# CS 6476: Computer Vision

minchen

Instructor: Frank Dellaert Tas: Cusuh Ham (head TA), and 8 (9?) more TAs

09

Image by kirkh.deviantart.com

# Today's Class

- Who am I?
- Specifics of this course
- What is Computer Vision?

## A bit about me

Originally from Belgium 1989 EE in Leuven 1993 M.Sc. ECE at CWRU 2001 Ph.D. CS, Carnegie Mellon

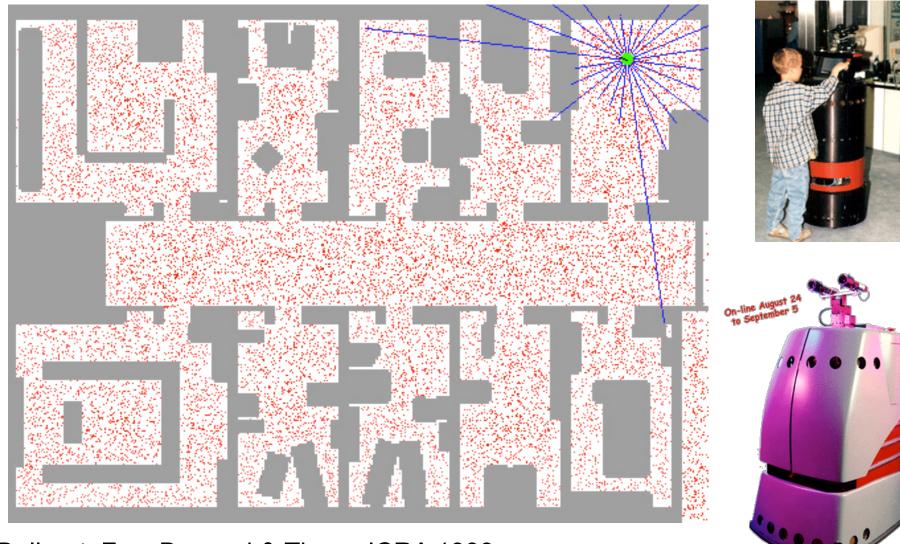
Georgia Tech since August 2001

Teaching Computer Vision etc.:

| 7641 | Machine Learning                 | 02, 03,<br>04         | 45  |
|------|----------------------------------|-----------------------|-----|
| 8803 | 3D Reconstruction and Mapping    | 02, 09,<br>10,12      | 70  |
| 4495 | Computer Vision, undergraduate   | 04, 05,<br>06, 07     | 78  |
| 8803 | Intro to Perception and Robotics | 05, 06,<br>07,13,14   | 185 |
| 7495 | Computer Vision, graduate        | 06, 07,<br>11, 12, 13 | 153 |
| 4475 | Computational Photography        | 07, 09,<br><b>18</b>  | 155 |
|      | Digital Video Special effects    | 08, 09,<br>10, 11     | 146 |
|      | 5                                |                       | 832 |



#### Monte Carlo Localization, at Carnegie Mellon!



Dellaert, Fox, Burgard & Thrun, ICRA 1999 Fox, Dellaert, Burgard & Thrun, AAAI 1999

Factor Graphs and AD for Flexible Inference in Robotics and Computer Vision, © 2008-2018 Dellaert et al.

In the Smithsonian Institution's National Museum of American History and ON THIS WEB SITE!

