

# Introduction

Introduction to Computer Vision  
CSE 152  
Lecture 1

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Intro Computer Vision

- We'll start with some introductory material
- .... And end with
  - Syllabus
  - Organizational materials
  - Prerequisites

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## What is computer vision?



Add camera as input device to computer.

Done?

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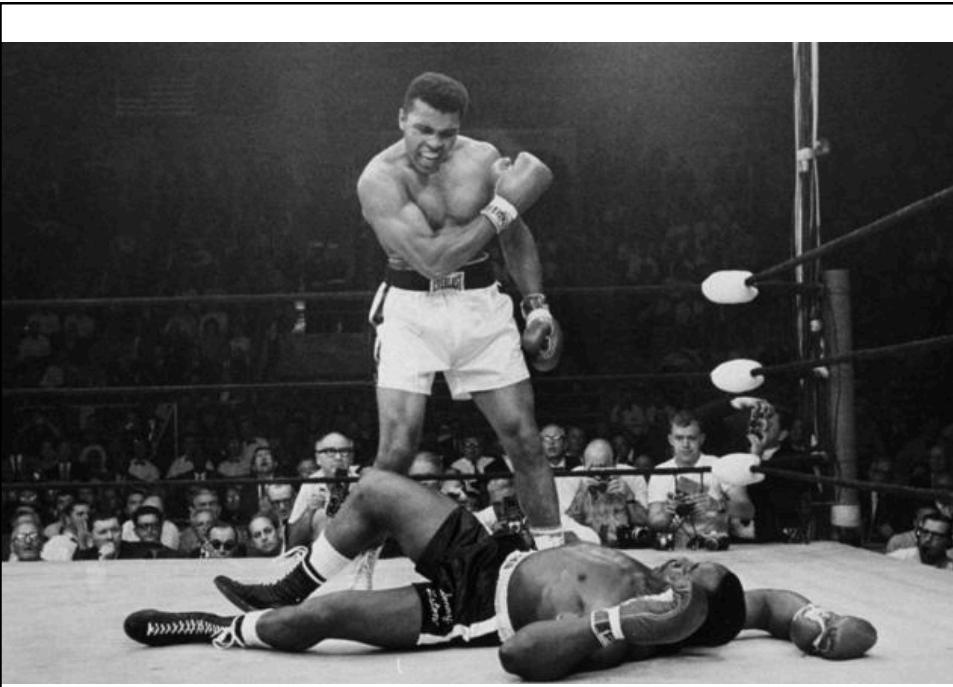
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## What is Computer Vision?

- Szeliski (Text): “In computer vision, we are trying to...describe the world that we see in one or more images and to reconstruct its properties.”
- Trucco and Verri (secondary text): Computing properties of the 3-D world from one or more digital images
- Sockman and Shapiro: To make useful decisions about real physical objects and scenes based on sensed images
- Ballard and Brown: The construction of explicit, meaningful description of physical objects from images.
- Forsyth and Ponce: Extracting descriptions of the world from pictures or sequences of pictures”

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## Why is this hard?



What is in this image?

1. A hand holding a man?
2. A hand holding a mirrored sphere?
3. An Escher drawing?
4. A 1935 self portrait of Escher

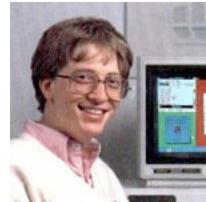
- Interpretations are ambiguous
- The forward problem (graphics) is well-posed
- The “inverse problem” (vision) is not

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## The challenge has been underestimated: We all make mistakes.

- “In 1966, Minsky hired a first-year undergraduate student and assigned him a problem to solve over the summer: connect a television camera to a computer and get the machine to describe what it sees.”  
– Crevier 1993, pg. 88
- “640K ought to be enough for anybody.”  
– Bill Gates, 1981



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MASSACHUSETTS INSTITUTE OF TECHNOLOGY  
PROJECT MAC

Artificial Intelligence Group    July 7, 1966  
Vision Memo. No. 100.

THE SUMMER VISION PROJECT  
Seymour Papert

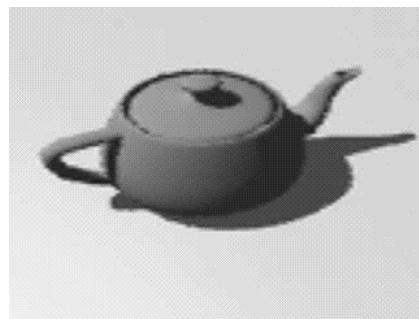
The summer vision project is an attempt to use our summer workers effectively in the construction of a significant part of a visual system. The particular task was chosen partly because it can be segmented into sub-problems which will allow individuals to work independently and yet participate in the construction of a system complex enough to be a real landmark in the development of "pattern recognition".

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## What do you see?

