

# Introduction



# Overview of today's lecture

- Teaching staff introductions
- What is computer vision?
- Course fast-forward and logistics

Teaching staff introductions

# Instructor: Ioannis (Yannis) Gkioulekas

I won't hold it against you if you mispronounce my last name



Originally from Greece



National Technical University of Athens (2004-2009)



Harvard University (2009-2017)



Carnegie Mellon University (2017-now)

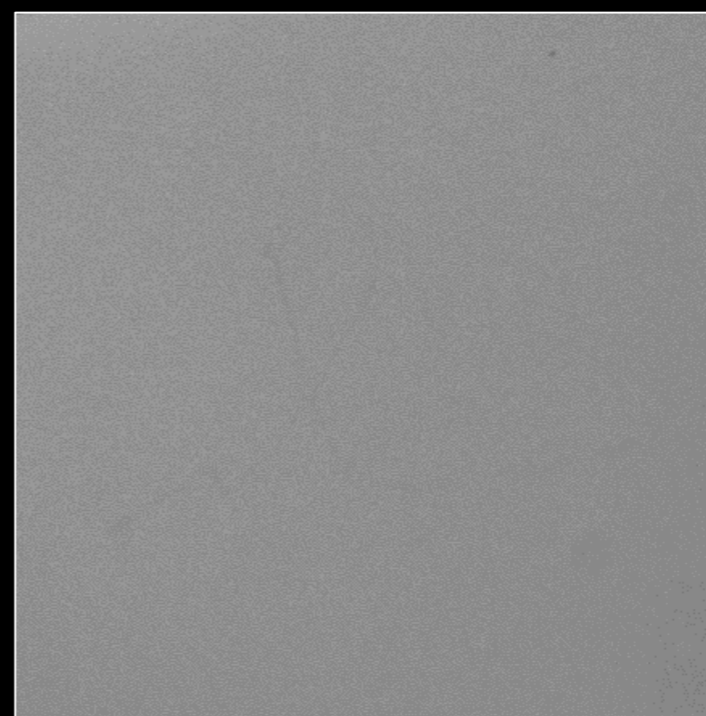
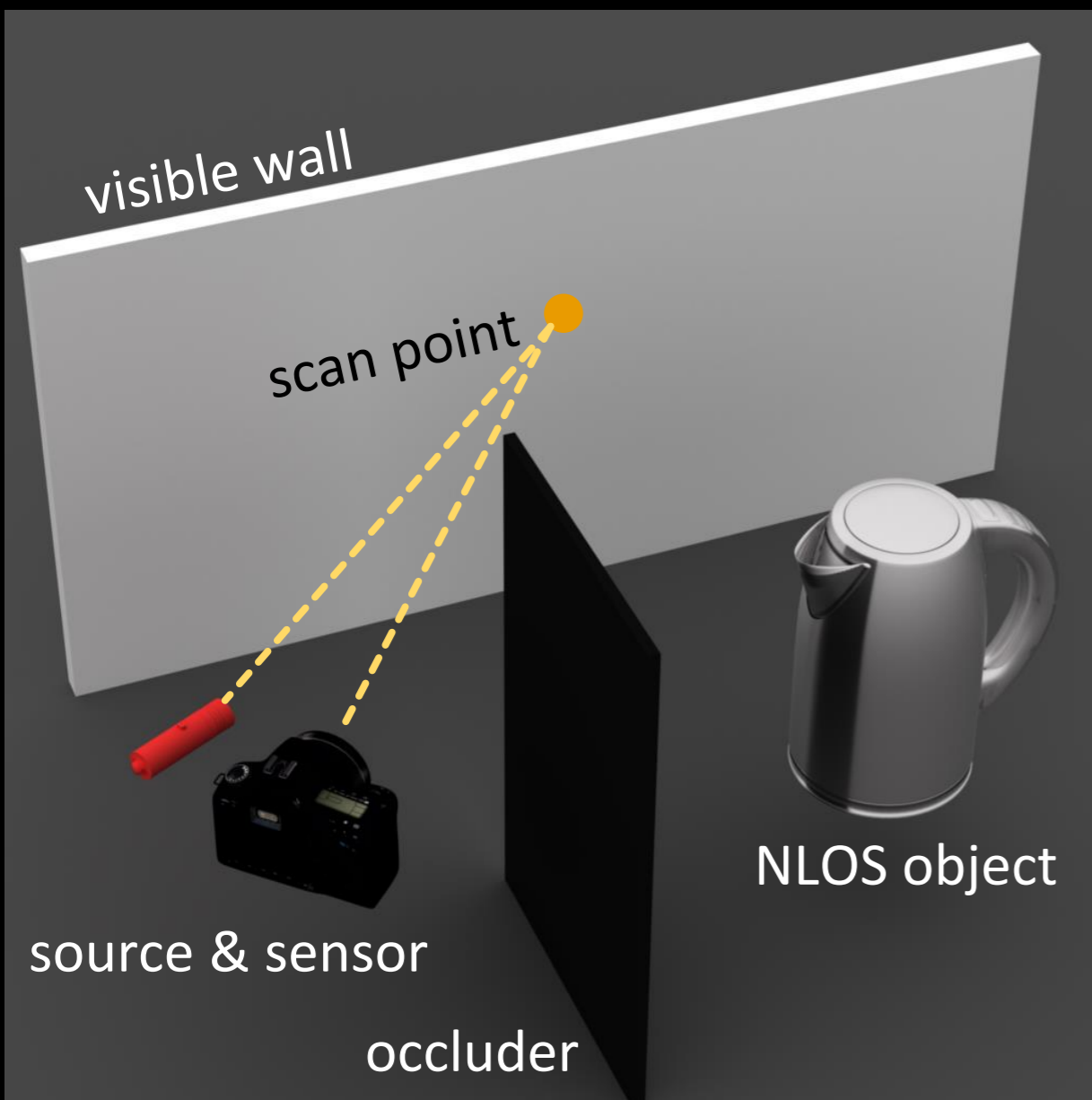


Yannis at Harvard in 2011

My website: <http://www.cs.cmu.edu/~igkioule>

See also: <http://imaging.cs.cmu.edu/>

# Looking around corners

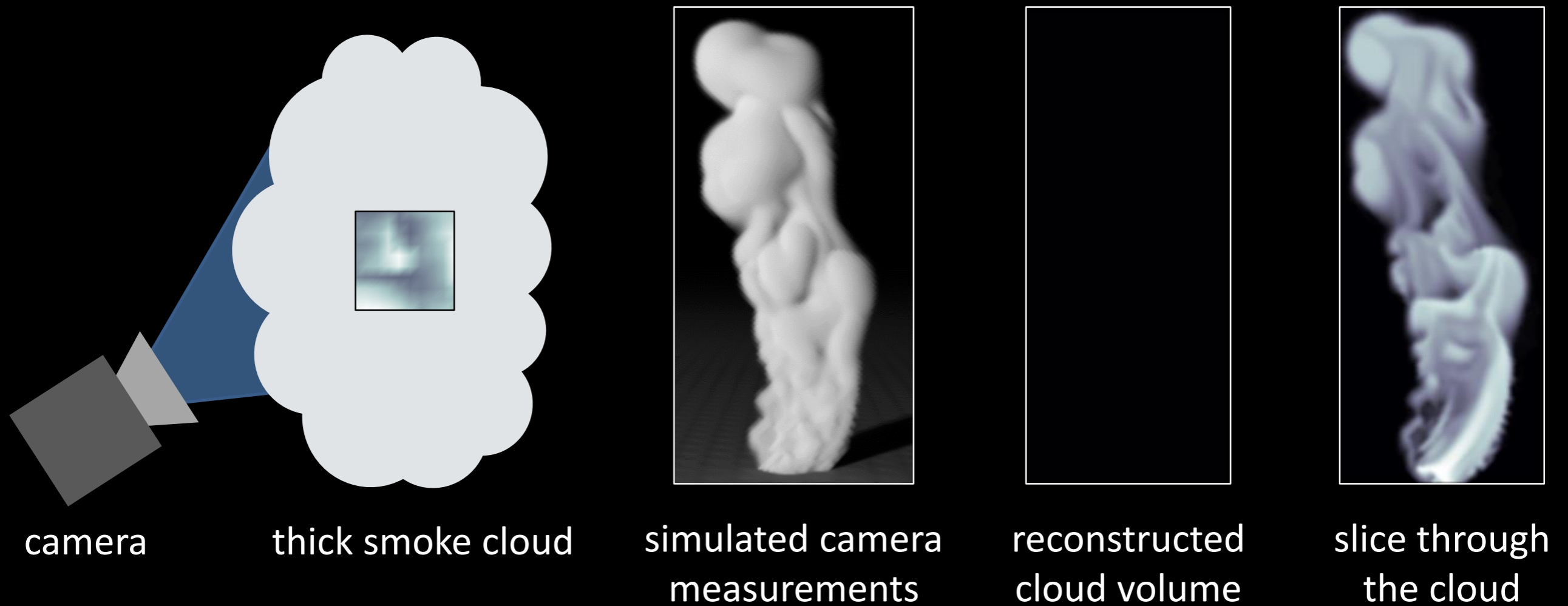


what a regular camera sees

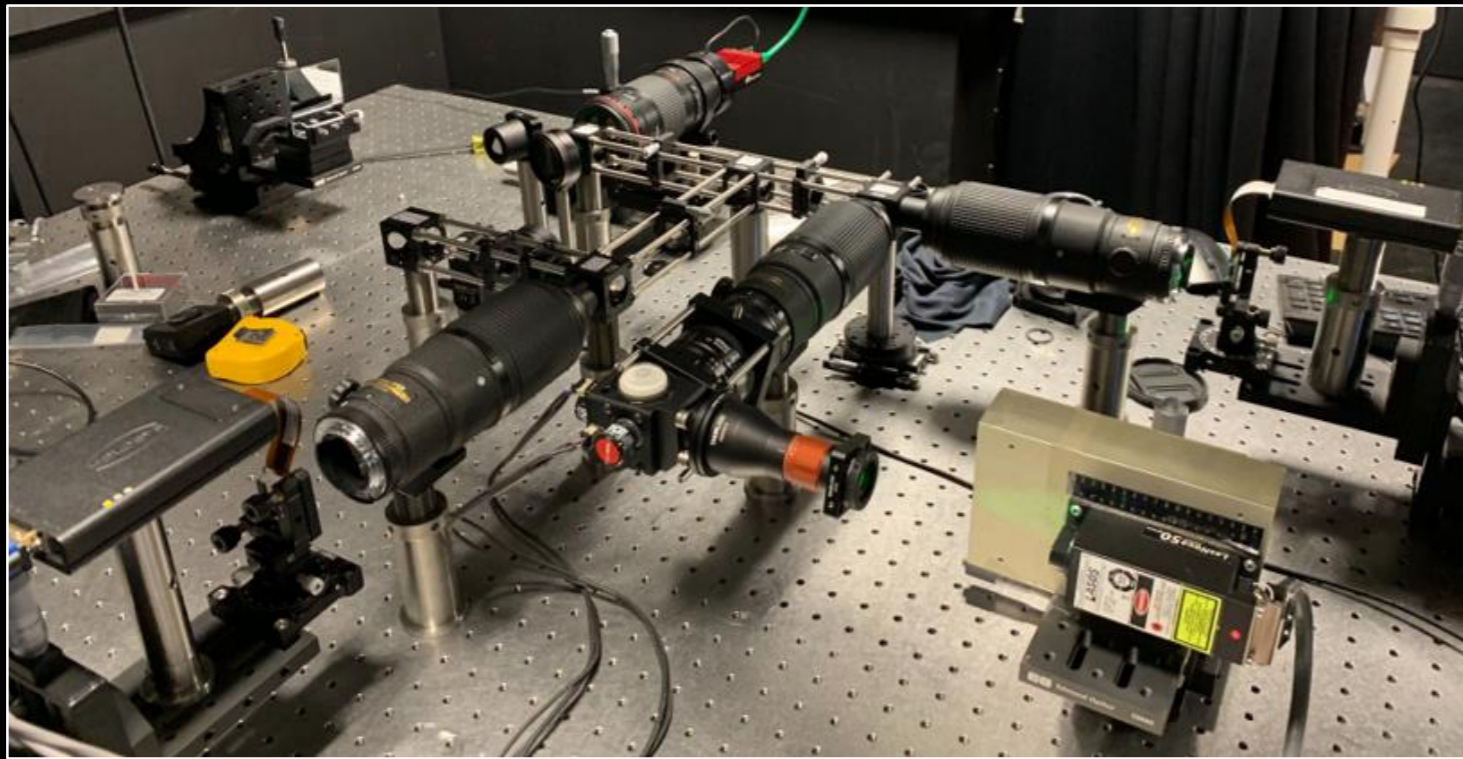


what we can reconstruct

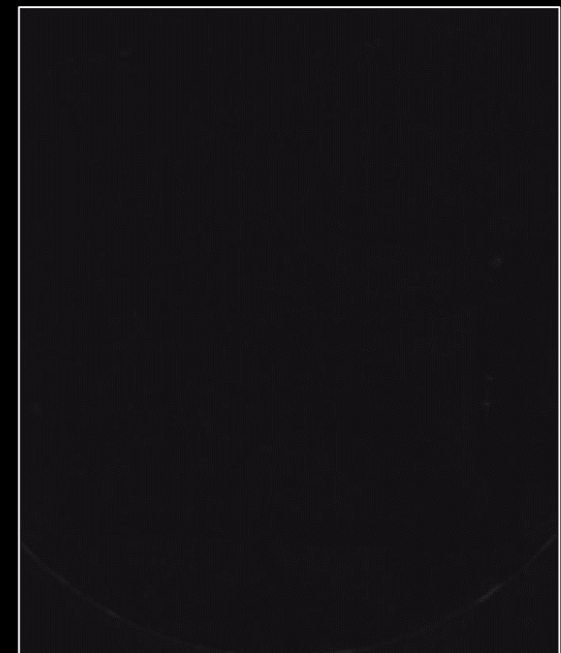
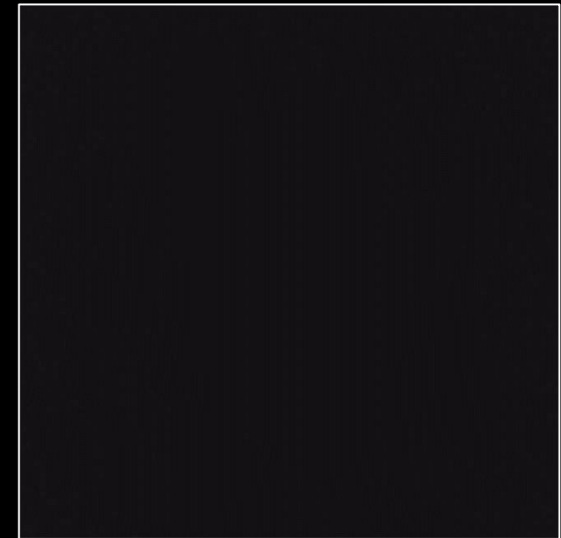
# Looking inside deep scattering objects