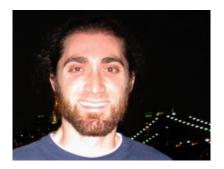
#### **Spatiotemporal Reconstruction**

4D Cities: 3D + Time





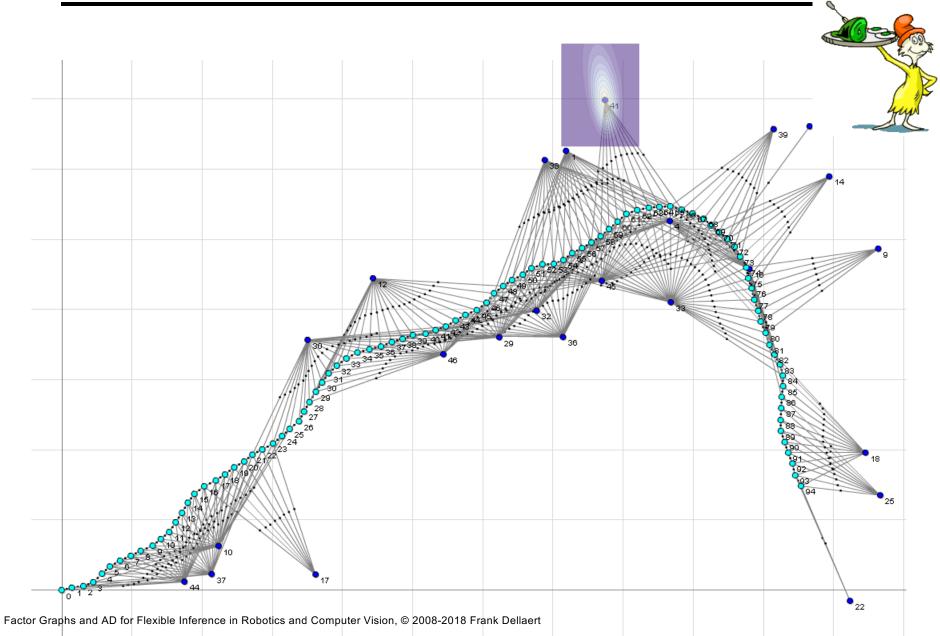
**Historical Image Collection** 



**Grant Schindler** 

#### Supported by NSF CAREER, Microsoft Recent revival: NSF NRI award on 4D crops for precision agriculture...

#### Factor Graphs -> GTSAM !



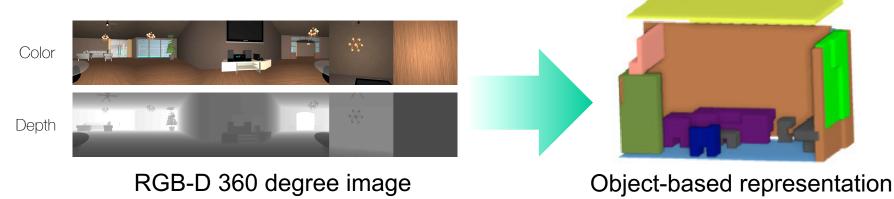
# Silicon Valley intermission at Skydio



# Silicon Valley intermission at Facebook



#### The Scene Understanding and Modeling Challenge



#### Organizers

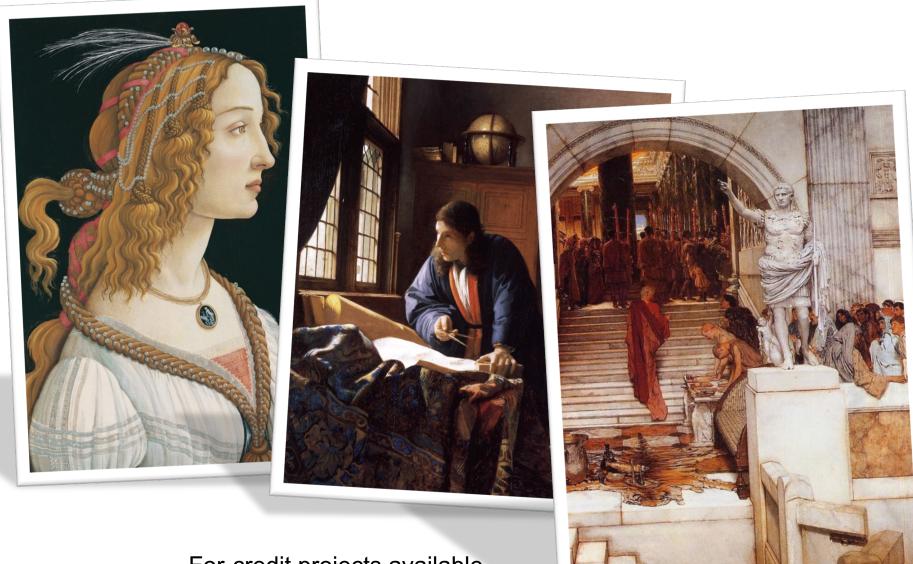
Daniel Huber (Facebook) Lyne Tchapmi (Stanford University) Frank Dellaert (FB / Georgia Tech)