- Changing viewpoint
- Moving light source
- Deforming shape

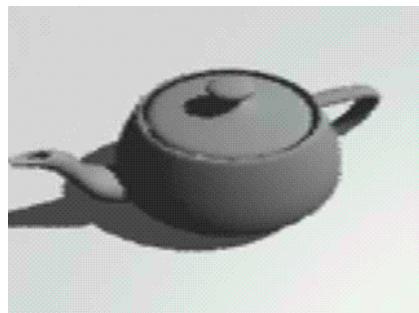


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## What was happening

- Changing viewpoint
- Moving light source
- Deforming shape



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## Should computer vision follow from our understanding of human vision?

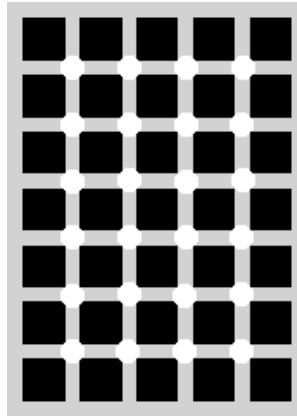
### Yes & No

- 1. Who would ever be crazy enough to even try creating machine vision?
  - 2. Human vision “works”, and copying is easier than creating.
  - 3. Secondary benefit – in trying to mimic human vision, we learn about it.
- 
- 1. Why limit oneself to human vision when there is even greater diversity in biological vision
  - 2. Why limit oneself to biological when there may be greater diversity in sensing mechanism?
  - 3. Biological vision systems evolved to provide functions for “specific” tasks and “specific” environments. These may differ for machine systems
  - 4. Implementation – hardware is different, and synthetic vision systems may use different techniques/methodologies that are more appropriate to computational mechanisms

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## Hermann Grid



Scan your eyes over the figure. Do you see the gray spots at the intersections? Stare at one of them and it will disappear.

Why does this happen? Is it useful? Eye does not seem be acting like a camera and faithfully capturing scene?

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How many red X's are there?

Raise your hand when you know.

X	X	X	X	X	X	X	X
X	X	X	X	X	X	X	X
X	X	X	X	X	X	X	X
X	X	X	X	X	X	X	X
X	X	X	X	X	X	X	X
X	X	X	X	X	X	X	X
X	X	X	X	X	X	X	X
X	X	X	X	X	X	X	X
X	X	X	X	X	X	X	X
X	X	X	X	X	X	X	X

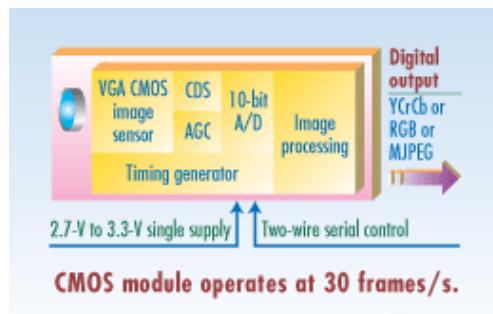
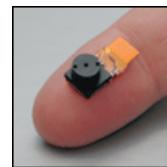
How many red X's are there?

Raise your hand when you know.

O	X	O	X	O	X	X
X	O	X	X	X	O	X
O	X	X	O	X	X	O
X	X	O	X	O	O	X
O	X	X	O	X	X	X
X	O	X	X	X	O	X
O	X	X	O	X	X	O
X	O	X	X	X	O	X
X	X	X	O	O	X	X
X	O	X	X	X	O	X

# Ubiquitous Vision

- Digital video has become really cheap.
- It's widely embedded in cell phones, cars, games, etc.
- 99.9% of digitized video isn't seen by a person.
- That doesn't mean that only 0.1% is important!
- And there's an enormous amount of image and video content on the internet...



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## Applications: touching your life

- Optical Character Recognition
- Football
- Movies
- Surveillance
- HCI – hand gestures
- Aids to the blind
- Face recognition & biometrics
- Road monitoring
- Industrial inspection
- Virtual Earth; street view
- Robotic control
- Autonomous driving
- Space: planetary exploration, docking
- Medicine – pathology, surgery, diagnosis
- Microscopy
- Military
- Remote Sensing
- Digital photography
- Google Goggles
- Video games

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## Vision to explore the world



Image from Microsoft Virtual Earth  
(see also: Google Earth)

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## Vision to explore other worlds



Image from NASA's Mars Exploration Rover Spirit

- Panorama stitching
- 3D terrain modeling
- Obstacle detection,
- Position tracking
- For more, read “Computer Vision on Mars” by Matthies et al.

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# Vision to look at people



- Digital cameras, smart phones, Facebook, Google Photos, Snapchat etc.

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## 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.