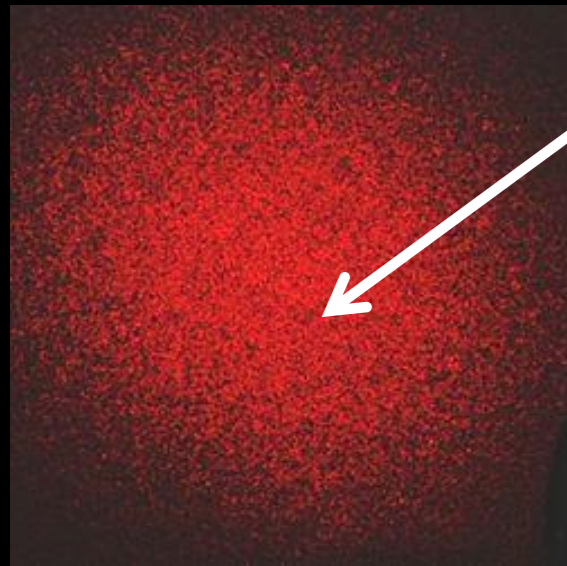
# Seeing light in flight



camera for capturing video at  $10^{15}$  frames per second

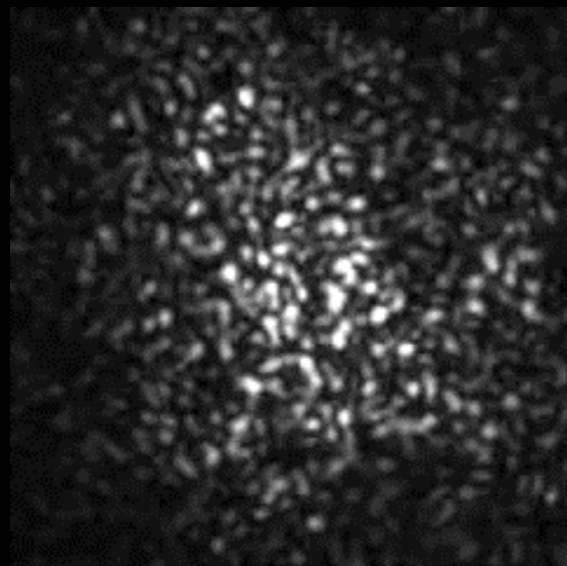


# Rendering wave effects

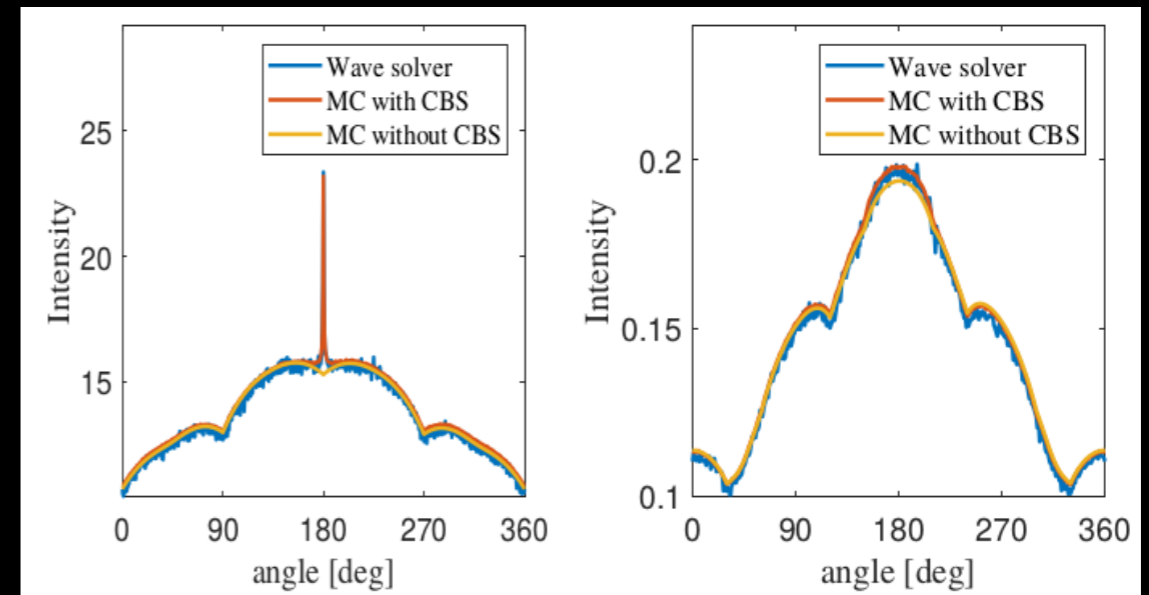


speckle: noise-like pattern

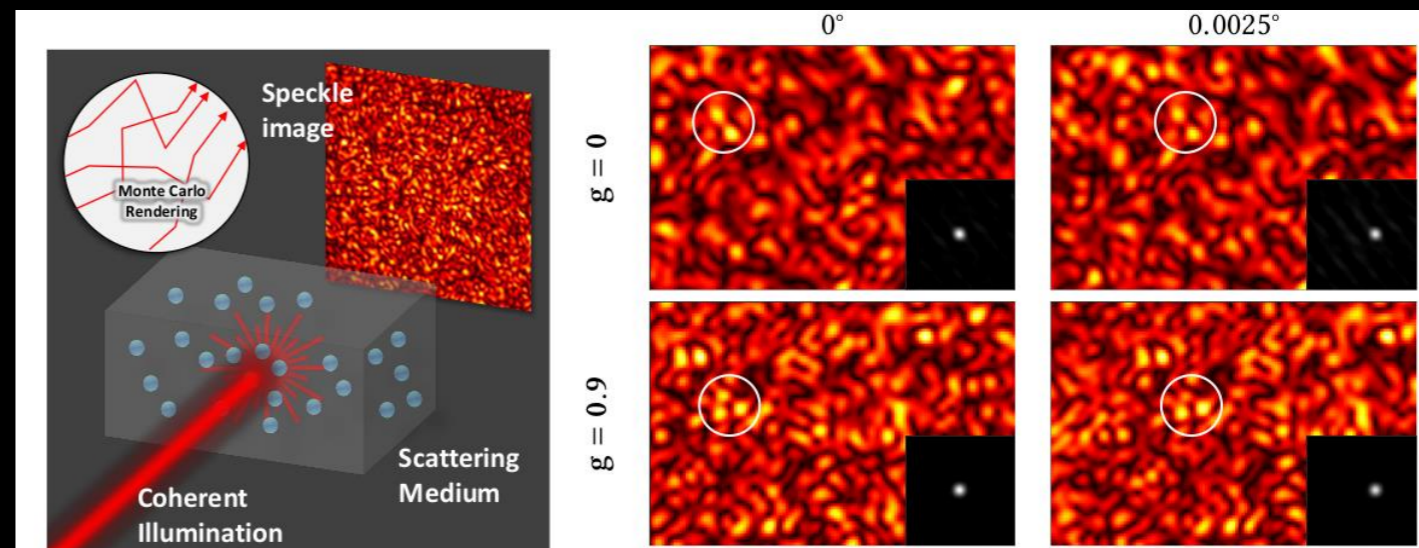
what real laser images look like



what real laser videos look like



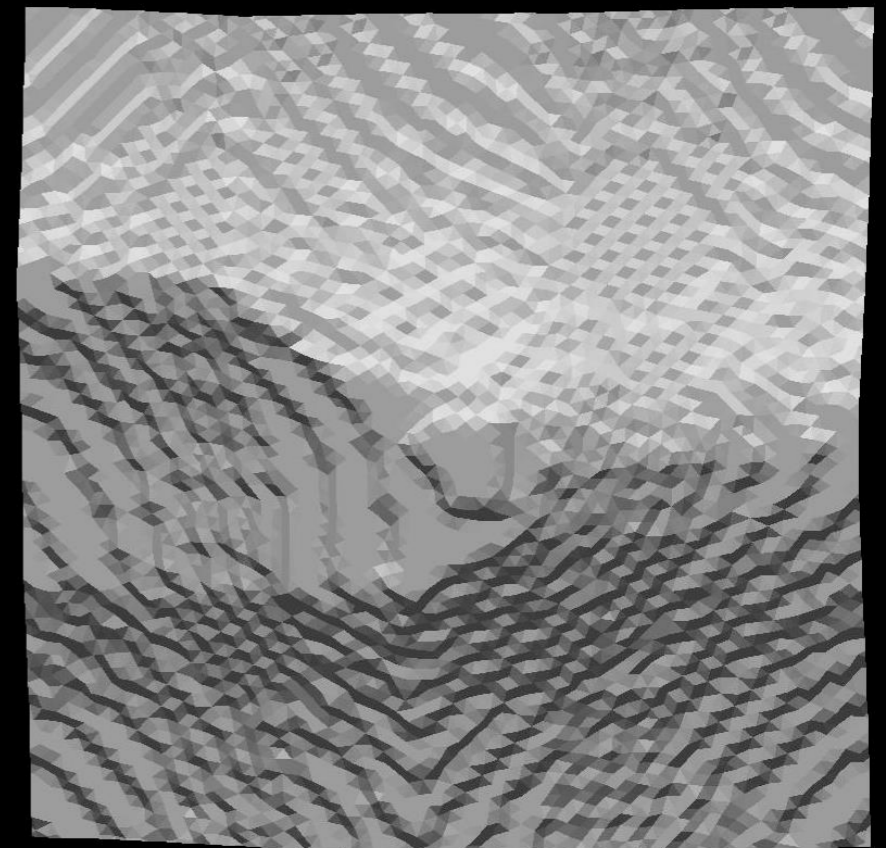
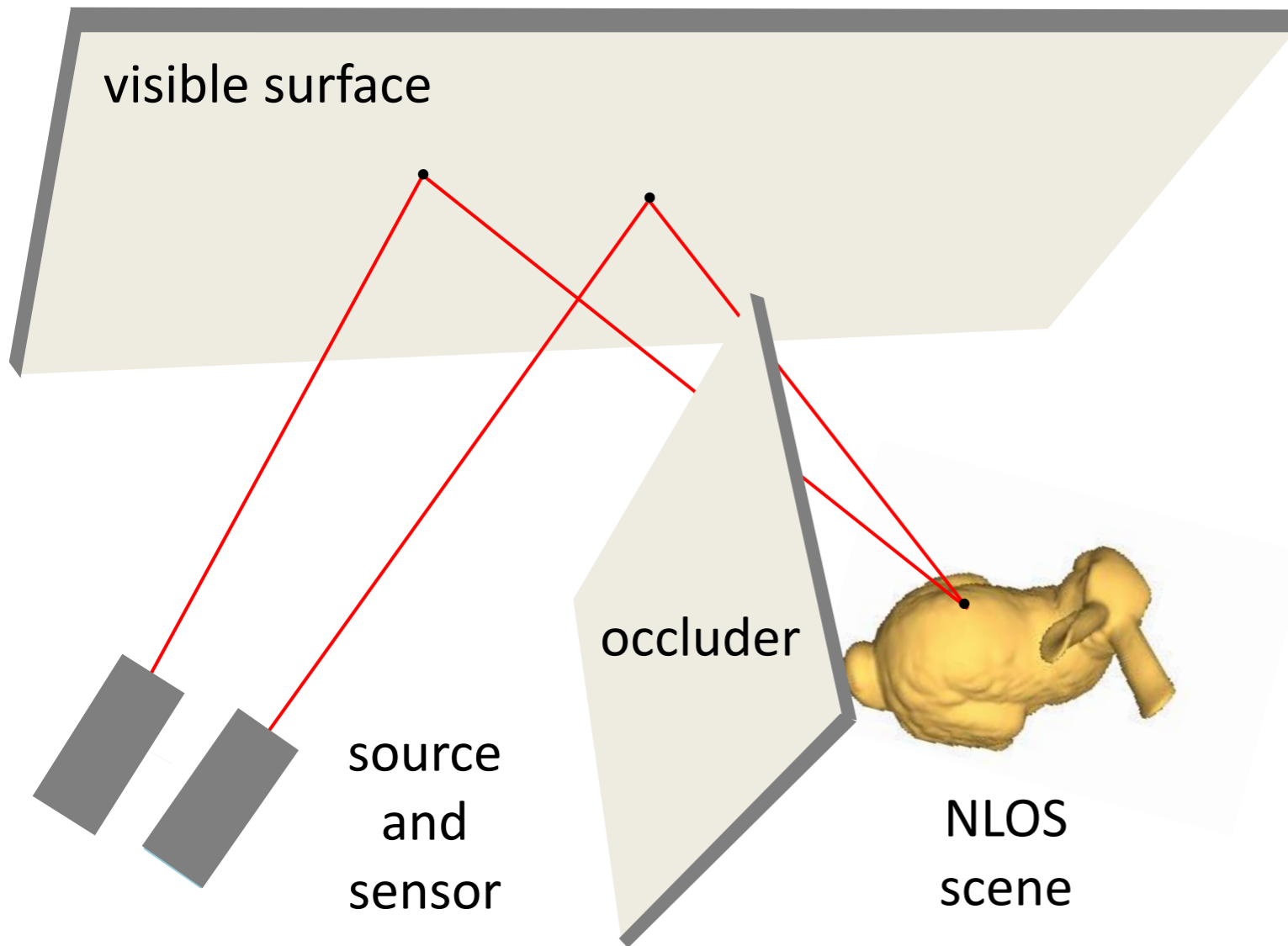
match wave equation solvers, **10<sup>5</sup>x faster**



