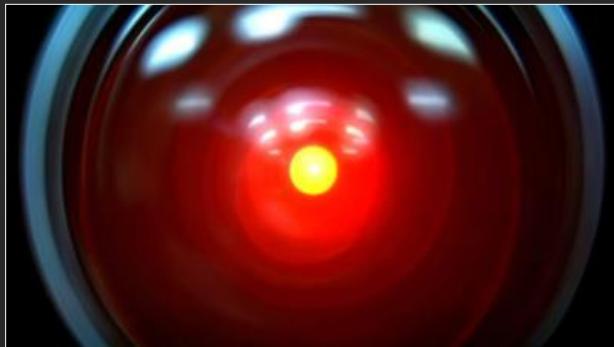
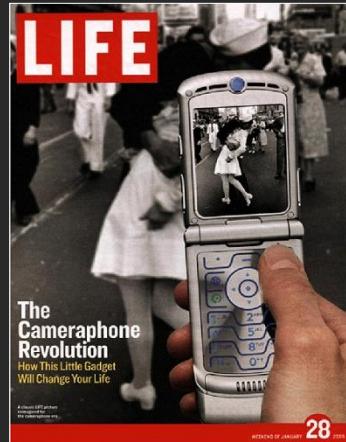


ELEC 345: Computer Vision

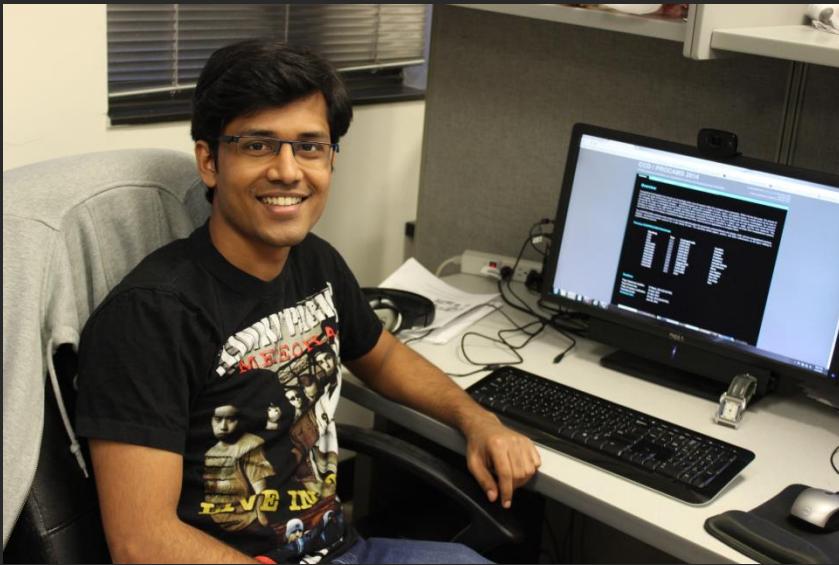


ELEC 345

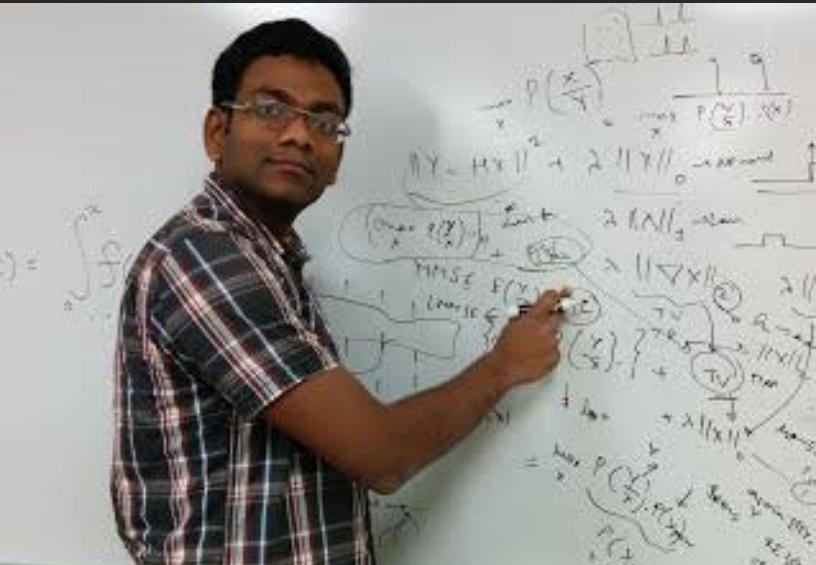
Introduction to Computer Vision and its applications

- Course catalog number: ELEC 345 (Spring 2017)
- Instructor: Prof. Ashok Veeraraghavan
(vashok (at) rice.edu)
DH 3030
- Office Hours: Wednesday 9:00-10:00 AM
- Meeting time: Tuesday 4:00 – 5:15 PM
Thursday 4:00 – 5:15 PM
- Meeting place: HRZ 210

Teaching Assistants



Vivek Boominathan (vb10@rice.edu)



Adithya Pediredla (akp4@rice.edu)

Recitation Sessions

Mondays or Wednesdays

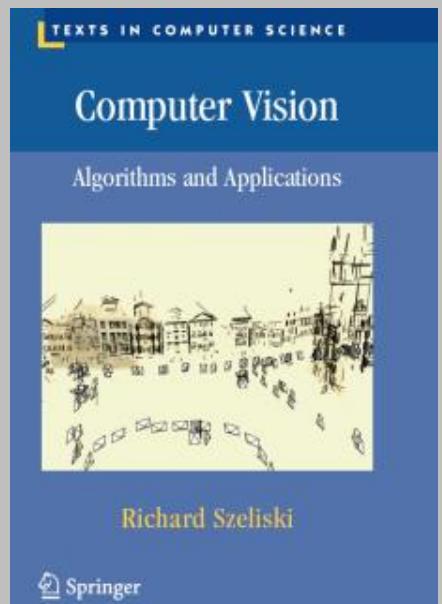
5:00-6:00 PM

Venue: TBD

Course Info

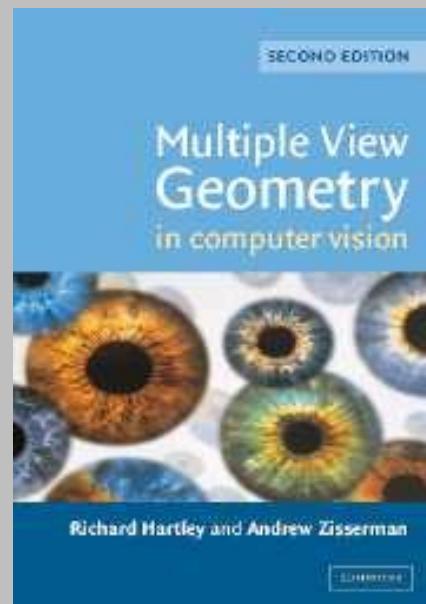
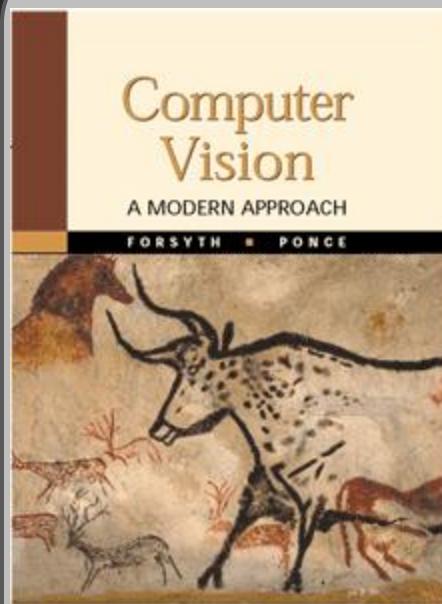
- Course assumes prior
 - Programming experience
 - Experience with basic Linear algebra
 - Introductory knowledge of Vector calculus
 - Creativity and enthusiasm
- Course also requires that you have some
 - Matlab experience
 - Interest in imaging or photography
 - Hard work ---- this course is not going to be easy – We are going to build some real working computational photography systems and algorithms as projects. Be prepared to work hard and have loads of fun
- Do you own a camera? Do you have access to a camera?

Books



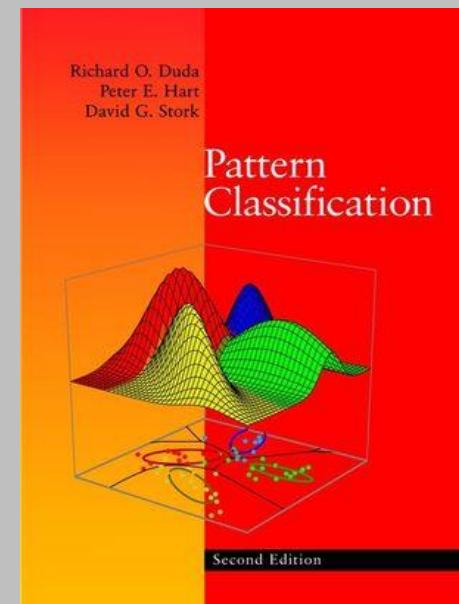
Textbook

Free to download



Reference Books

Selected chapters are recommended reading



Grading

Grading (subject to change)

Take Home Assignments	-	65%
Mid Term (take home)	-	15%
Final Exam (in class)	-	5%
Final Exam (take home)	-	15%

All Assignments and Exams will have 3 Parts

Part A - Straightforward from Class Notes

Part B - Creativity and Extensions to Concepts Reqd.