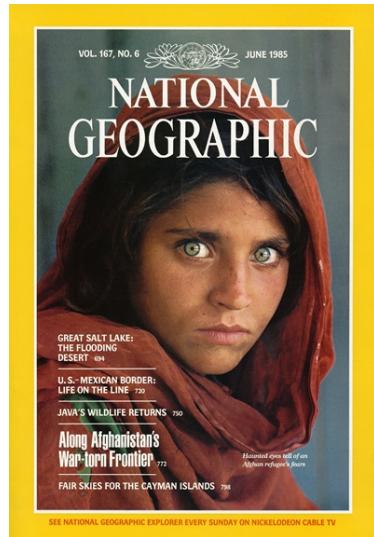


[Sony Cyber-shot® T70 Digital Still Camera](#)

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## Face recognition



Who is she?

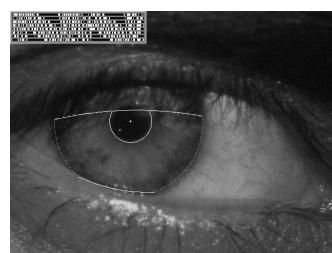
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## Vision-based biometrics



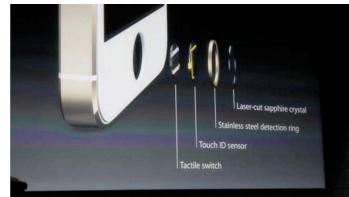
*"How the Afghan Girl was Identified by Her Iris Patterns"* Read the [story](#)



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## Login without a password...



Fingerprint scanners on  
laptops,  
mice, other devices



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## Vision to look at stuff: Object recognition

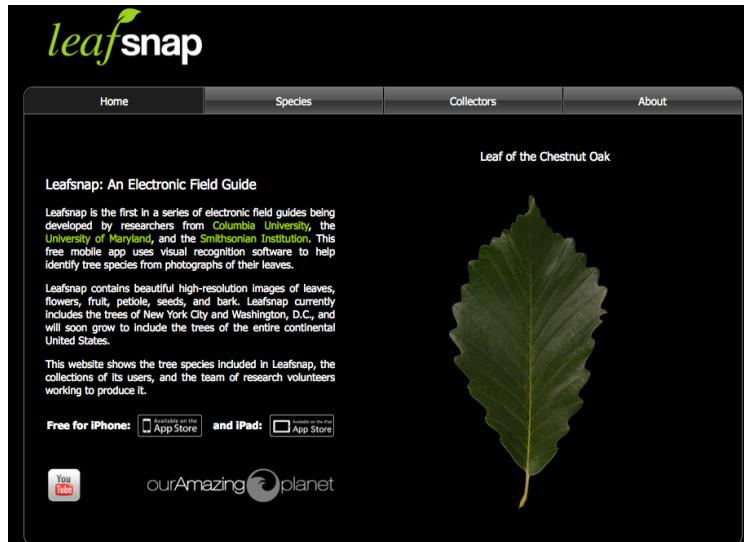


- Point & Find, Nokia
- SnapTell.com (now Amazon)
- Mobile Acuity
- Google Photos
- Apple Photos

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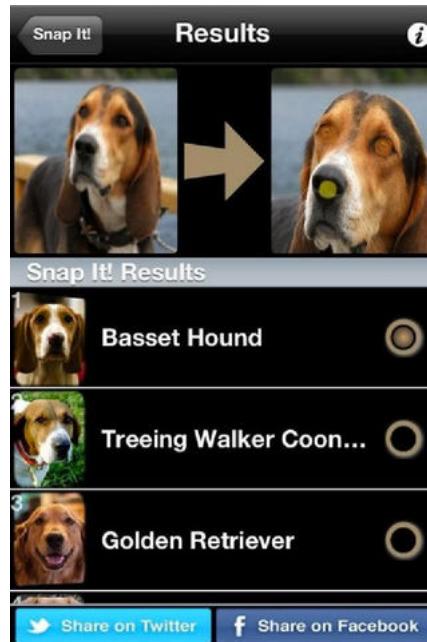
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**Visual Field Guides:**  
**Leafsnap.com -> Dogsnap -> Birdsnap**  
**-> Merlin, iNaturalist, etc**



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**birdsnap**

USA Eastern Western Backyard Local  
Birds of the United States

Bird Wheel Bird List Bird Lab About

Sort by Tree Life Alphabetical Visual Recognition Text Search

Order: Falconiformes Family: Falconidae Subfamily: Caracinae Genus: Caracara Species: *C. cherway*

by Andrew Spencer

Some recordings include other species

View original image

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## 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...”

