



Future Technologies of War

**Robotics, AI and Autonomy:
Moving Beyond The Hype
to a Deeper Understanding**

**Professor Michael Milford
Acting Director
QUT Centre for Robotics**



**Centre for
Robotics**

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Introductions



Robotics



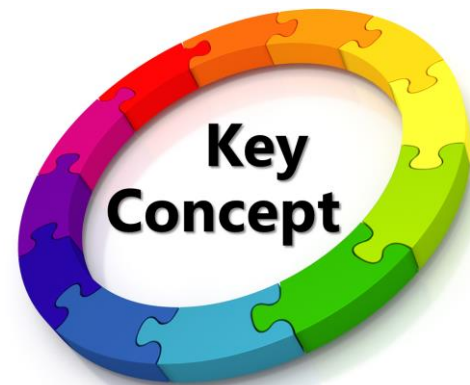
Autonomous vehicles



Sensing



Artificial Intelligence



Throughout Talk

Introductions





**Centre for
Robotics**

About Us

Our centre



Continues on from over 10 years of investment in Robotics at QUT



To be at the forefront of research and innovation in intelligent robotics



Formed in January 2020



Initial 4 years with option to continue



100+ members, including
16 CIs, 19 AIs and 50+ HDRs

Our research programs

Physical
interaction

Led by Distinguished Prof
Peter Corke

Perception &
localisation

Led by Professor
Michael Milford

Decision &
control

Led by Professor
Jason Ford

Visual learning &
understanding

Led by Assoc. Professor Niko
Suenderhauf

Human
interaction

Still in formation



Robotics, Automation & Autonomous Vehicles at QUT



ARC Industrial Transformation Training Centre for Joint Biomechanics



ARM
Advanced Robotics for Manufacturing
HUB

ARC Industrial Transformation Centre for Co Robotics in Manufac

Australian Research Special Research In Excellence in Antarctic Securing Antarctic Environmental Future' (SAEF) research program

New \$44M ARC Centre of Excellence bid with Defence Component

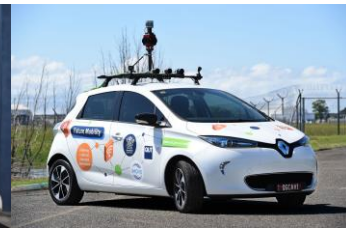
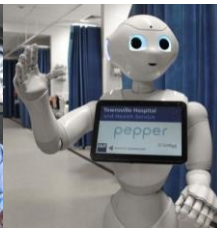


Neuro-Autonomy

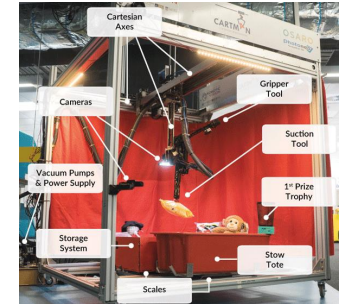
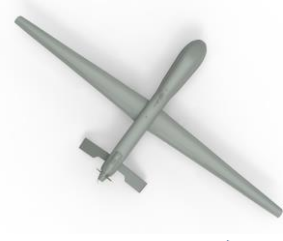
Neuroscience-Inspired Perception, Navigation, and Spatial Awareness for Autonomous Robots



ROBOT ACADEMY



Bridging the Divide Between World Class Fundamental Research with Deployed and Fielded Autonomous Systems up to High TRL Levels



Collaborations and Connections with Over 100 Leading International Companies, Startups and Universities



123rf.com Anton Balazh

Beyond defence, a significant number of the Fortune 500 and top 100 universities

Flexible Working Models:

Teams: From Single Team Projects to Major International Collaborations

Nature of Work: From blue sky fundamental research to high technology readiness level

Example 1



THE UNIVERSITY OF
MELBOURNE



UNSW
AUSTRALIA



Neuro-Autonomy Neuroscience-Inspired Perception, Navigation, and Spatial Awareness for Autonomous Robots

- Up to \$15M funding
- a 3 year project extendable to 5 years
- funded by Defence Science Technology (Australian-side) and Office of Naval Research (US side)
- 24 successful bids out of 295 proposals, 8% success rate.
- 6 universities: MIT, BU, Uni Melb, QUT, Macquarie and UNSW including many long term collaborators with QUT



