



# CPSC 425: Computer Vision



Image Credit: Devi Parikh

**Lecture 1:** Introduction and Course Logistics

# Course **logistic**

**Times:** Mon, Wed, Fri 15:00-16:00pm

**Locations:** West Mall Swing, Room 122

**Instructor:** Leonid Sigal



**E-mail:** [lsigal@cs.ubc.ca](mailto:lsigal@cs.ubc.ca)

**Office:** ICICS 119

**Course webpage:** <http://www.cs.ubc.ca/~lsigal/teaching.html>

**Discussion:** [piazza.com/ubc.ca/winterterm12018/cpsc425](https://piazza.com/ubc.ca/winterterm12018/cpsc425)

# About me ...

I have been working  
in **Computer Vision**  
for the last ~20 years

**Associate Professor**

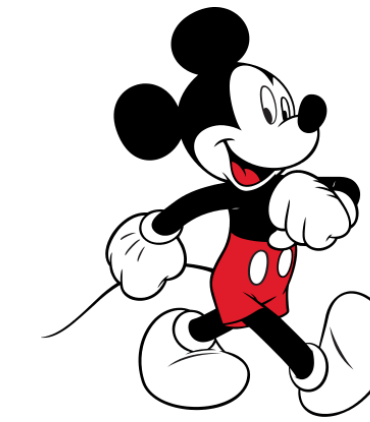
2017 -



THE UNIVERSITY  
OF BRITISH COLUMBIA

**Senior Research Scientist**

2009 - 2017



Disney Research

**Postdoctoral Researcher**

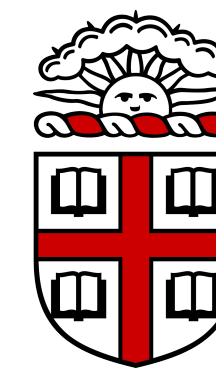
2007 - 2009



UNIVERSITY OF  
**TORONTO**

**PhD, MSc**

2001 - 2008



BROWN

**BOSTON  
UNIVERSITY**

**Software Engineer**

1999 - 2001

**COGNEX**

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Sarah Elhammadi



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# Course **logistic**

**Times:** Mon, Wed, Fri 15:00-16:00pm

**Locations:** West Mall Swing, Room 122

Use **Piazza** for any questions related to material and assignments in the course

If you have a question, I can guarantee you that at least 10 students in the course have an identical question.

**Course webpage:** <http://www.cs.ubc.ca/~lsigal/teaching.html>

**Discussion:** [piazza.com/ubc.ca/winterterm12018/cpsc425](https://piazza.com/ubc.ca/winterterm12018/cpsc425)

# What is **Computer Vision**?

Computer vision, broadly speaking, is a research field aimed to enable computers to **process and interpret visual data**, as sighted humans can.



**Image Credit:** <https://www.deviantart.com/infinitecreations/art/BioMech-Eye-168367549>

What do **you** see?



**Slide Credit:** Jitendra Malik (UC Berkeley)

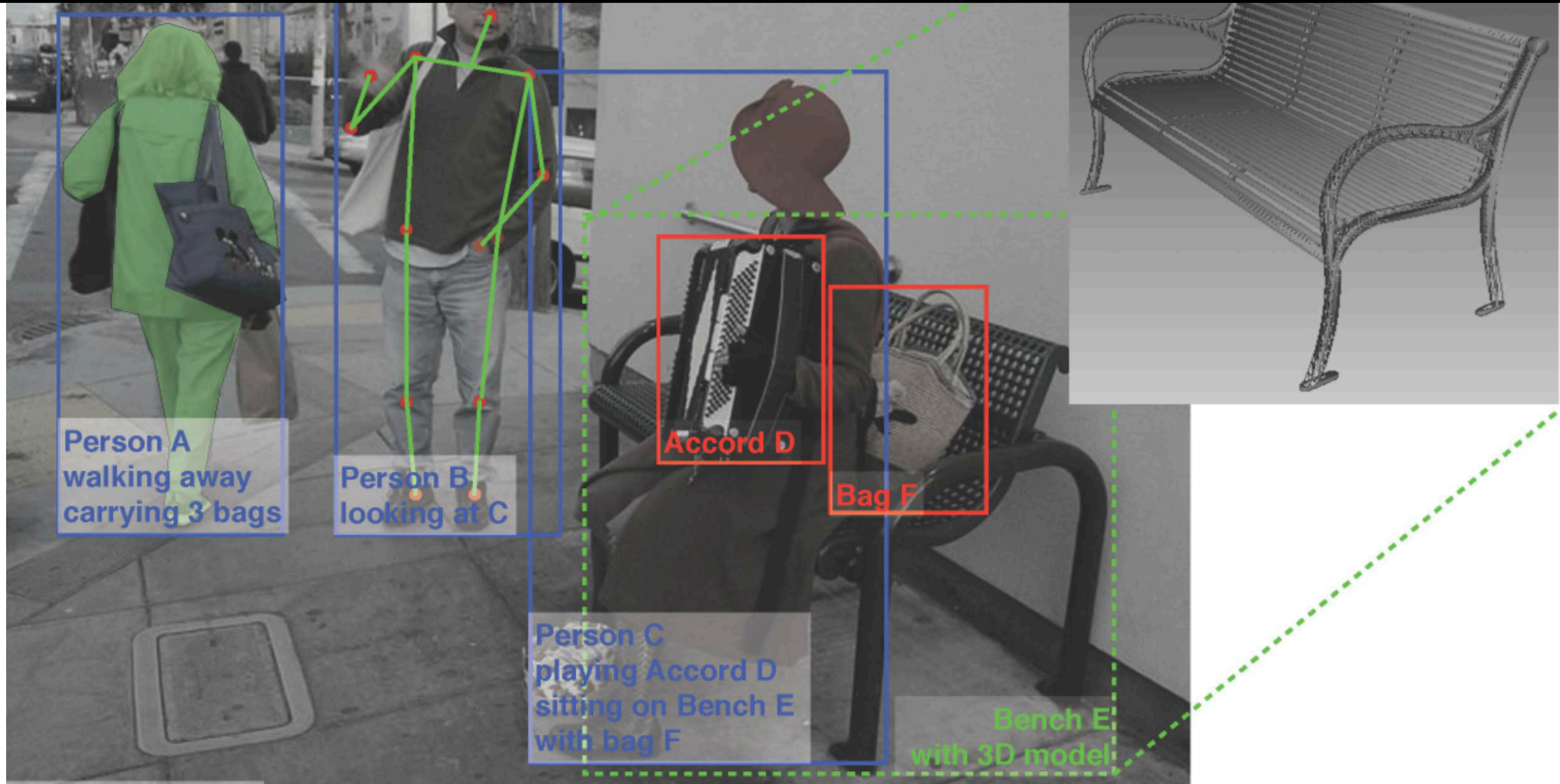
# What we would like **computer to infer**?





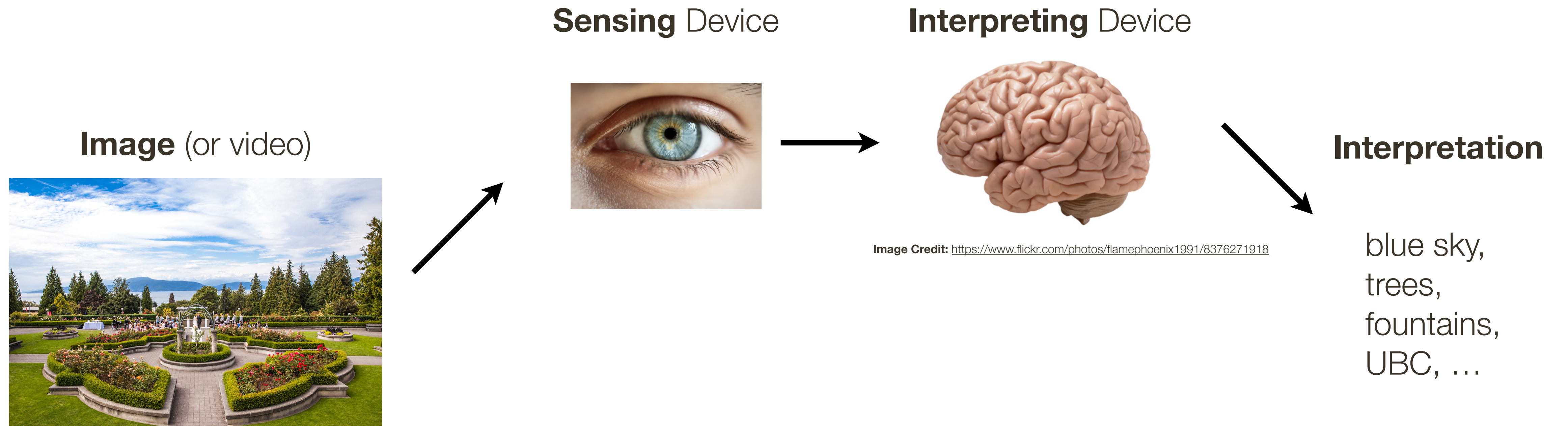
# What we would like **computer to infer**?

Will person B put some money into person C's cup?



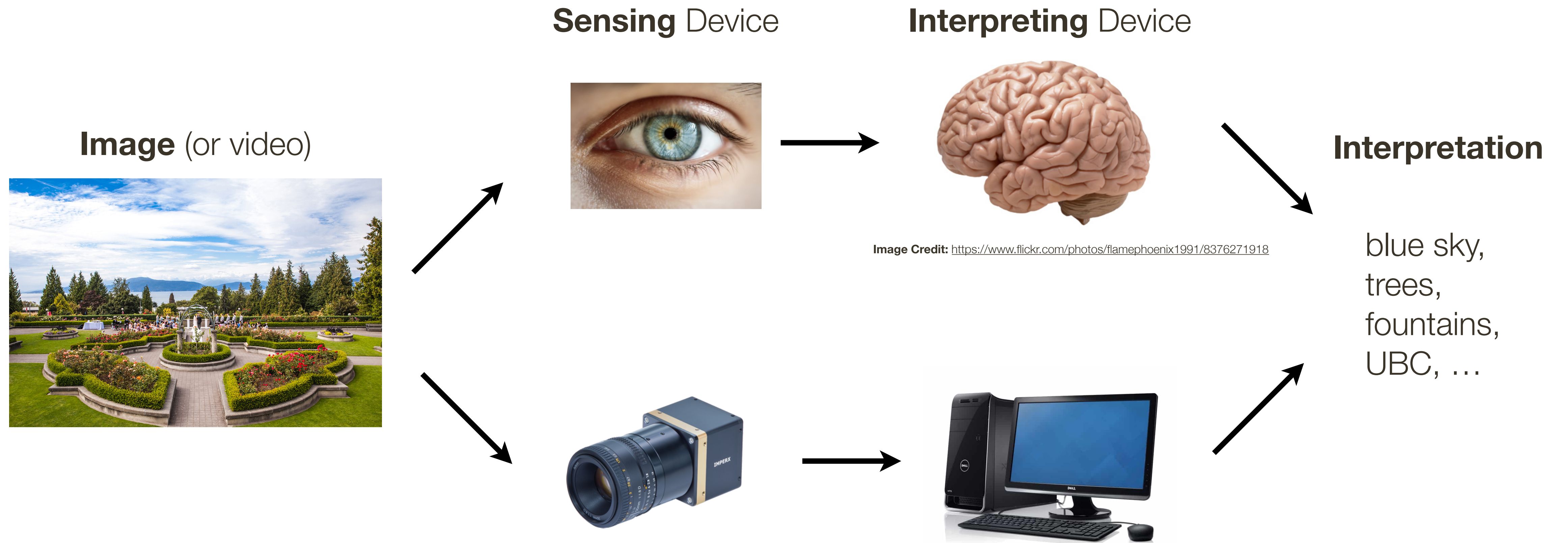
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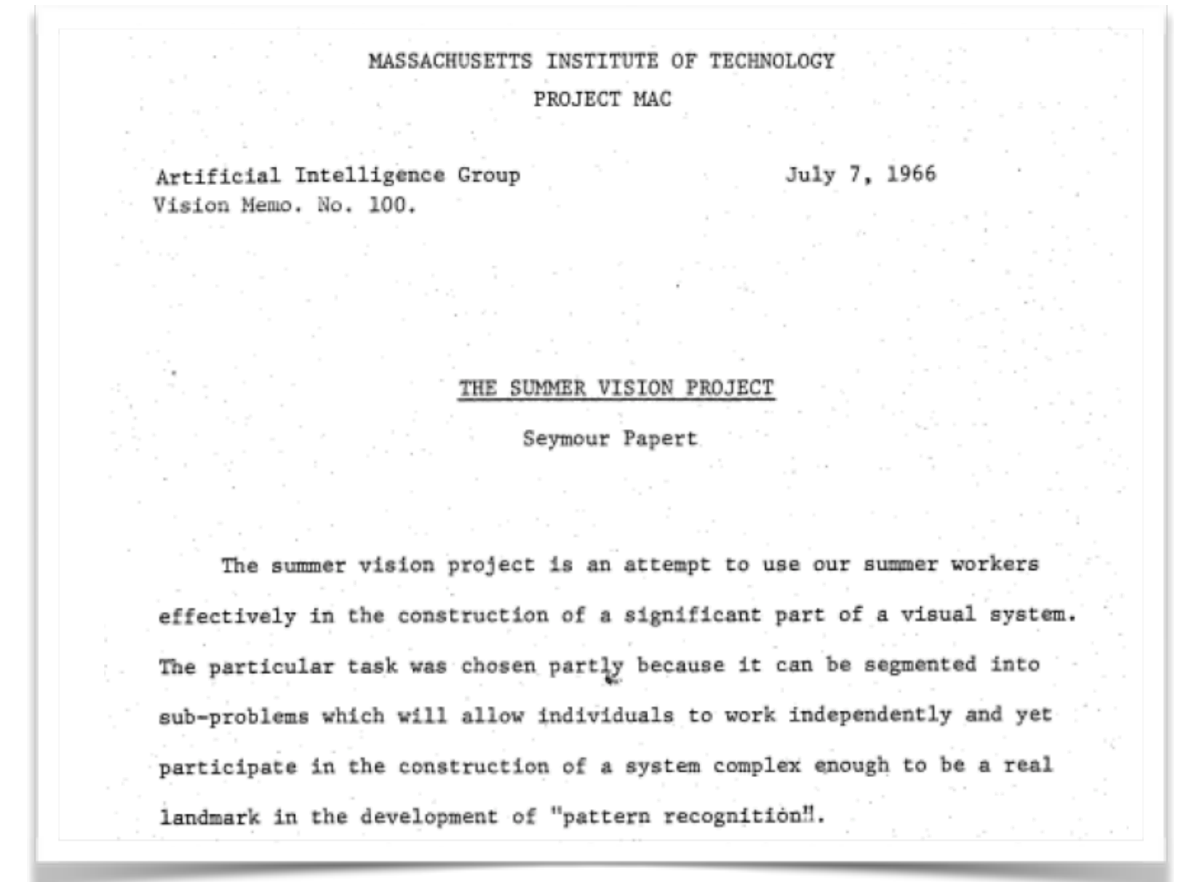
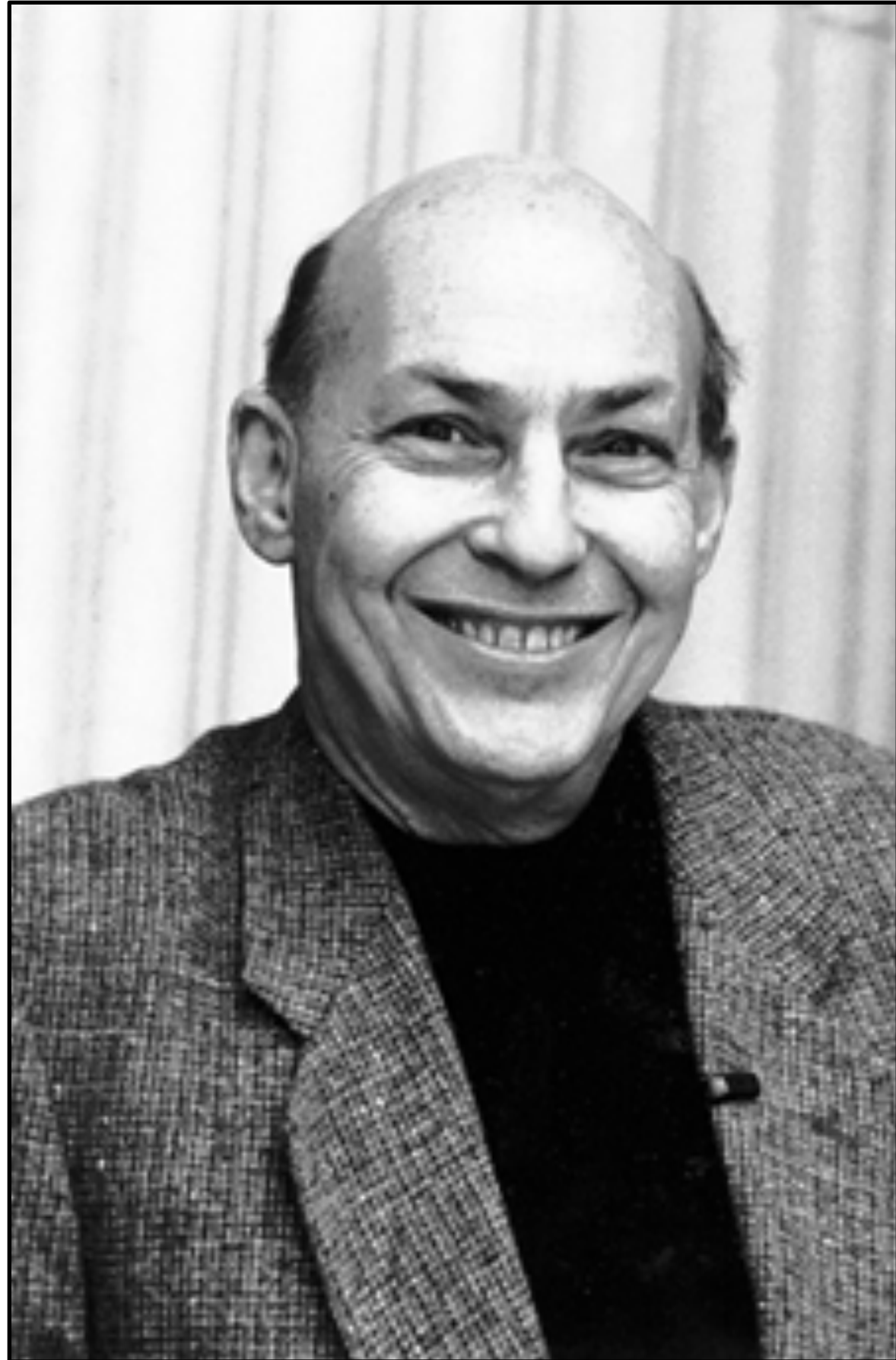