## Amazon Go



1. Turn-style entry. Consumer scans in with Amazon App on smartphone
2. Consumer goes around the store, picks up items, adds to bag, shops like normal
3. Consumer exits



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## Vision to create special effects: shape capture



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

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## Vision to create special effects: motion capture



Facial  
Motion  
capture

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## Vision for Entertainment



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

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## Vision for augmented reality

- AR Toolkit
- Blippar
- Magic Leap
- Microsoft HoloLens

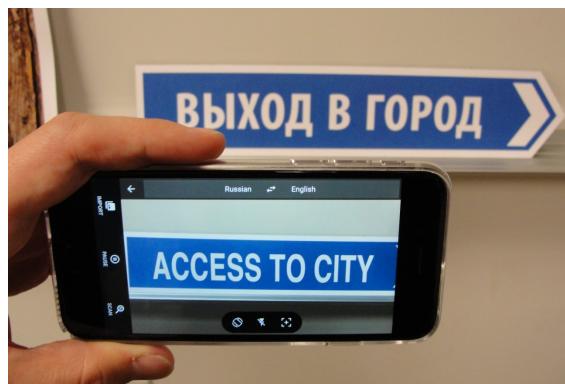


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## Augmented reality

- Text detection, localization, and translation, then render with similar font



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# Augmented reality

- Pokémon Go



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# Vision for smart cars

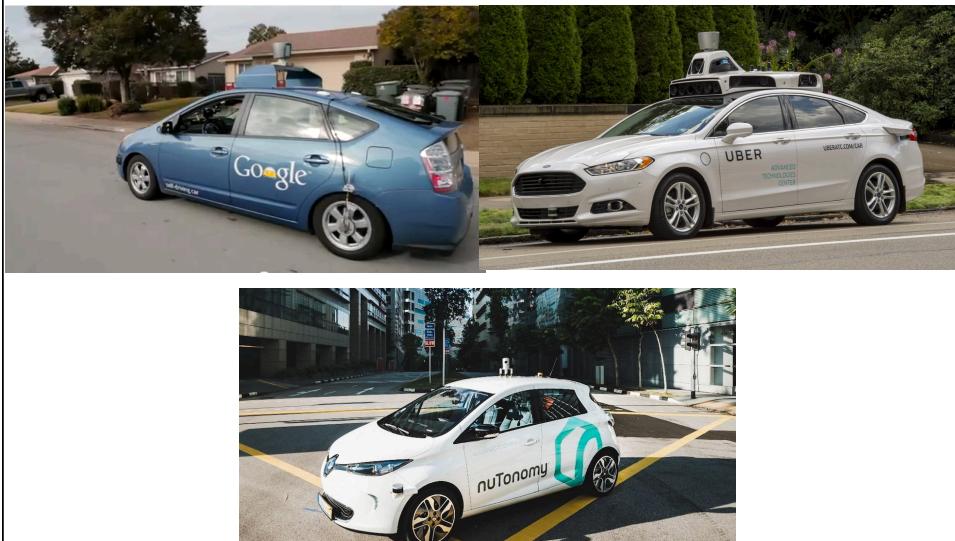
The website features a top banner with "Our Vision. Your Safety." and sections for "manufacturer products" and "consumer products". It highlights "EyeQ Vision on a Chip", "Vision Applications" (Road, Vehicle, Pedestrian Protection), and "AWS Advance Warning System". A news sidebar shows "Mobileye Advanced Technologies Power Volvo Cars World First Collision Warning with Auto Brake System" and "Mobileye New Collision Warning with Auto Brake Helps Prevent Rear-end". An events sidebar lists "Mobileye at Equip Auto, Paris, France" and "Mobileye at SEMA, Las Vegas, USA". A bottom image shows a car's forward-looking camera view with a pedestrian detection overlay.

- Mobileye
  - Vision systems currently in high-end BMWs

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Slide content courtesy of Amnon Shashua

## Autonomous Cars



<http://www.youtube.com/watch?v=cdgQpa1pUUE>

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## Vision-based interaction (and games)



Nintendo Wii has  
camera-based IR  
tracking built in.



Digimask: put your face on a 3D avatar.



CSE152, Winter 2019 Playmotion game a Disney Epcot



Xbox  
Kinect

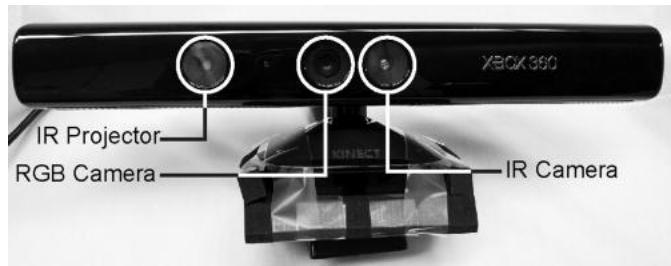
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# Vision for Robotics



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## 3D sensors



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## Vision from your perspective: First person vision



Google Glass

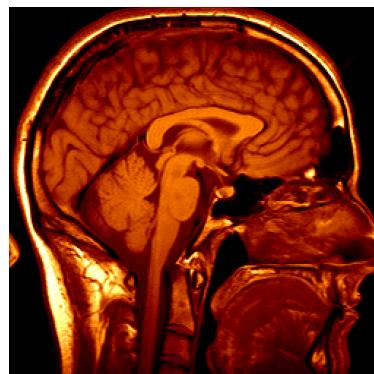


Oracam

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## Vision for medicine



3D imaging  
MRI, CT



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

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Vision for Science

Molecular Reconstruction from  
Cryo-electron Microscope Images

CSE152, Winter 2019      [ Malick, Zhu, Kriegman ]

Coralnet.ucsd.edu

CORALNET BETA  
A WEB SOLUTION FOR CORAL REEF ANALYSIS

Upload coral reef images, organize and annotate images, and view annotation statistics.