Massachusetts
Institute of
Technology



Example 2

- Rheinmetall Autonomous Combat Warrior (ACW) Program (w/ CSIRO, DSTG, RMIT)
- Advanced Terrain Detection (ATD) for Autonomous Ground Vehicle
- in collaboration with CSIRO/Data61
- Terrain traversability estimation using sensor data fusion
- Semantics: identify mud, water, rocks, sand, vegetation etc.
- + 3D information (Geometry)
- => Traversability for Autonomy



Robotics



**> 10,000,000
Roombas sold**

**My robot vacuum cleaner
foolishly attempting to
escape down the stairs
during experiments**



Robotics



6:16:34 05/06/2015



IEEE Spectrum: DARPA Grand Challenge
<https://www.youtube.com/watch?v=g0TaYhpOfo>

Boston Dynamics: <https://www.youtube.com/watch?v=fRj34o4hN4I>

Robotics and Automation



Robotics and Automation: Retail and Point of Sale



Ports and Mining

Automation occurring relatively quietly
in the background, out of direct sight





RioTinto


Our business ▾ Investors ▾ Careers ▾ Media

Global home > Media > Media releases > Rio Tinto to expand autonomous fleet as part of \$5 billion productivity drive

18 December 2017

Rio Tinto to expand autonomous fleet as part of \$5 billion productivity drive

SHARE    


 Rio Tinto to expand autonomous fleet as part of \$5 billion productivity drive
PDF 102 KB

Rio Tinto will expand its fleet of autonomous haul trucks at its world-class iron ore operations in the Pilbara by more than 50 per cent by 2019 after signing agreements with leading manufacturers Caterpillar Inc. and Komatsu Ltd. to convert traditional trucks to autonomous vehicles.

A total of 29 Komatsu haul trucks will be retrofitted with Autonomous Haulage System (AHS) technology starting next year. The project at the Brockman 4 operation is scheduled for completion by mid-2019, allowing the mine to run entirely in AHS mode once fully deployed.





Rio Tinto to expand autonomous fleet

Today, we have more than 80 autonomous trucks operating at our iron ore mines




itnews





GOVERNMENT IT SECURITY FINANCE IT TELCO BENCHMARK AWARDS

    LOG IN SUBSCRIBE Q

Brisbane Port moves closer to full automation


By Staff Writers
May 23 2014
9:09AM

1 Comment 

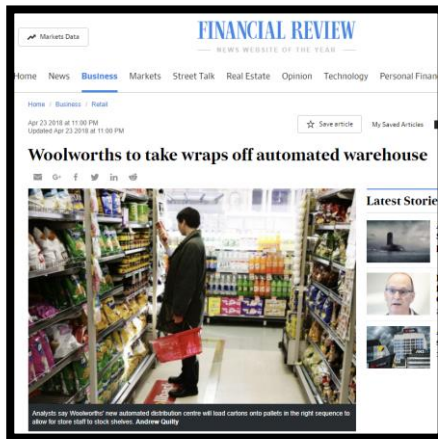
 
 

Second major tenant completes robot rollout.

Stevedoring firm DP World Australia has taken the wraps off \$250 million in upgrades designed to enable "semi-automated" operations at its Port of Brisbane container terminal. The company — which is majority-owned by Citigroup — has invested in 14 automated stacking cranes ...



Logistics



Again, mostly occurring relatively quietly in
the background out of direct sight

Hardware is HARD

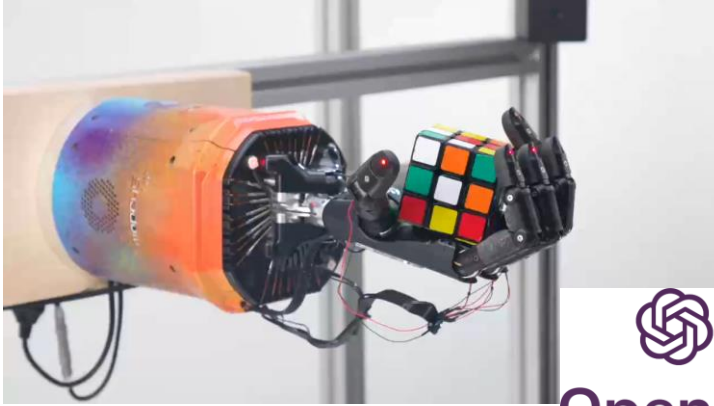


123rf.com / pcanzo

Progress will usually be relatively slow with anything affected by the laws of physics, e.g.:

- energy storage,
- sophisticated physical robot components like hands & grasping,
- dynamics of walking