Part C – Graduate Course Credit

Quick Round of Introductions

**BRING YOUR OWN
NAME TAG**

Today

- Course Syllabus
- Assignments and Examinations
- Course Rules, Policies and Procedures
- Introduction to computer vision, animals and illusion

Course Syllabus

<http://www.youtube.com/watch?v=Vxq9yj2pVWk>

Course Syllabus

Introduction				
01		Introduction to Computer Vision and Sample Applications. Animal Eyes, Perception and Illusions		
02		Linear filters and Edge detection Assignment0 release		
03		Feature extraction (Harris + SIFT)		
04		Feature Extraction 2		
05		Model Fitting and RANSAC Assignment1 release		
06		Alignment		
07		Photometric tools (Gradient domain processing, Laplacian etc)		
08		REVIEW AND DISCUSSION Assignment2 release		

Course Syllabus

Image Formation				
09		Cameras, Projection		
10		Projective Geometry and meterology		
11		Computational Photography		
		Assignment3 release		
12		REVIEW AND DISCUSSION		
13		Camera Calibration		
		Spring Break (No classes)		
15		Stereo and Multi-view stereo		
		Assignment5 release		
16		Midterm Exam		
16		Structured Light and Kinect		
17		Structure from Motion		
18		Light, Shading and Color (Material Properties)		
		Assignment6 release		
19		Photometric Stereo and Shape from Shading		

Course Syllabus

Recognition and Pattern Classification/Machine Learning Methods				
20		History and Overview		
		Midterm Recess (No Class)		
21		Recognition and Machine Learning Assignment7 release		
22		Bags of features and part based models		
23		Face + Review and Discussion		
24		Motion (Tracking, Optical Flow)		
25		Photometry: Segmentation		

- **Assignments – 65%**
 - There will be periodic assignments distributed
 - Assignments will be mix of
 - Reading papers
 - Implementing algorithms
 - Writing a summary of a paper etc.
 - Assignments will progressively get tougher: the first couple of assignments might be easy to get your feet wet.
 - The total grade of assignments will be graded for a total of 65% credit
- **Examinations**
 - One Midterm exam (Take Home)
 - Final Exam
 - One part taken in class
 - Another part taken at home

Class Rules

- Questions
 - All questions are welcome
 - Interrupt me if you do not understand something
 - I am available in class to help you all learn--- make use of that
- Talk to each other
 - Discuss papers that you like
- Shape the syllabus
 - If there are particular papers or topics you think would be interesting, let me know.
- Laptops, Ipads etc are not permitted.
 - If you want to take class notes on your laptop or IPAD let me know ahead of time and get permission.
 - Otherwise, I expect your concentration in class.

Class Rules

Setting Course Expectations

- HARD
- DEFINITELY TIME CONSUMING
- YOU WILL LEARN CV IF YOU COMPLETE THE COURSE REQUIREMENTS
- I EXPECT AND WILL TREAT ALL OF YOU AS ADULTS
- DEFINITELY TIME CONSUMING COURSE

- Many of the slides used in the course have their origin in various computer vision and related courses in several universities. Thanks to many of the original slide creators and those who modified it subsequently.

Slide Credits:

Steve Seitz

Rick Szeliski

Srinivas Narasimhan

Fei-Fei-Li

Svetlana Lazebnik

Neel Joshi

Antonio Torralba

Rob Fergus

Frank Dellaert

Michael Black

Introduction to computer vision

The goal of computer vision

- To extract “meaning” from pixels



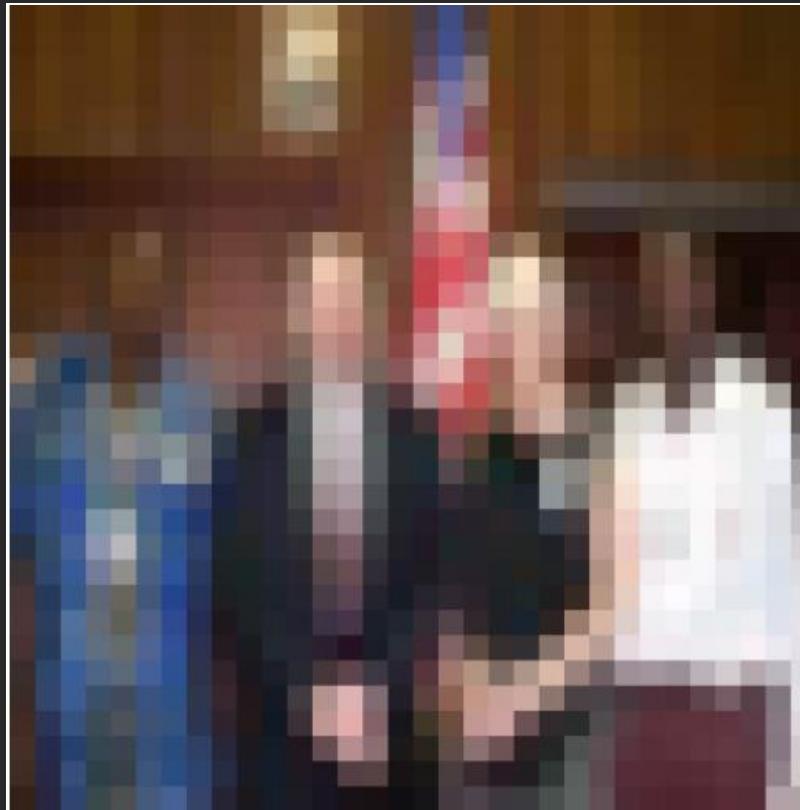
What we see

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

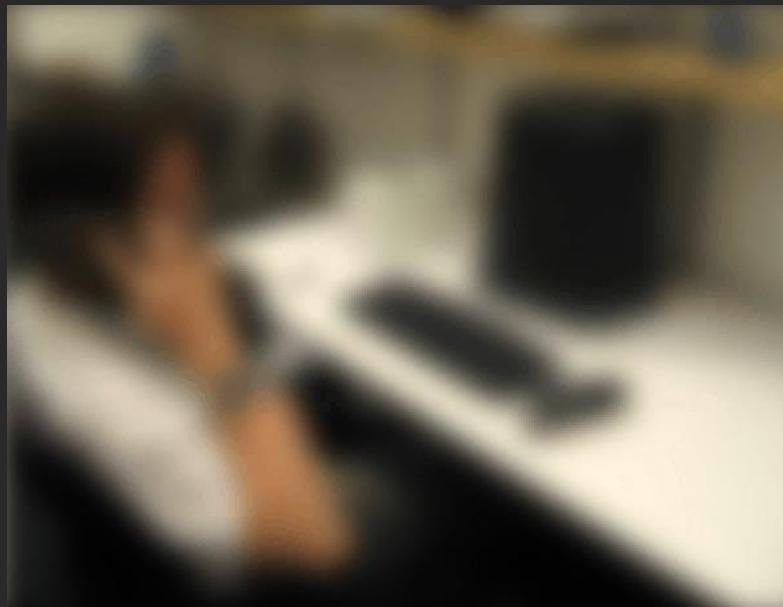
- To extract “meaning” from pixels



Humans are remarkably good at this...

The goal of computer vision

- To extract “meaning” from pixels



Humans are remarkably good at this...

What kind of information can be extracted from an image?

- Metric 3D information
- Semantic information

Vision as measurement device

Real-time stereo

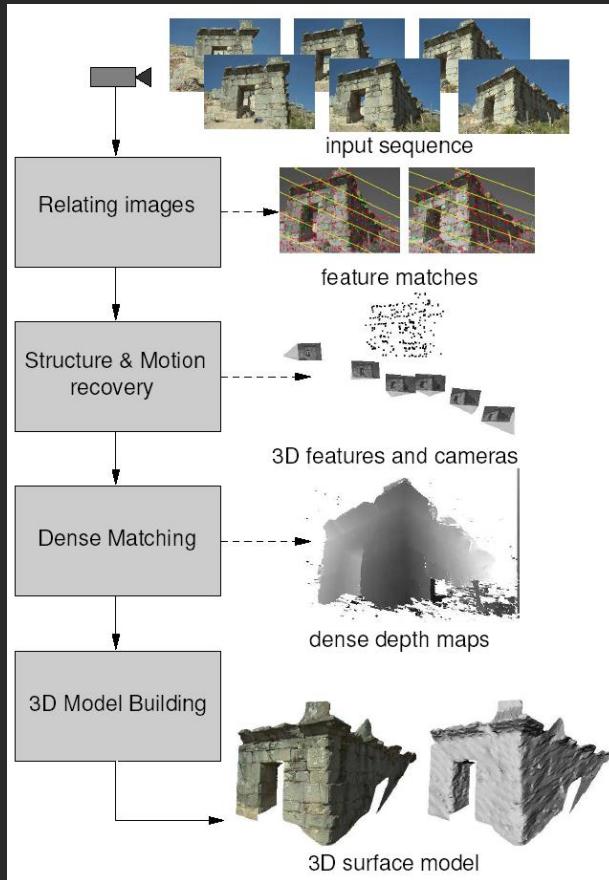


NASA Mars Rover

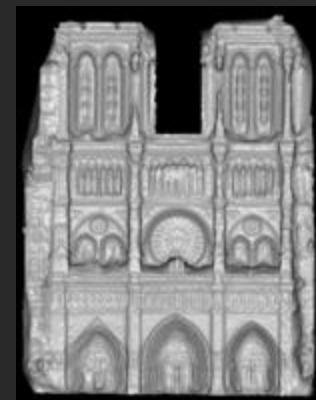


Pollefeys et al.

Structure from motion



Reconstruction from Internet photo collections



Goesele et al.