Sign In   Register   What is CoralNet?

Map Satellite

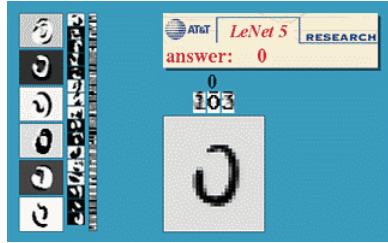
Google Imagery ©2017 NASA, TerraMetrics | Terms of Use

Visit data sources from around the world by clicking on public sources to explore images, labels, and coverage statistics.

There are currently 588 sources on CoralNet, with a combined total of 501481 images and 17475449 point annotations.

Computer Vision

## Vision to bridge communication between physical and digital worlds: Optical Character Recognition (OCR)



Digit recognition, AT&T labs  
<http://www.research.att.com/~yann/>

Or more recent, see blog post about  
[Dropbox OCR](#)

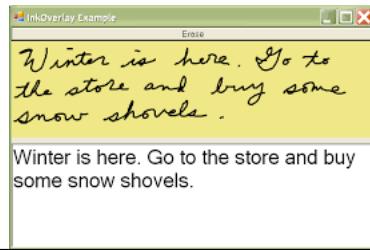
Handwriting recognition

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4YCH428  
4YCH428

License plate readers

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



Vision

## Scene Text: Text Recognition in the Wild



COCO-Text  
A large-Scale Scene Text Dataset  
<https://bgshih.github.io/cocotext/>

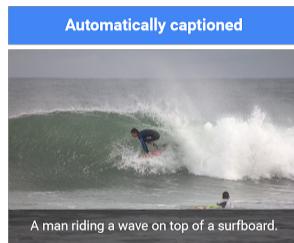
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# Automatic image captioning

- Deep learning



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# Automatic image captioning