# What is **Computer Vision**?

Computer vision, broadly speaking, is a research field aimed to enable computers to **process and interpret visual data**, as sighted humans can.



# Computer vision ... the beginning ...



“spend the summer linking a camera to a computer and getting the computer to describe what it saw”

- Marvin Minsky (1966), MIT  
Turing Award (1969)

... >50 years later

# Computer vision ... the beginning ...



Gerald Sussman, MIT

“You’ll notice that **Sussman** never worked in vision again!” – Berthold Horn

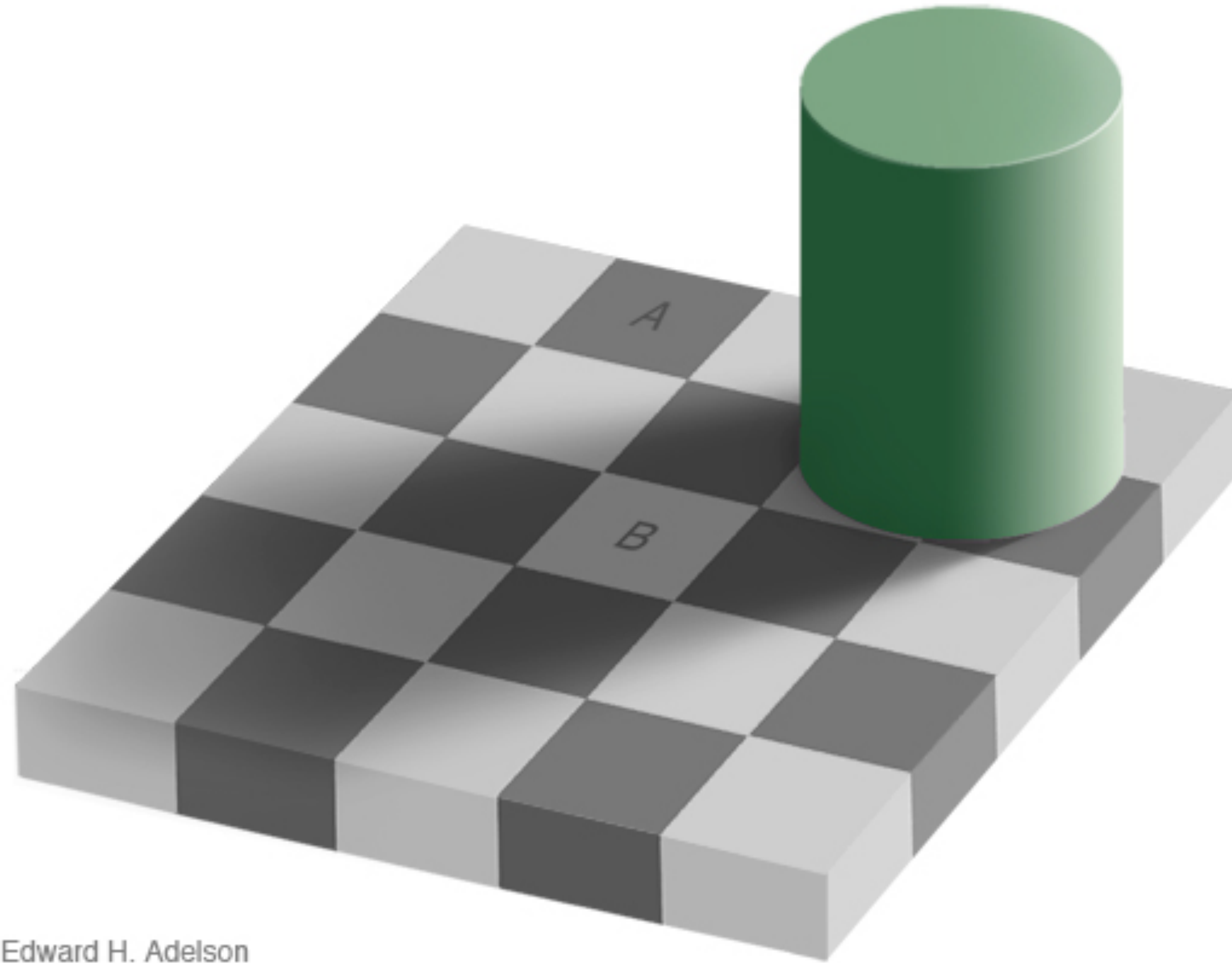
# Can computers **match (or beat)** human vision?

- We've been at it for 50 years

# Can computers **match (or beat)** human vision?

- How good is human vision?

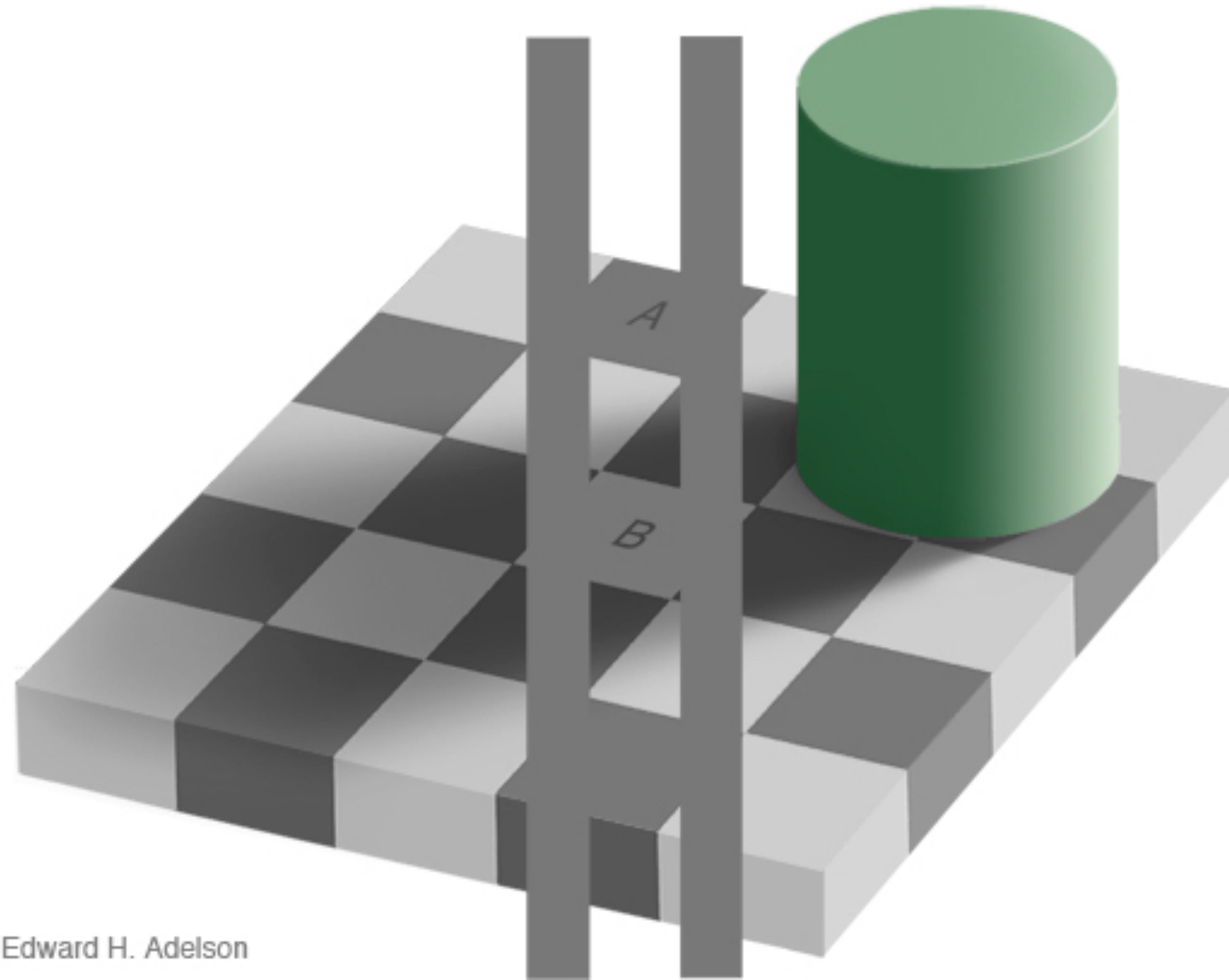
Can computers **match (or beat)** human vision?



Edward H. Adelson



Can computers **match (or beat)** human vision?



