Autonomous Vehicles & Deep Learning

Ching-Yao Chan On behalf of Trevor Darrell and Tom West California PATH, UC Berkeley

Redefining Mobility Summit, CCTA March 30, 2017

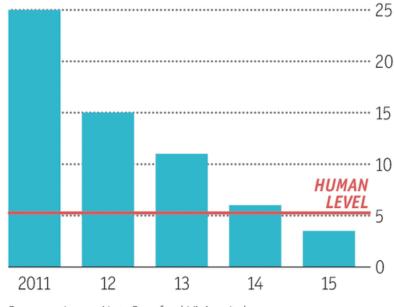
## Deep Learning: A Buzzword

- Alpha Go beating human chess champions
- Already broadly adopted at many high-tech companies
  - image processing, speech recognition, language translation, data analysis, etc.
- A cluster of start-ups
- A flurry of investments, notably by and in automotive industry
  - Toyota Research Institute \$1B on AI (11/2015)
  - Ford \$1B bet on Argo AI (02/2017)
  - Intel buys Mobileye \$15.3B (03/2017)

### **Doing Better and Better** With Depper and Deeper Networks

#### **Ever cleverer**

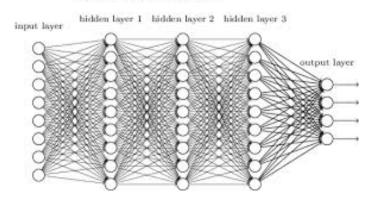
Error rates on ImageNet Visual Recognition Challenge, %



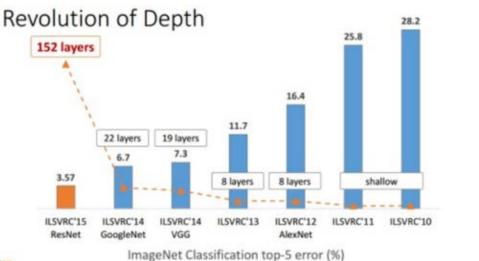
Sources: ImageNet; Stanford Vision Lab

Economist.com

#### Deep neural network



Research



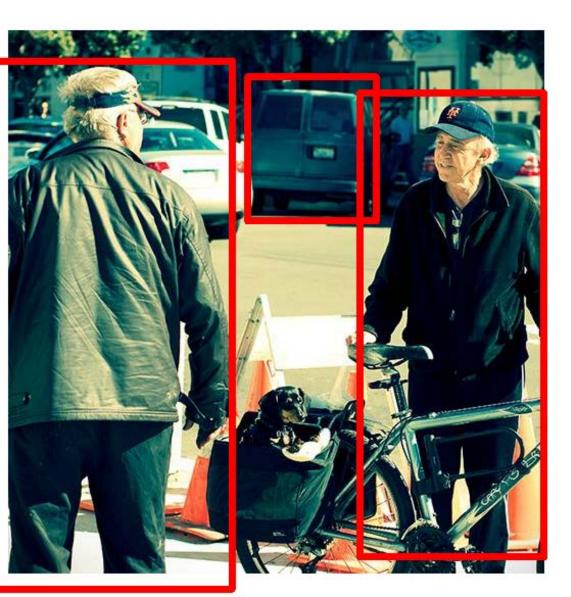


Kaiming He, Xiangyu Zhang, Shaoqing Ren, & Jian Sun. "Deep Residual Learning for Image Recognition". arXiv 2015.

### Cambrian Explosion in Computer Vision & Al Driverless Car, Hod Lipson and Melba Kurman

- Life forms were simple and blind before the Cambrian explosion, 541 millions years ago.
- Over the next few million years, diversification accelerates and life-forms began to resemble organisms that make up the world we are familiar today.
- "Visual system" is the light-switch that turns on the rapid pace of evolution.
- Evolution is composed of long intervals of near-stasis punctuated by short periods of rapid change. (Steven Jay Gould, Harry Whittington, Niles Eldredge)
- Are we at the crossroads of this punctuated equilibrium in machine intelligence?

# Large-scale Semantic Description



#### **Object Detection**

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Source: Trevor Darrell presentation

# Large-scale Semantic Description

"A man with glasses and a coat, facing back, walking away"



"An elderly man with a hat and glasses, facing the camera and talking"

"An entlebucher mountain dog sitting in a bag"

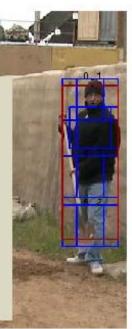
"A blue GMC van

parked, in a back view"



Object Detection Semantic Segmentation Pose Estimation Attribute Classification Fine-Grained Recognition Action Recognition

> "a man wearing long sleeves, possibly holding a shovel." "person last seen at 0900 in view 5" "unusual farm worker"



## Hypothetically,

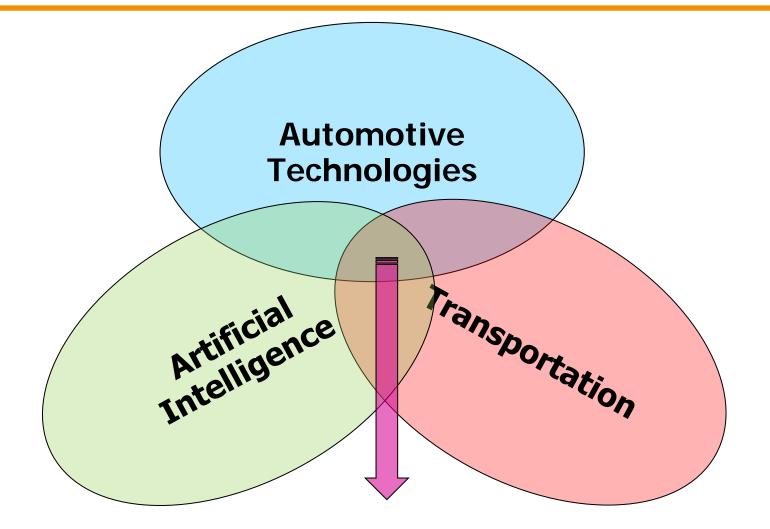
- Recent Tesla Incident (May 2016, Florida)
  - Supposedly, the Tesla (camera + radar) sensor did not recognize the "side of truck" versus the background sky;





 Can a "deep learning" system recognize an object that does "not look the same" as a previously seen (trained) target?

### When AI Meets Automobile



**AI-Enabled Mobility** 

## **Berkeley Deep Drive**

- Headed by Prof. Trevor Darrell, EECS, UC Berkeley
- Current members include:
  - Automakers:
    - Audi/VW, Ford, GM, Honda, Hyundai, Toyota
  - System providers:
    - Bosch, Huawei, Panasonic, Sony,
  - Technology providers:
    - Google X, Mapillary, Nexar
    - Nvidia, NXP, Qualcomm, Samsung

## **Berkeley Deep Drive**

A Research Alliance to Investigate State-of-the-Art Technologies in Computer Vision and Machine Learning for Automotive Applications

Pushing the scientific forefronts of

- Computer Vision/Autonomous Perception
- Automated Driving Systems
- Robotics
- A.I./Machine Learning

## **Future of AI/Deep Learning**

- A progressive but accelerating enabler
- A worldwide community
- Deep Learning for image, speech, and language applications already widely deployed
- Bright Prospects for automated driving, medical imaging, robotics, etc.
- Probably still a way to go before truly intelligent machines rule the world.

Thank You

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