Some of the Key Technologies



Grasping and Manipulation



Mapping, Positioning & Navigation



Sensing and Understanding

Autonomous Vehicles: Current State of Play



Massive Consolidation of Key Players



Self-Driving Car Project



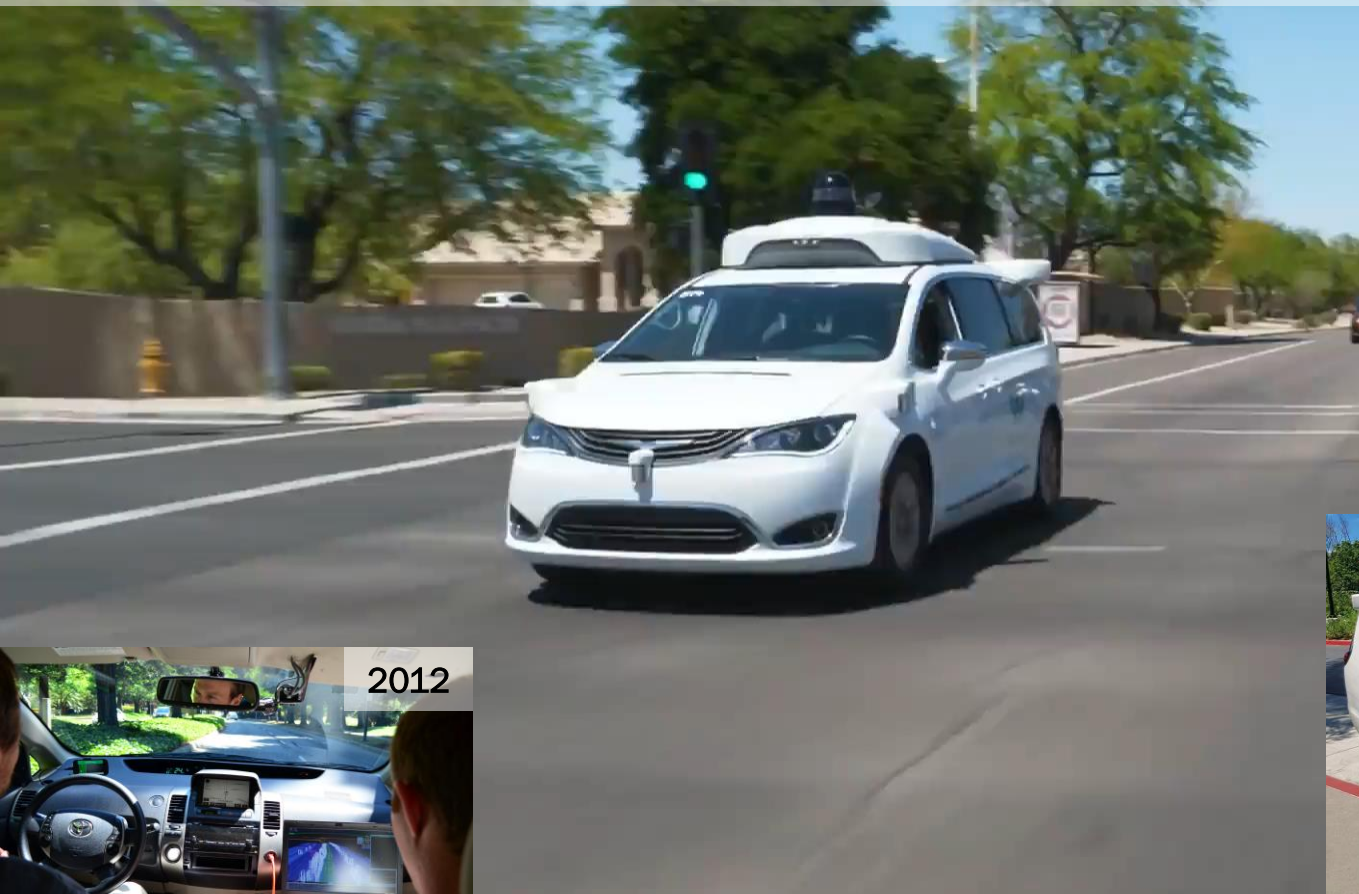
WAYMO



Tech Company Corporate Example: Waymo/Google

Other key companies:

- GM Cruise
- Tesla
- Hundreds more at varying scales...