- Deep learning

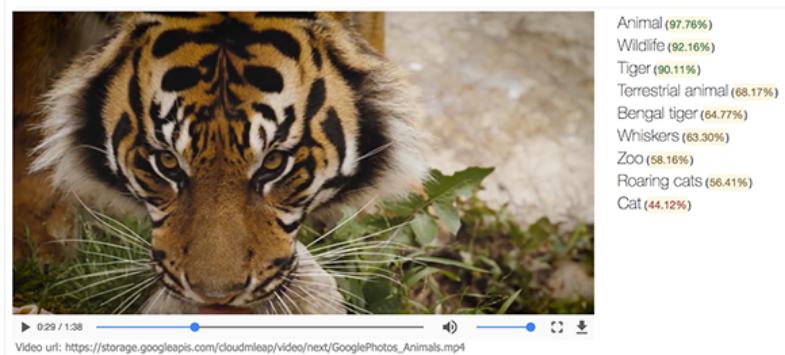


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# Video understanding

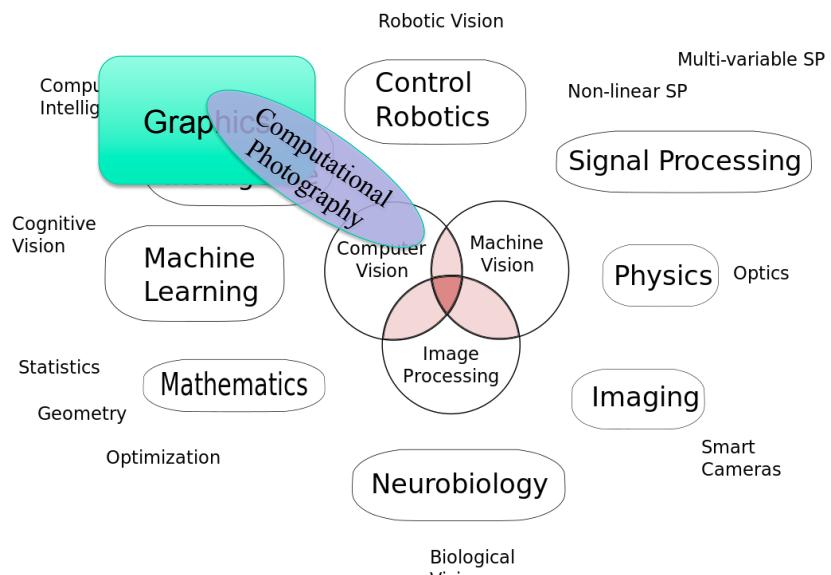
- Deep learning



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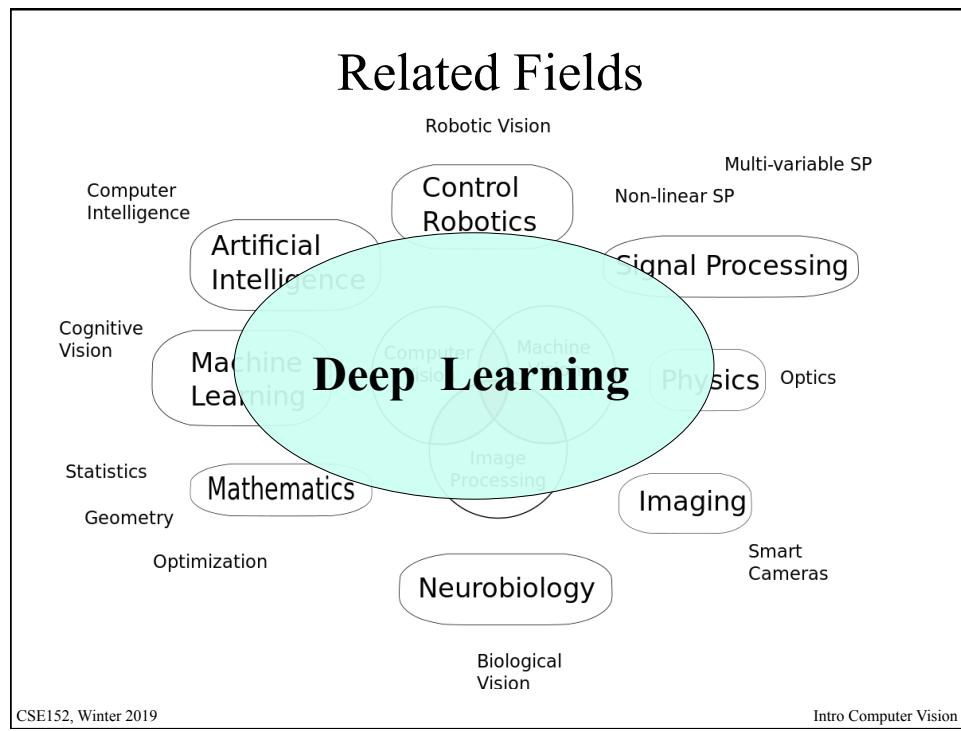
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## Related Fields



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- ## Four Rs of computer vision
- Reprojection
    - Rendering a scene and features from a different view, under different illumination, under different surface properties, etc.
  - Reconstruction
    - Multiple view geometry, structure from motion, shape from X (where X is texture, shading, contour, etc.), etc.
  - Registration
    - Tracking, alignment, optical flow, correspondence, etc.
  - Recognition
    - Recognizing objects, scenes, events, etc.
- CSE152, Winter 2019      Others may have slightly different Rs      Intro Computer Vision

## Rudiments: The implied fifth R

- image filtering
- interest point detection
- edge detection
- probability
- statistics
- linear algebra
- projective geometry
- optics
- Fourier analysis
- sampling
- algorithms
- photometry
- physics of color
- human vision
- psychophysics
- performance evaluation

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From Serge Belongie

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## How are images understood? Visual cues

- Variation in appearance in multiple views
  - stereo
  - motion
- Shading & highlights
- Shadows
- Contours
- Texture
- Blur
- Geometric constraints
- Prior knowledge

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## How do we solve computer vision problems?

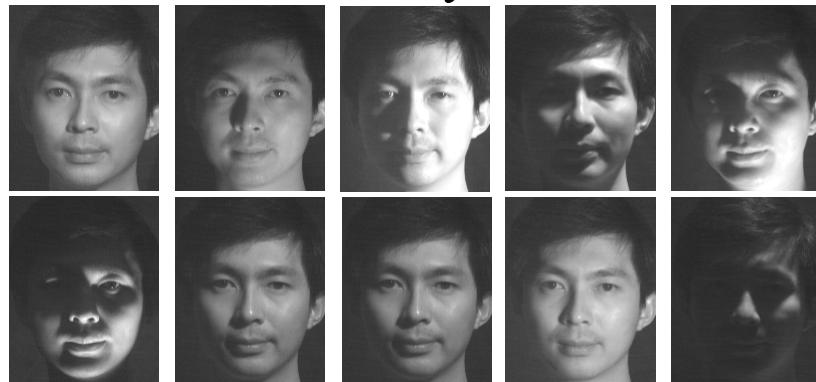
1. Build mathematical/physical model of the problem and implement algorithm with provably correct properties.
2. Craft a solution using software libraries of established methods and tailor them to the particulars of the problem.
3. Gather image data, potentially label it, and use machine learning to provide solution.

