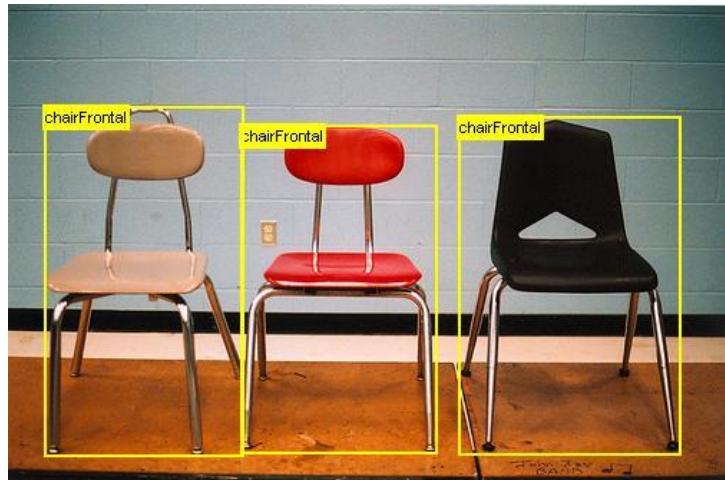
- Reflectance and image formation.
- Radiometry.
- Shape from shading.
- Photometric stereo.
- Color.



# Topics to be covered

Objects, faces, and learning:

- Basics of probability.
- K-means, KNN, PCA, SVM.
- Bag of words.
- Viola-Jones face detection.
- Perceptron, backpropagation.
- Convolutional neural networks.



# Topics to be covered

Dealing with motion:

- Optical flow (LK, HS).
- Image registration.
- Kalman Filtering.
- Tracking (KLT, Mean-Shift).



# Grading

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Based on

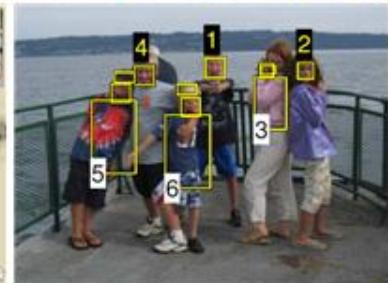
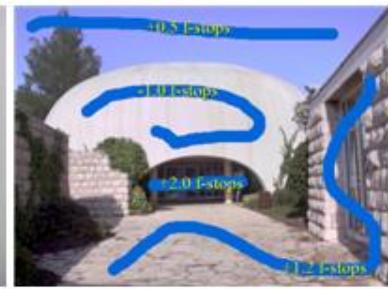
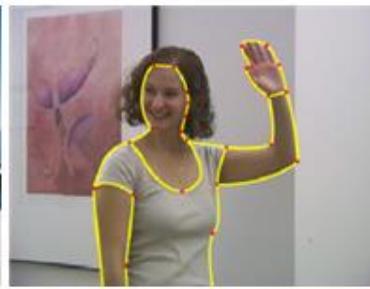
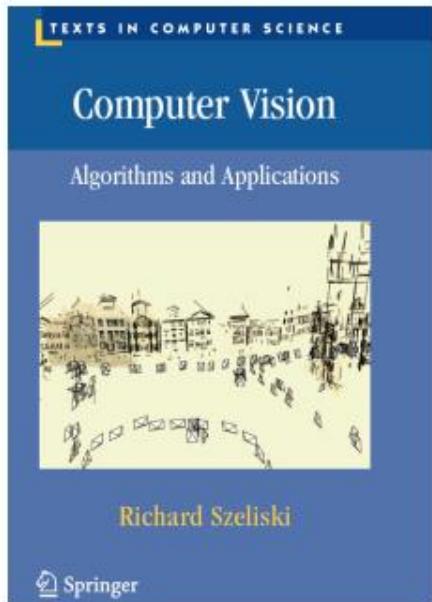
- Projects – 20%
- Final exam - 50-60%
- class participation – 5%
- 2 Seminar/workshop – 15%
- Assignments / Class tests (optional) – 0-10%

# Textbook

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## Computer Vision: Algorithms and Applications