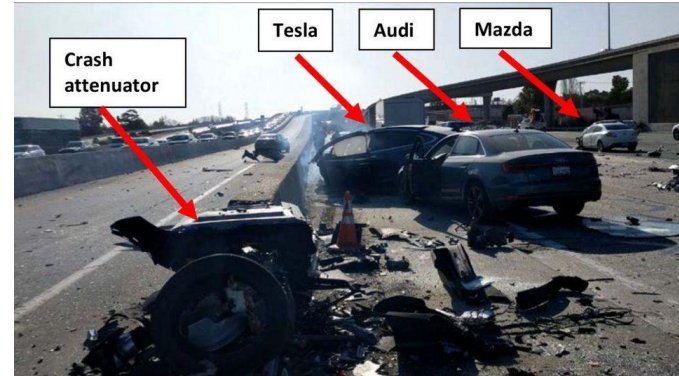
2012



2018

<https://www.youtube.com/watch?v=uHbMt6WDhQ8>

High Profile Incidents and Low Profile Benefits



123rf.com / Tomasz Wyszolmirski

<https://www.forbes.com/sites/bradtempleton/2019/05/03/lawsuit-over-tesla-autopilot-fatality-unlikely-to-win-but-it-uncovers-real-issues/#57b4a8f76034>



The Big Challenge: Human Interaction



<https://www.youtube.com/watch?v=VG68SKoG7vE>



Corner Cases and Generalization



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



Sensing

The image shows a custom-built sensor rig. It features three large, black, cylindrical lenses or sensors mounted horizontally in a row. The rig is constructed from black metal plates and silver-colored bolts. It is mounted on a blue and white checkered surface, likely the roof of a vehicle. In the background, a green safety fence and a clear blue sky are visible. The word "Sensing" is overlaid in white text on the first lens. A GoPro camera is also visible on the right side of the rig.