## An example problem:

Shading as a result of differences in lighting is

1. A source of information
2. An annoyance

## Illumination variability as an annoyance



“The variations between the images of the same face due to illumination and viewing direction are almost always larger than image variations due to change in face identity.”

-- Moses, Adini, Ullman, ECCV ‘94

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## How do we understand shading?

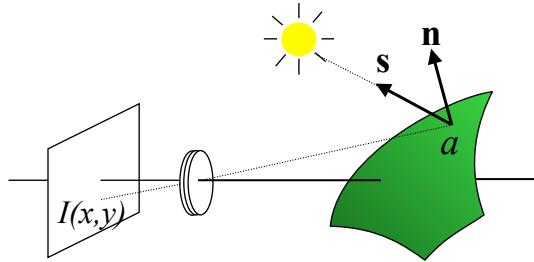
(An idealization of “engineering” research)

1. Construct a model of the domain (usually mathematical, based on physics).
2. Prove properties of that model to better understand the model and opportunities of using it.
3. Develop algorithms to solve a problem that is correct under the model.
4. Implement & evaluate it.
5. Question assumptions of the model & start all over again.

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## Step 1. Build an Model: Image Formation Model



At image location  $(x,y)$  the intensity of a pixel  $I(x,y)$  is

$$I(x,y) = a(x,y) \mathbf{n}(x,y) \cdot \mathbf{s}$$

where

- $a(x,y)$  is the albedo of the surface projecting to  $(x,y)$ .
- $\mathbf{n}(x,y)$  is the unit surface normal.
- $\mathbf{s}$  is the direction and strength of the light source.

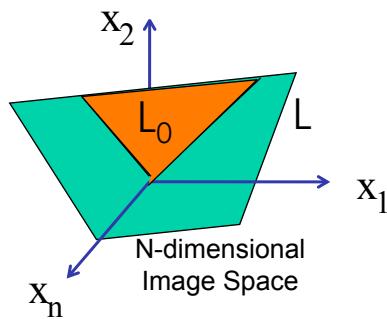
## Step 2. Prove a property

*The set of images of a Lambertian surface with no shadowing is a subset of 3-D linear subspace.*

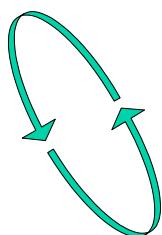
[Moses 93], [Nayar, Murase 96], [Shashua 97]

$$\mathcal{L} = \{\mathbf{x} \mid \mathbf{x} = \mathbf{B}\mathbf{s}, \forall \mathbf{s} \in \mathbb{R}^3\}$$

where  $\mathbf{B}$  is a  $n$  by 3 matrix whose rows are product of the surface normal and Lambertian albedo



### Steps 3,4 : Develop a provable algorithms and implement it: Relighting

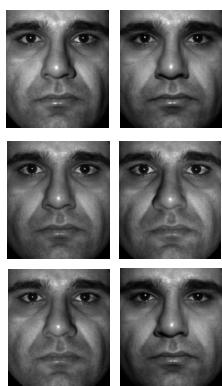


Single Light Source

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### Steps 3,4 : Develop a provable algorithms and implement it: Photometric Stereo



Basic idea: 3 or more  
images under slightly  
different lighting

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## Step 5. Question Assumptions

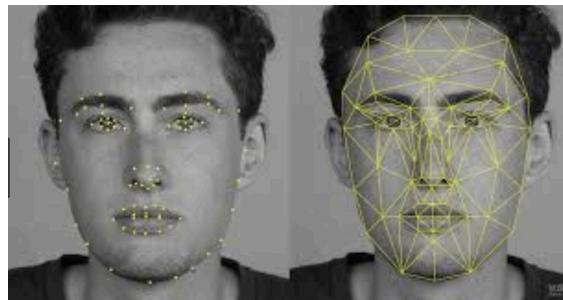
- What about cast shadows?
- Many objects are glossy or have more complex reflectance functions



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## Crafting a solution



- Distance between facial features (eye center, tip of nose, lip corners, eyebrows) should be good for recognition.
- Feature descriptors like SIFT or ORB are pretty insensitive to lighting and available in OpenCV
- Let's detect those features, build a Delaunay triangulation, and use an SVM for classification.