Edward H. Adelson

# Can computers **match (or beat)** human vision?

- **Yes and No** (mostly NO)

# Computer **Vision Problems**

1. Computing properties of the 3D world from visual data (***measurement***)

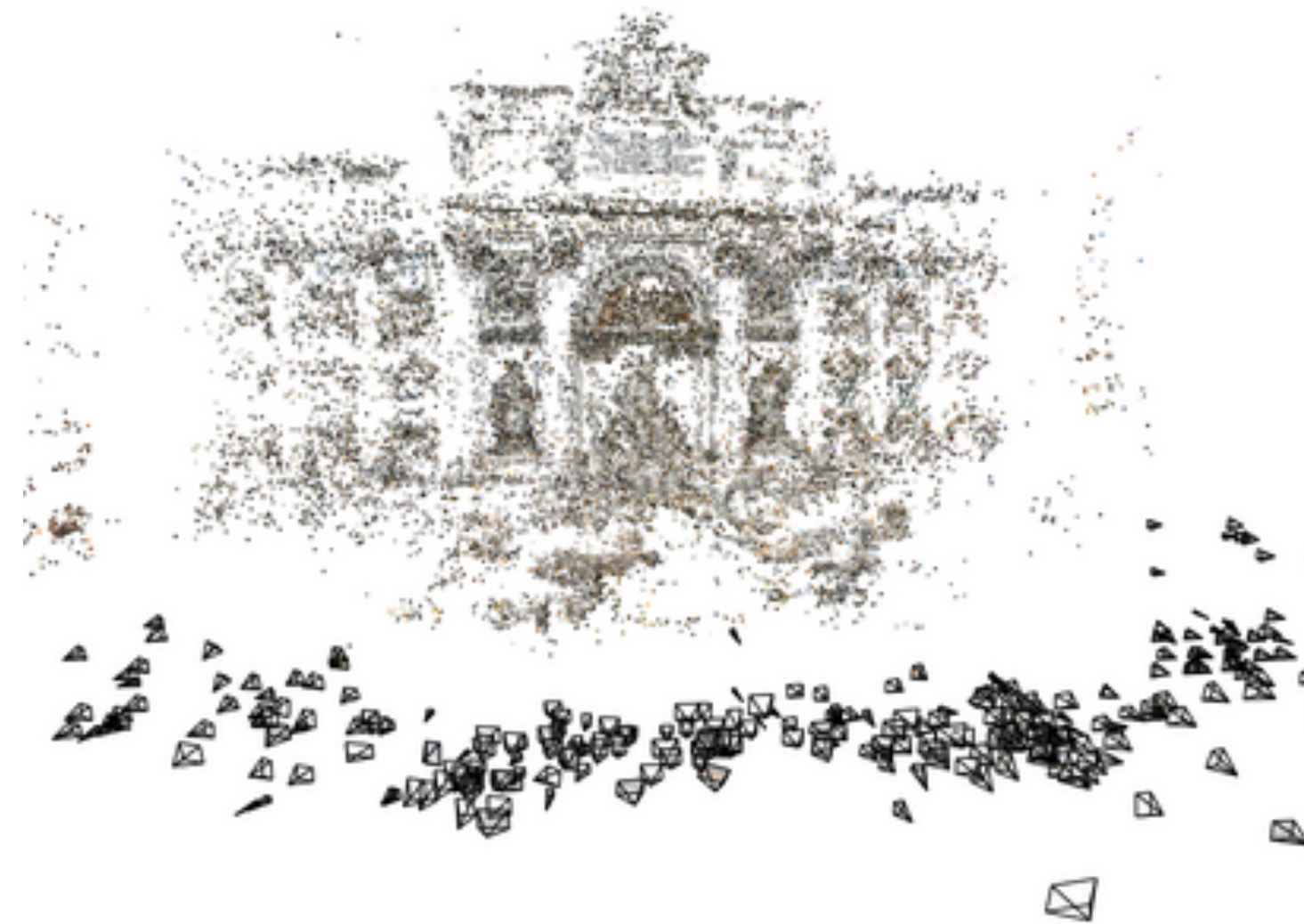
# 1. Vision for **Measurement**

Real-time stereo



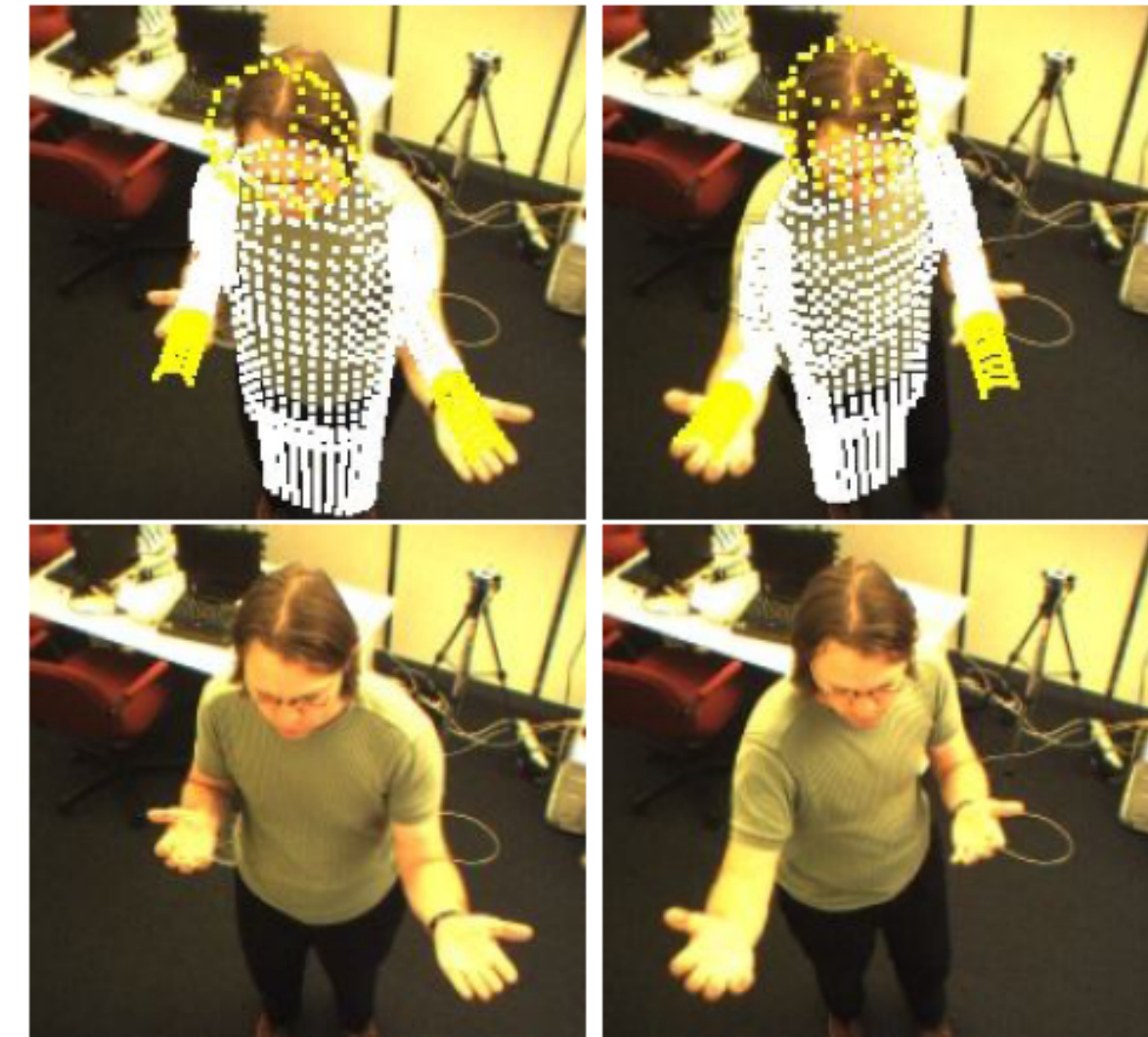
Wang et al.

Structure from motion



Snavely et al.

Tracking



Demirdjian et al.

# Computer **Vision Problems**

1. Computing properties of the 3D world from visual data (***measurement***)

**Ill-posed problem:** real world is much more complex than what we can measure in images: 3D  $\rightarrow$  2D

It is (literally) impossible to invert the image formation process

# Computer **Vision Problems**

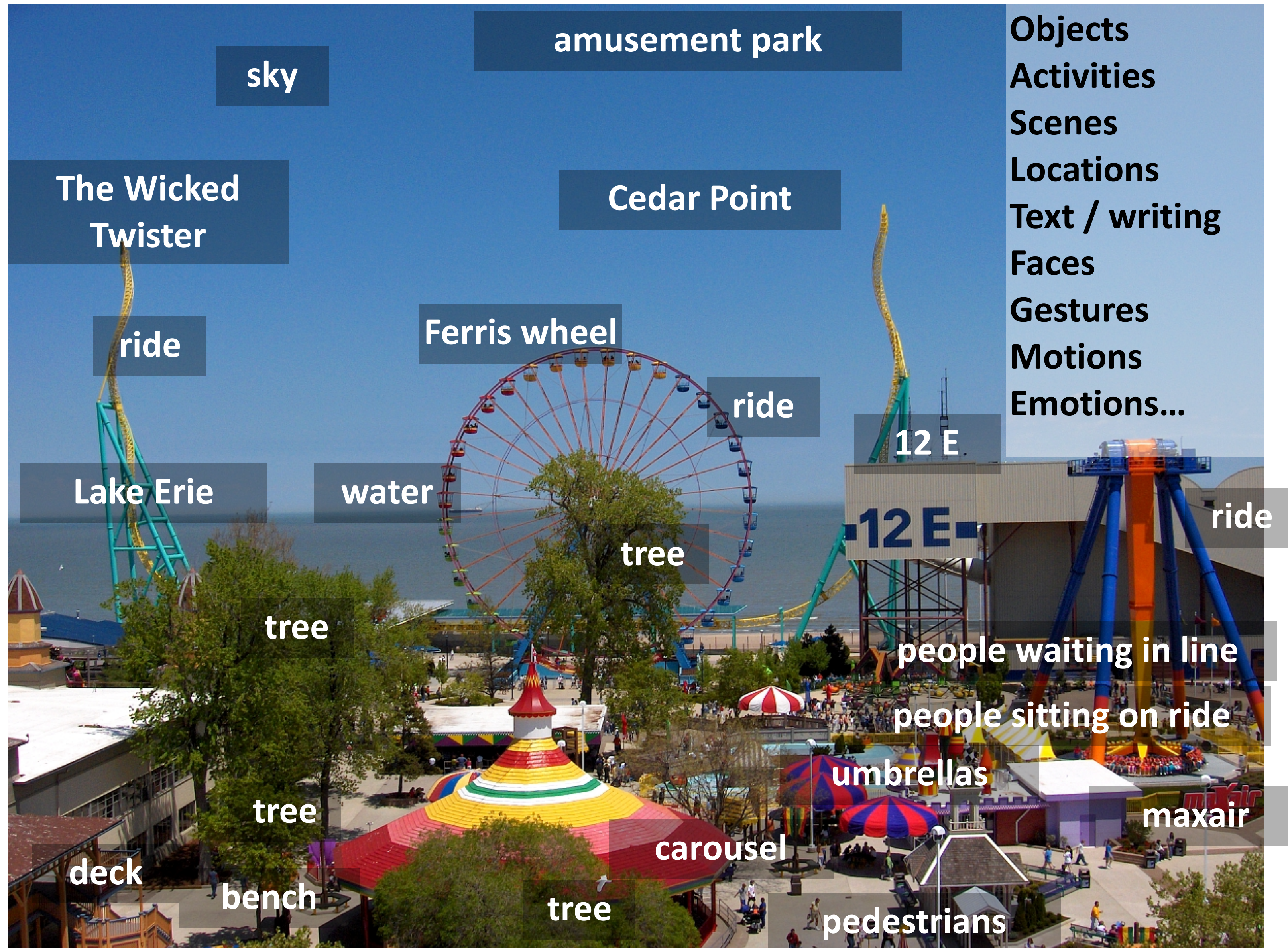
1. Computing properties of the 3D world from visual data (***measurement***)
2. Algorithms and representations to allow a machine to recognize objects, people, scenes, and activities (***perception and interpretation***)

## 2. Vision for **Perception and Interpretation**



**Slide Credit:** Kristen Grauman (UT Austin)

## 2. Vision for **Perception and Interpretation**



Objects  
Activities  
Scenes  
Locations  
Text / writing  
Faces  
Gestures  
Motions  
Emotions...



# Computer **Vision Problems**

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

It is computationally intensive / expensive

## 2. Vision for **Perception and Interpretation**

~ 55% of **cerebral cortex** in humans (13 billion neurons) are devoted to vision  
more human brain devoted to vision than anything else



# Computer **Vision Problems**

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

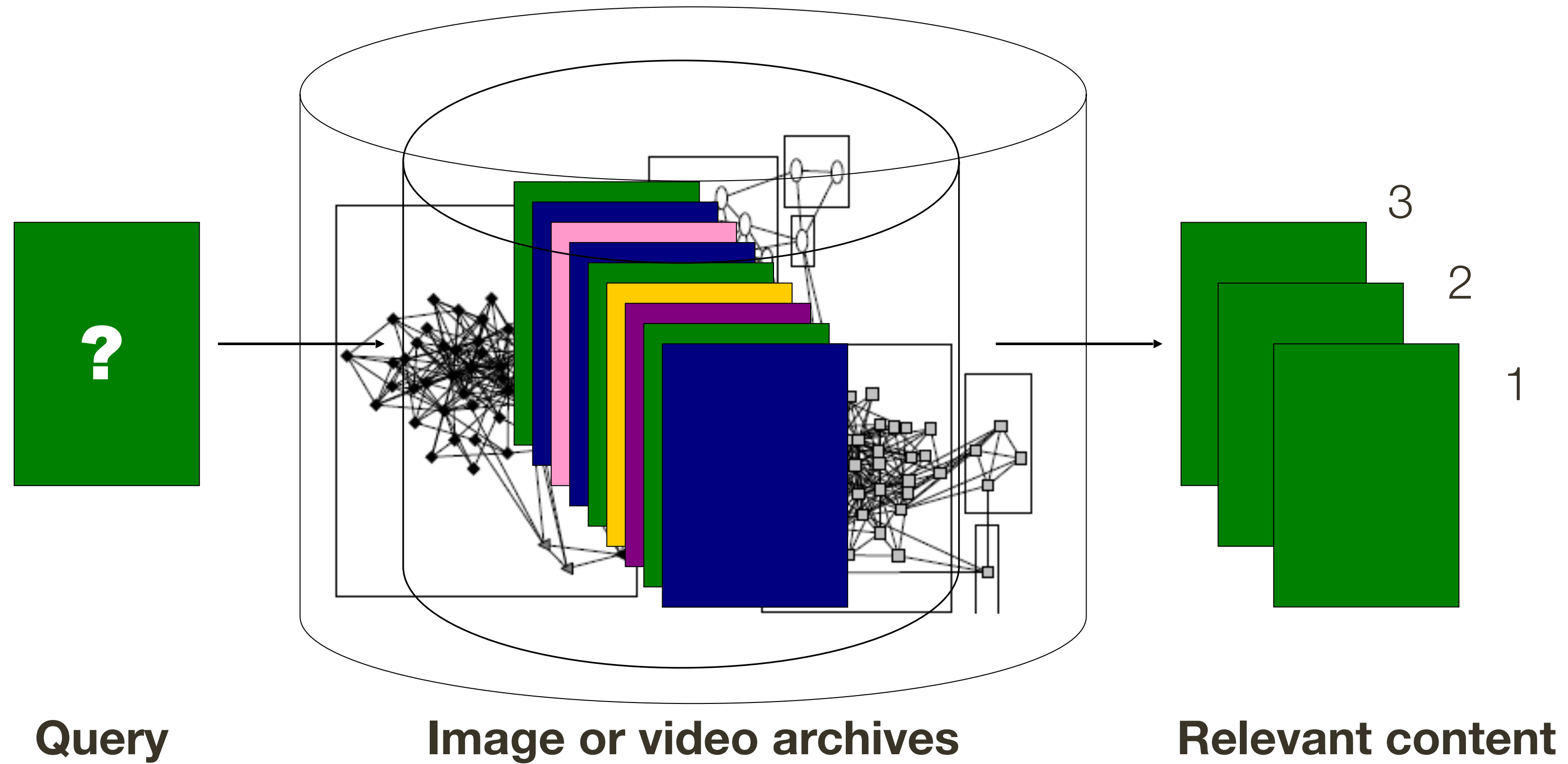
It is computationally intensive / expensive