reproduce physical effects like memory effect



# Differentiable rendering



reconstruction evolution

<http://imaging.cs.cmu.edu/>

# TA: Anand Bhoraskar

Master of Science in Computer Vision (MSCV)

## **Research Interests:**

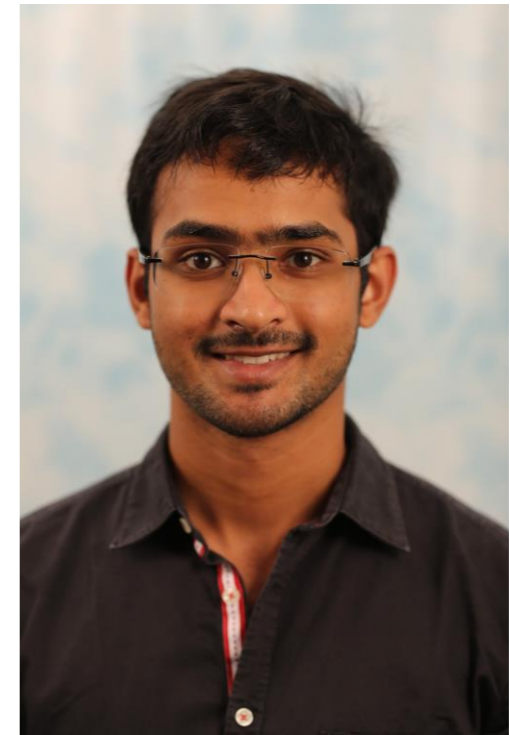
Simultaneous Localization and Mapping (SLAM),  
Deep Learning, Object Detection/Tracking

## **Current Area of Research:**

Long term mapping for SLAM for dynamic environments

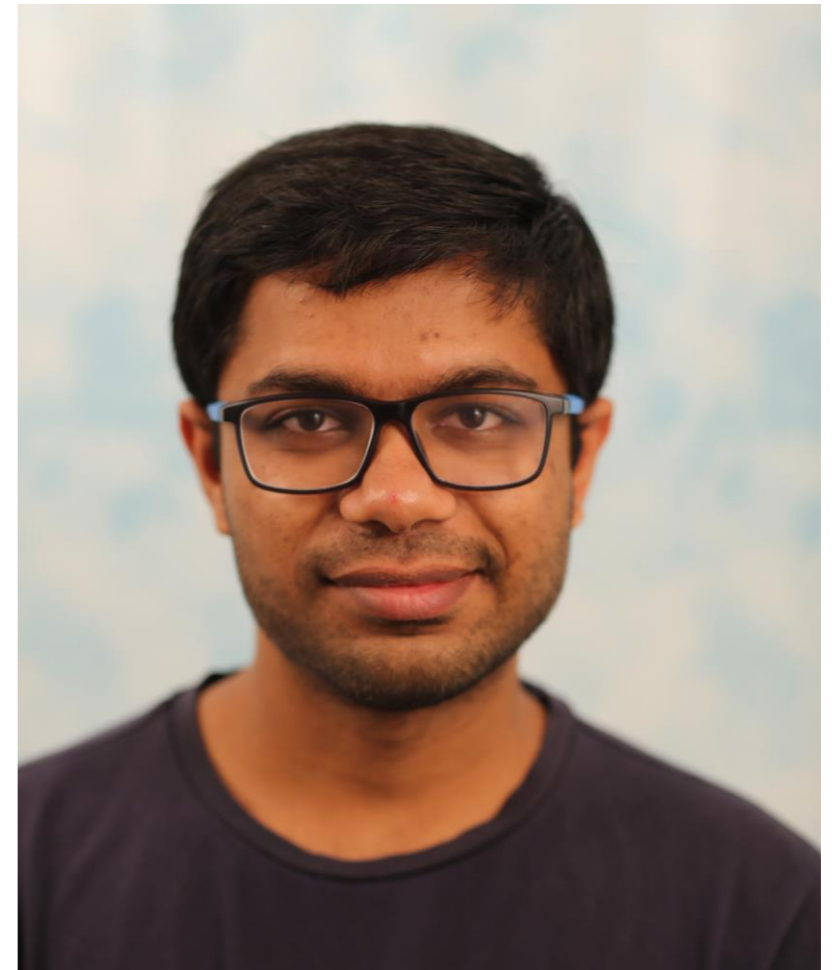
## **Past Research:**

Video Stabilization, Object Tracking



# TA: Prakhar Kulshreshtha (PK)

- **Master of Science in Computer Vision (MSCV)**
- **Research Interests:**
  - Deep Learning for Detection and Instance Segmentation
  - SLAM
  - Online Learning in Computer Vision
- **Current area of research:**
  - Long-term SLAM for Dynamic environments (under Prof. Michael Kaess)
- **Past Research:**
  - Instance segmentation for quality estimation of food grains on a smartphone
  - Text Intelligence in smartphone keyboard apps
  - Online Face Clustering



What is  
computer vision?



**What a person sees**





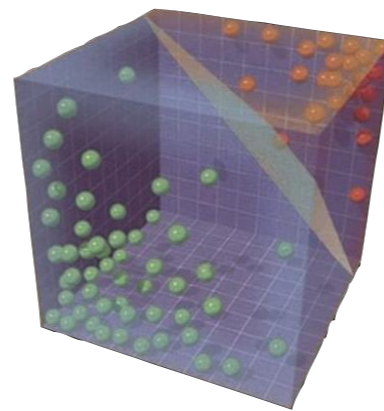
**Why are we able to interpret this image?**

The goal of computer vision is  
to give computers  
**(super) human-level perception**



# typical perception pipeline

**representation**



'fancy math'



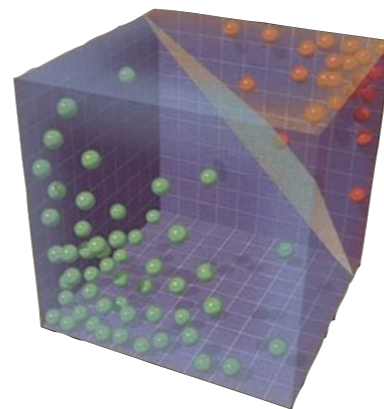
**output**

# typical perception pipeline

**representation**



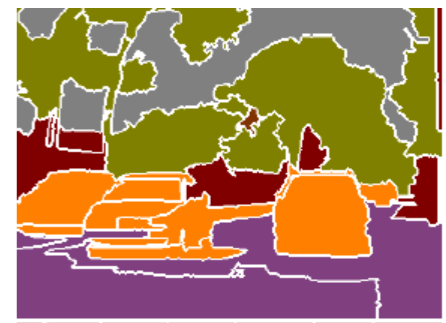
what should we look at?  
(image features)



'fancy math'



**output**



what can we understand?  
(semantic segmentation)

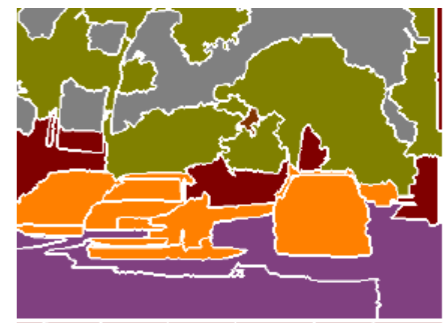
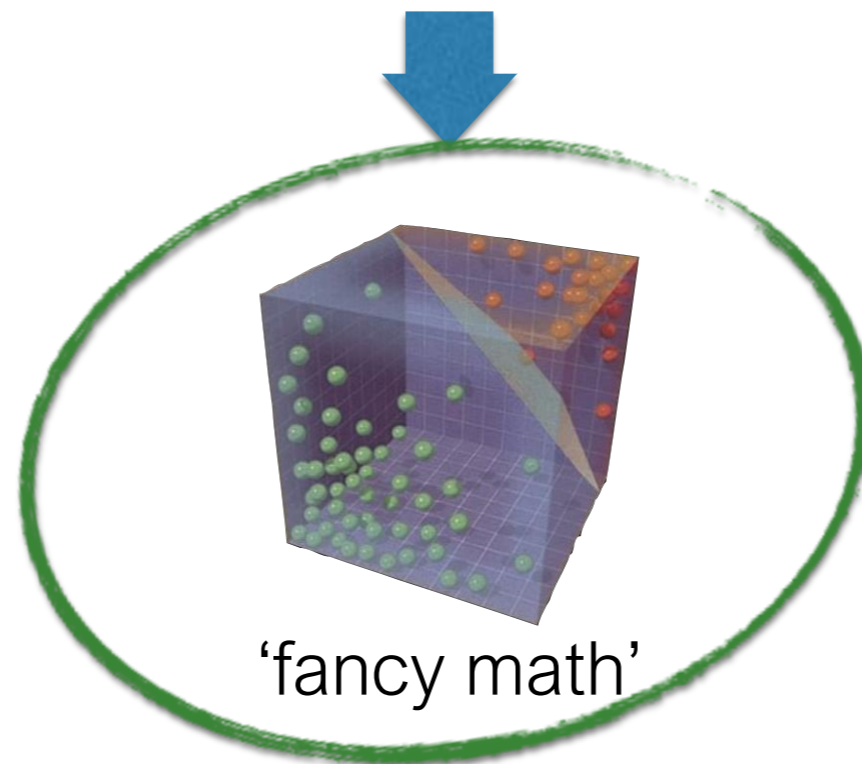
# typical perception pipeline

**representation**



what should we look at?  
(image features)