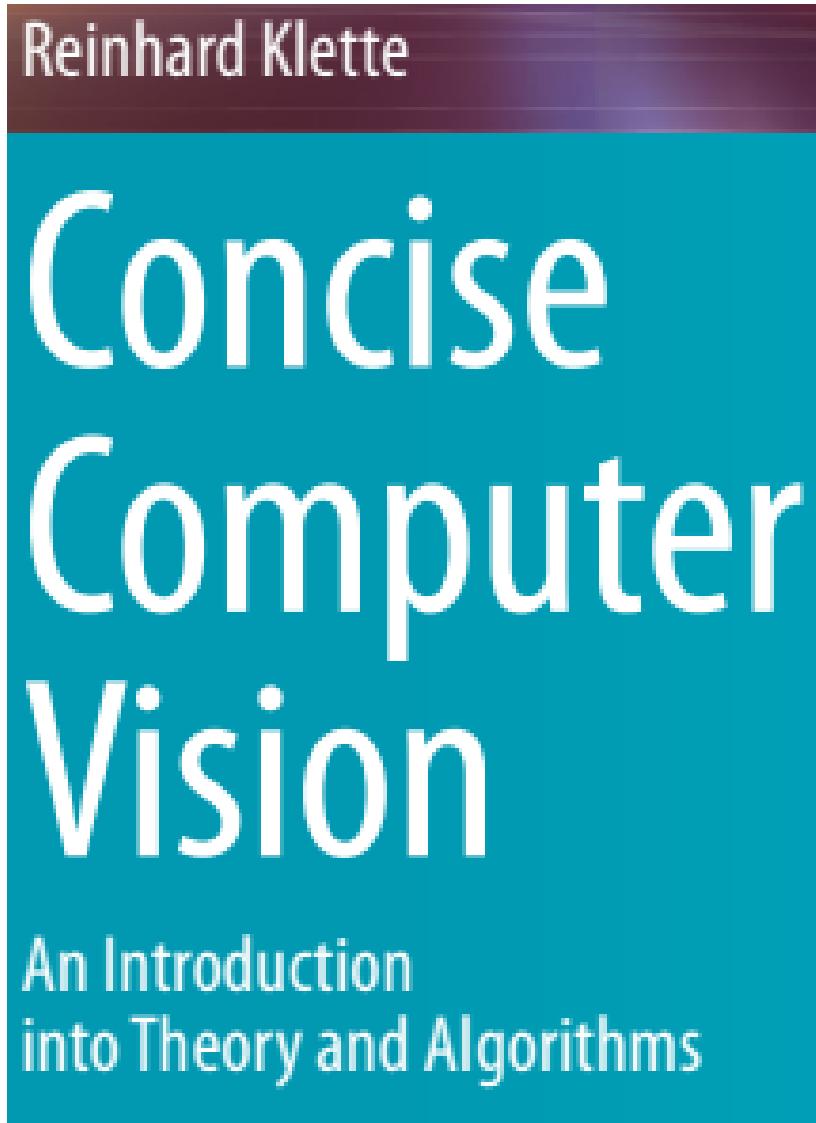
© 2010 [Richard Szeliski](#), Microsoft Research



<http://szeliski.org/Book/>

# Textbook

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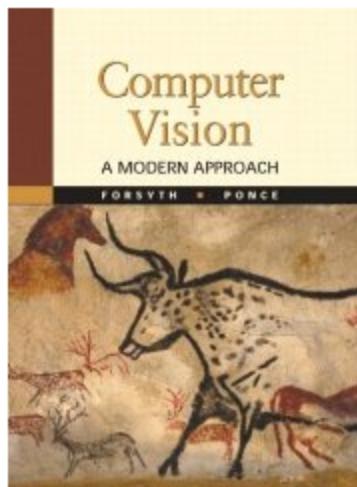


Reinhard Klette

# Concise Computer Vision

An Introduction  
into Theory and Algorithms

# ary Text



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## Computer Vision: A Modern Approach (Hardcover)

by [David A. Forsyth](#) (Author), [Jean Ponce](#) (Author)

(20 customer reviews)

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# General Comments

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Prerequisites—*these are essential!*

- Data structures
- A good working knowledge of C and C++ programming
  - (or willingness/time to pick it up quickly!)
- Linear algebra
- Vector calculus