Vision as a source of semantic information



Object categorization

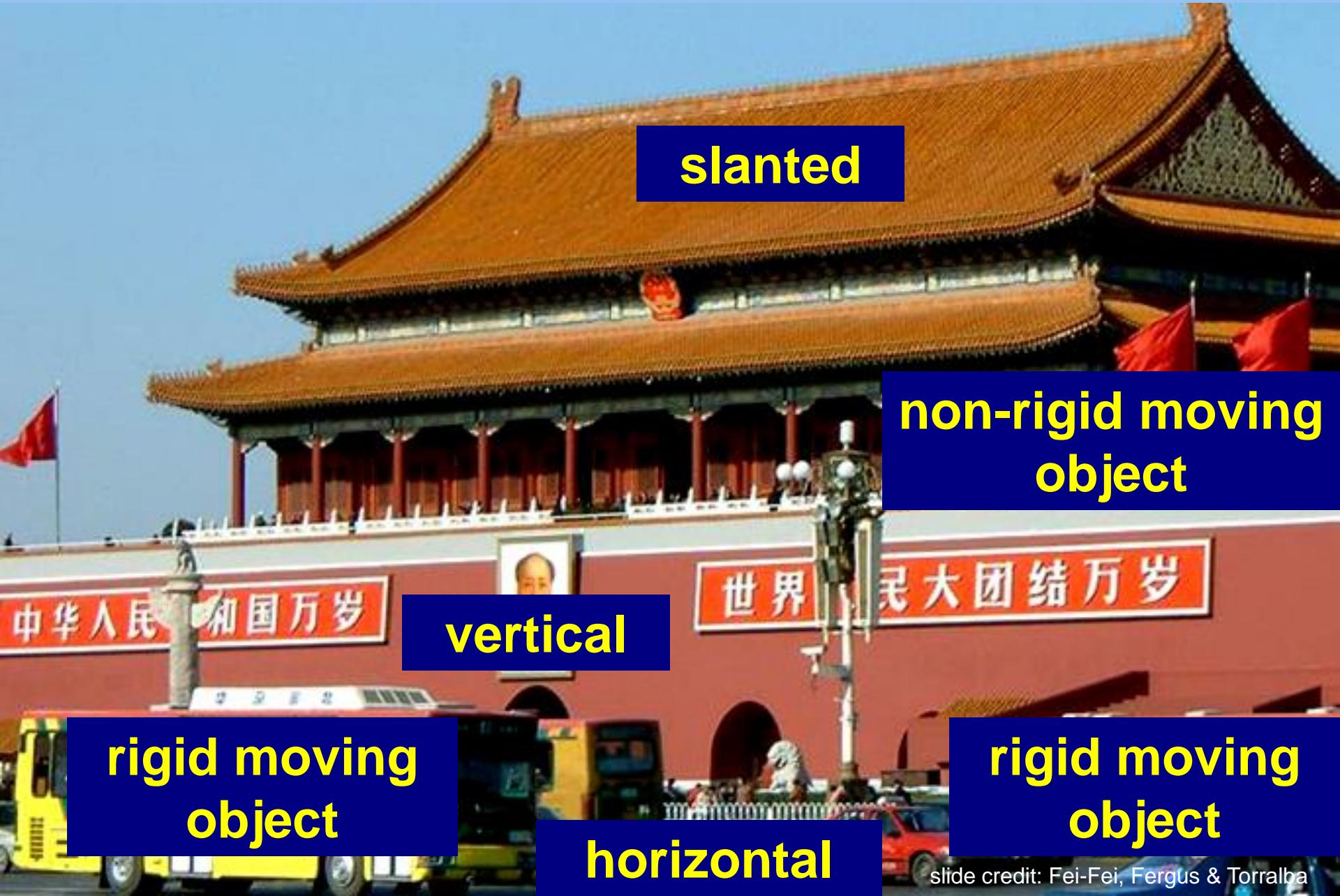


Scene and context categorization

- **outdoor**
- **city**
- **traffic**
- ...



Qualitative spatial information



Why study computer vision?

- Vision is useful: Images and video are everywhere!



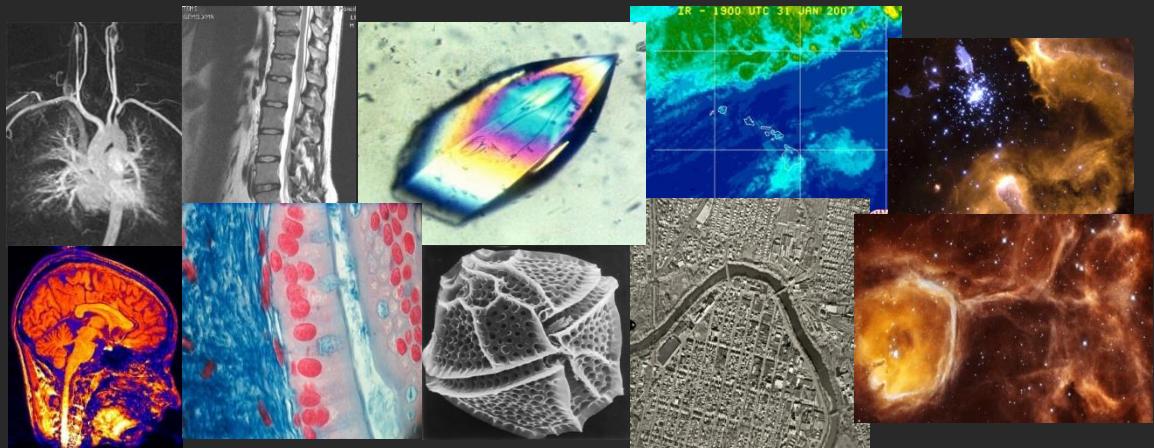
Personal photo albums



Movies, news, sports



Surveillance and security



Medical and scientific images

Why study computer vision?

- Vision is useful
- Vision is interesting
- Vision is difficult
 - Half of primate cerebral cortex is devoted to visual processing
 - Achieving human-level visual perception is probably “AI-complete”

Why is computer vision difficult?