We do not (fully) understand the processing mechanisms involved

# Computer **Vision Problems**

1. Computing properties of the 3D world from visual data (***measurement***)
2. Algorithms and representations to allow a machine to recognize objects, people, scenes, and activities (***perception and interpretation***)
3. Algorithms to mine, search, and interact with visual data (***search and organization***)

# 3. Search and Organization



# Computer **Vision Problems**

1. Computing properties of the 3D world from visual data (***measurement***)
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3. Algorithms to mine, search, and interact with visual data (***search and organization***)

Scale is enormous, explosion of visual content

# 3. Search and Organization



\*from iStock by GettyImages

Snapchat



**31.7 Million**  
/ hour

WhatsApp



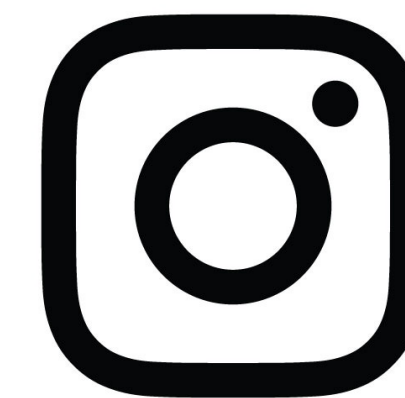
**29.2 Million**  
/ hour

Facebook



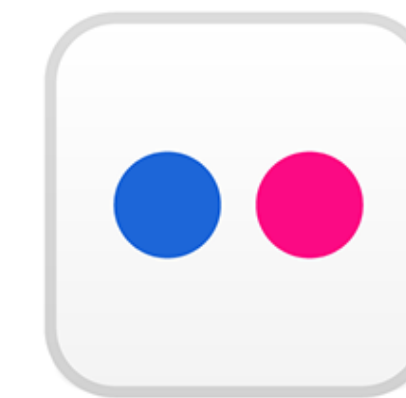
**14.6 Million**  
/ hour

Instagram



**2.9 Million**  
/ hour

Flickr



**0.2 Million**  
/ hour



**18K hours**  
/ hour

\*based on article by Kimberlee Morrison in Social Times (2015)

# 3. Search and Organization



> 85% of all web content is multimedia content of visual form

\*from iStock by GettyImages

Snapchat



31.7 Million

WhatsApp



29.2 Million

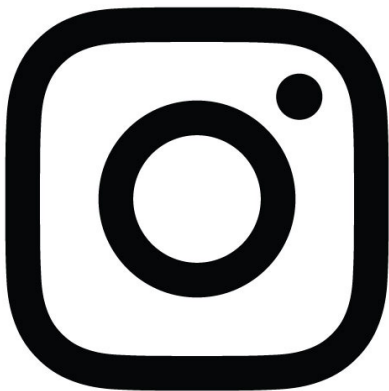
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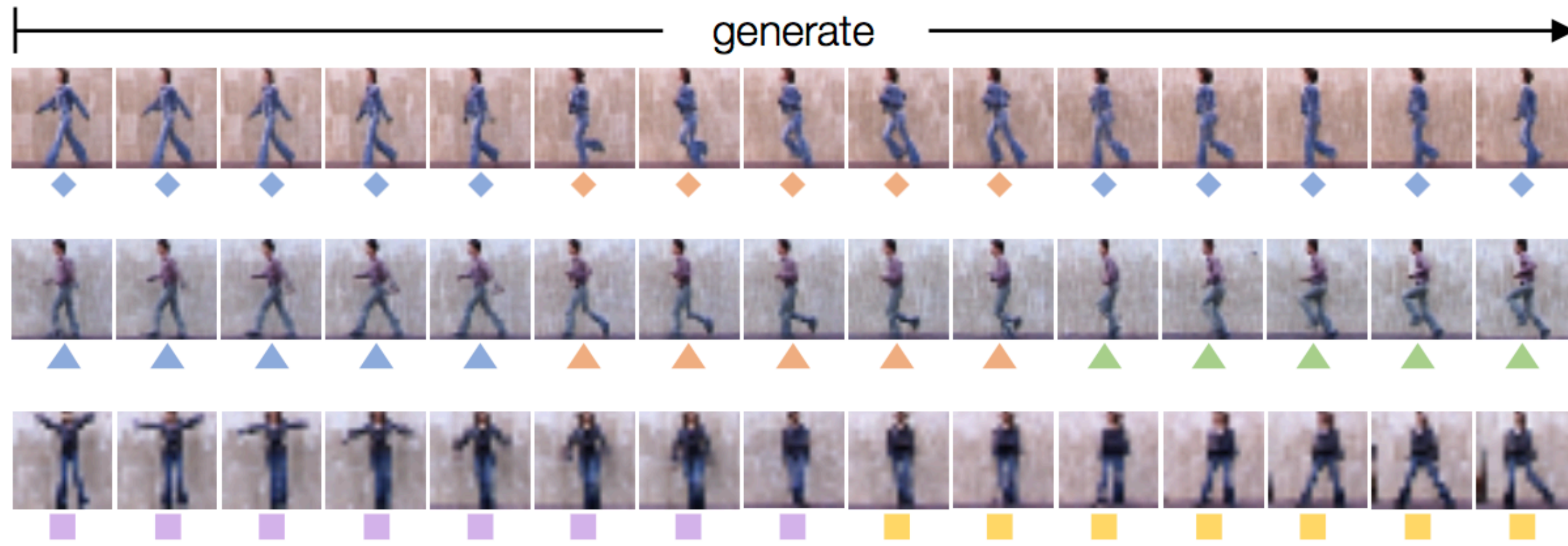


# Computer **Vision Problems**

1. Computing properties of the 3D world from visual data (***measurement***)
2. Algorithms and representations to allow a machine to recognize objects, people, scenes, and activities (***perception and interpretation***)
3. Algorithms to mine, search, and interact with visual data (***search and organization***)
4. Algorithms for manipulation or creation of image or video content (***visual imagination***)

# 4. Visual Imagination

(✓) Identity =  $\blacklozenge$  |  $\blacktriangle$  |  $\blacksquare$     (✓) Action =  $\bullet$ walking |  $\bullet$ running |  $\bullet$ skipping |  $\bullet$ jumping jack |  $\bullet$ side step



He et al. ECCV 2018

Input	Hair Color			Expression no smile	Gender male	Brown Hair		No Smile + male	Brown Hair + no smile + male
	Black	Blond	Brown			+ no smile	+ male		

ModularGAN Architecture

Zhao et al. ECCV 2018

# Computer **Vision Problems**

1. Computing properties of the 3D world from visual data (***measurement***)
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# Can computers **match (or beat)** human vision?

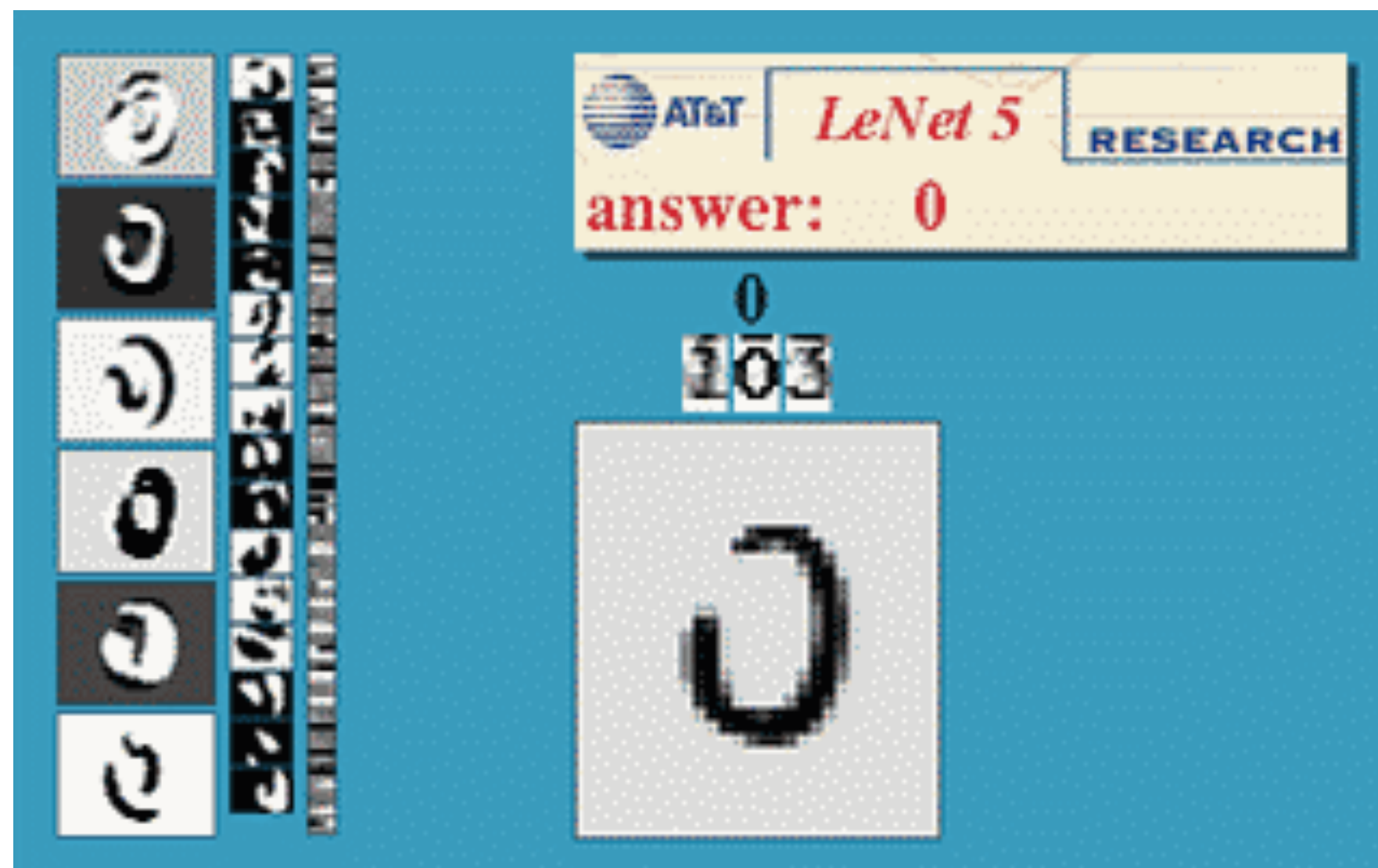
- **Yes and No** (mostly NO)
- Let's see some examples of state-of-the-art and where it is used

# Optical Character Recognition (**OCR**)

Technology to convert **scanned documents to text**  
(comes with any scanner now days)



Yann LeCun



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



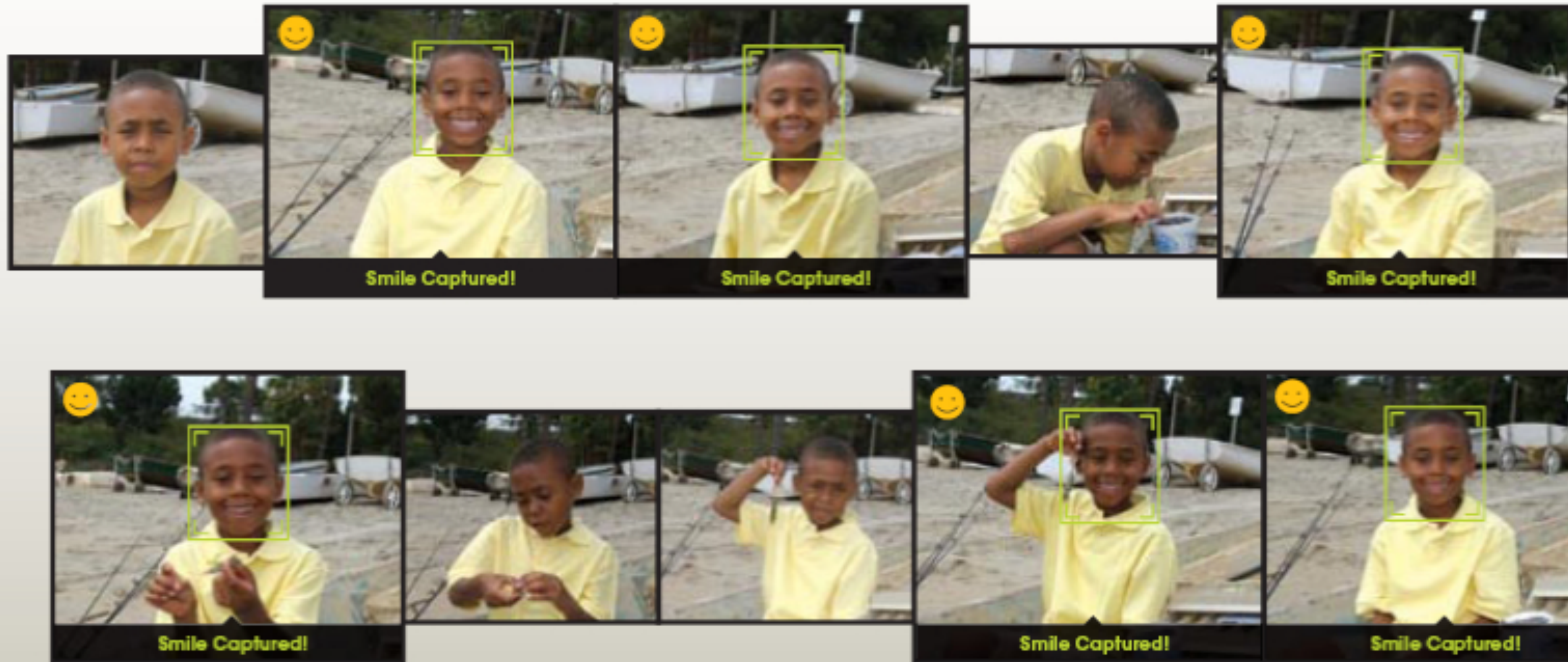
License plate readers  
[http://en.wikipedia.org/wiki/Automatic\\_number\\_plate\\_recognition](http://en.wikipedia.org/wiki/Automatic_number_plate_recognition)

# Face Detection

Technology available in any digital camera now  
(one of the first big commercial successes of vision algorithms)