GPS

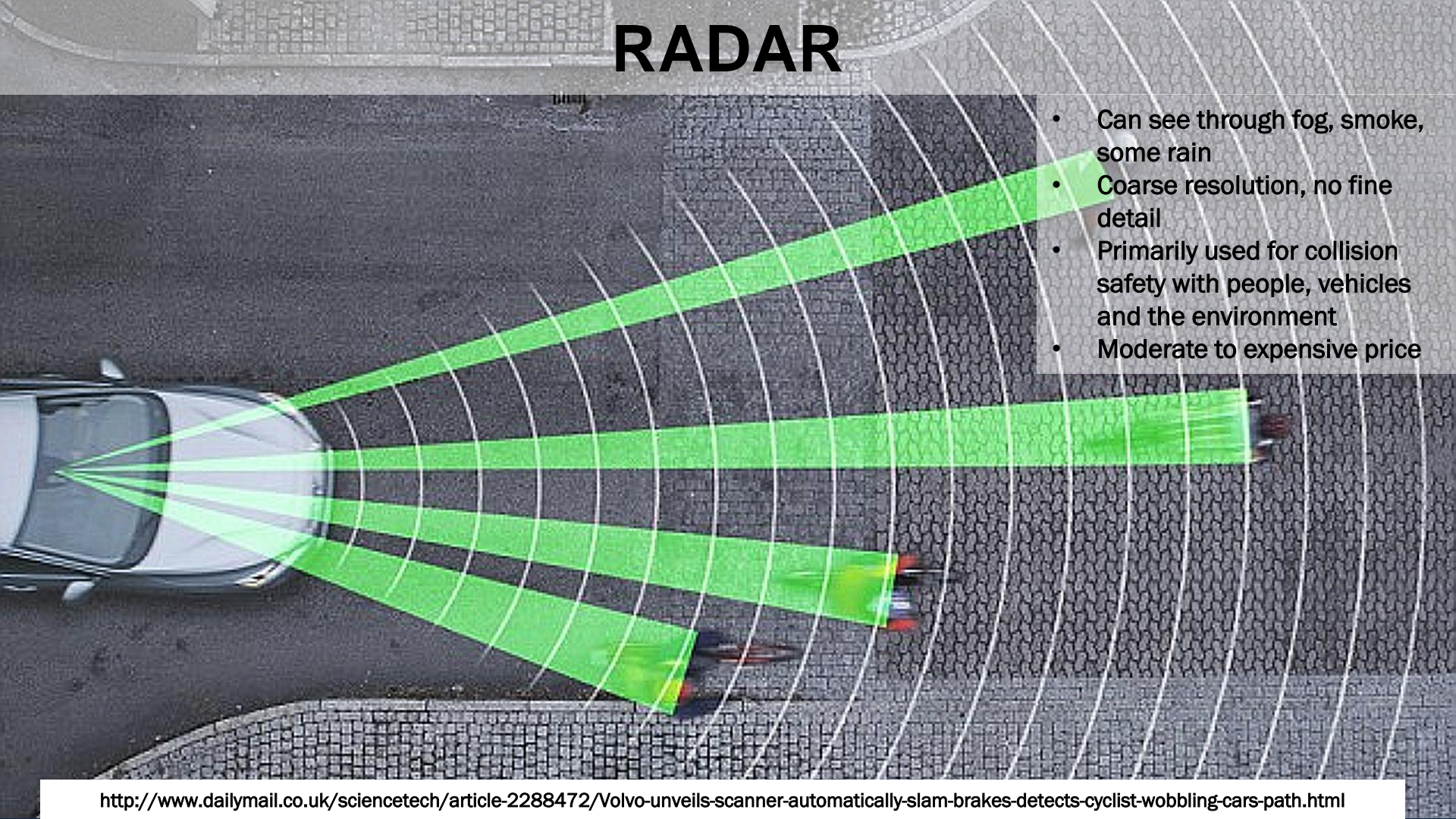
CAMERA-BASED GPS

QUT

- Provides position, good for journey planning
- Satellite-based, not 100% reliable (tunnels, urban canyons)
- “Autonomy-enabling” still not universally available (drop outs, accuracy, latency)
- Almost universal assumption that it can’t be used as primary source of positioning information

RADAR

- Can see through fog, smoke, some rain
- Coarse resolution, no fine detail
- Primarily used for collision safety with people, vehicles and the environment
- Moderate to expensive price



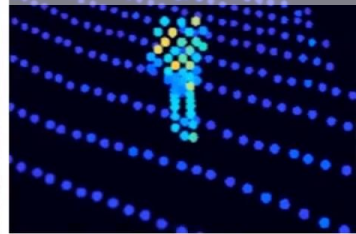
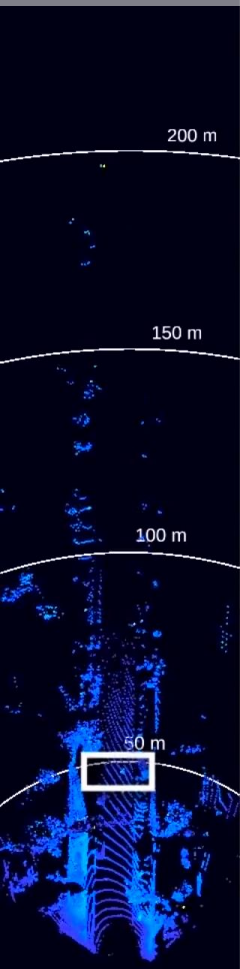
LIDAR

- 3D scan of range to all line of sight objects in all directions
- Medium resolution, high range accuracy
- Disrupted by heavy rain, particulates
- Good for detecting vehicles, pedestrians, mapping and positioning
- Expensive