Challenges: viewpoint variation



Michelangelo 1475-1564

slide credit: Fei-Fei, Fergus & Torralba

Challenges: illumination

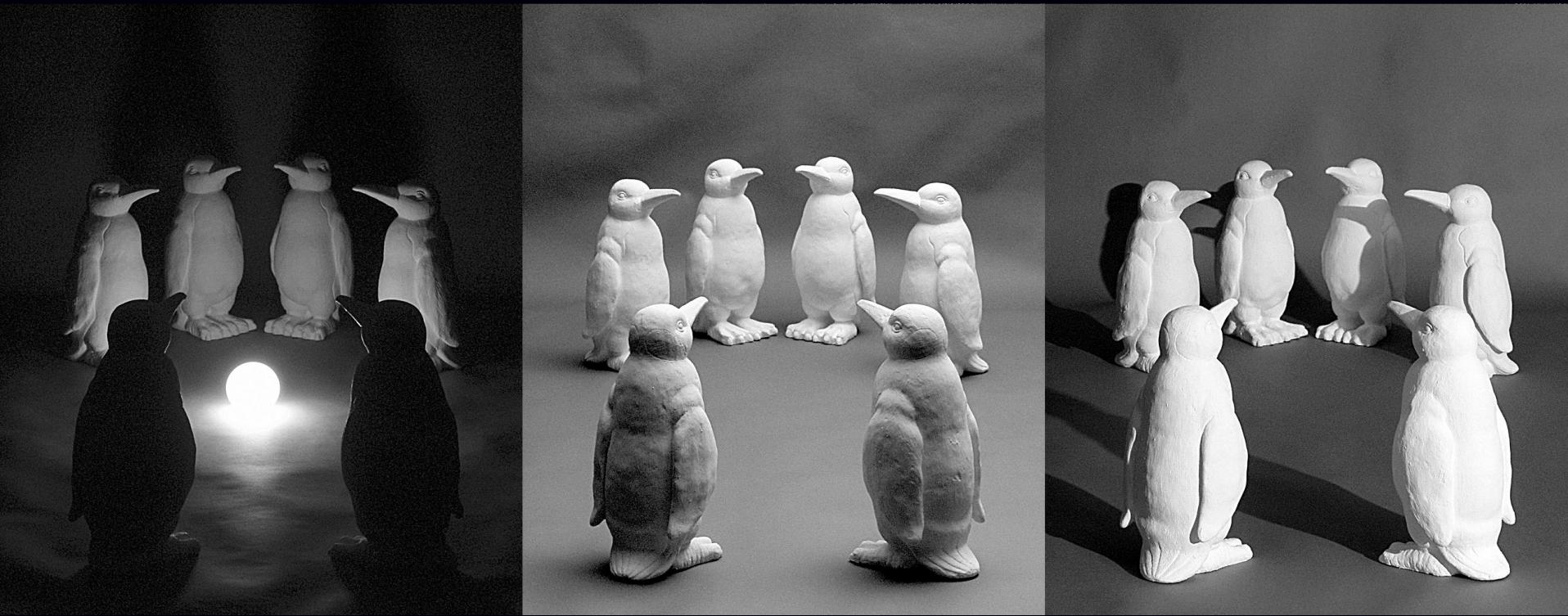


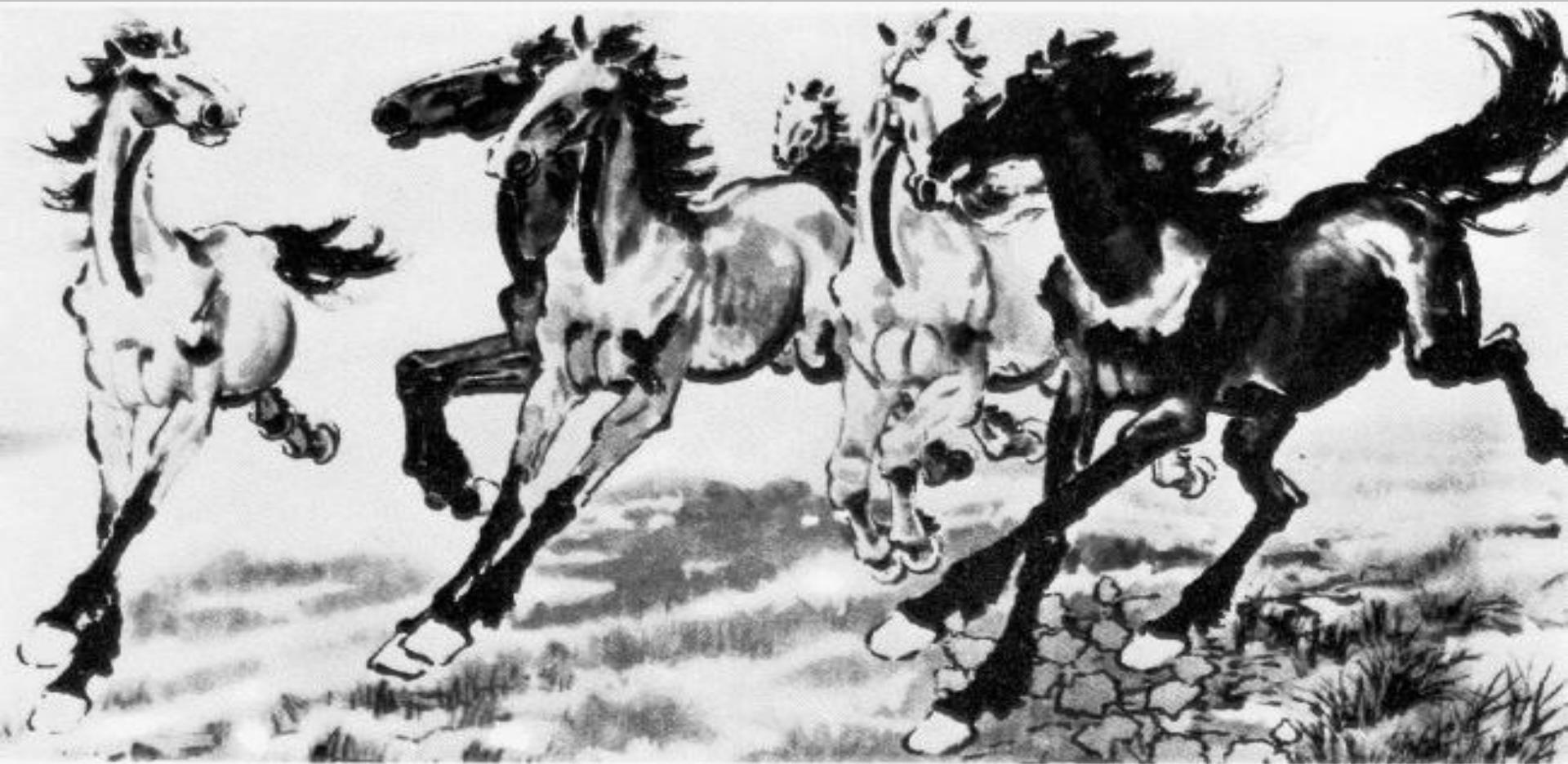
image credit: J. Koenderink

Challenges: scale



slide credit: Fei-Fei, Fergus & Torralba

Challenges: deformation



Xu, Beihong 1943

Challenges: occlusion



Magritte, 1957

slide credit: Fei-Fei, Fergus & Torralba

Challenges: background clutter



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

NATIONAL GEOGRAPHIC

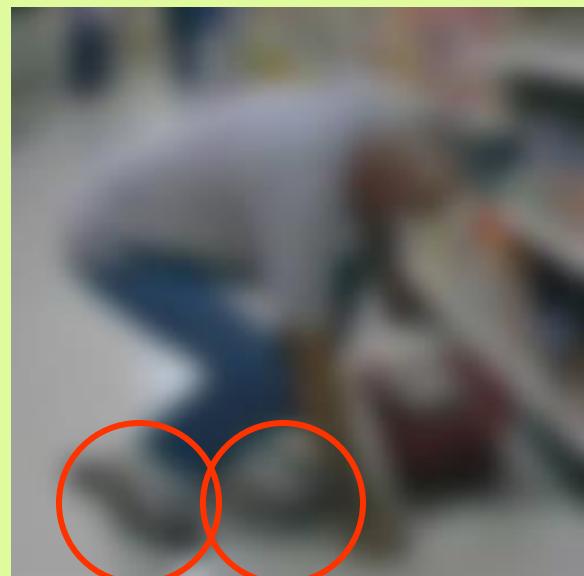
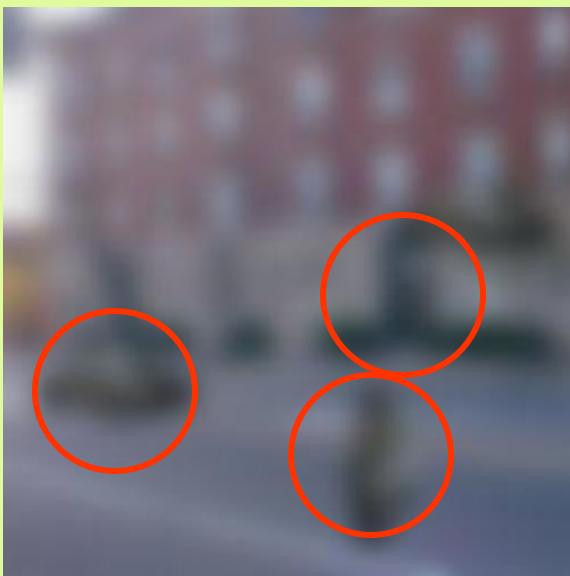
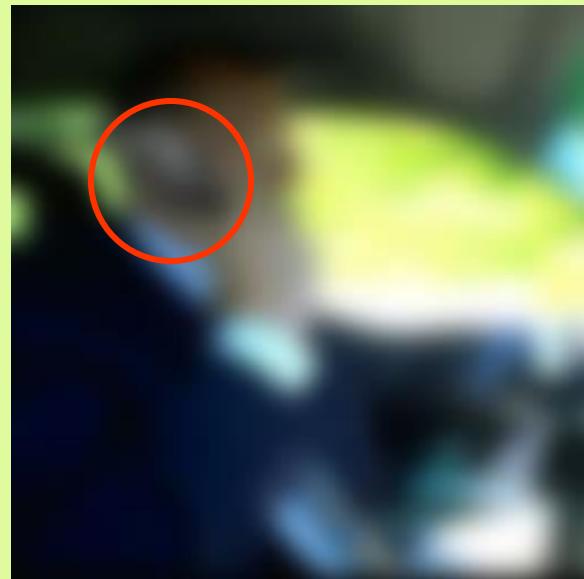
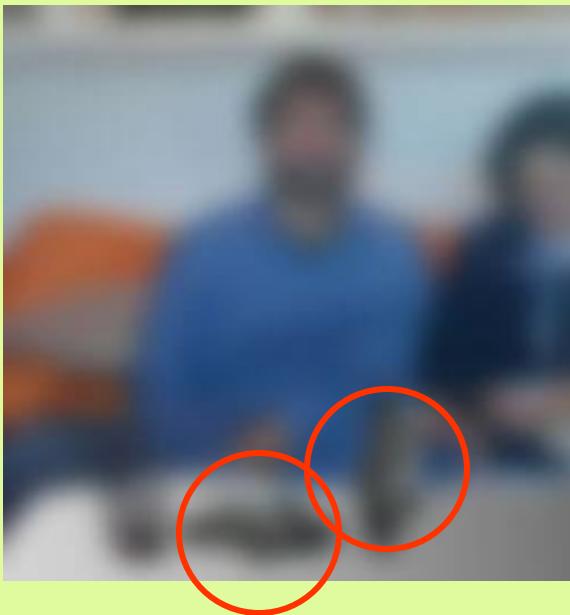
Challenges: Motion



Challenges: object intra-class variation

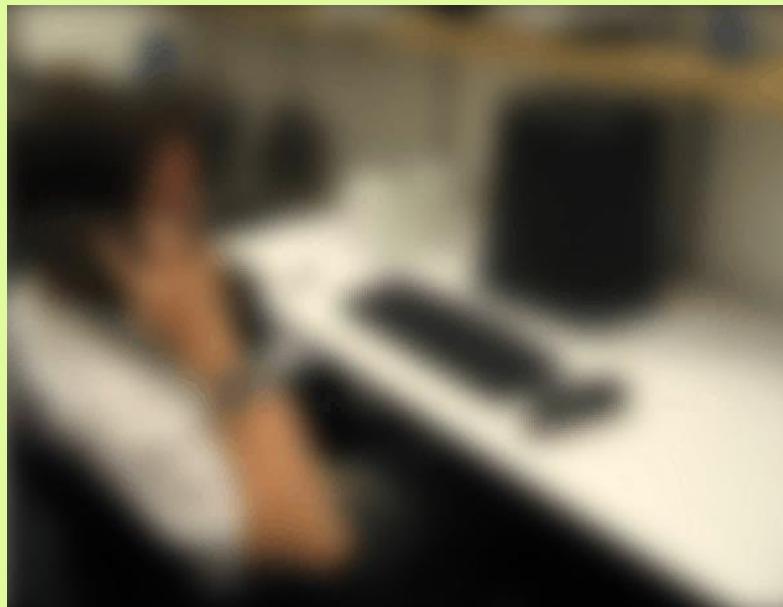


Challenges: local ambiguity



slide credit: Fei-Fei, Fergus & Torralba

Challenges: local ambiguity



Challenges: local ambiguity



Source: Rob Fergus and Antonio Torralba

Challenges or opportunities?