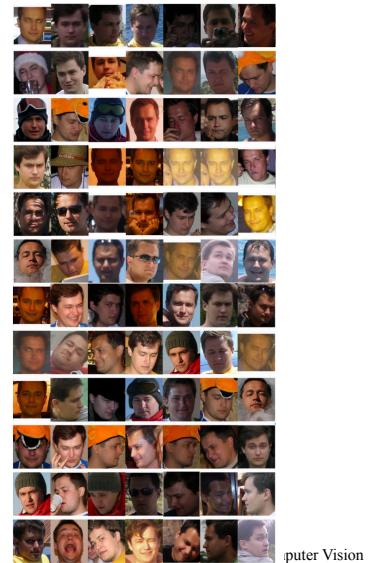
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# Use lots of data and machine learning

- Google FaceNet trained on hundreds of millions of cropped face images
- 140 Million Parameters
- 1.6B Flops

[Schroff, Kalenichenko, Philbin, 2015]



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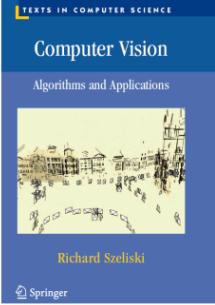
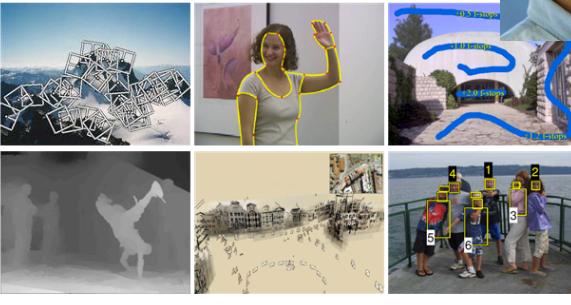
## About the Course

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Intro Computer Vision

**Primary Text 1**  
**Computer Vision: Algorithms and Applications**

© 2010 Richard Szeliski, Microsoft Research


Welcome to the Web site (<http://szeliski.org/Book>) for my computer vision textbook, which you can now purchase at a variety of locations, including [Springer](#) ([SpringerLink](#), [DOD](#)), [Amazon](#), and [Barnes & Noble](#).

This book is largely based on the computer vision courses that I have co-taught at the University of Washington ([2008](#), [2005](#), [2001](#)) and Stanford (2003) with [Steve Seitz](#) and [David Fleet](#).

You are welcome to download the PDF from this Web site for personal use, but **not** to repost it on any other Web site. Please post a link to this URL (<http://szeliski.org/Book>) instead. An electronic version of this manuscript will continue to be available even after the book is published. Note, however, that while the content of the electronic and hardcopy versions are the same, the page layout (pagination) is different, since the electronic version is optimized for readability.

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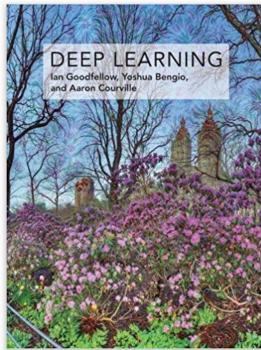
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# Primary Text 2

**Deep Learning (Adaptive Computation and Machine Learning series)**

by [Ian Goodfellow](#) ▾ (Author), [Yoshua Bengio](#) ▾ (Author), [Aaron Courville](#) ▾ (Author)

 193 customer reviews

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Intro Computer Vision

# Secondary Text

The screenshot shows a product page on the Amazon website for the book "Introductory Techniques for 3-D Computer Vision" by Emanuele Trucco and Alessandro Verri. The page includes the book cover, which features a complex diagram of 3D computer vision concepts like perspective projection and camera geometry. Below the cover, there are sections for "Available from these sellers" and "Book Trade-In". The "Book Trade-In" section includes a table showing the trade-in price of \$12.00.

Used Price	\$60.00
Trade-in Price	\$12.00
Price after Trade-in	\$48.00

**Available on Ereserves**

CSE152, Winter 2019      Intro Computer Vision

# The Syllabus

<http://cseweb.ucsd.edu/classes/sp19/cse152-a/>

CSE152, Winter 2019      Intro Computer Vision

## Background

- Linear algebra
- Multivariable calculus
- Probability
- Programming (we'll use python)

## Announcements

- HW0 to be posted on Tuesday
- Read Chapter 1, Szeliski

## Academic Integrity Policy

Integrity of scholarship is essential for an academic community. The University expects that both faculty and students will honor this principle and in so doing protect the validity of University intellectual work. For students, this means that all academic work will be done by the individual to whom it is assigned, without unauthorized aid of any kind.

## Collaboration Policy

It is expected that you complete your academic assignments on your own and in your own words and code. The assignments have been developed by the instructor to facilitate your learning and to provide a method for fairly evaluating your knowledge and abilities (not the knowledge and abilities of others). So, to facilitate learning, you are authorized to discuss assignments with others; however, to ensure fair evaluations, you are not authorized to use the answers developed by another, copy the work completed by others in the past or present, or write your academic assignments in collaboration with another person. If the work you submit is determined to be other than your own, you will be reported to the Academic Integrity Office for violating UCSD's Policy on Integrity of Scholarship.