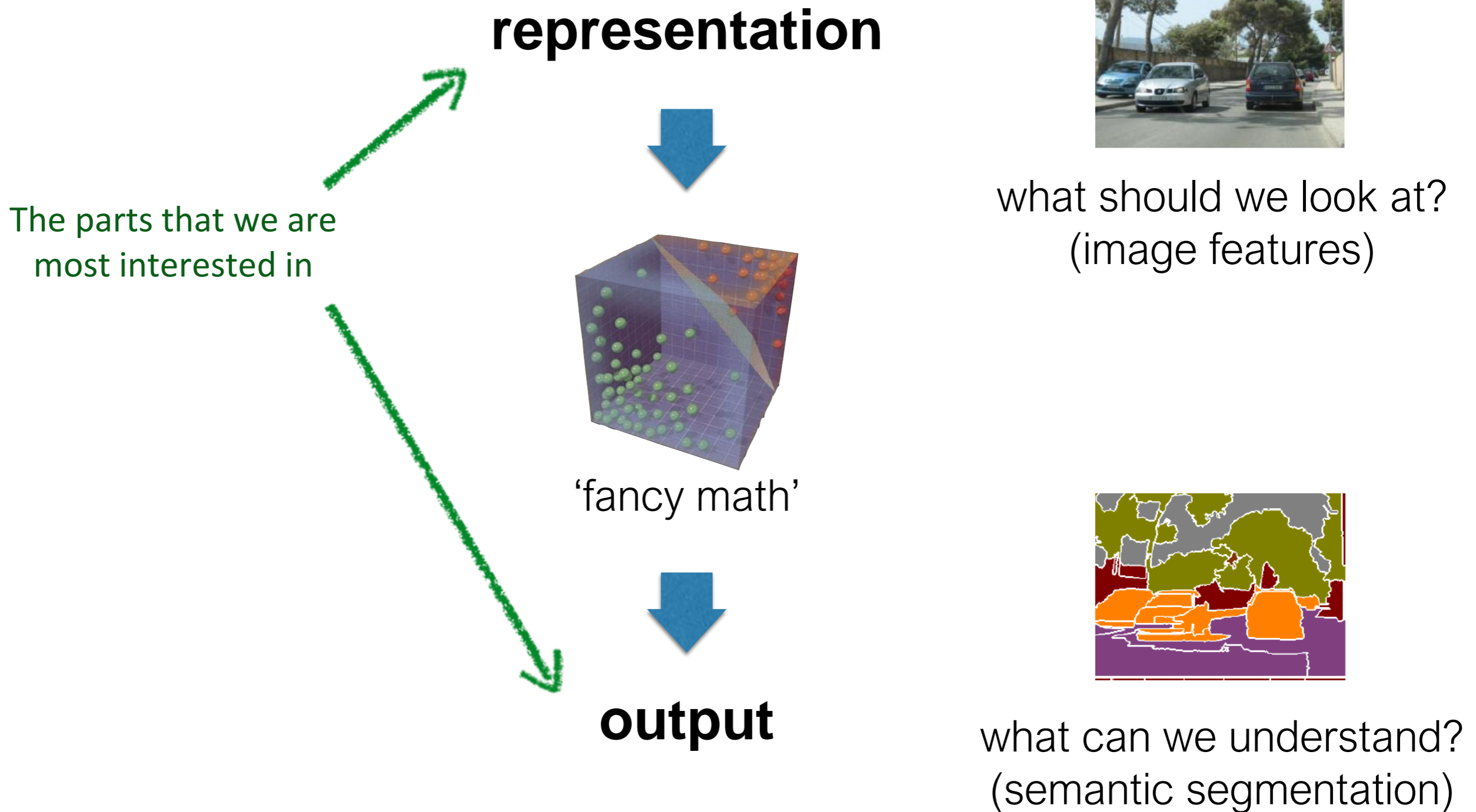
easy to get lost in  
the techniques



**output**

what can we understand?  
(semantic segmentation)

# typical perception pipeline



Important note:

**In general, computer vision does not work**

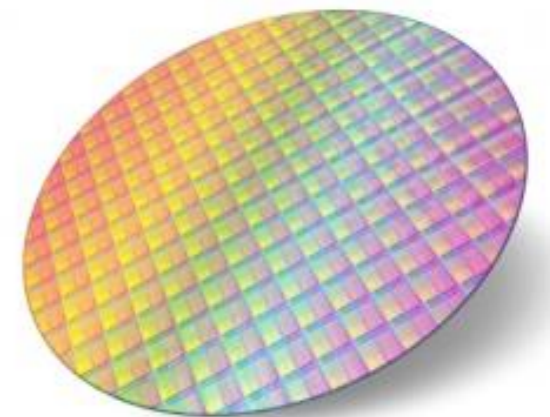
Important note:

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

# Applications of computer vision

# Machine vision

Automated visual inspection





# Object Recognition



Toshiba Tech IS-910T

2013



DataLogic LaneHawk LH4000

2012

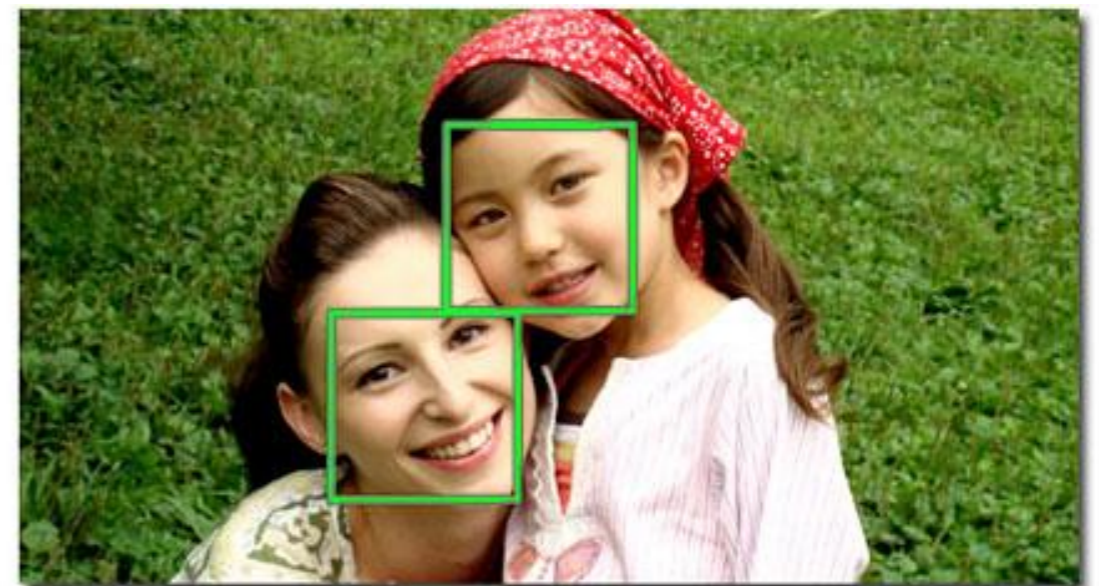
# Face detection



Sony Cyber-shot



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

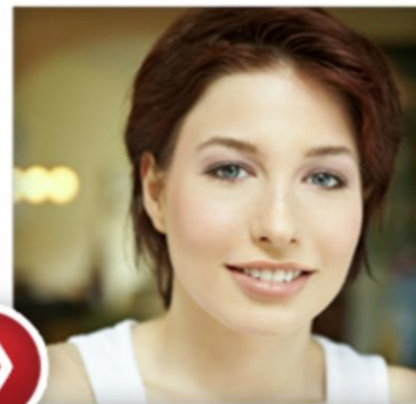
BROWSE LOOKS

TRENDS

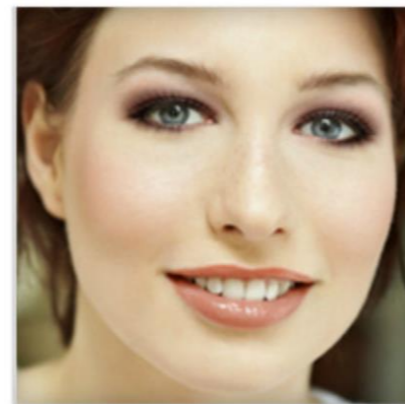
ADVICE

ABOUT

Creating  
your own  
new look  
is easy



1. Upload your photo

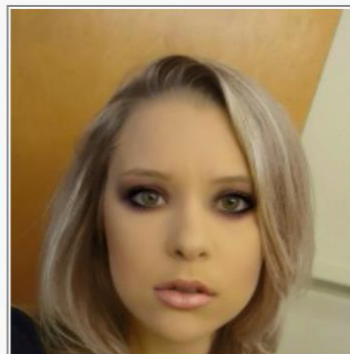


2. Apply some makeup



3. Choose a hairstyle

try  
it  
now!



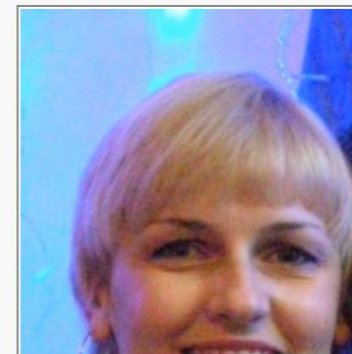
TODAY'S FEATURED MAKEOVER

**rtyjukilop.l,kmujny**

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!



# leafsnap



- Snap It! Results**
-  **Red Maple**  
*Acer rubrum*
  -  **Striped Maple**  
*Acer pensylvanicum*
  -  **Sycamore Maple**  
*Acer pseudoplatanus*

- ⓘ
-  First Last Scientific ⓘ
-  *Ilex opaca*
  -  **American Hornbeam**  
*Carpinus caroliniana*
  -  **American Linden**  
*Tilia americana*
  -  **American Sycamore**  
*Platanus occidentalis*
  -  **Amur Corktree**  
*Phellodendron amurense*
- Q  
A  
B  
C  
D  
E  
F  
G  
H  
J  
K  
L  
M  
N  
O  
P  
Q  
R  
S  
T  
U  
V  
W  
Y
- Home Browse Collection Options Snap It!



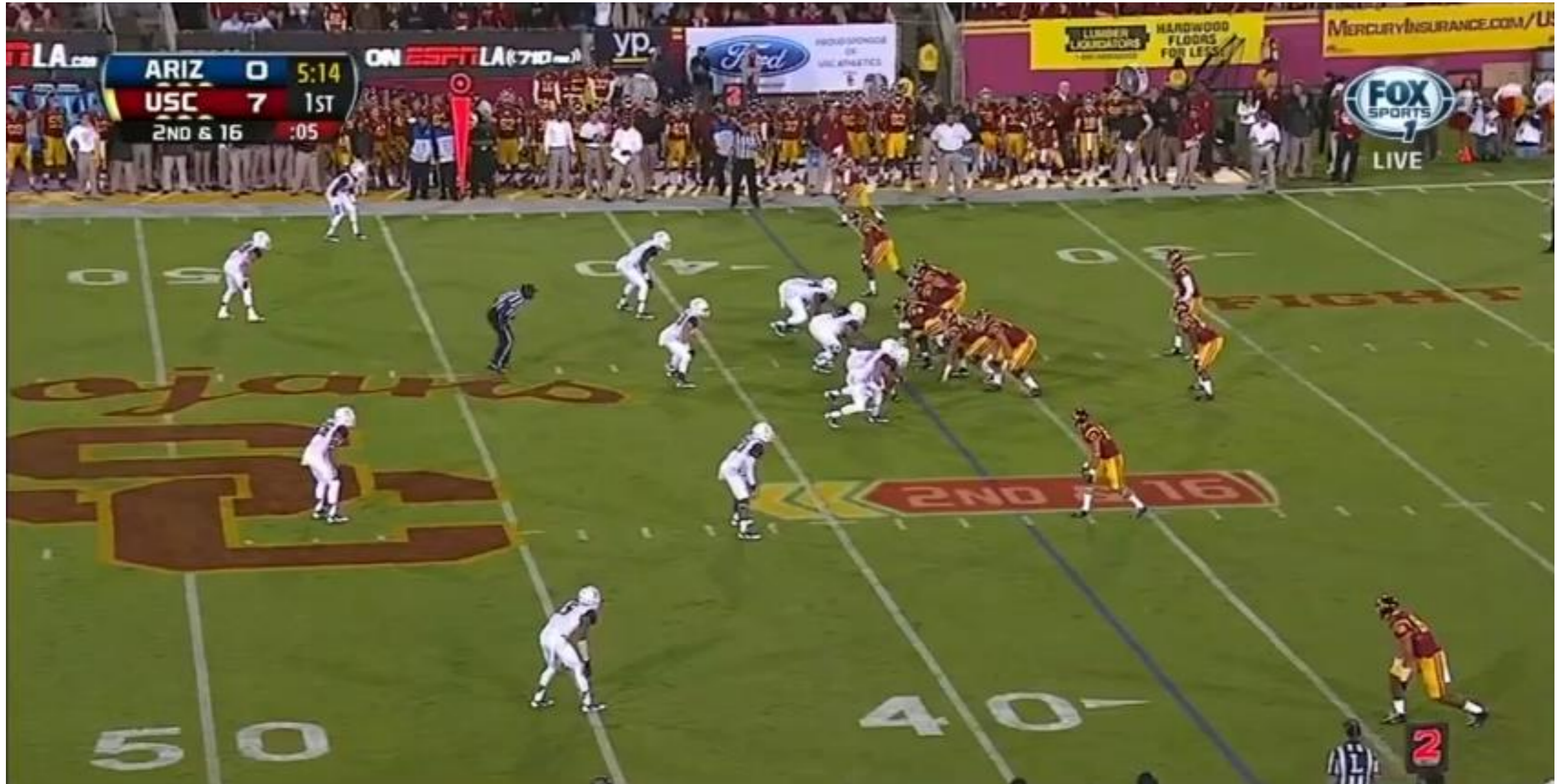
**Word Lens**



Word Lens

[www.QuestVisual.com](http://www.QuestVisual.com)