#### Vision Problems Addressed

| Object segmentation | 6-DOF pose estimation |  |
|---------------------|-----------------------|--|
| Object completion   | Appearance modeling   |  |
| Instance labeling   | Layout estimation     |  |

of a room

#### What's next? Robot Painting!



For-credit projects available

#### **Course Website/Syllabus**

#### **Fall '19 Computer Vision**



#### tinyurl.com/GT-19F-CS4476 or Google "Dellaert"

## Proj1: Image Filtering and Hybrid Images

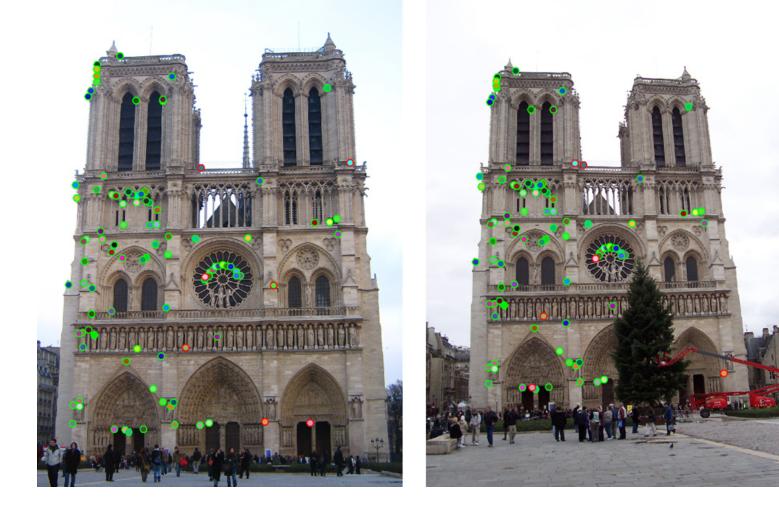
Implement image filtering to separate high and low frequencies

Combine high frequencies and low frequencies from different images to create an image with scale-dependent interpretation



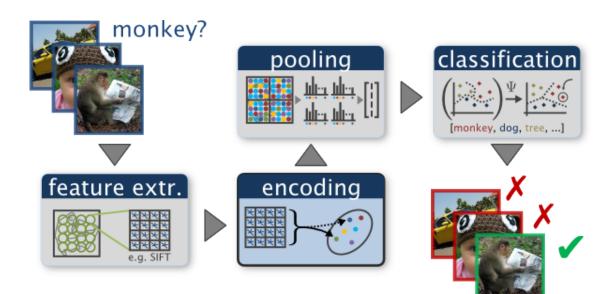
# Proj2: Local Feature Matching

Implement interest point detector, SIFT-like local feature descriptor, and simple matching algorithm.



## Proj5: Scene Recognition with Bag of Words

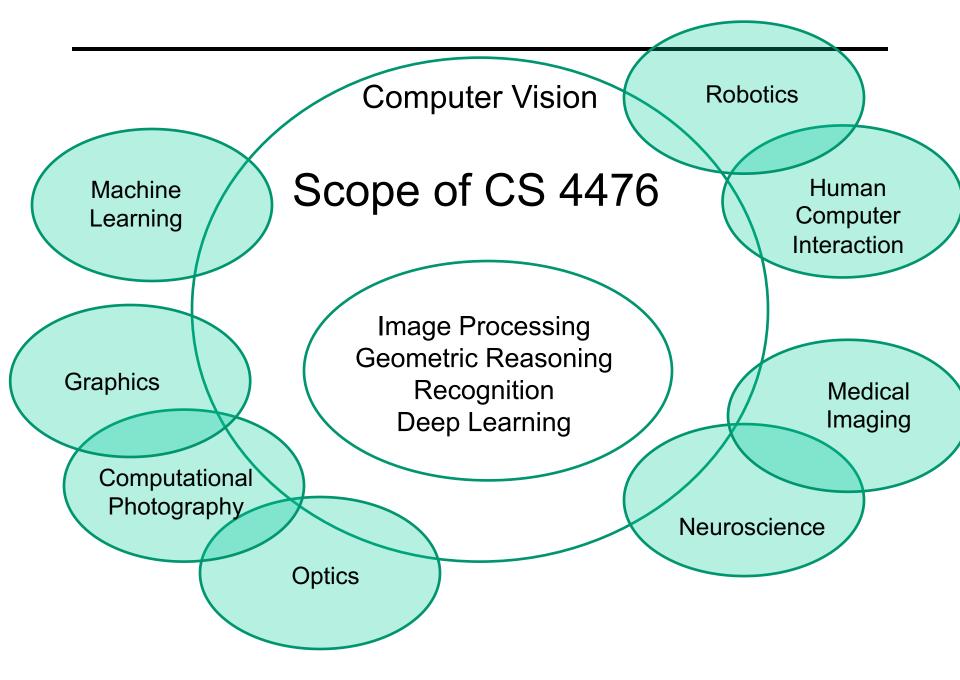
Quantize local features into a "vocabulary", describe images as histograms of "visual words", train classifiers to recognize scenes based on these histograms.