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



Image source: J. Koenderink

Depth cues: Linear perspective



Depth cues: Aerial perspective



Depth ordering cues: Occlusion

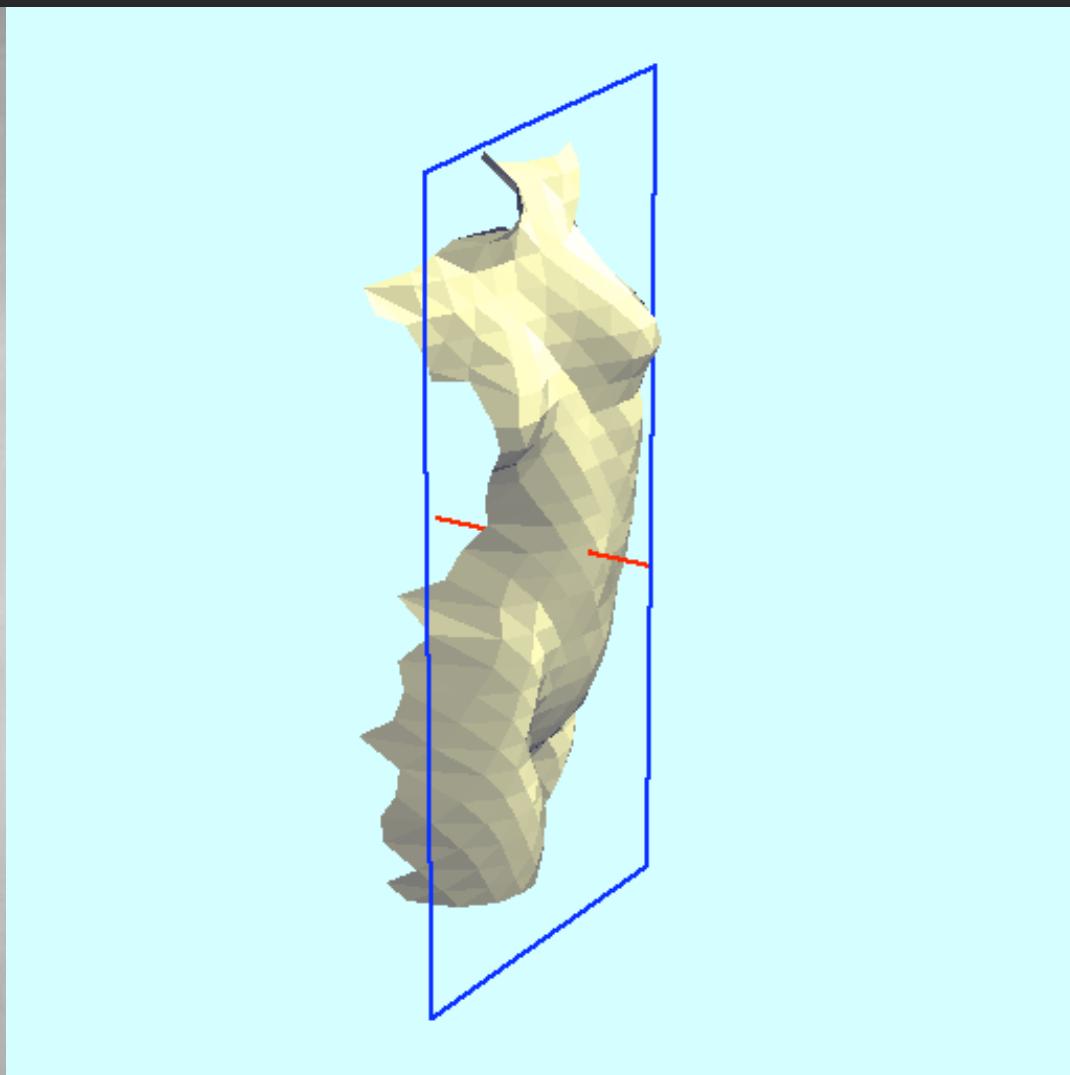


Source: J. Koenderink

Shape cues: Texture gradient



Shape and lighting cues: Shading



Position and lighting cues: Cast shadows



Source: J. Koenderink

Grouping cues: Similarity (color, texture, proximity)



Grouping cues: “Common fate”



Image credit: Arthus-Bertrand (via F. Durand)

Inherent ambiguity of the problem

- Many different 3D scenes could have given rise to a particular 2D picture



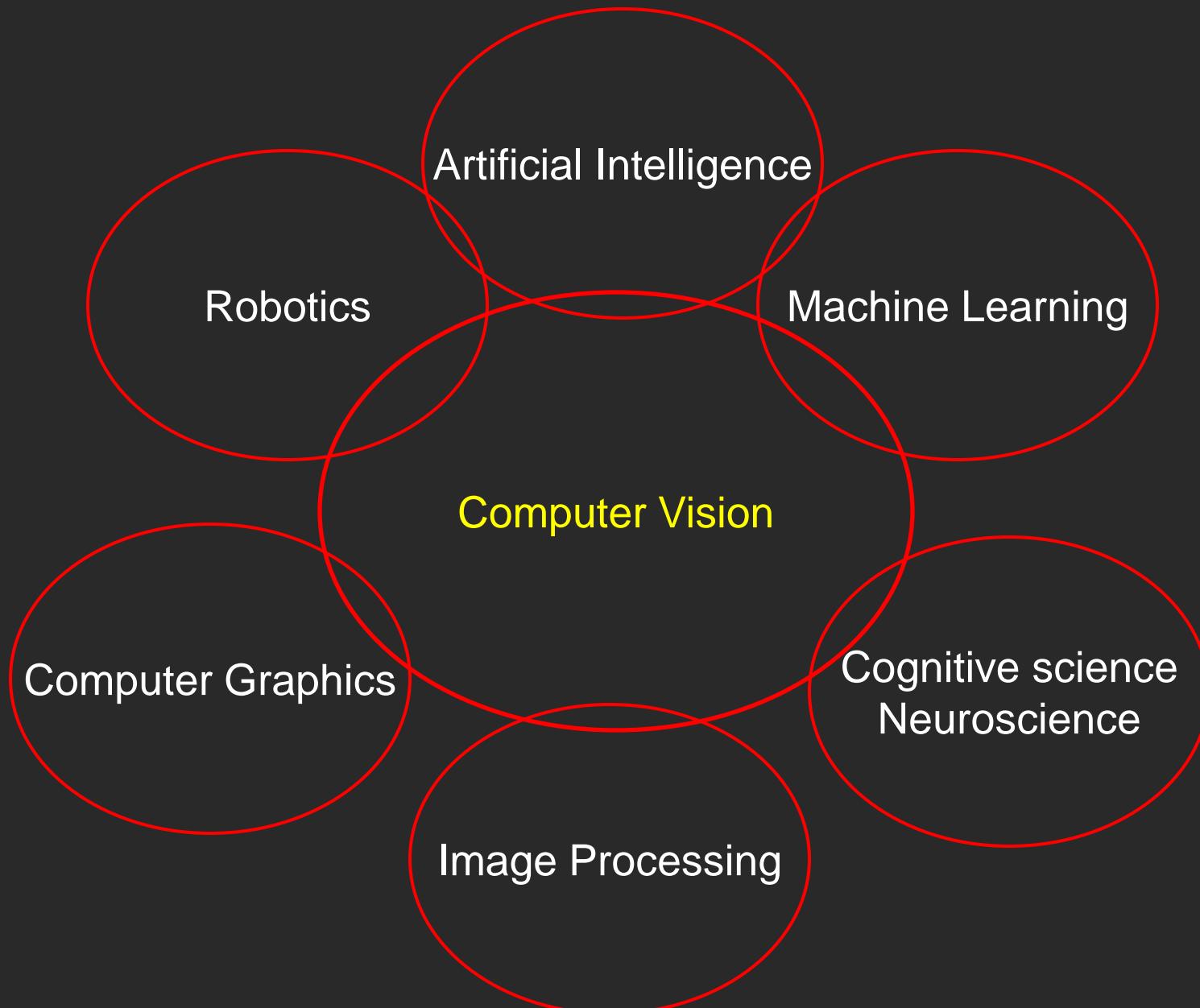
Inherent ambiguity of the problem

- Many different 3D scenes could have given rise to a particular 2D picture

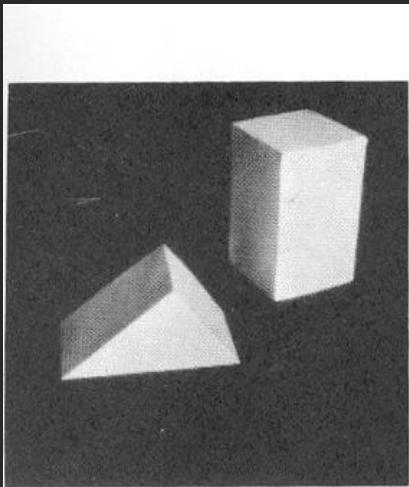


- Possible solutions
 - Bring in more constraints (more images)
 - Use prior knowledge about the structure of the world
- Need a combination of geometric and statistical methods

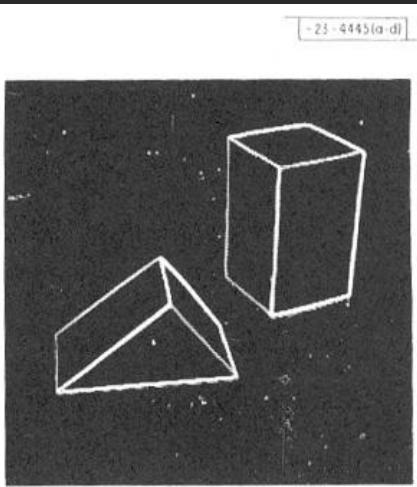
Connections to other disciplines



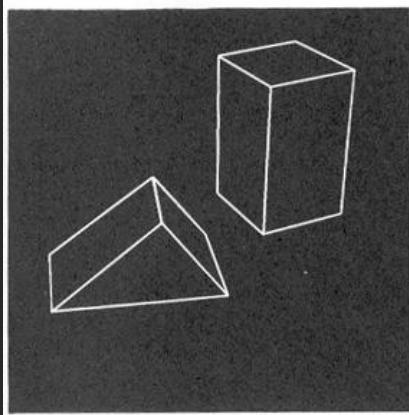
Origins of computer vision



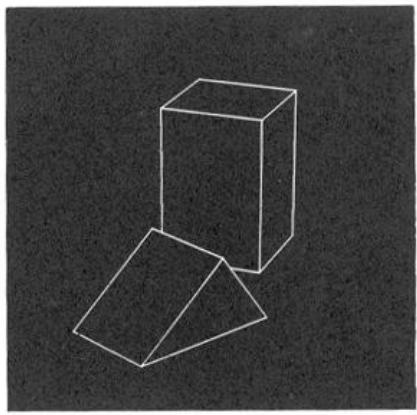
(a) Original picture.



(b) Differentiated picture.



(c) Line drawing.