# Smile Detection



# Face Recognition



Facebook

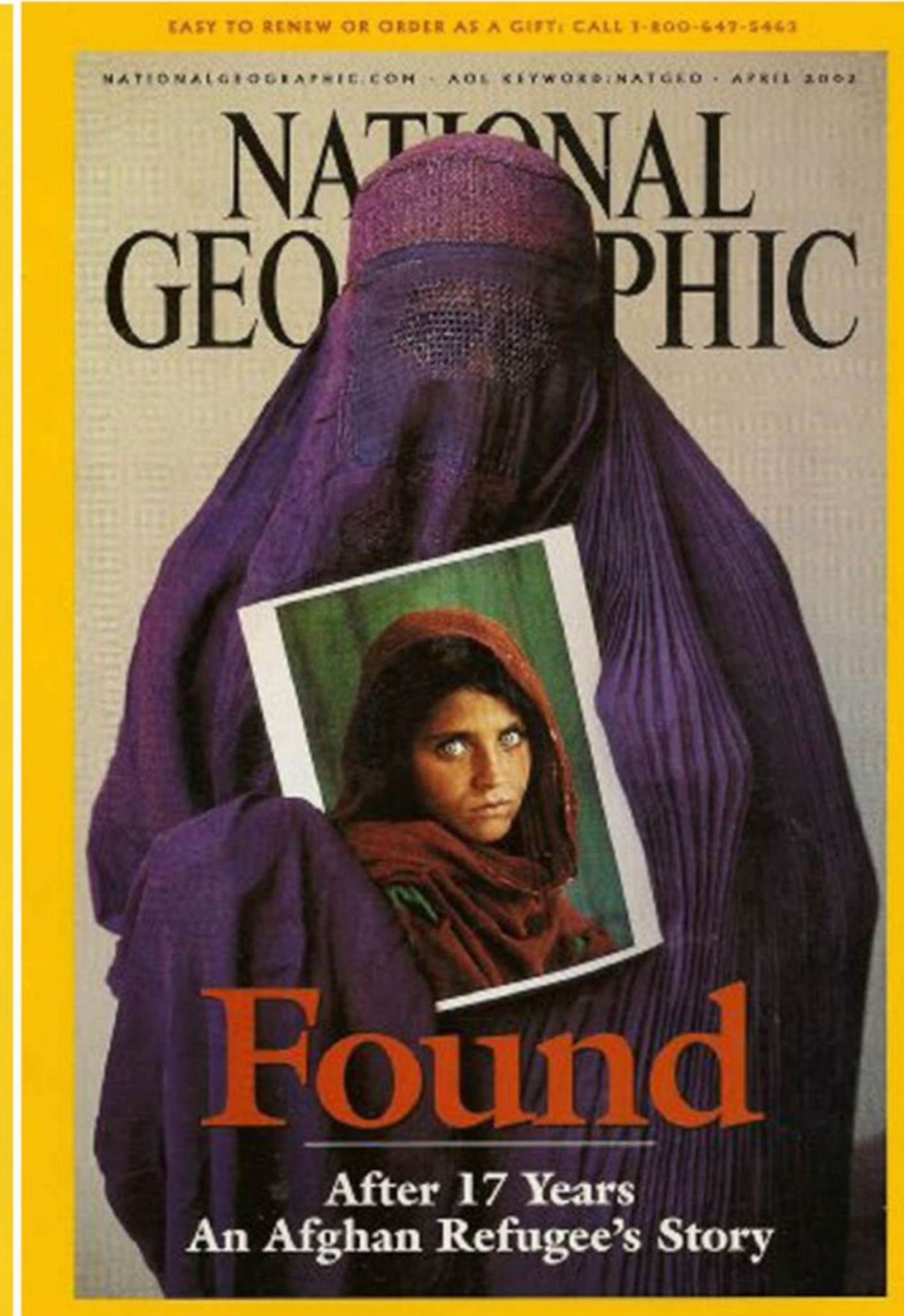
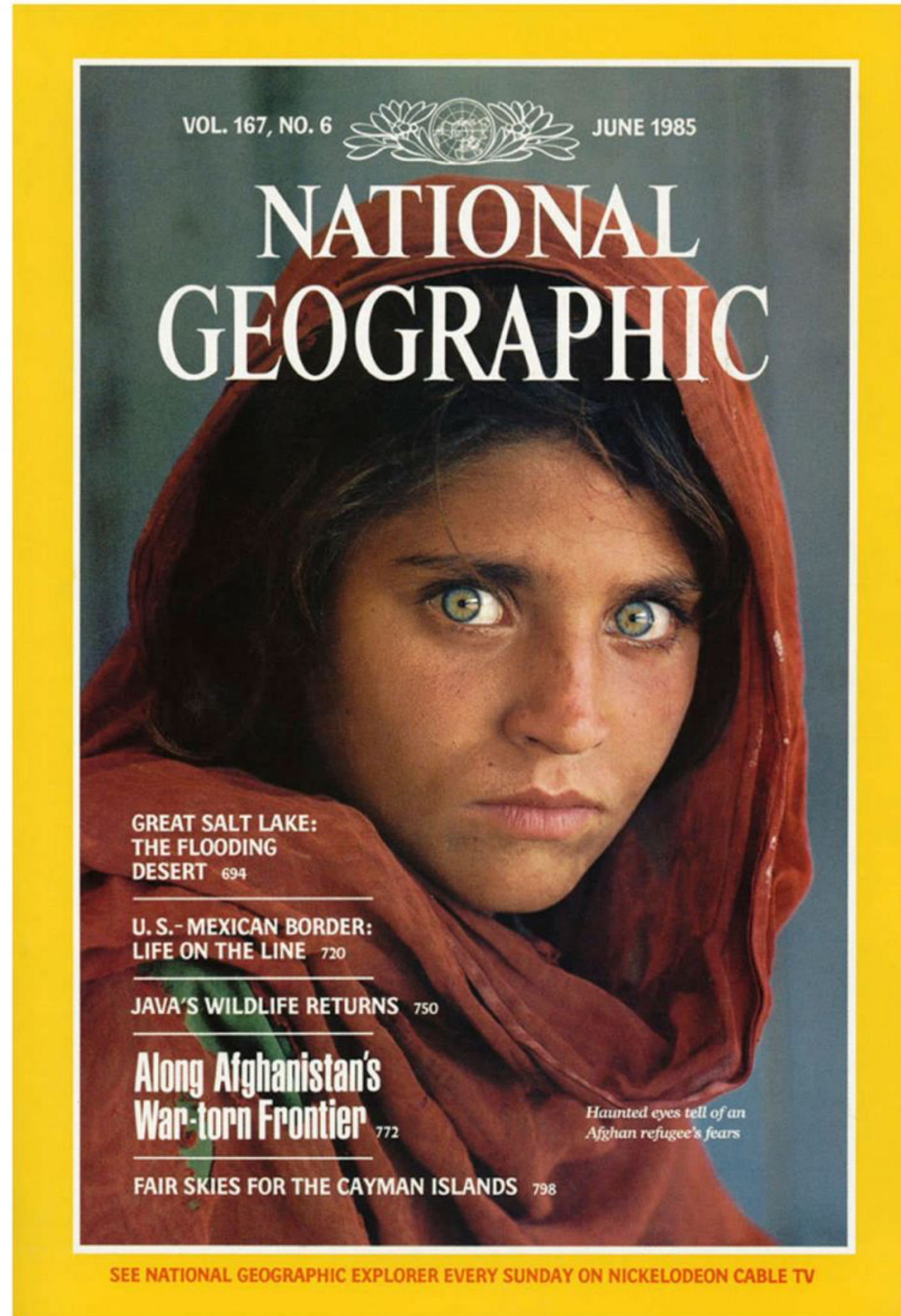
## Apple's iPhoto



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



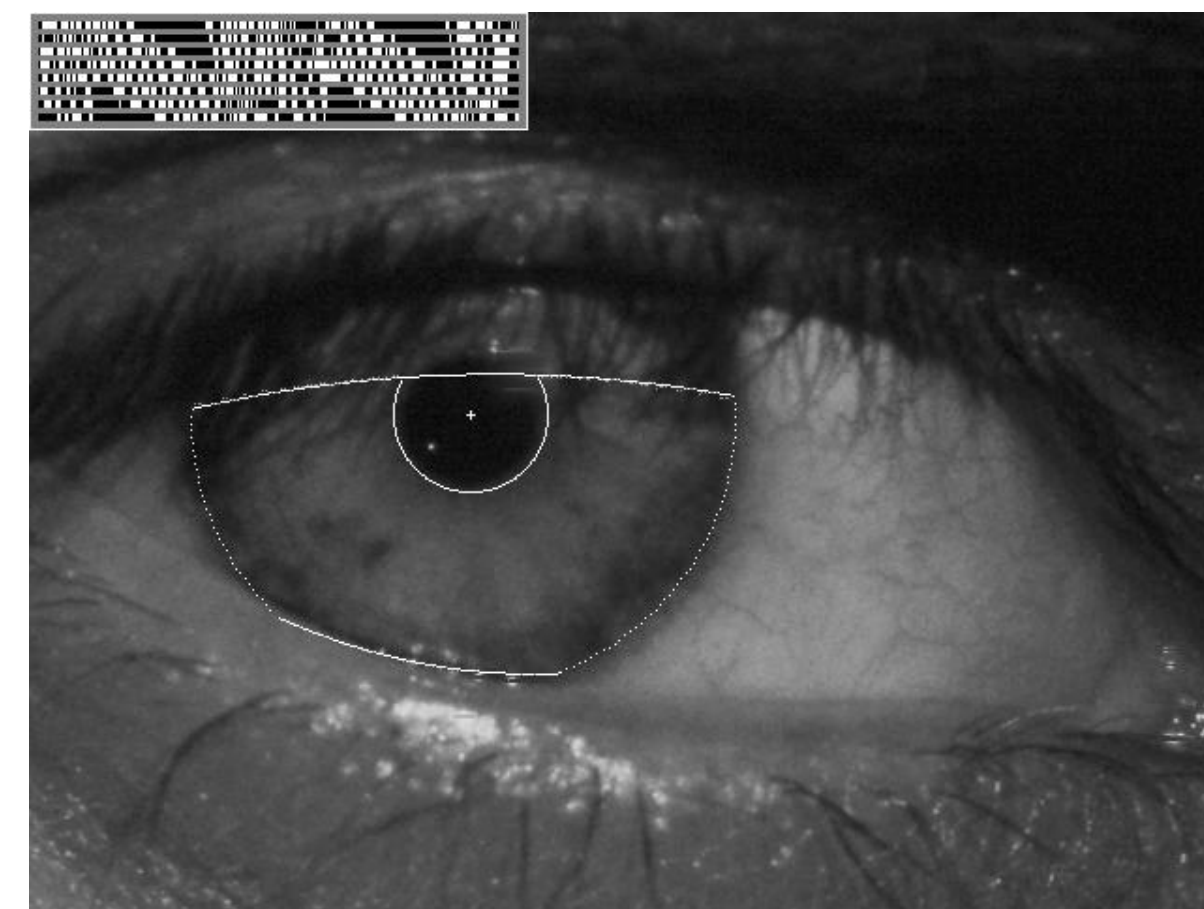
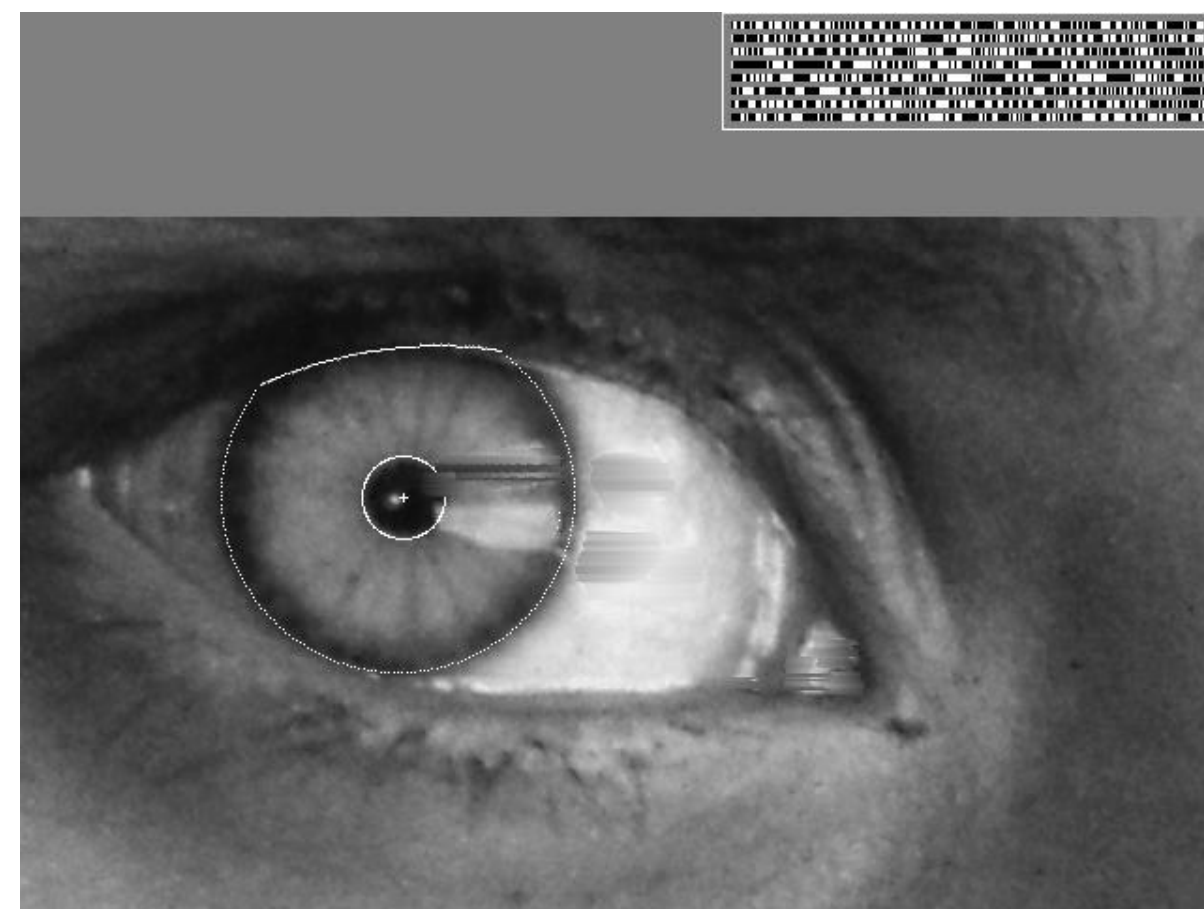
# Vision for **Biometrics**



# Vision for **Biometrics**



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



# Vision for **Biometrics**



Fingerprint scanners on many new laptops,  
other devices

iPhone X Face ID



Face recognition systems are not part of  
widely used technologies

How it works and how to fool it:

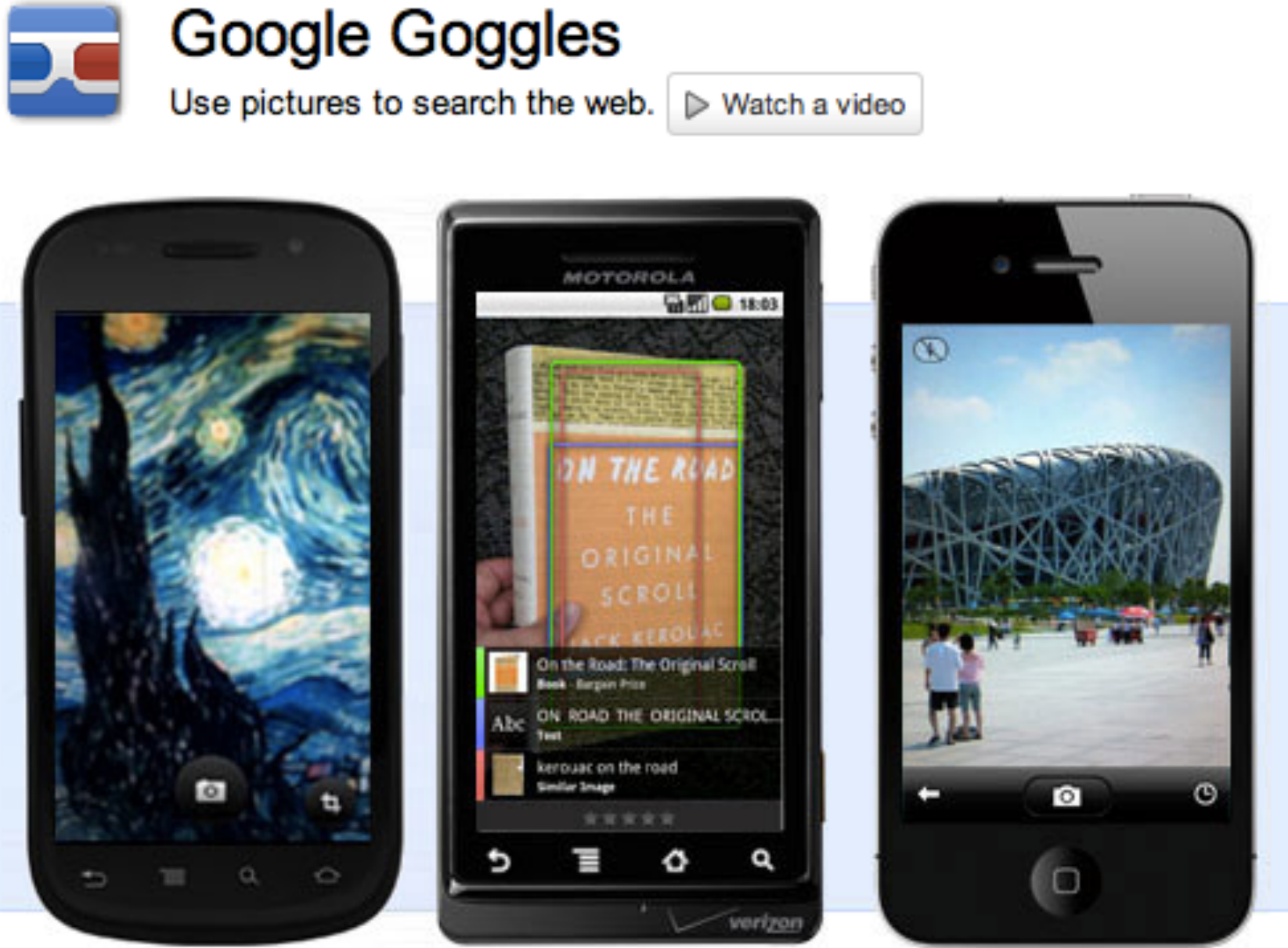
<https://www.youtube.com/watch?v=FhbMLmsCax0>

# Object Recognition (in supermarkets)



<https://www.youtube.com/watch?v=NrmMk1Myrxc>

# Object Recognition (in mobile devices)



## Nokia's Point & Find

<https://www.youtube.com/watch?v=8SdwVCUJ0QE>



[https://en.wikipedia.org/wiki/Nokia\\_Point\\_&\\_Find](https://en.wikipedia.org/wiki/Nokia_Point_&_Find)

# 3D Urban Modeling and Virtual Tourism



[ Agarwal, Furukawa, Snavely, Curless, Seitz, Szeliski, 2010 ]

# Visual Special Effects (**VFX**): Shape and Motion Capture



The Matrix movies, ESC Entertainment, XYZRGB, NRC

Pirates of the Caribbean, Industrial Light and Magic



# Vision in **Sports**



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

**Slide Credit:** Stephen Seitz (University of Washington)

<http://www.sportvision.com/video.html>



# Automotive Safety and Smart Cars



Tesla's Autopilot

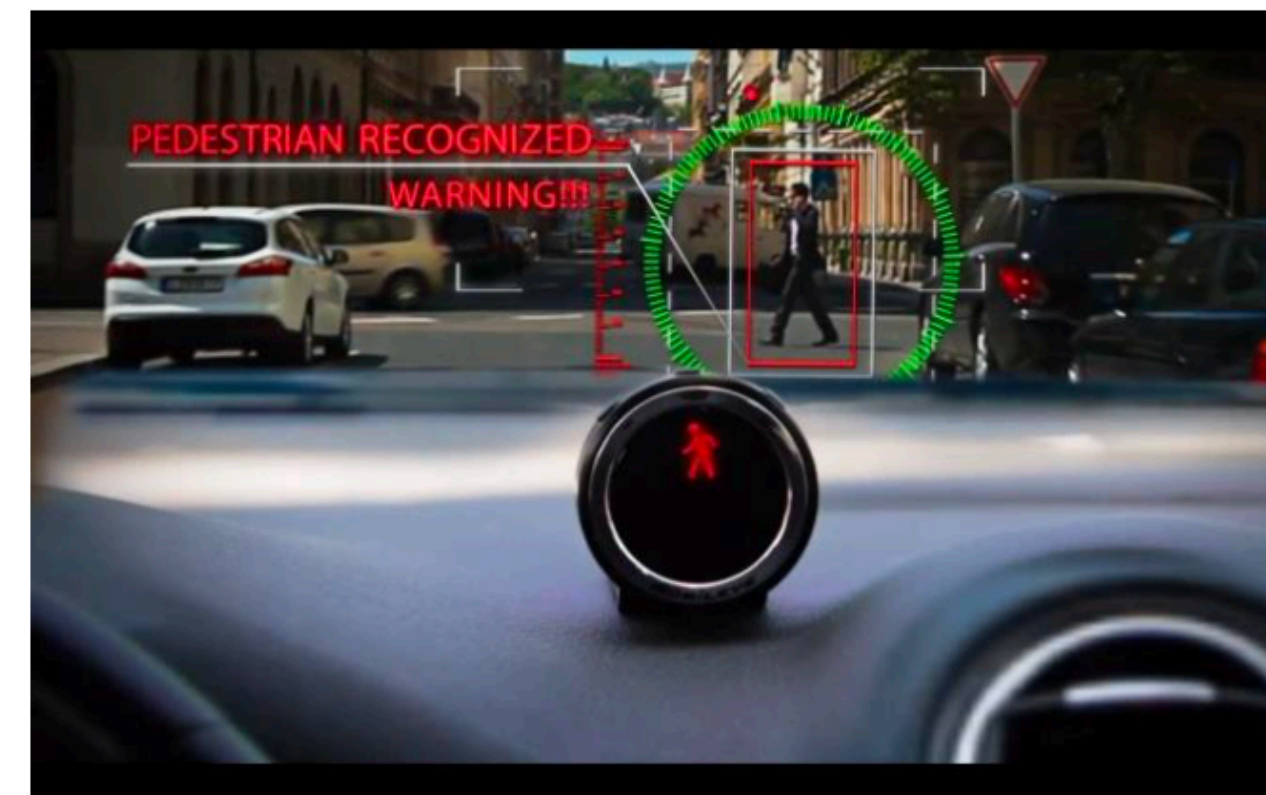
A screenshot of the Mobileye website. The main banner features a top-down view of a car with three camera fields of view highlighted: 'rear looking camera', 'forward looking camera', and 'side looking camera'. Below the banner are three product highlights: 'EyeQ Vision on a Chip' with an image of the chip, 'Vision Applications' showing a pedestrian with a bounding box, and 'AWS Advance Warning System' with a circular display showing a car icon and a '0.8' value. Navigation tabs for 'manufacturer products' and 'consumer products' are at the top.

A screenshot of the Mobileye website sidebar. It contains two sections: 'News' with two headlines about Volvo's collision warning system and 'Events' with two headlines about Mobileye's presence at Equip Auto in Paris and SEMA in Las Vegas. A 'read more' link is at the bottom.

Google Self-driving Cars



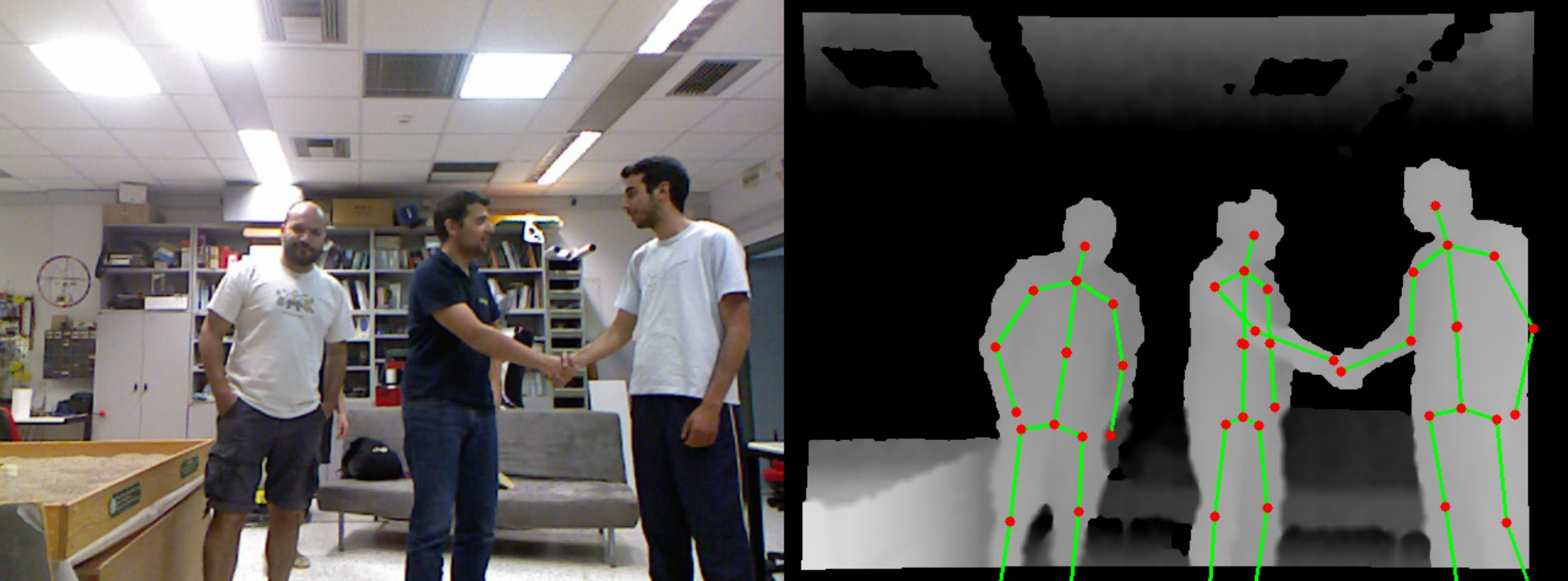
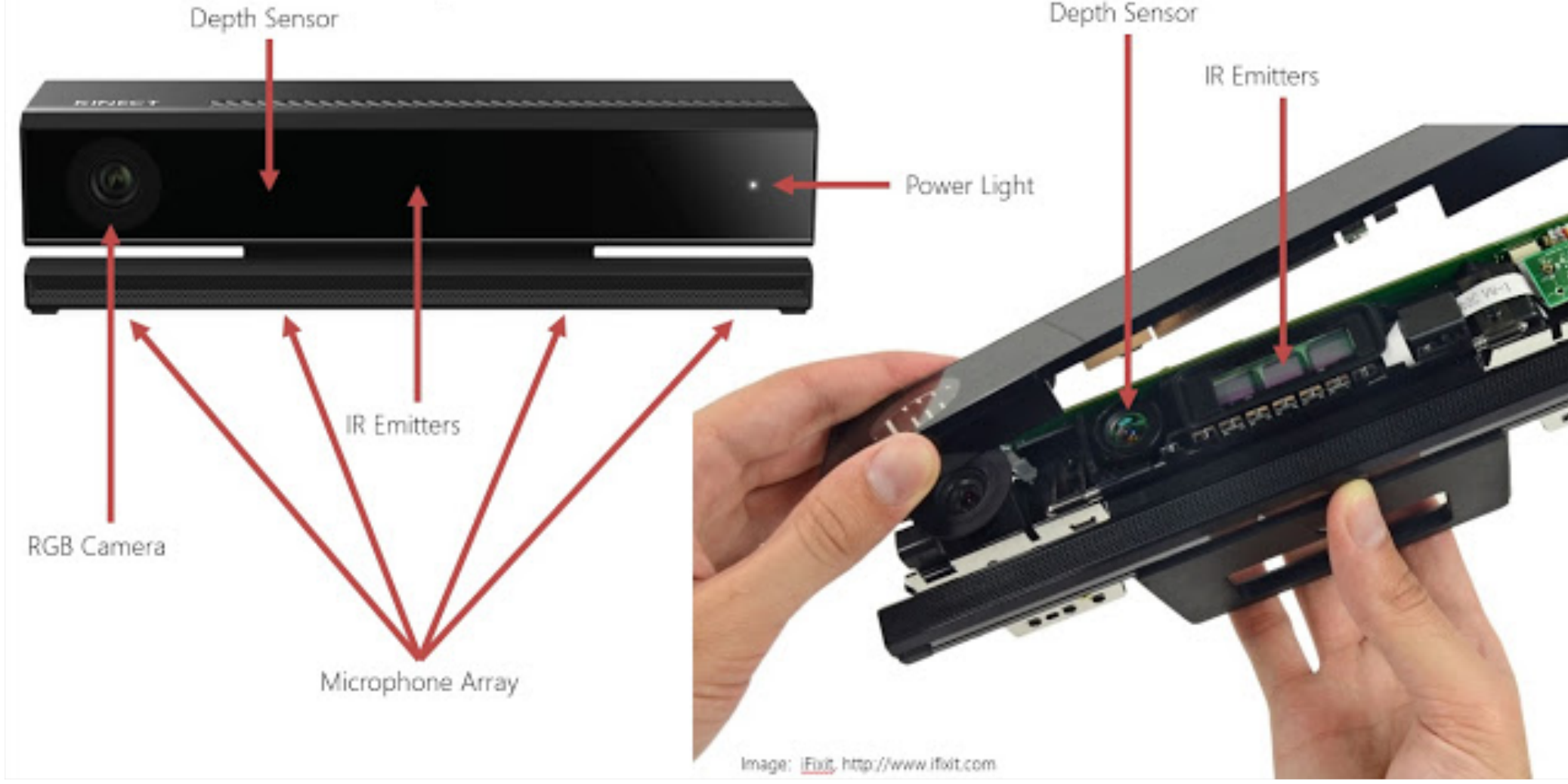
Mobileye