# What is Computer Vision?



Computer Graphics: Models to Images Comp. Photography: Images to Images **Computer Vision: Images to Models** 



## **Computer Vision**

Make computers understand images and video or any visual data.



What kind of scene?

Where are the cars?

How far is the building?

# Vision is really hard

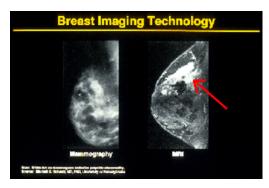
- Vision is an amazing feat of natural intelligence
  - Visual cortex occupies about 50% of Macaque brain
  - One third of human brain devoted to vision (more than anything else)



# Why computer vision matters



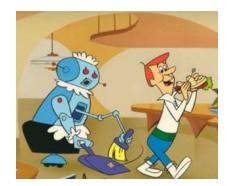
Safety



Health



Security



Comfort



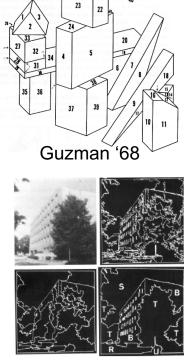
Fun



Access

#### Ridiculously brief history of computer vision

- 1966: Minsky assigns computer vision as an undergrad summer project
- 1960's: interpretation of synthetic worlds
- 1970's: some progress on interpreting selected images
- 1980's: ANNs come and go; shift toward geometry and increased mathematical rigor
- 1990's: face recognition; statistical analysis in vogue
- 2000's: broader recognition; large annotated datasets available; video processing starts
- 2010's: Deep learning with ConvNets
- 2020's: Widespread autonomous vehicles?
- 2030's: robot uprising?



Ohta Kanade '78





Turk and Pentland '91

# How vision is used now

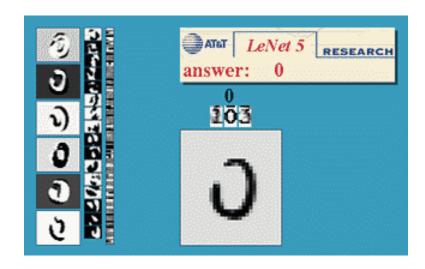
• Examples of real world applications

Some of the following slides by Steve Seitz

## **Optical character recognition (OCR)**

#### Technology to convert scanned docs to text

• If you have a scanner, it probably came with OCR software





Digit recognition, AT&T labs http://www.research.att.com/~yann/ License plate readers http://en.wikipedia.org/wiki/Automatic\_number\_plate\_recognition

## Face detection



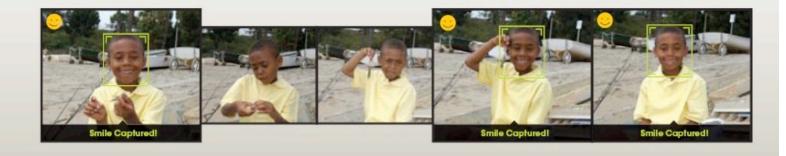
• Digital cameras detect faces

# Smile detection

#### The Smile Shutter flow

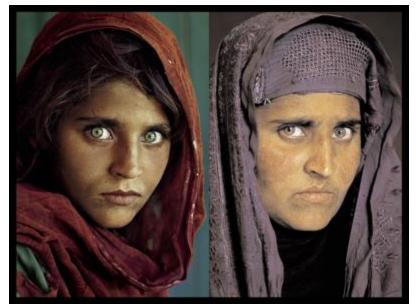
Imagine a camera smart enough to catch every smile! In Smile Shutter Mode, your Cyber-shot® camera can automatically trip the shutter at just the right instant to catch the perfect expression.