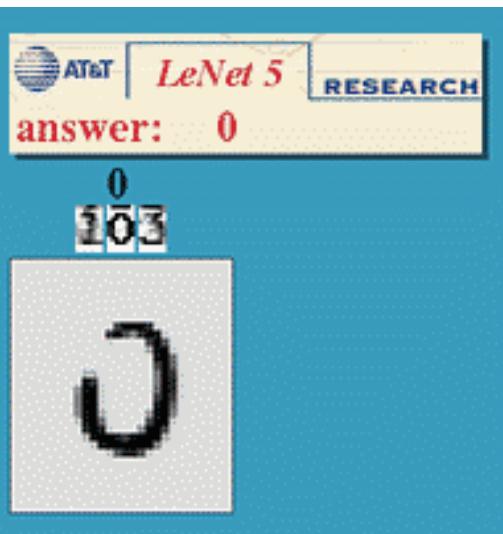
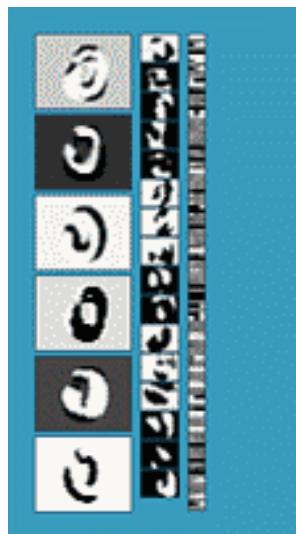


(d) Rotated view.

L. G. Roberts, *Machine Perception of Three Dimensional Solids*, Ph.D. thesis, MIT Department of Electrical Engineering, 1963.

Successes of computer vision to date

Optical character recognition (OCR)



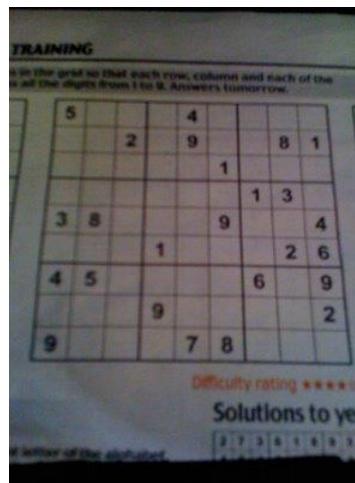
Digit recognition
yann.lecun.com



License plate readers
http://en.wikipedia.org/wiki/Automatic_number_plate_recognition



Automatic check processing



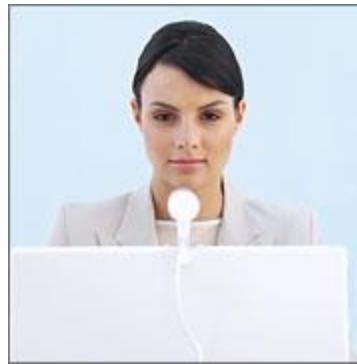
Sudoku grabber
<http://sudokugrab.blogspot.com/>

Source: S. Seitz, N. Snavely

Biometrics

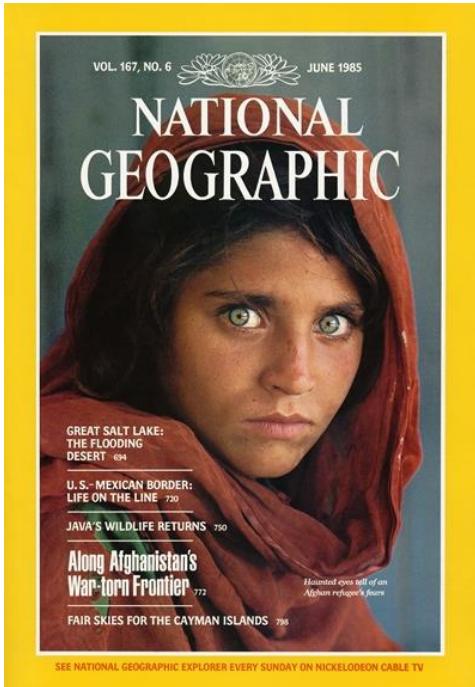


Fingerprint scanners on
many new laptops,
other devices

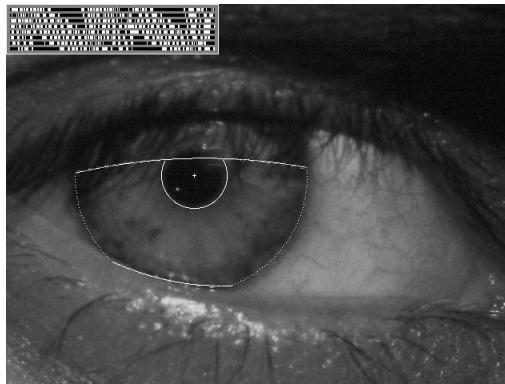
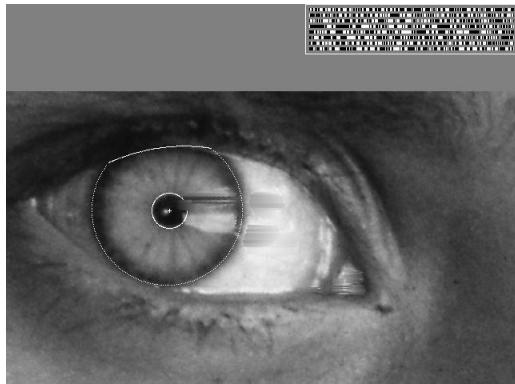


Face recognition systems now
beginning to appear more widely
<http://www.sensiblevision.com/>

Biometrics



How the Afghan Girl was Identified by Her Iris Patterns



Source: S. Seitz

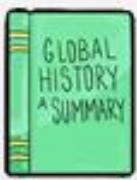
Mobile visual search: Google Goggles

Google Goggles in Action

Click the icons below to see the different ways Google Goggles can be used.



Landmark



Book



Contact Info.



Artwork



Places



Wine



Logo

A smartphone screen showing search results for "Terrazas de los Andes".

Google goggles labs

Wine
Bodegas Terrazas De Los Andes Malbec Reserva 2004

wine.library...

Web Results

Terrazas de los Andes
2009, 2008, 2007, 2006, 2005, 2004, 2003, 2002, 2001, 2000, 1999, 1998, 1997, 1996, 1995, 1994, 1993, 1992, 1991, 1990, 1989, 1988, 1987, 1986, 1985, 1984 ...
<http://www.terrazasdelosandes.com/>

Bodegas Terrazas de los Andes Winery
(Perdriel, Luján de Cuyo , AR ...)
Popular wines by **Bodegas Terrazas de los Andes**.

Object recognition (in mobile phones)



This is becoming real:

- **Lincoln** Microsoft Research
- Point & Find, Nokia

Face detection



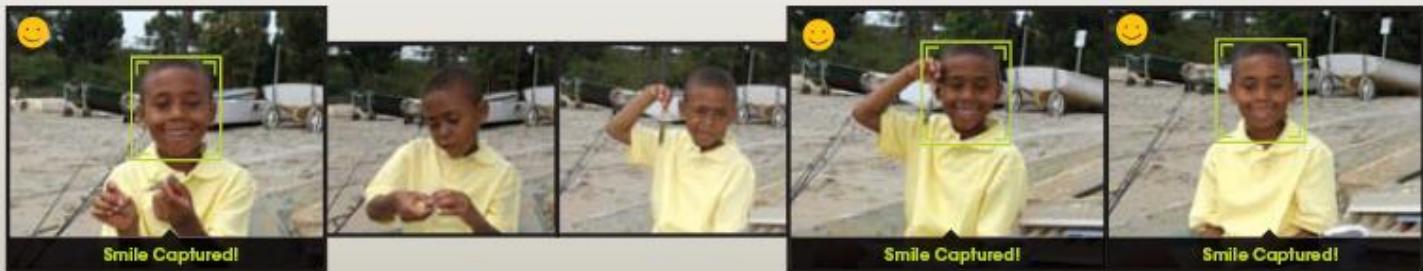
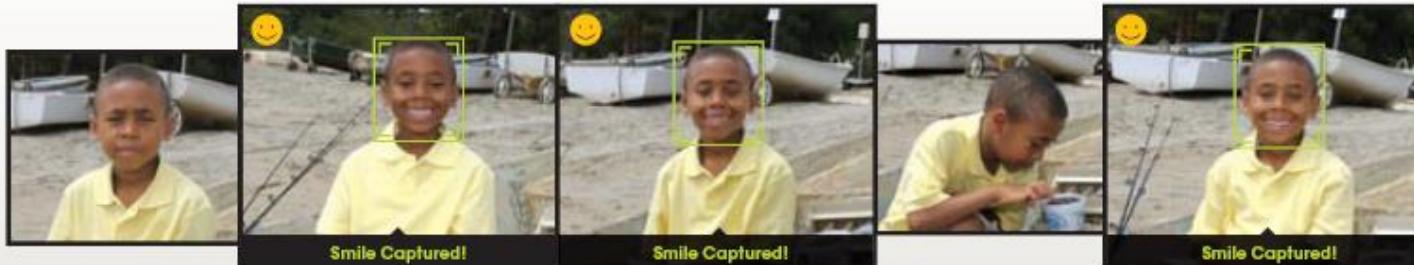
Many new digital cameras now detect faces

- Canon, Sony, Fuji, ...

Smile detection

The Smile Shutter flow

Imagine a camera smart enough to catch every smile! In Smile Shutter Mode, your Cyber-shot® camera can automatically trip the shutter at just the right instant to catch the perfect expression.