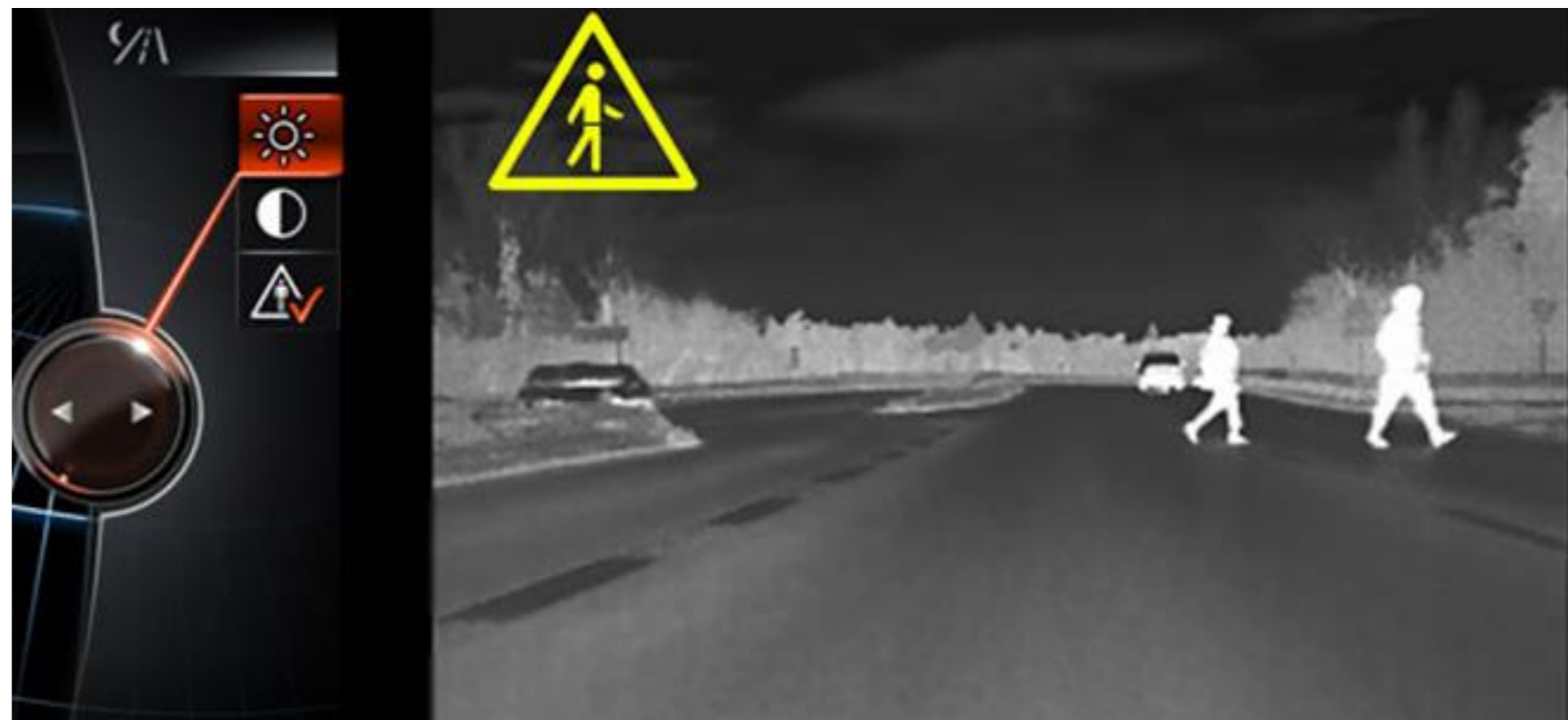
# First-down line





BMW 5 series

BMW night vision







“Around view” camera

Infinity EX





The system converts image data taken by 4 super-wide angle cameras, to display a virtual image of the vehicle from above.



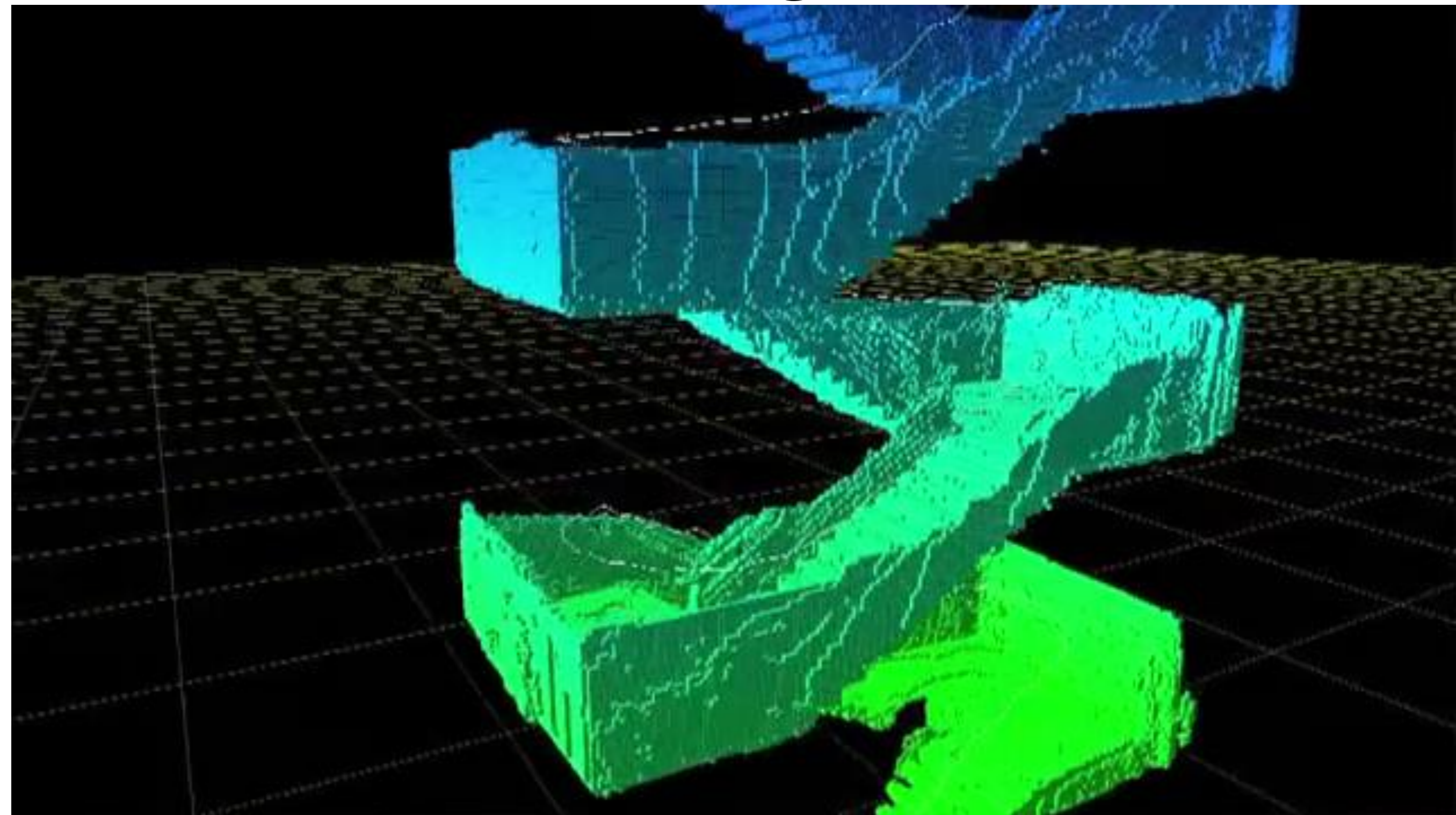
# Image stitching



# Photosynth



# Tango



# Virtual Fitting



# Computer Vision for VR

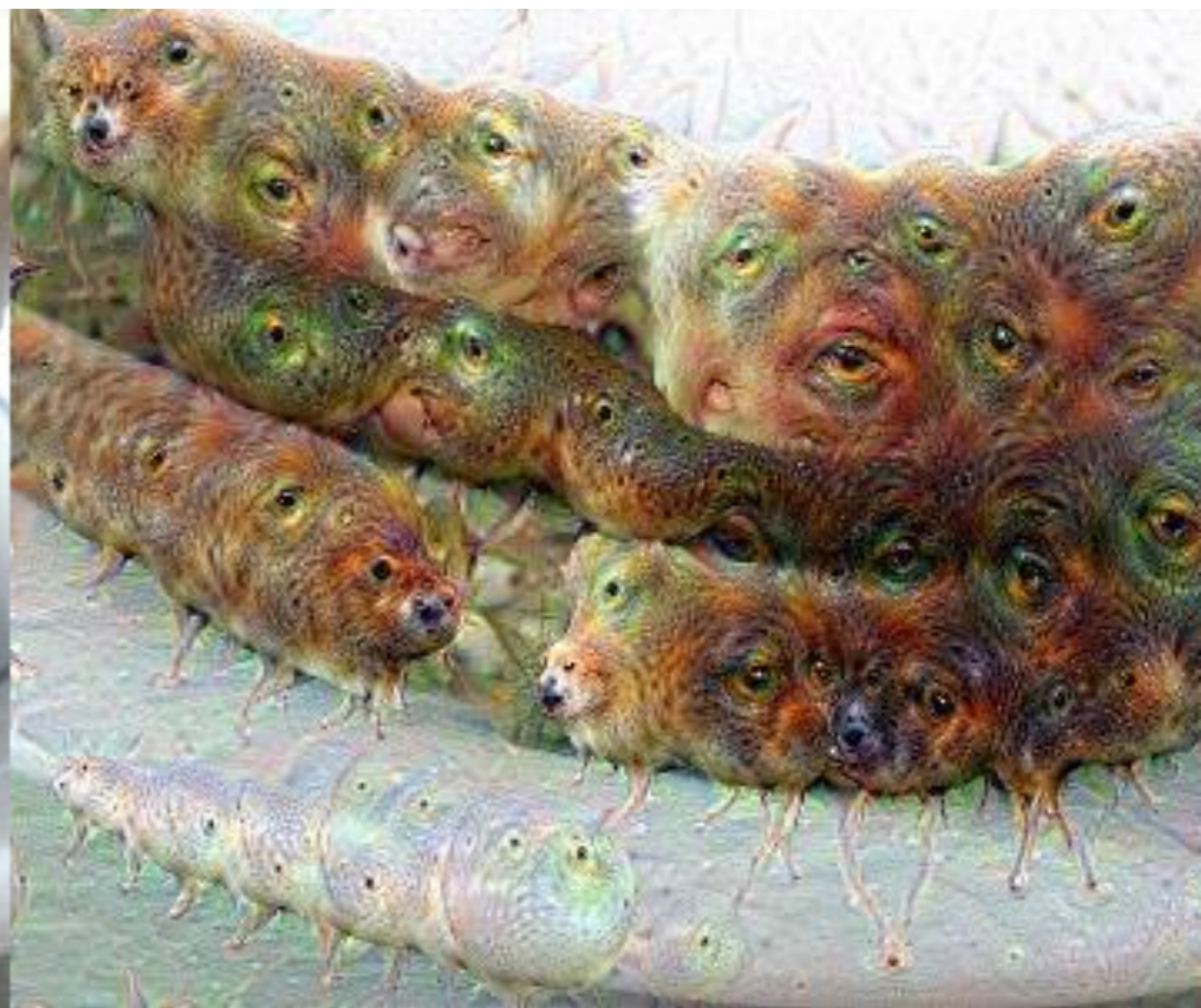




# Deep Face



# Deep Dream





Facebook video style transfer 2016

# Face2Face: Real-time Face Capture and Reenactment of RGB Videos

*Justus Thies<sup>1</sup>, Michael Zollhöfer<sup>2</sup>,  
Marc Stamminger<sup>1</sup>, Christian Theobalt<sup>2</sup>,  
Matthias Nießner<sup>3</sup>*

<sup>1</sup>University of Erlangen-Nuremberg

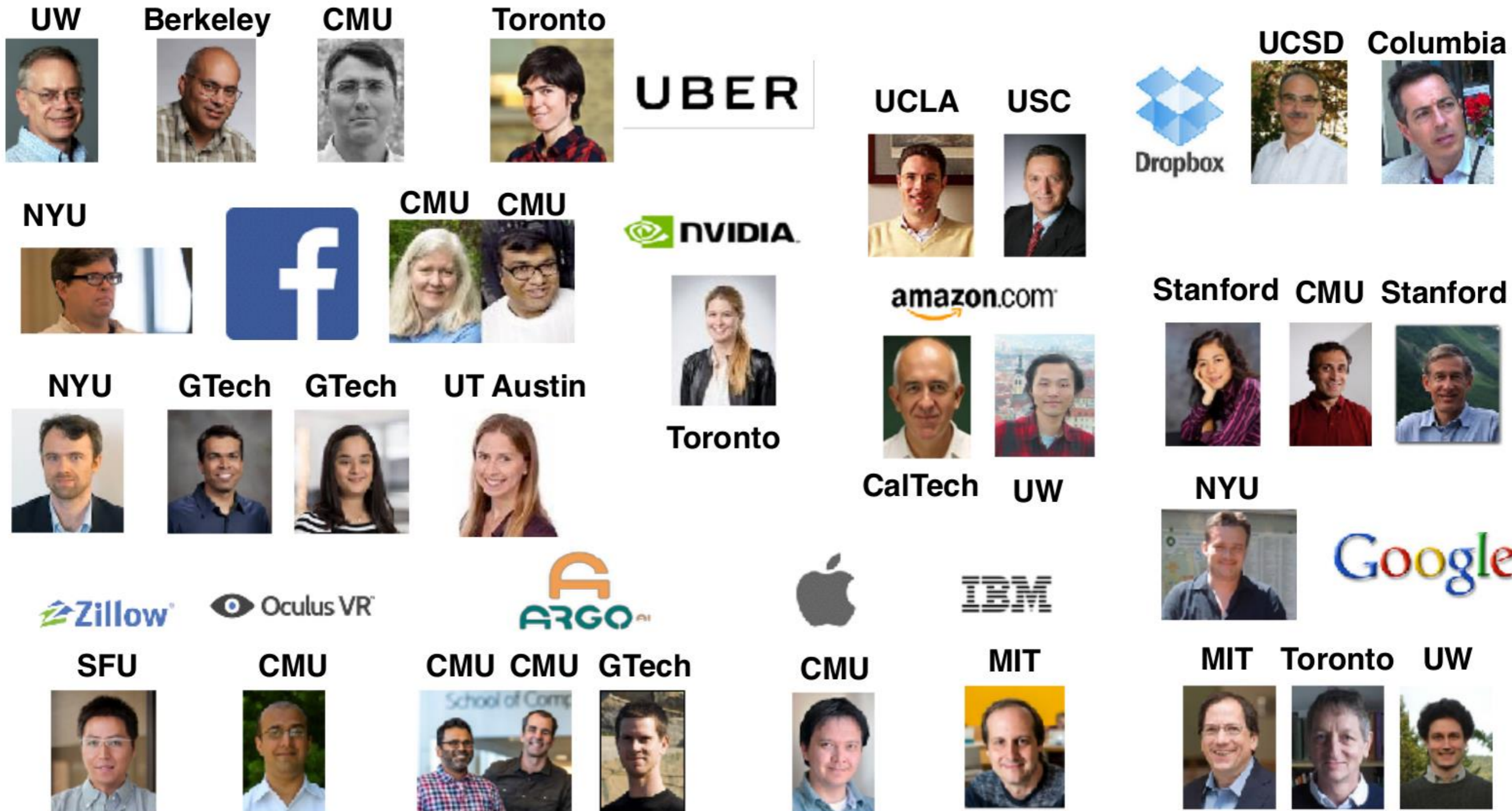
<sup>2</sup>Max-Planck-Institute for Informatics