# Interactive Games: **Kinect**



## Sensor Components



# Vision for Robotics, Space Exploration

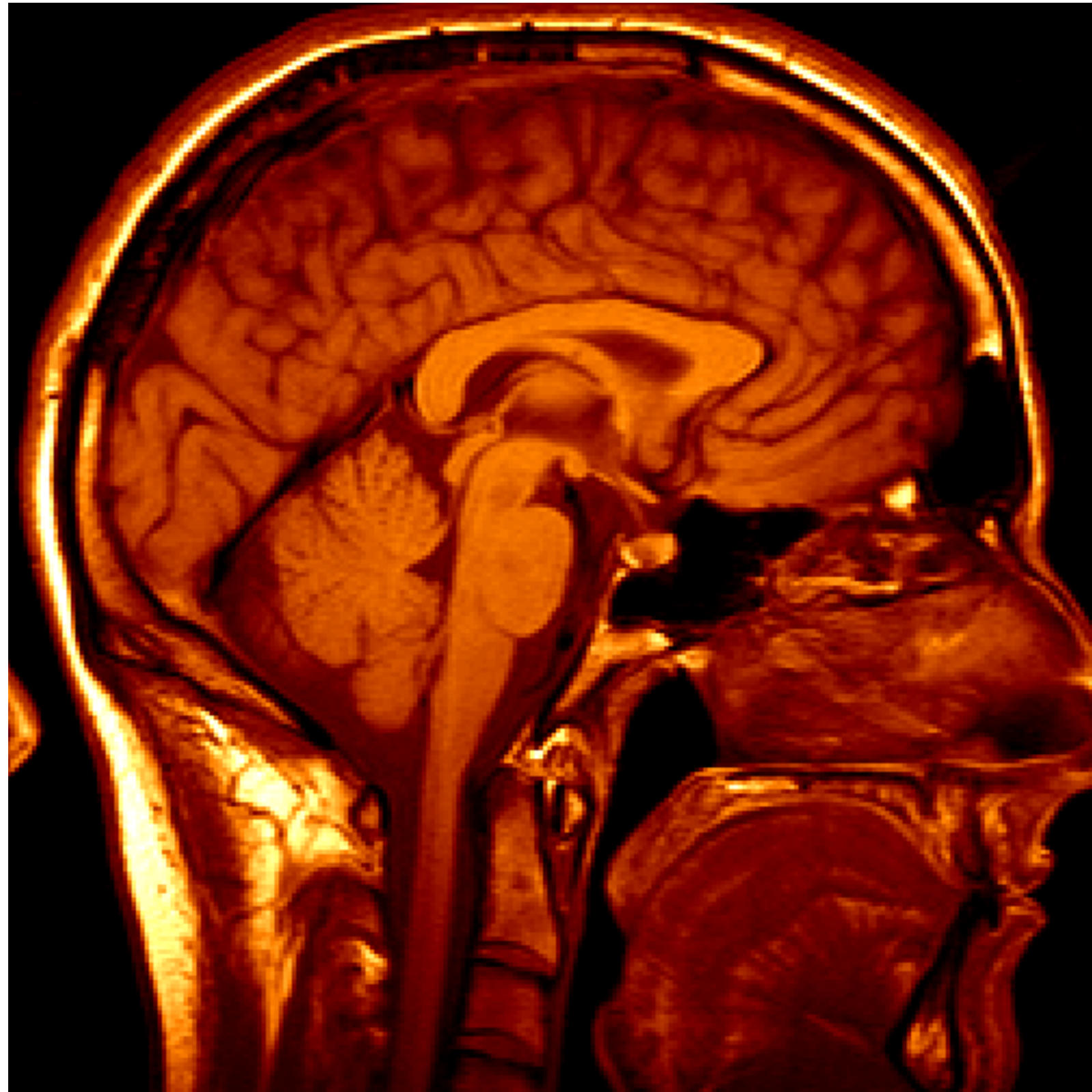


[NASA'S Mars Exploration Rover Spirit](#) captured this westward view from atop a low plateau where Spirit spent the closing months of 2007.

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.

# Vision for **Medical Imaging**

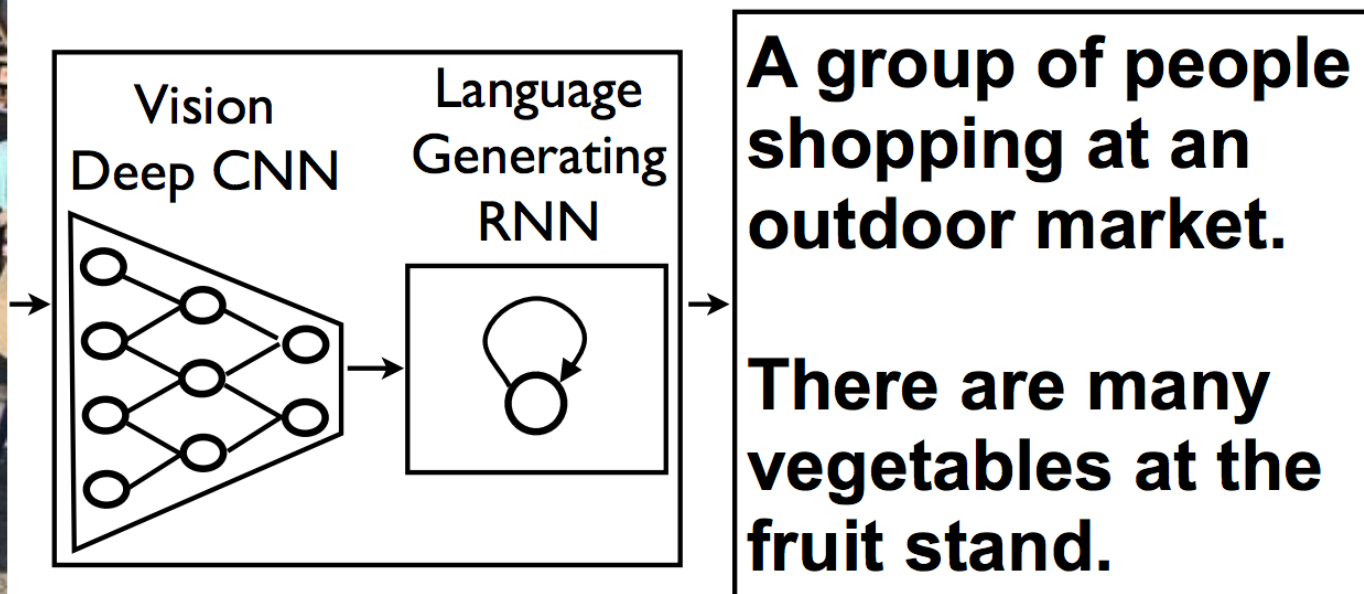


3D imaging  
MRI, CT



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

# Captioning and Visual Question Answering



[ Vinyals et al., 2015 ]

Demo: <http://vqa.clouddcv.org>

Demo: <http://demo.visualdialog.org>

**Q1:** *What color is the bowl ?*

GT answer: *White*  
Predicted answer: *White*  
Rank of GT: *1*



**Q2:** *Do you see any people?*

GT answer: *No*  
Predicted answer: *No, just the cat*  
Rank of GT: *2*



**Q3:** *What color is the cat ?*

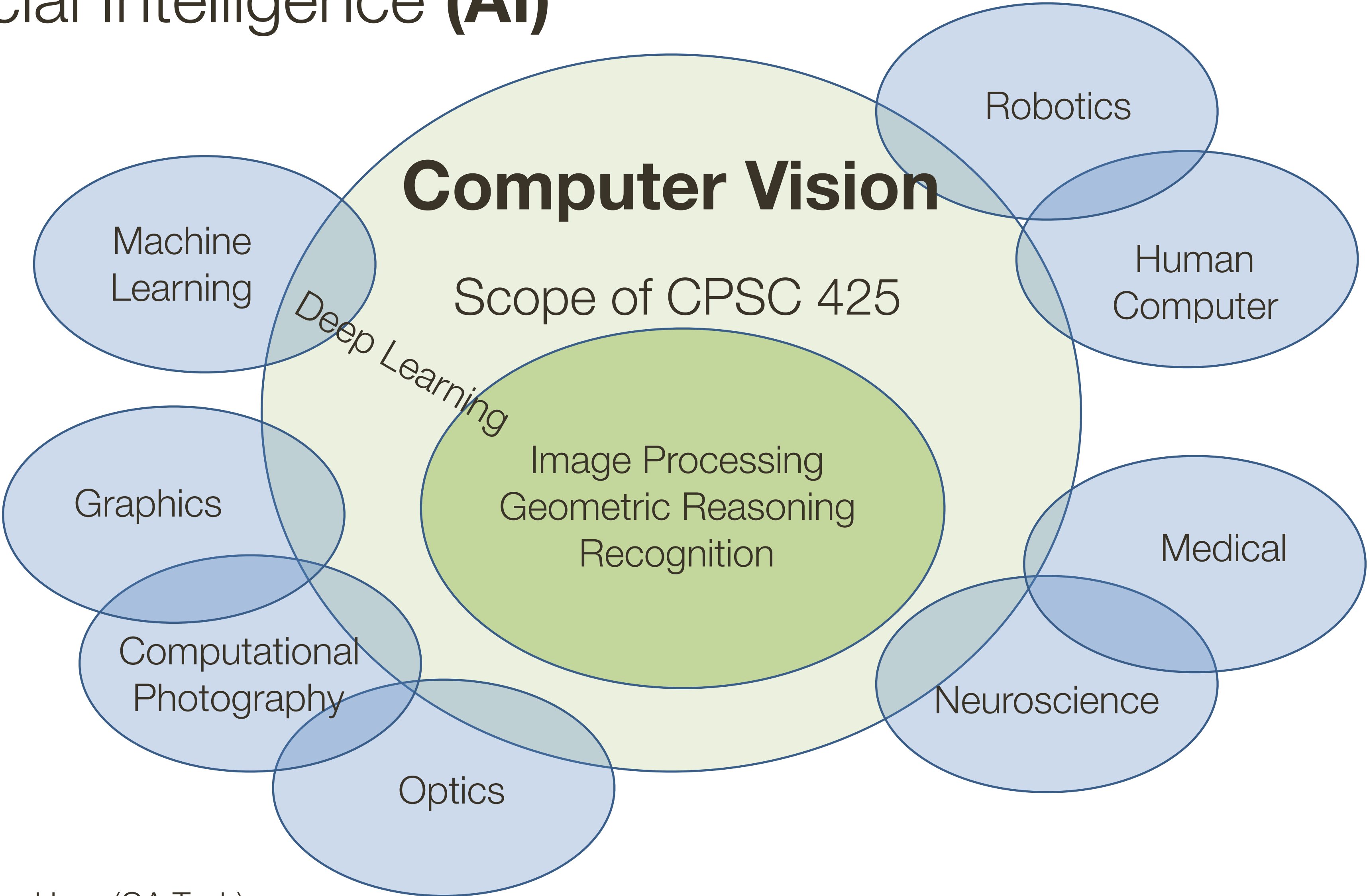
GT answer: *Grey, white, and black*  
Predicted answer: *Grey, black and white*  
Rank of GT: *6*



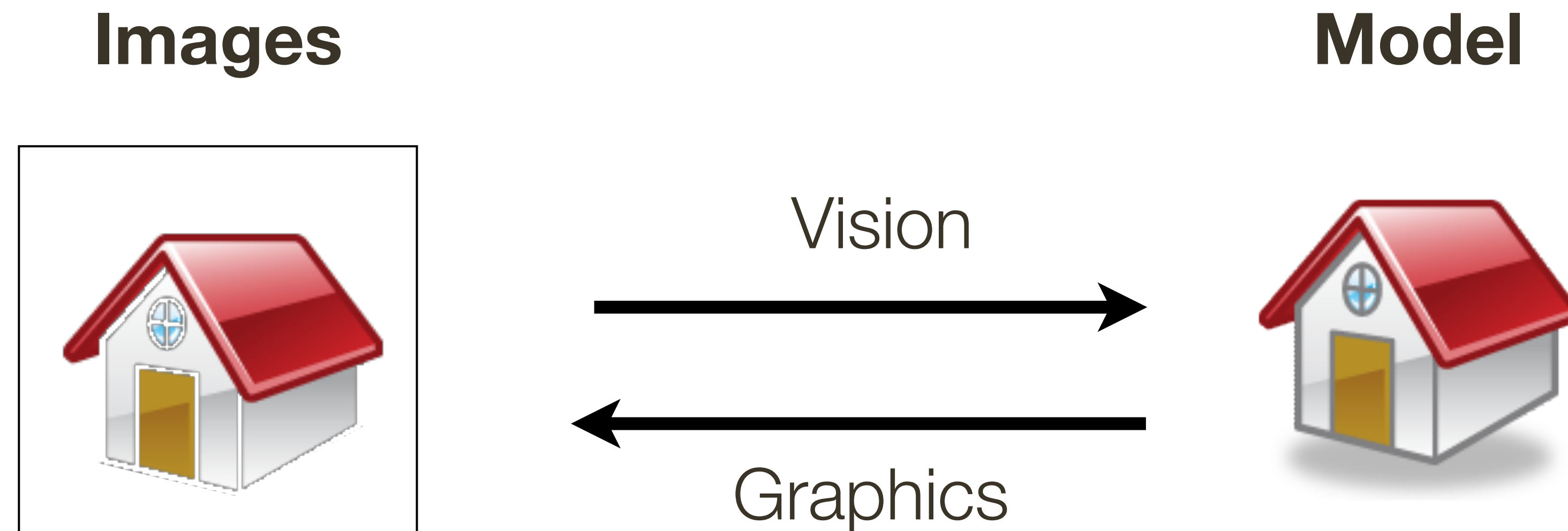
[ Seo et al., NIPS 2017 ]

# Related Disciplines

## Artificial Intelligence (AI)



# Related Disciplines: Vision and Graphics



**Inverse problems: analysis and synthesis**

(it is sometimes useful to think about computer **vision as inverse graphics**)

# Why Study Computer Vision?

It is one of the **most exciting areas of research** in computer science

Among the **fastest growing technologies** in the industry today



WIRED



WHO'S SHAPING THE DIGITAL WORLD?