[Sony Cyber-shot® T70 Digital Still Camera](#)

Source: S. Seitz

Face recognition: Apple iPhoto software



<http://www.apple.com/ilife/iphoto/>

Object recognition (in supermarkets)



LaneHawk by EvolutionRobotics

“A smart camera is flush-mounted in the checkout lane, continuously watching for items. When an item is detected and recognized, the cashier verifies the quantity of items that were found under the basket, and continues to close the transaction. The item can remain under the basket, and with LaneHawk, you are assured to get paid for it... “

Sports



Sportvision first down line

Nice [explanation](#) on www.howstuffworks.com

Automotive safety

►► manufacturer products consumer products ◀◀

Our Vision. Your Safety.

rear looking camera forward looking camera side looking camera

EyeQ Vision on a Chip

Road, Vehicle, Pedestrian Protection and more

Vision Applications

AWS Advance Warning System

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

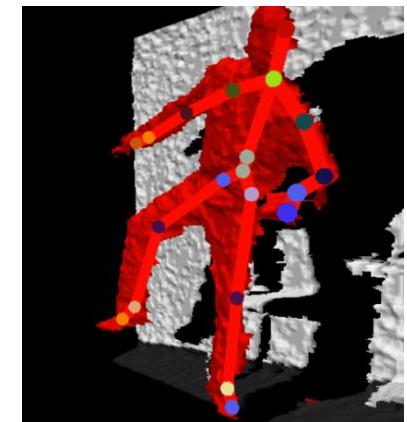
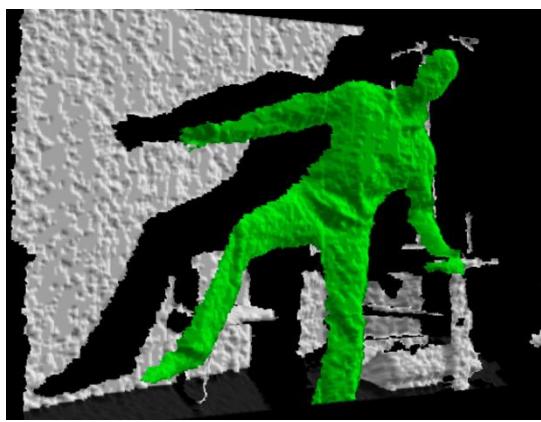
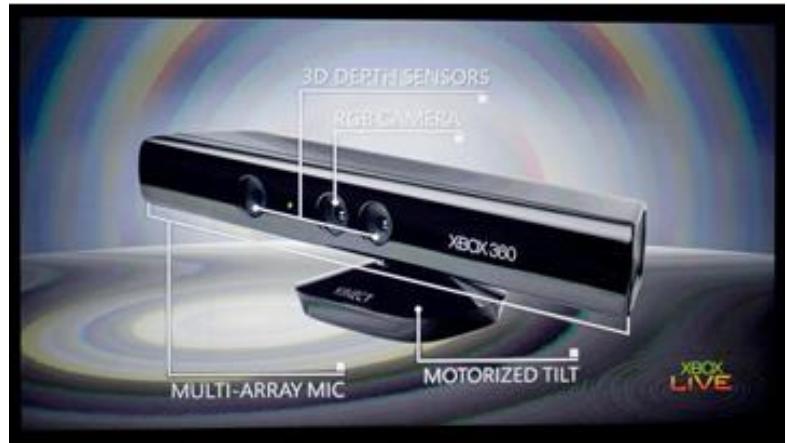
read more

Mobileye: Vision systems in high-end BMW, GM, Volvo models

- Pedestrian collision warning
- Forward collision warning
- Lane departure warning
- Headway monitoring and warning

Source: A. Shashua, S. Seitz

Vision-based interaction: Xbox Kinect



<http://blogs.howstuffworks.com/2010/11/05/how-microsoft-kinect-works-an-amazing-use-of-infrared-light/>

<http://electronics.howstuffworks.com/microsoft-kinect.htm>

<http://www.xbox.com/en-US/Live/EngineeringBlog/122910-HowYouBecometheController>

<http://www.ismashphone.com/2010/12/kinect-hacks-more-interesting-than-the-devices-original-intention.html>

Special effects: shape and motion capture



Source: S. Seitz

Earth viewers (3D modeling)

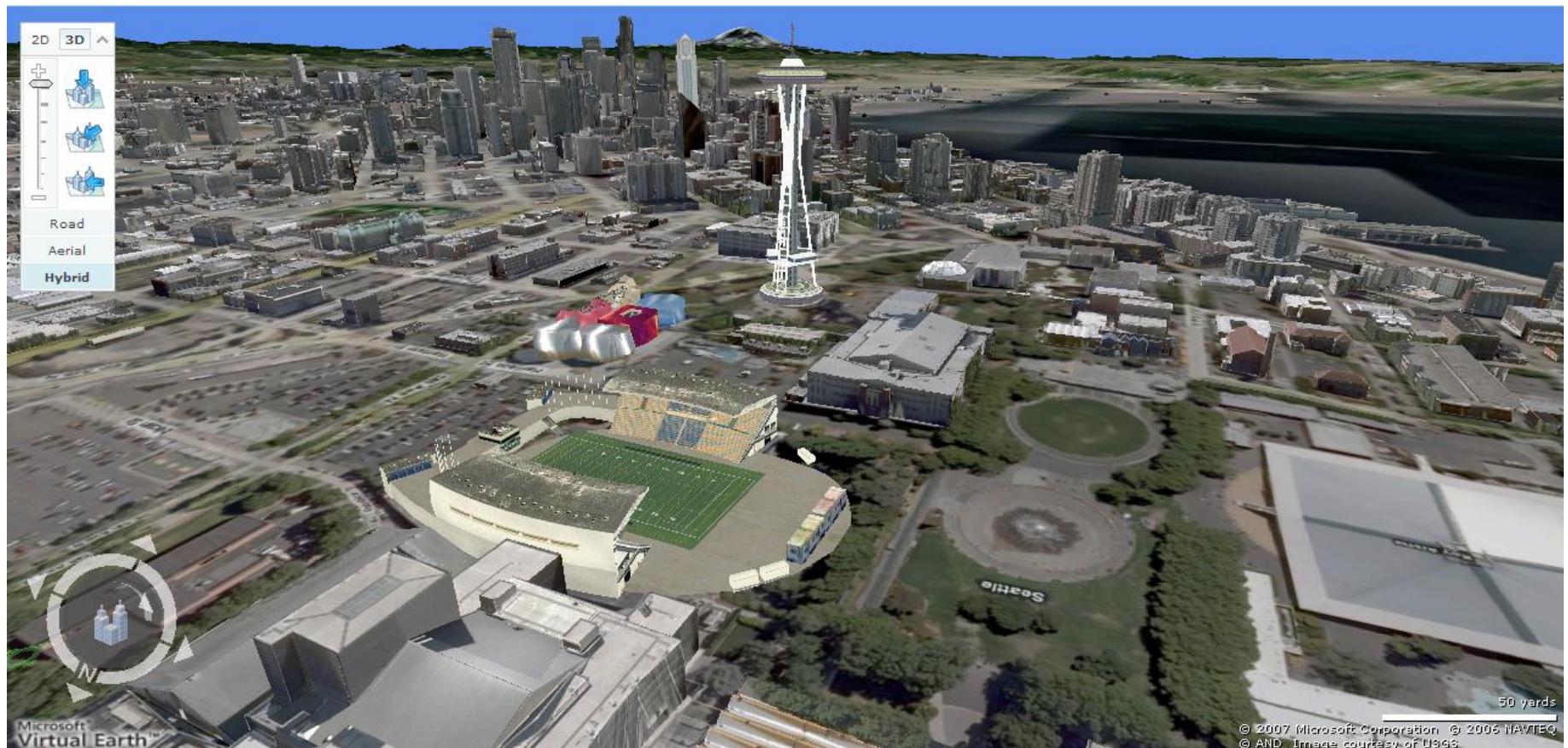
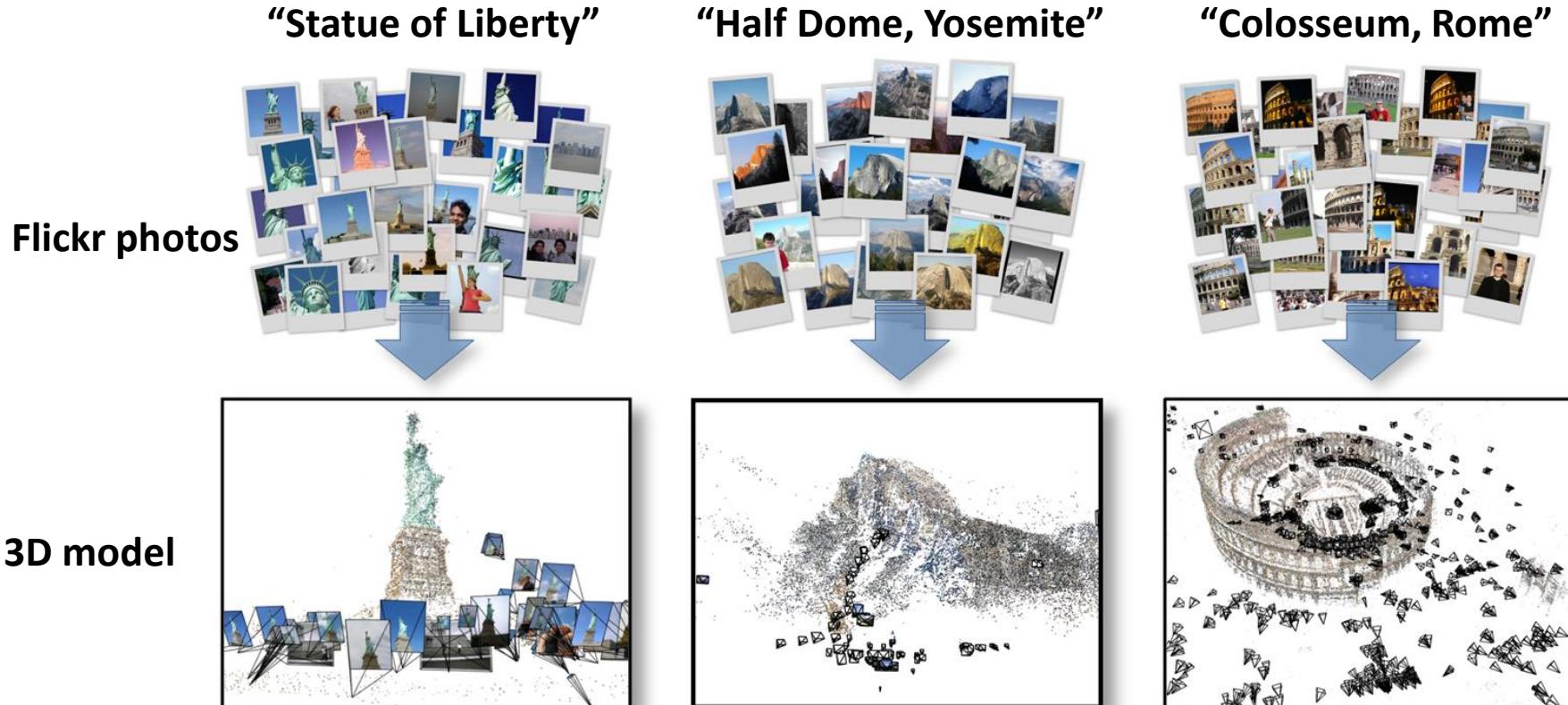