<sup>3</sup>Stanford University

**CVPR 2016 (Oral)**

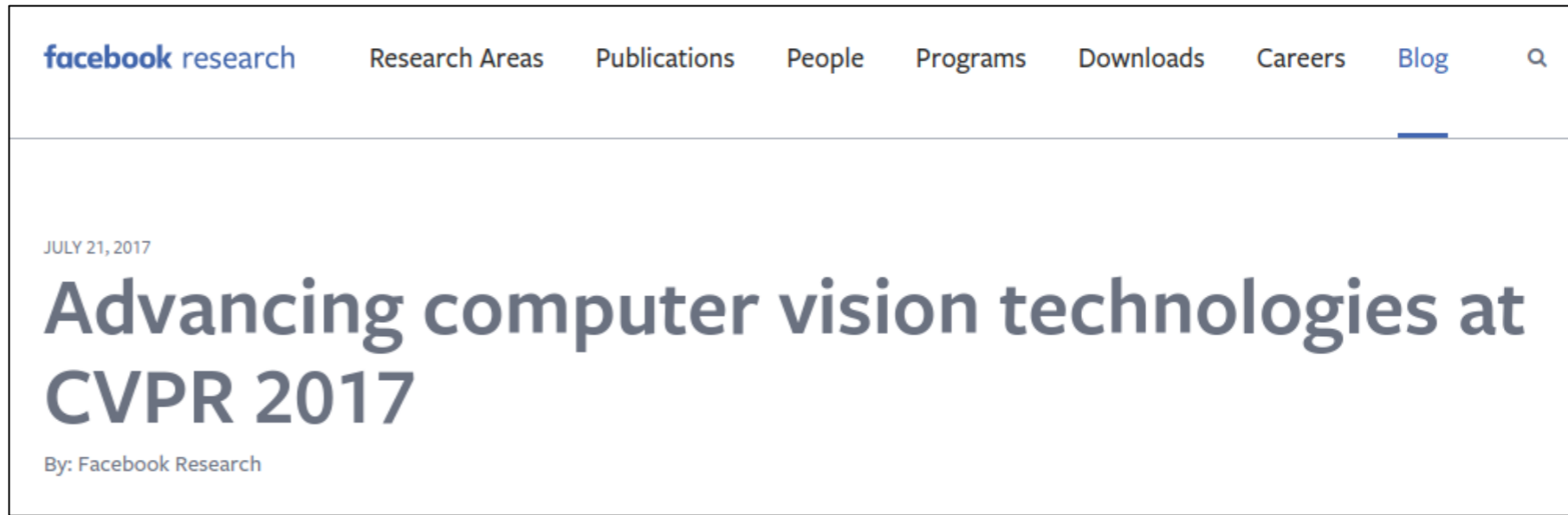
It's a good time to do  
computer vision

# Industry aggressively hiring CV faculty from universities



# Industry aggressively hiring CV graduates, or even students!

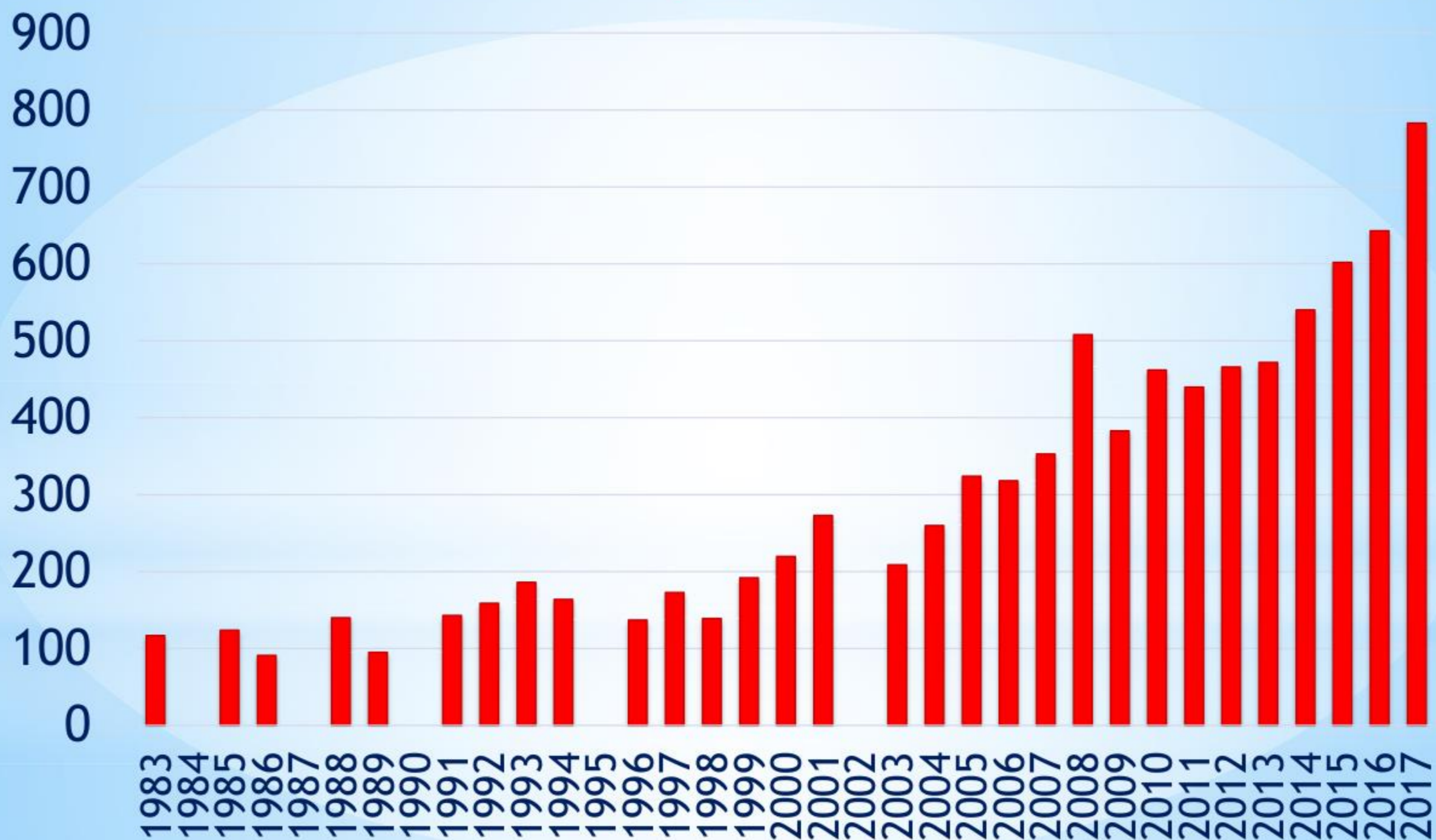
(strong dominant industrial presence at conferences for recruitment)