# Wired's 100 **Most Influential People** in the World

## 63. Yann Lecun

*Director of AI research, Facebook, Menlo Park*

LeCun is a leading expert in deep learning and heads up what, for Facebook, could be a hugely significant source of revenue: understanding its user's intentions.

## 62. Richard Branson

*Founder, Virgin Group, London*

Branson saw his personal fortune grow £550 million when Alaska Air bought Virgin America for \$2.6 billion in April. He is pressing on with civilian space travel with [Virgin Galactic](#).

## 61. Taylor Swift

*Entertainer, Los Angeles*



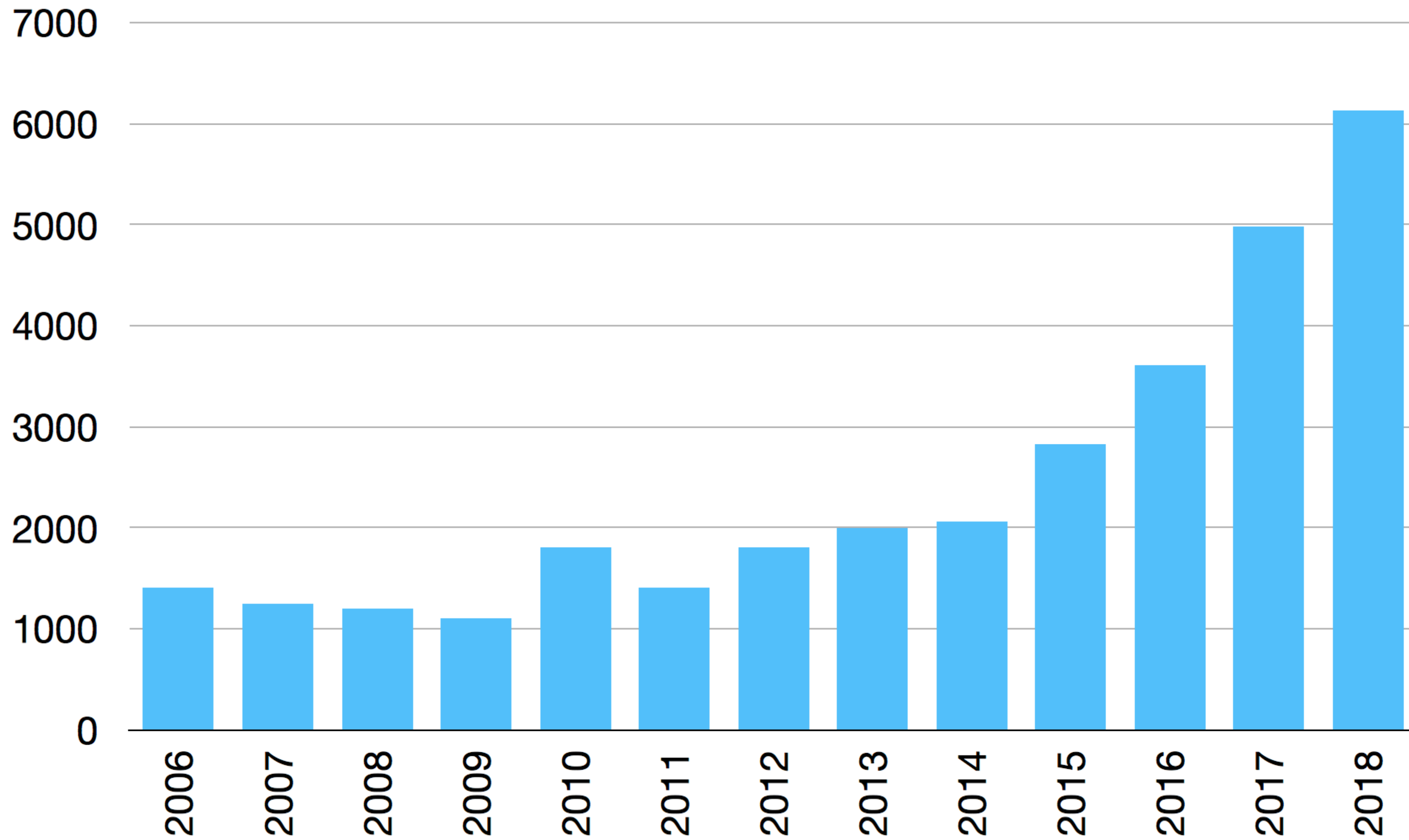


# CVPR 2018

Salt Lake City



# CVPR Attendance



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**Office:** ICICS 119

**TAs:** Polina Zablotskaia



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Tzu-Yun Shann



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Siddhesh Khandelwal



[skhandel@cs.ubc.ca](mailto:skhandel@cs.ubc.ca)

Sarah Elhammadi



[shammadi@cs.ubc.ca](mailto:shammadi@cs.ubc.ca)

**Course webpage:** <http://www.cs.ubc.ca/~lsigal/teaching.html>

**Discussion:** [piazza.com/ubc.ca/winterterm12018/cpsc425](https://piazza.com/ubc.ca/winterterm12018/cpsc425)

# Topics Covered

- Image Processing (Linear Filtering, Convolution)
- Filters as Templates
- Image Feature Detection (Edges & Corners)
- Texture & Colour
- Image Feature Description (SIFT)
- Model Fitting (RANSAC, The Hough Transform)
- Camera Models, Stereo Geometry
- Motion and Optical Flow
- Clustering and Image Segmentation
- Learning and Image Classification

# Course Origins

CPSC 425 was originally developed by **Bob Woodham** and has evolved over the years. Much of the material this year is adapted from material prepared by Bob, as well extensions developed by others who taught this course

## Previously taught by:

- 2016-2017 Term 2 by **Jim Little**
- 2015-2016 Term 2 by **Fred Tung**
- 2015-2015 Term 2 by **Jim Little**

**Note:** This is my first time teaching CPSC 425

# Grading Criteria



In-class **clicker questions**: 10%



**Programming Assignments**: 25%

5 graded and 1 ungraded (optional) assignment



**Midterm Exam** (October 17th): 25%

**Final Exam** (TBD): 40%



# Clicker Questions

**Bring** your i>Clickers to class

**Register your remote:** <https://canvas.ubc.ca/>

There will be clicker questions (not in every lecture):

- 1/2 point for participation
- 1/2 point for correct answer

The clicker questions contribute 10% to your total grade

# Assignments

There will be **6 assignments** in total (5 marked)

- Approximately 1 every 2 weeks
- You will hand these in before class ([read hand in instructions and late policy on course webpage](#))



You will use the **Python**, with the following libraries:  
Python Imaging Library (PIL), NumPy, Matplotlib, SciPy,  
Scikit-Learn

- Assignment 0 (which is ungraded) will introduce you to this.

Assignments contribute 25% to your final score (each graded assignment is 5% of your grade)

# Midterm Exam

[ Tentatively ] on **Wednesday, October 17th**

- Here in class during the lecture period
- Closed book, no notes allowed

Multiple choice, true / false and short answer questions

- Aimed to test your “understanding” of the content of the course

The Midterm exam will contribute 25% to your final score

# Final Exam

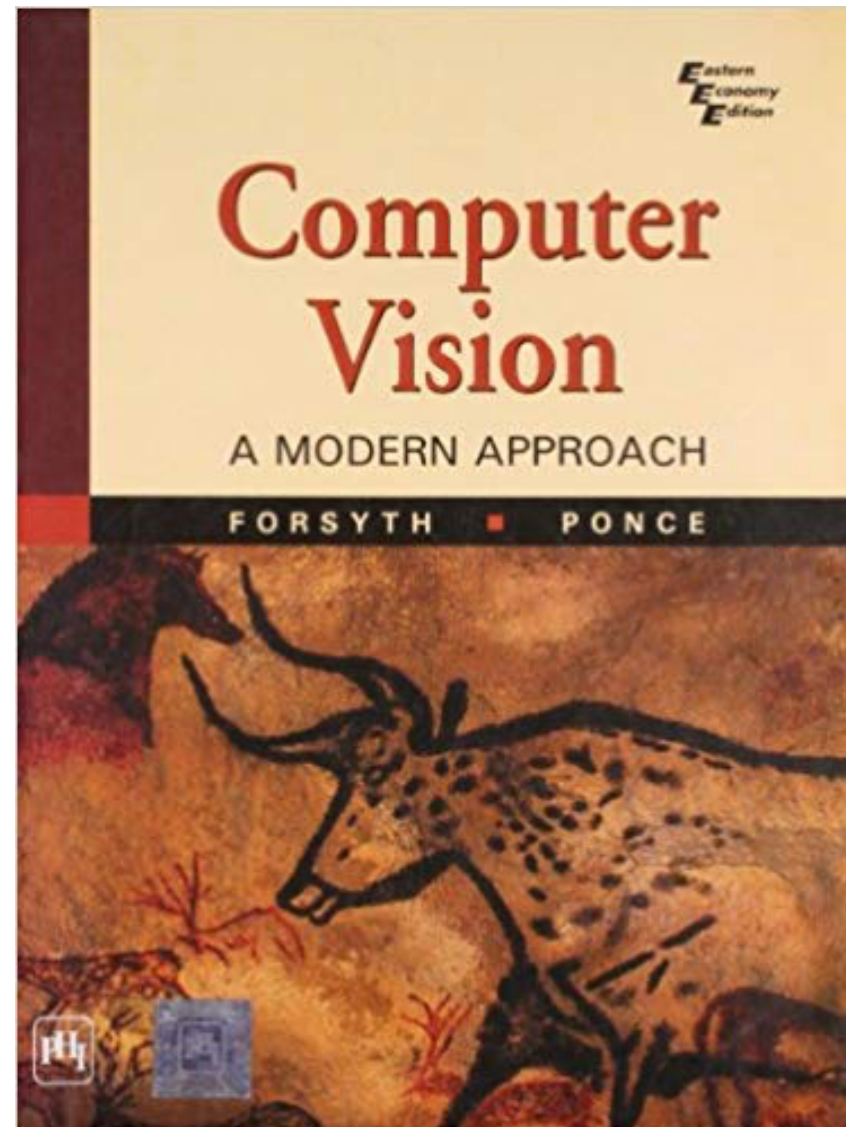
The Final exam is held during the regular examination period, **December 4 — December 19, 2018**, and is scheduled by the Registrar's Office

Similar to the midterm but longer and with more extensive short/medium answer questions

The Final exam will contribute 40% to your final score

# Textbooks

The course uses the following textbook, which is recommended (but **not required**):

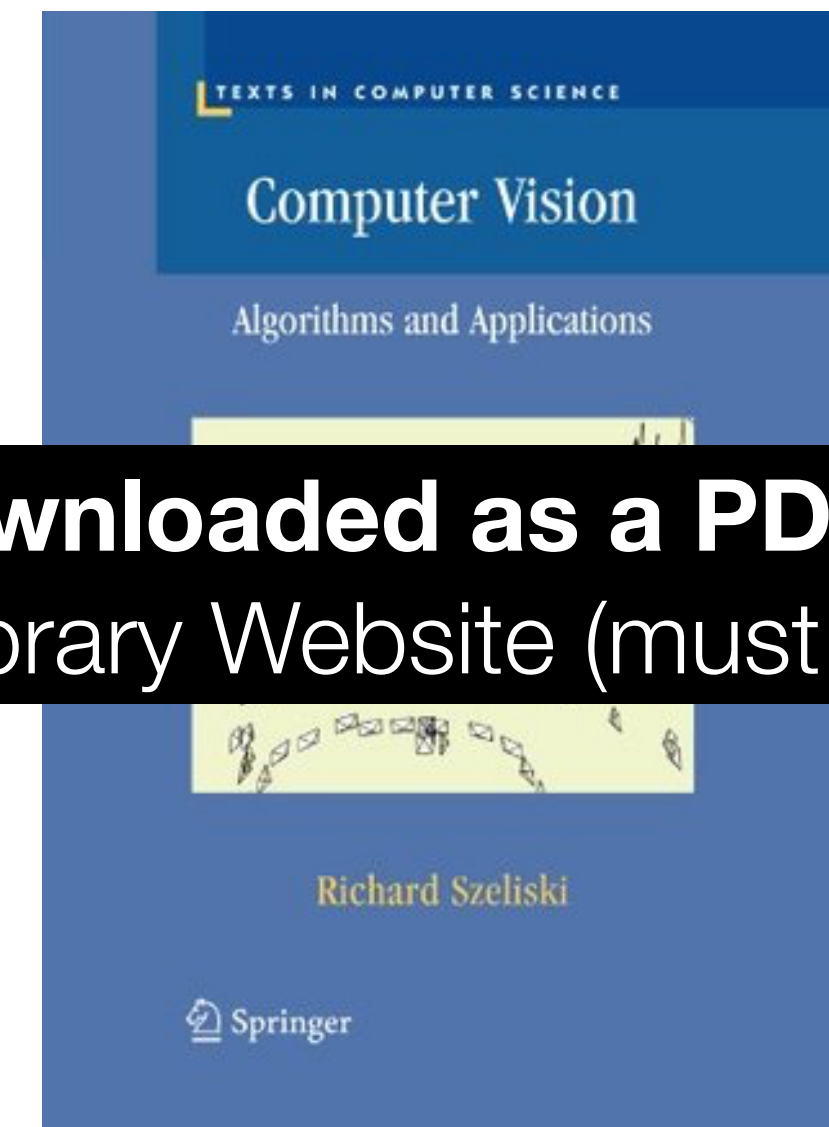


## Computer Vision: A Modern Approach (2nd edition)

**By:** D. Forsyth & J. Ponce

**Publisher:** Pearson

**Pub. Date:** 2012



## Computer Vision: Algorithms and Applications

**By:** R. Szeliski

**Publisher:** Springer

**Pub. Date:** 2010

Can be **freely downloaded as a PDF** from SpringeLink, through UBC Library Website (must login using CWL).

# Readings

You will be assigned **readings**.

- Sometimes you will be assigned readings from other sources

Ideally, you want read the assigned reading **before coming** to the lecture

- Reading assignments will be posted on course webpage
- They will also be mentioned in class

# Prepare for the **Next Lecture**

## Readings:

- **Next** Lecture: Forsyth & Ponce (2nd ed.) 1.1.1 — 1.1.3

## Reminders:

- Start working on **Assignment 0** (ungraded) due Wednesday, **September 12**
- **[optional]** Watch TED talk by Prof. Fei-Fei Li  
<https://www.youtube.com/watch?v=40riCqvRoMs>