Image from Microsoft's [Virtual Earth](#)
(see also: [Google Earth](#))

Source: Steve Seitz and Neel Joshi

Phototourism

Automatic 3D reconstruction from Internet photo collections



Source: Neel Joshi

3D visualization: Microsoft Photosynth



<http://photosynth.net>

Source: S. Seitz

Vision for robotics, space exploration

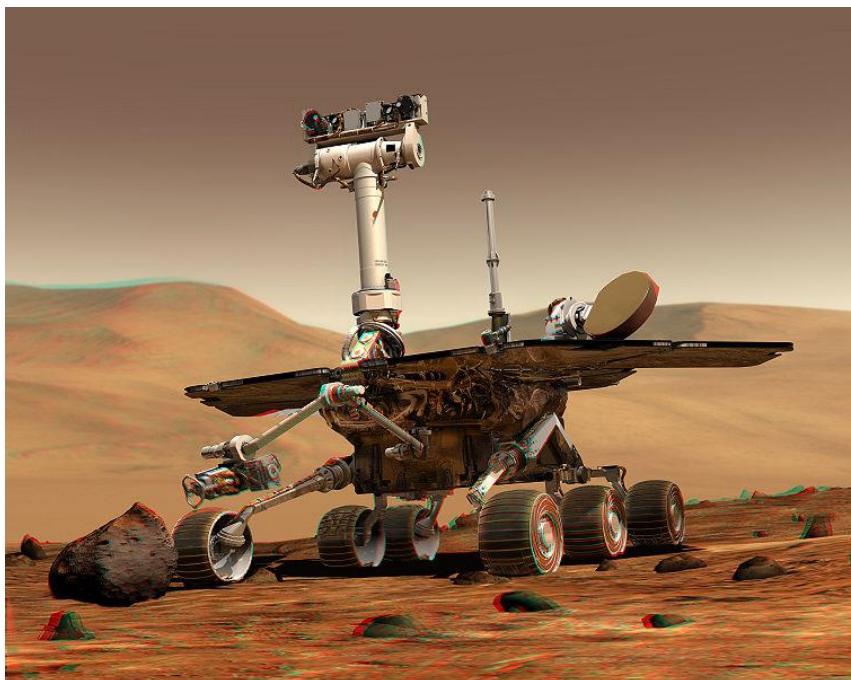


[NASA'S Mars Exploration Rover Spirit](#) captured this westward view from atop a low plateau where Spirit spent the closing months of 2007.

Vision systems (JPL) used for several tasks

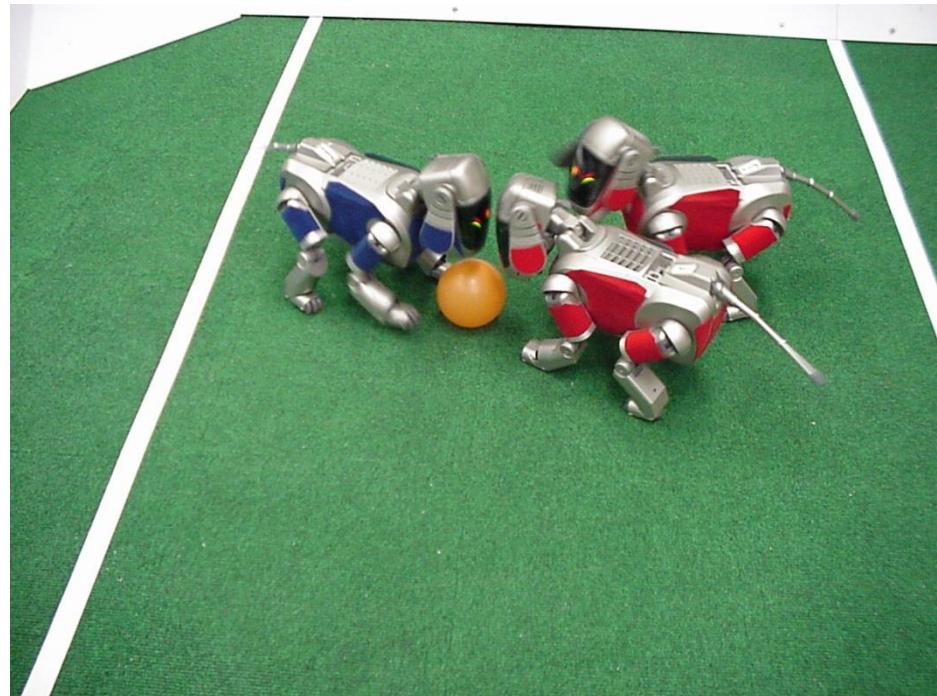
- Panorama stitching
- 3D terrain modeling
- Obstacle detection, position tracking
- For more, read "[Computer Vision on Mars](#)" by Matthies et al.

Robotics



NASA's Mars Spirit Rover

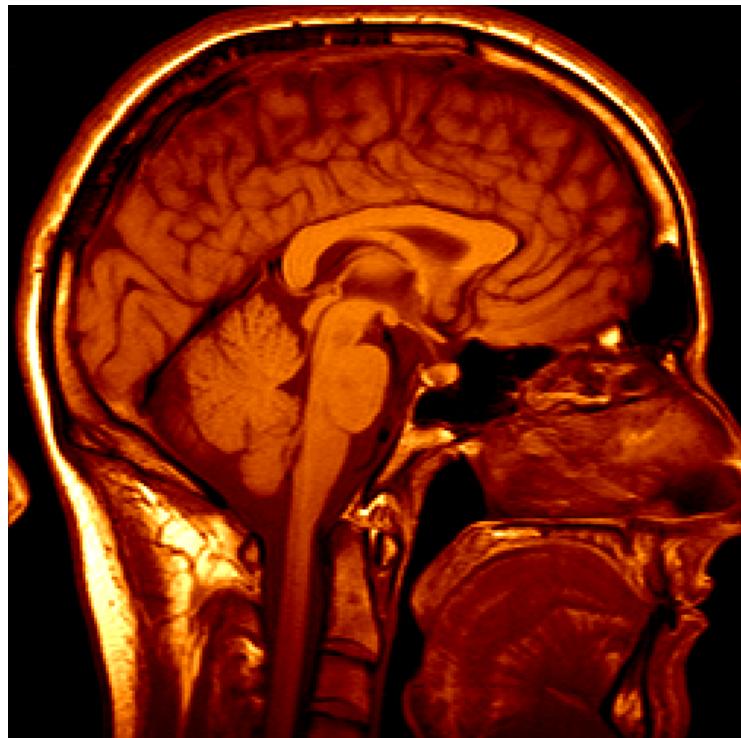
http://en.wikipedia.org/wiki/Spirit_rover



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

Source: Steve Seitz and Neel Joshi

Medical imaging



3D imaging
MRI, CT



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

The computer vision industry

- A list of companies here:

<http://www.cs.ubc.ca/spider/lowe/vision.html>

Next Class

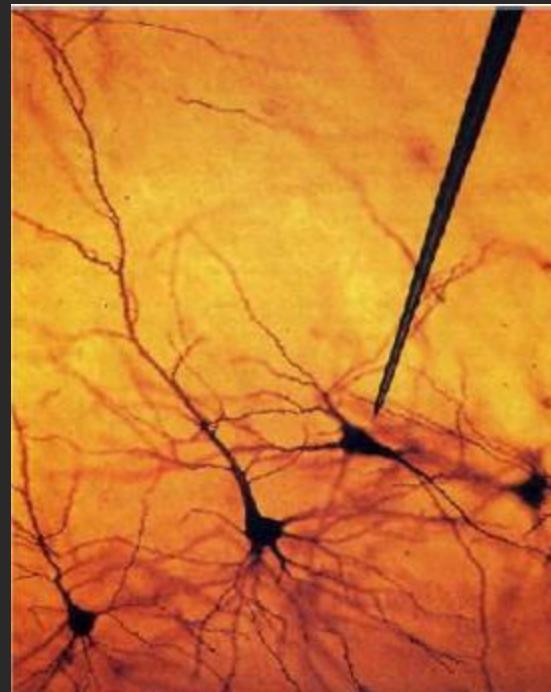
Animal Eyes

Perception

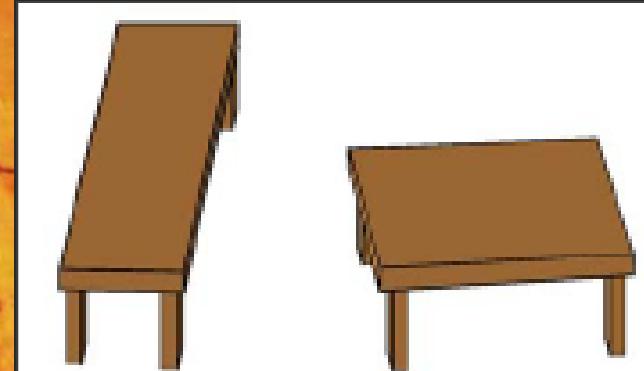
Illusions



Compound eye and its evolutionary advantages?



1981 Nobel Prize in Medicine
Hubel and Wiesel



Compare the length and breadth of these two tables. Why did I ask this question?