# CVPR GROWTH

Number of **papers** at CVPR

*Original slide  
courtesy of  
CVPR 2016*

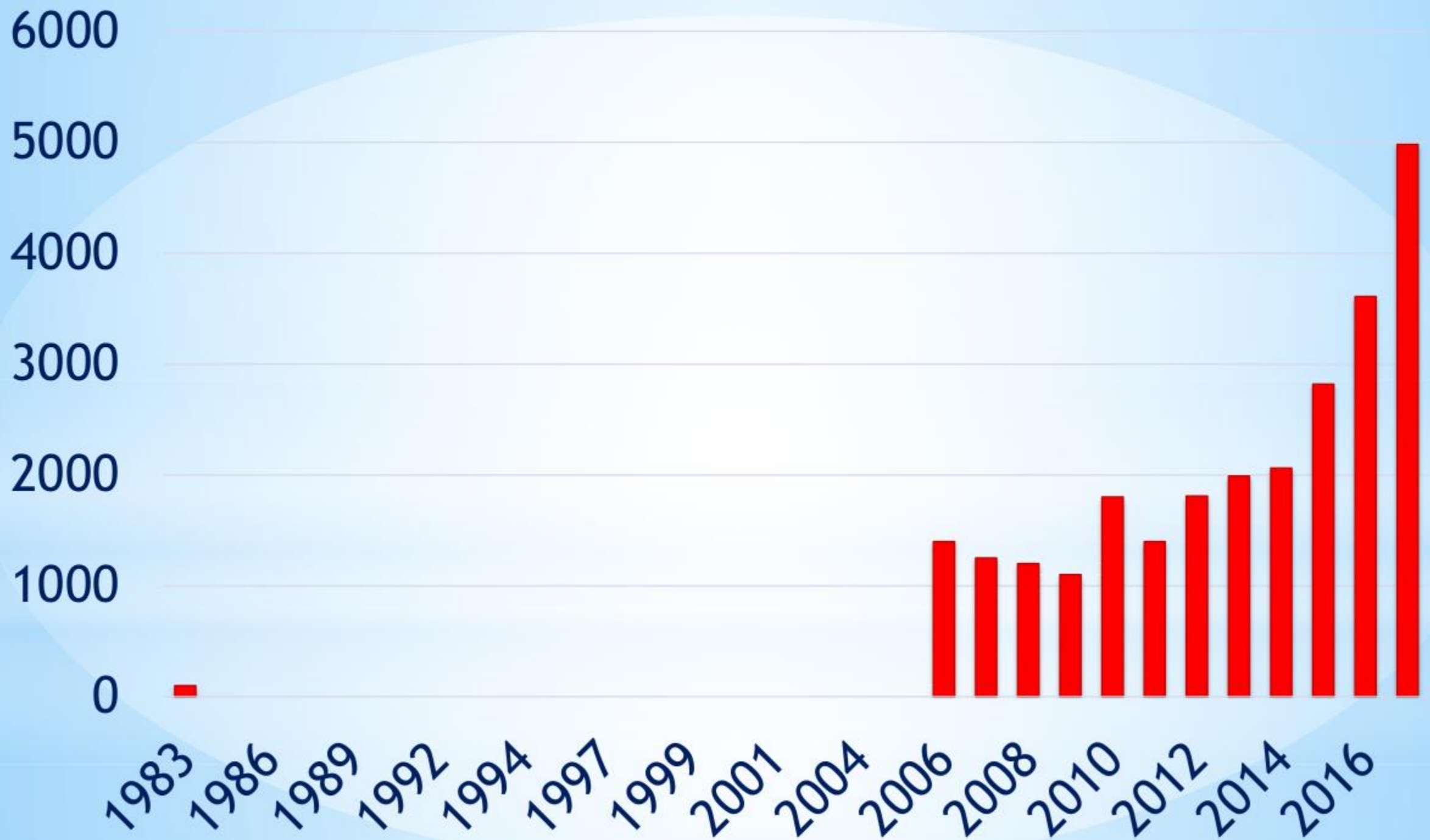




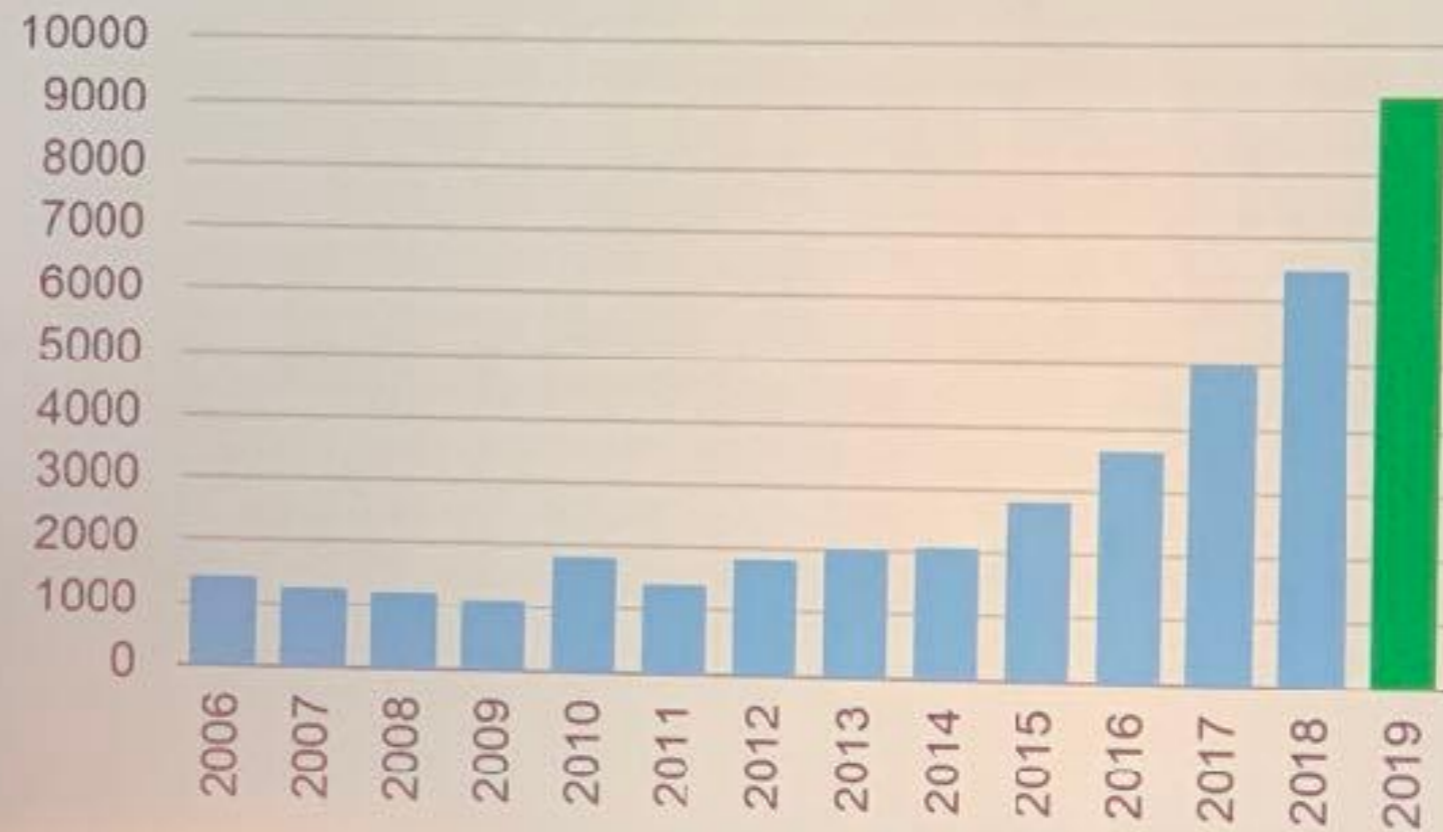
# CVPR GROWTH

Number of **attendees** at CVPR

*Original slide  
courtesy of  
CVPR 2016*



## CVPR Attendance Trend



# Computer vision at CMU

Dedicated courses for each subject we cover in this class:

- Physics-based Methods in Vision
- Geometry-based Methods in Computer Vision
- Computational Photography
- Visual Learning and Recognition
- Statistical Techniques in Robotics
- Sensors and sensing

... plus an entire department's worth of ML courses.

CVPR 2019: CMU was the second most common academic affiliation among authors  
(can you guess the first?)

# Master in Computer Vision at CMU



Carnegie Mellon  
THE ROBOTICS INSTITUTE



## Master of Science - Computer Vision MSCV

August 2016 - December 2017 (16-month program)

Computer vision is the study of acquiring and interpreting visual imagery. As computer vision shifts from research to development, there is a critical need for developers with expertise in this field.

### GOALS

- Offer a comprehensive set of courses
- Facilitate hands-on research and development projects
- Expose students to current and emerging state-of-the-art Computer Vision applications
- Prepare students for careers in Computer Vision

### COURSES

Introduction to Computer Vision  
Introduction to Machine Learning  
Mathematical Fundamentals for Robotics  
Visual Learning and Recognition  
Geometry-based Methods in Computer Vision

#### Electives (choose 2)

Human Communication and Multimodal Machine Learning  
The Visual World as seen by Neurons and Machines  
Comprehensive Sensing and Sparse Optimization  
Large Scale Learning using Images and Text  
Big Data approaches in Computer Vision  
Human Motion Modeling and Analysis  
Statistical Techniques in Robotics  
Physics-based Methods in Vision  
Probabilistic Graphical Models  
Statistical Machine Learning  
Convex Optimization  
Vision Sensors

#### Project and Seminar Courses

MSCV Seminar MSCV Project I MSCV Project II

### ADMISSION AND APPLICATION

Requirements: Undergraduate (B.S. or equivalent) in engineering, computer science or applied mathematics

#### Application Materials

- Résumé • General GRE
- TOEFL / IELTS (Foreign Students only)
- Statement of Purpose (1 to 2 pages)
- Letters of Recommendation (3 Required)
- Undergraduate/Graduate (as applicable) Transcripts

Only online applications will be accepted.

Early application deadline: December 3, 2015

Final application deadline: December 15, 2015

FOR INDUSTRY SPONSORSHIPS PLEASE CONTACT  
JULIE GOLDSTEIN (JGOLDS@CS.CMU.EDU), 412-268-4017

Carnegie Mellon University  
5000 Forbes Avenue, Pittsburgh, PA 15232  
ms-cv@ri.cmu.edu

[www.ri.cmu.edu/MSCV](http://www.ri.cmu.edu/MSCV)

MSCV Faculty



Srinivasa  
Narasimhan  
MSCV Program Director



Martial  
Hebert  
MSCV Spiritual Guru



J. Andrew (Drew)  
Bagnell



Fernando  
De la Torre Frade



Abhinav  
Gupta



Kris M.  
Kitani



Simon  
Lucey



Deva  
Kannan Ramanan



Yaser Ajmal  
Sheikh

# Course logistics

# Website



<http://www.cs.cmu.edu/~16385/>

(includes links to Canvas and Piazza)

# Assignments Canvas

<https://canvas.cmu.edu/courses/14118>

# Discussion&notes piazza

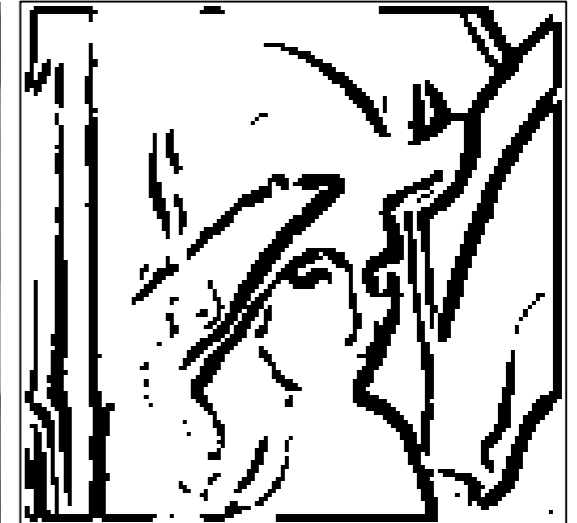
<https://piazza.com/class/k53x5h48my264d>

(you should sign up here on your own)

# Topics to be covered

Image processing:

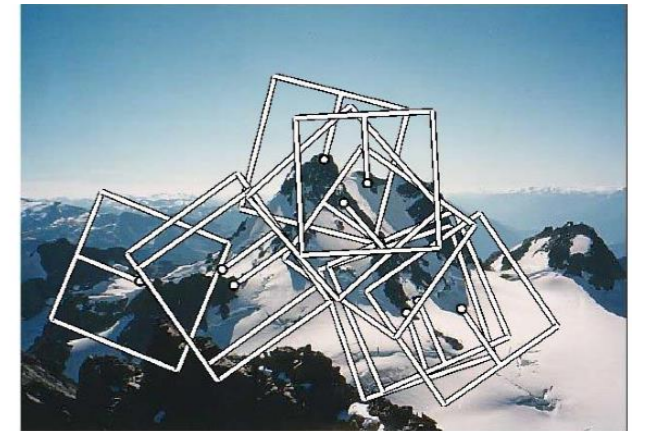
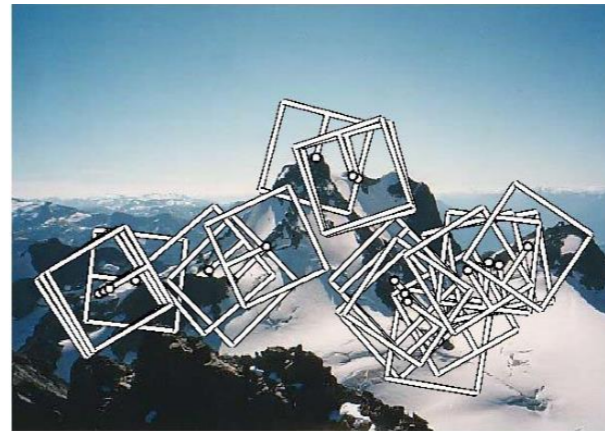
- Basics of filtering.
- Image pyramids.
- Gradients and lines.
- Hough transforms.



# Topics to be covered

Feature detection and correspondences:

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

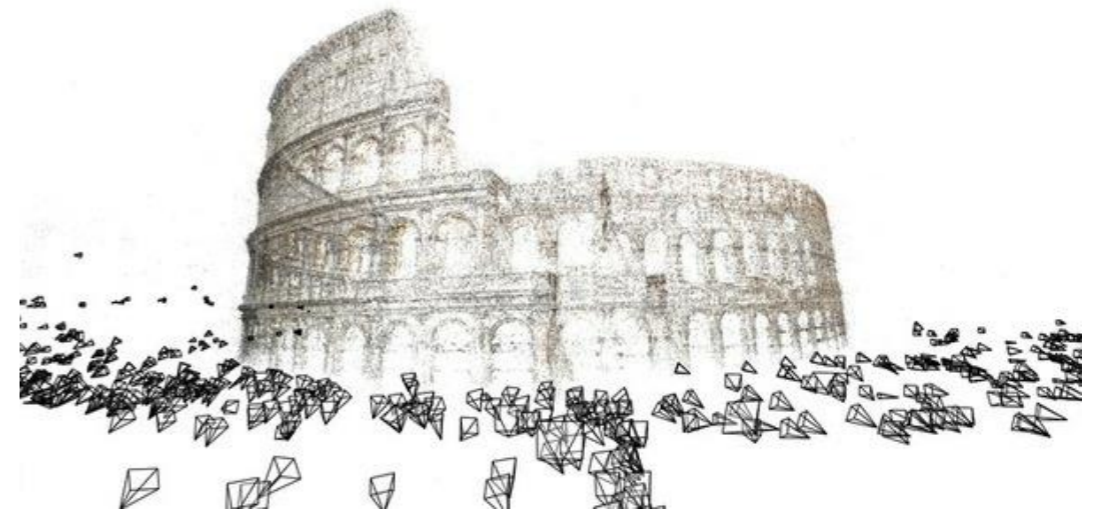




# Topics to be covered

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:

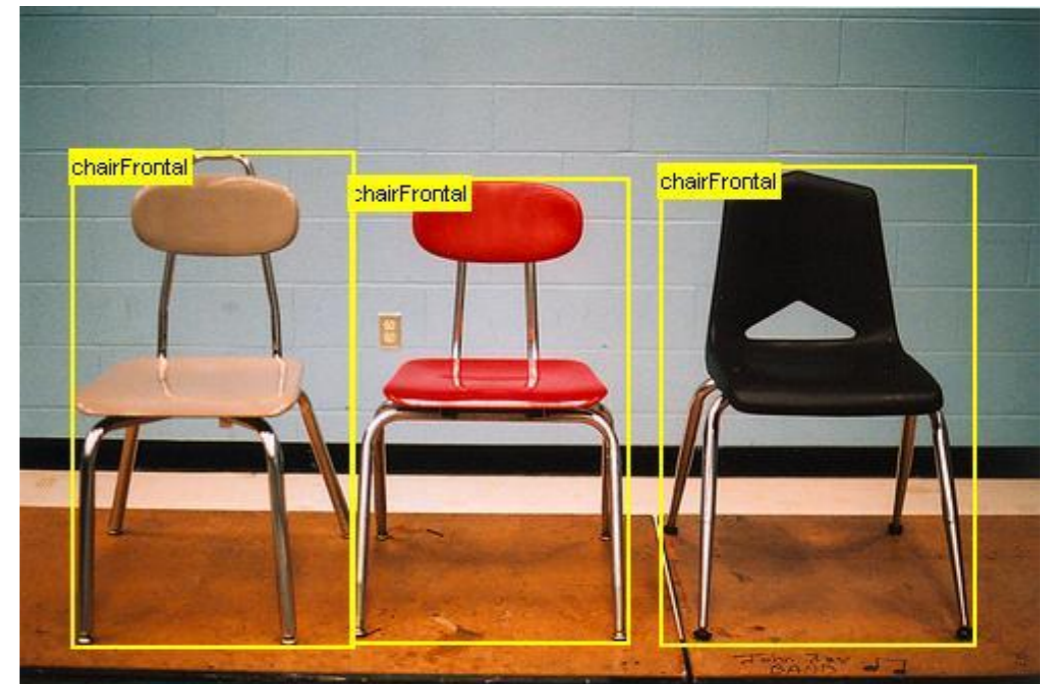
- Reflectance and image formation.
- Radiometry.
- Shape from shading.
- Photometric stereo.
- Color.