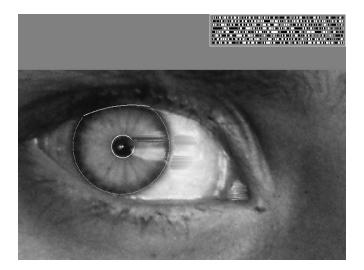


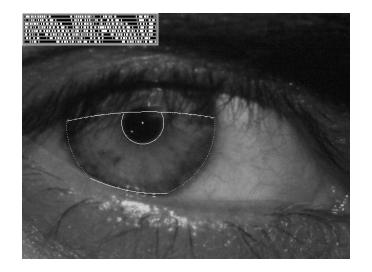
#### Sony Cyber-shot® T70 Digital Still Camera

## Vision-based biometrics



*"How the Afghan Girl was Identified by Her Iris Patterns"* Read the <u>story</u> <u>wikipedia</u>

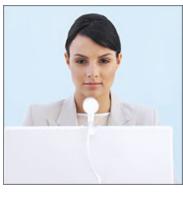




# Login without a password...









Fingerprint scanners on many new laptops, other devices Face recognition systems now beginning to appear more widely <u>http://www.sensiblevision.com/</u>

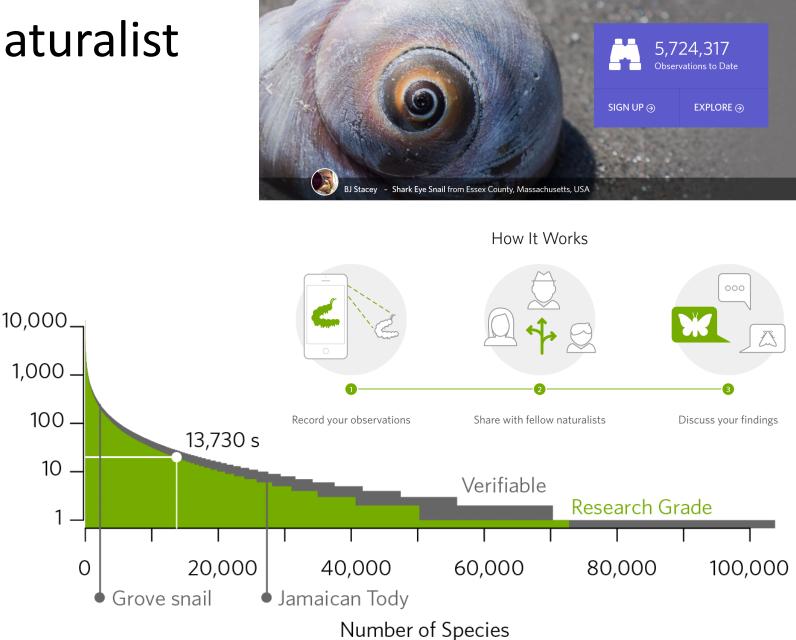
# **Object recognition (in mobile phones)**



<u>Point & Find, Nokia</u> <u>Google Goggles</u>

# iNaturalist

Number of Observations



https://www.inaturalist.org/pages/computer\_vision\_demo

## Special effects: shape capture



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

## Special effects: motion capture



Pirates of the Carribean, Industrial Light and Magic

## Sports



Sportvision first down line Nice <u>explanation</u> on <u>www.howstuffworks.com</u>

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

## Medical imaging

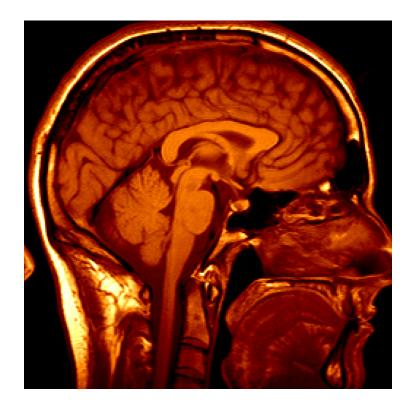




Image guided surgery Grimson et al., MIT

3D imaging MRI, CT

## Smart cars

#### Slide content courtesy of Amnon Shashua



- Mobileye
  - Market Capitalization: 11 Billion dollars
  - Bought by Intel for 15 Billion dollars