# Topics to be covered

Objects, faces, and learning:

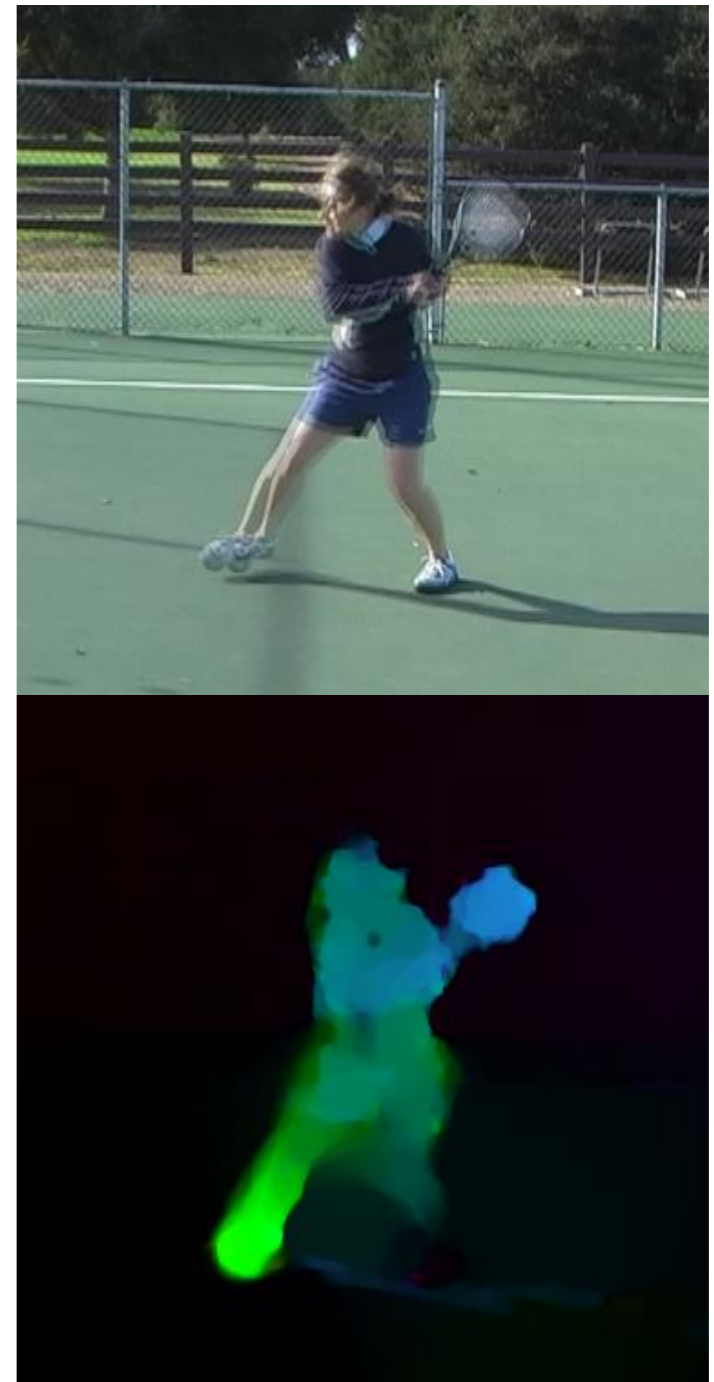
- Basics of probability.
- K-means, KNN, PCA, SVM.
- Bag of words.
- Viola-Jones face detection.
- Perceptron, backpropagation.
- Convolutional neural networks.



# Topics to be covered

Dealing with motion:

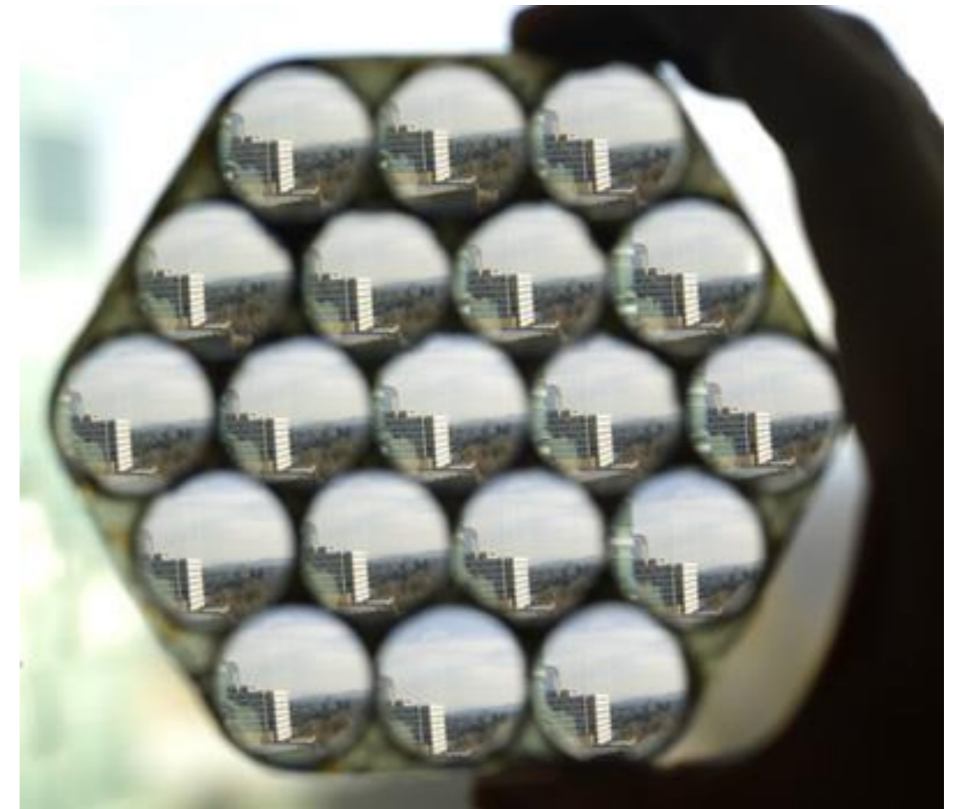
- Optical flow (LK, HS).
- Image registration.
- Kalman Filtering.
- Tracking (KLT, Mean-Shift).



# Topics to be covered

Special topics:

- Computational photography.
- ???



# Grading

- Seven two-week programming assignments: 70%
- Twelve weekly take-home quizzes: 27%
- Class and Piazza participation: 3%

## Take-home quizzes:

- New this year.
- Two-three theory questions.
- Replace mid-term and final.

## Participation:

- Be around for lectures.
- Post on Piazza discussions.
- Ask and answer questions.

# Programming assignments

Assignment 1 Hough Transform

Assignment 2 Homography

Assignment 3 Stereo

Assignment 4 Photometric Stereo

Assignment 5 Bag of Words

Assignment 6 Convolutional Neural Nets

Assignment 7 Lucas-Kanade Tracking

- a lot of programming in Matlab and Python.
- hours and hours of programming.
- days and days of debugging.
- generous grading policy (like grad school)
- take advantage of extra credit

# Programming assignments

Assignment 1 Hough Transform

Assignment 2 Homography

Assignment 3 Stereo

Assignment 4 Photometric Stereo

Assignment 5 Bag of Words

Assignment 6 Convolutional Neural Nets

Assignment 7 Lucas-Kanade Tracking

seriously, a lot of  
programming, so start early!

- a lot of programming in Matlab and Python.
- hours and hours of programming.
- days and days of debugging.
- generous grading policy (like grad school)
- take advantage of extra credit



# Schedule

- Tentative schedule on course website.
- Likely to change.
- Always check course website and Piazza for updates!

Date	Topics	Slides	Assignments
M, Jan 13	Introduction		
W, Jan 15	Image filtering		
M, Jan 20	<b>No class (Martin Luther King day)</b>		
W, Jan 22	Image pyramids and Fourier transform		PA1 out
M, Jan 27	Hough transform		TQ1 out
W, Jan 28	Feature and corner detection		
M, Feb 3	Feature descriptors and matching		TQ1 due, TQ2 out
W, Feb 5	2D transformations		PA1 due, PA2 out
M, Feb 10	Image homographies		TQ2 due, TQ3 out
W, Feb 12	Camera models		
M, Feb 17	Two-view geometry		TQ3 due, TQ4 out
W, Feb 19	Stereo		PA2 due, PA3 out
M, Feb 24	Structure from motion		TQ4 due, TQ5 out
W, Feb 26	Radiometry and reflectance		
M, Mar 2	Photometric stereo and shape from shading		TQ5 due, TQ6 out
W, Mar 4	Color		PA3 due, PA4 out
M, Mar 9	<b>No class (spring break)</b>		
W, Mar 11	<b>No class (spring break)</b>		
M, Mar 16	Image processing pipeline		TQ6 due, TQ7 out
W, Mar 18	Introduction to recognition		PA4 due, PA5 out
M, Mar 23	Bag of works		TQ7 due, TQ8 out
W, Mar 25	Neural networks		
M, Mar 30	Convolutional neural networks		TQ8 due, TQ9 out
W, Apr 1	Optimization		PA5 due, PA6 out
M, Apr 6	Faces		TQ9 due, TQ10 out
W, Apr 8	Optical flow		
M, Apr 13	Alignment		TQ10 due, TQ11 out
W, Apr 15	Tracking		PA6 due, PA7 out
M, Apr 20	Temporal models and SLAM		TQ11 due, TQ12 out
W, Apr 22	Graph-based methods		
M, Apr 27	Segmentation		TQ12 due
W, Apr 29	Wrap-up and discussion		PA7 due

# Leniency

Late days for programming assignments:

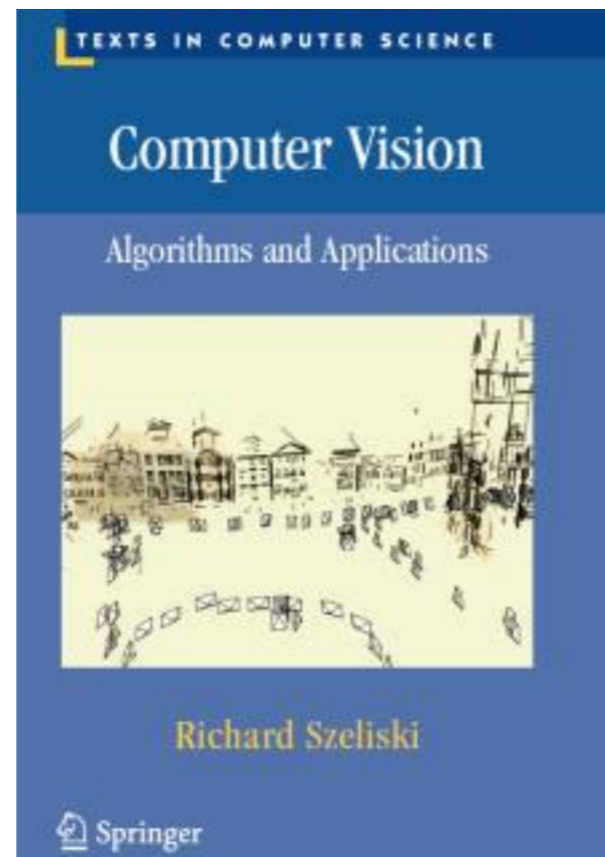
- 10% reduction of points per late day
- 6 free late days total
- use them wisely... save for later (harder) assignments!

Option to skip take-home quizzes:

- you only need to submit 9 out of 12 quizzes
- late quizzes will not be graded

# Book

We will be posting readings after each lecture



PDF online

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

# Prerequisites

We assume familiarity with calculus, linear algebra, basic probability, and programming.

Formal prerequisites:

- "Mathematical Foundations of Electrical Engineering" (18-202) and "Principles of Imperative Computation" (15-122)

OR

- "Matrix Algebra with Applications" (21-240) and "Matrices and Linear Transformations" (21-241) and "Calculus in Three Dimensions" (21-259) and "Principles of Imperative Computation" (15-122)

If you are missing a prerequisite but still want to enroll, let me know and we'll discuss it.

# Contact information and office hours

- Feel free to email us about administrative questions.
  - please use [16385] in email title!
- Technical questions should be asked on Piazza.
  - we won't answer technical questions through email.
  - you can post anonymously if you prefer.
- Office hours will be determined by poll.
  - feel free to email Yannis about additional office hours.
  - you can also just drop by Yannis' office (Smith Hall (EDSH) Rm 225).

Yannis will announce office hours for this week.

Please take the course survey  
before the next lecture!



(also posted on Piazza)