# Google cars



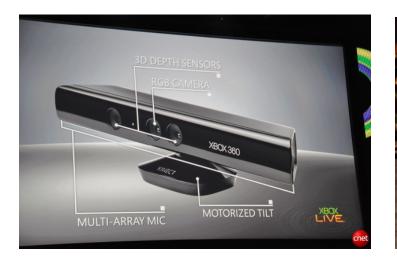
Oct 9, 2010. <u>"Google Cars Drive Themselves, in Traffic"</u>. <u>The New York Times</u>. John Markoff

June 24, 2011. <u>"Nevada state law paves the way for driverless cars"</u>. *Financial Post*. Christine Dobby

Aug 9, 2011, <u>"Human error blamed after Google's driverless car sparks five-vehicle</u> <u>crash"</u>. *The Star* (Toronto)

## **Interactive Games: Kinect**

- Object Recognition: <u>http://www.youtube.com/watch?feature=iv&v=fQ59dXOo63o</u>
- Mario: <u>http://www.youtube.com/watch?v=8CTJL5IUjHg</u>
- 3D: <u>http://www.youtube.com/watch?v=7QrnwoO1-8A</u>
- Robot: <u>http://www.youtube.com/watch?v=w8BmgtMKFbY</u>



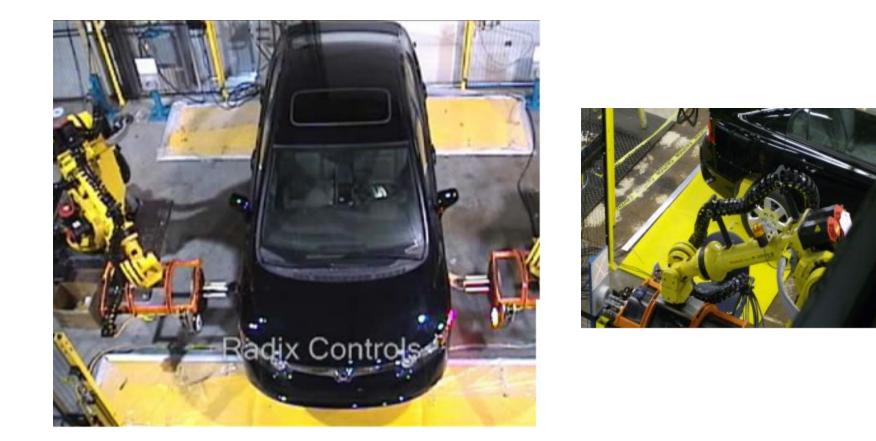


#### Augmented Reality and Virtual Reality



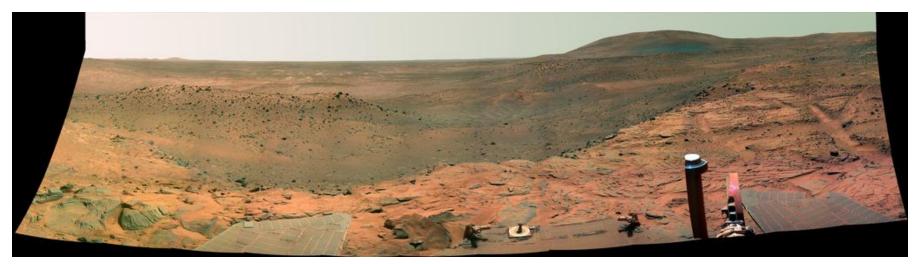
Magic Leap, Oculus, Hololens, etc.

## Industrial robots



Vision-guided robots position nut runners on wheels

# Vision in space



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.

#### Amazon Prime Air



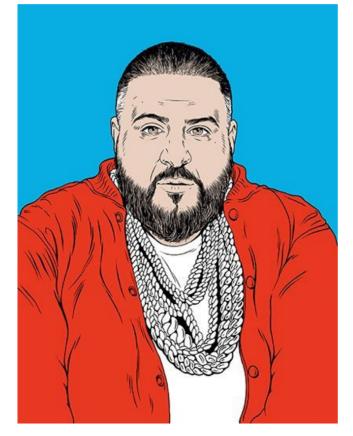
https://www.amazon.com/b?node=8037720011

#### State of the art today?

With enough training data, computer vision nearly matches human vision at most recognition tasks

Deep learning has been an enormous disruption to the field. More and more techniques are being "deepified".

# WHO'S SHAPING THE DIGITAL WORLD?



DJ Khaled

Credit Louise Zergaeng Pomeroy

#### 73. DJ Khaled

#### Snapchat icon; DJ and producer

Louisiana-born Khaled Mohamed Khaled, aka DJ Khaled, cut his musical chops in the early 00s as a host for Miami urban music radio WEDR. He proceeded to build a solid if not dazzling career as a mixtape DJ and music producer (he founded his label We The Best Music Group in 2008, and was appointed president of Def Jam South in 2009).

#### **69.** Geoffrey Hinton

#### Psychologist, computer scientist; researcher, Google Toronto

British-born Hinton has been dubbed the "godfather of deep learning". The Cambridge-educated cognitive psychologist and computer scientist started being an ardent believer in the potential of neural networks and deep learning in the 80s, when those technologies enjoyed little support in the wider AI community.

But he soldiered on: in 2004, with support from the Canadian Institute for Advanced Research, he launched a University of Toronto programme in neural computation and adaptive perception, where, with a group of researchers, he carried on investigating how to create computers that could behave like brains.

Hinton's work – in particular his algorithms that train multilayered neural networks – caught the attention of tech giants in Silicon Valley, which realised how deep learning could be applied to voice recognition, predictive search and machine vision.

The spike in interest prompted him to launch a free course on neural networks on e-learning platform Coursera in 2012. Today, 68-year-old Hinton is chair of machine learning at the University of Toronto and moonlights at Google, where he has been using deep learning to help build internet tools since 2013.

#### 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





Credit Google DeepMind



**Google-backed startup DeepMind Technologies has built an** artificial intelligence agent that can learn to successfully play 49 classic Atari games by itself, with minimal input.

#### The story of AlphaGo so far

AlphaGo is the first computer program to defeat a professional human Go player, the first program to defeat a Go world champion, and arguably the strongest Go player in history.

AlphaGo's first formal match was against the reigning 3-times European Champion, Mr Fan Hui, in October 2015. Its 5-0 win was the first ever against a Go professional, and the results were published in full technical detail in the international journal, <u>Nature</u>. AlphaGo then went on to compete against legendary player Mr Lee Sedol, winner of 18 world titles and widely considered to be the greatest player of the past decade.

AlphaGo's 4-1 victory in Seoul, South Korea, in March 2016 was watched by over 200 million people worldwide. It was a landmark achievement that experts agreed was a decade ahead of its time, and earned AlphaGo a 9 dan professional ranking (the highest certification) - the first time a computer Go player had ever received the accolade.

During the games, AlphaGo played a handful of <u>highly inventive winning moves</u>, several of which - including move 37 in game two - were so surprising they overturned hundreds of years of received wisdom, and have since been examined extensively by players of all levels. In the course of winning, AlphaGo somehow taught the world completely new knowledge about perhaps the most studied and contemplated game in history.

Since then, AlphaGo has continued to surprise and amaze. In January 2017, an improved AlphaGo version was revealed as the online player "Master" which achieved <u>60 straight wins in online fast time-control games</u> against top international Go players.

In May 2017, Alpha Go took part in The Future of Go Summit in the birthplace of Go, China, to delve deeper into the mysteries of Go in a spirit of mutual collaboration with the country's top players. You can read more about the five day summit here.



> More on The Future of Go Summit in this video



> Watch the video here



#### 2018 Arxiv, ICLR 2019



Large Scale GAN Training for High Fidelity Natural Image Synthesis

Andrew Brock, Jeff Donahue, Karen Simonyan

## This person does not exist



https://www.thispersondoesnotexist.com/