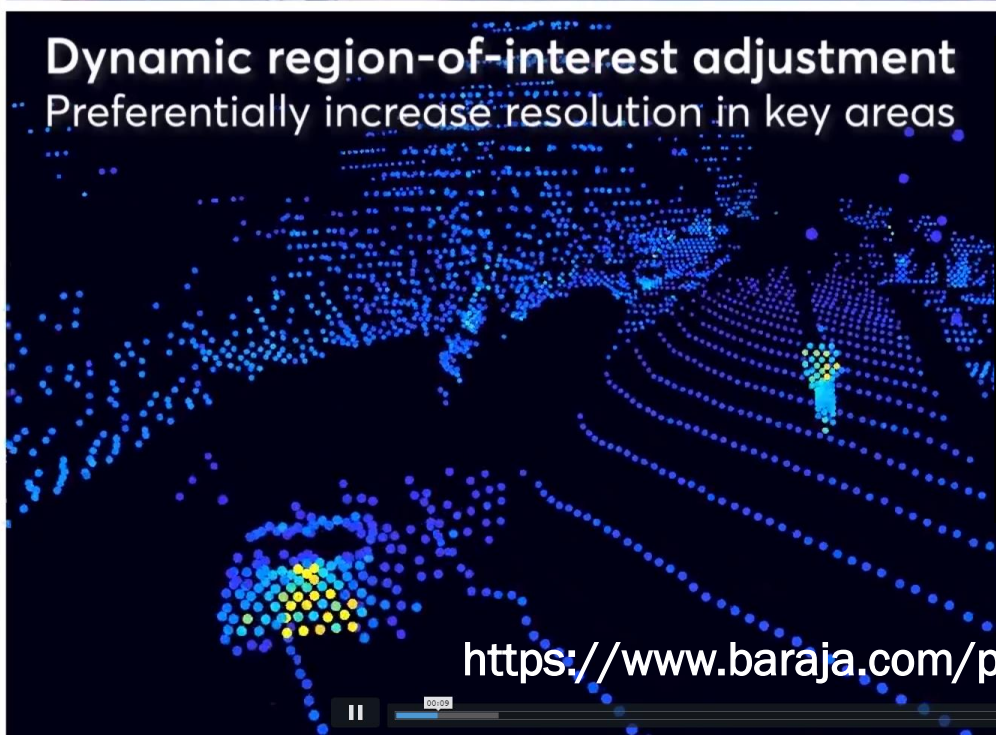


In-car photo by Michael Milford. Google Self-driving Car, Velodyne

Still some innovation in the area e.g. Baraja



Dynamic region-of-interest adjustment
Preferentially increase resolution in key areas



Driverless car start-up Baraja worth \$145m after latest fundraising

FINANCIAL REVIEW



Michael Bailey
Rich List Editor

Jun 24, 2019 — 4:01pm

Save

Share

Autonomous vehicles may be years from ruling the roads but investors see promise in Australian player Baraja, valuing the light detection and ranging (LIDAR) provider at \$145 million after a recent fundraise which made one founder a contender for the *Financial Review* Young Rich List.

Baraja has taken the type of telecommunications-grade laser that powers the internet and applied it to a LIDAR system, which measures the distance of surrounding objects for driverless cars.



Clifford Pankhurst (left) and Federico Calzavara of Baraja, which has developed LIDAR technology for self-driving cars that claims to eliminate interference from other autonomous vehicles. *Dominic Lawrence*

<https://www.baraja.com/product/>

50m



- Richest source of information
- High resolution
- Ranging to objects difficult
- Affected by environmental conditions (day-night, weather, atmospheric conditions)
- Relatively cheap

VISION (CAMERAS)

Camera Innovation Example: Dynamic Vision Sensors



Imperial College
London

Towards Visual SLAM with Event-based Cameras

Michael Milford¹, Hanme Kim², Stefan Leutenegger² and Andrew Davison²

¹Australian Centre for Robotic Vision, Queensland University of Technology

²Department of Computing, Imperial College London

Corresponding author: michael.milford@qut.edu.au

In "The Problem of Mobile Sensors: Setting future goals and indicators of progress for SLAM" Workshop at *Robotics and Science Systems* 2015



- **Low power**
- **Low latency**
- **High dynamic range**
- **Edge perception potential**

Bullet shot by a gun ($376\text{m/s} = 1,354\text{km/h}$)

Recall: trained in simulation only!



Huawei P20 Pro (240 FPS)



Our reconstruction (5400 FPS)

Source code & Datasets: https://github.com/uzh-rpg/rpg_e2vid

Rebecq et al., "High Speed and High Dynamic Range Video with an Event Camera",
T-PAMI'19. [PDF Video Code](#)

Event Cameras: Opportunities and the Road Ahead (CVPR 2020), Davide Scaramuzza, Robotics and Perception Group, Dept. of Informatics, University of Zurich, and Dept. of Neuroinformatics, University of Zurich and ETH Zurich, Switzerland
<https://youtu.be/6Sn9-M7qXLk>

Connectivity



A range of other sensors



Accelerometers, IMUs

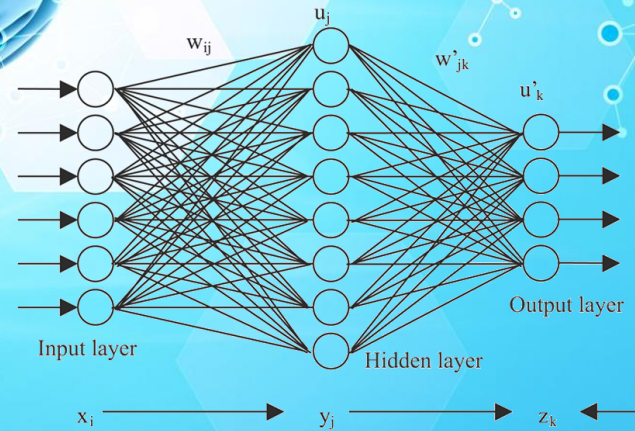


Wheel encoders



**Sonar, throttle, fuel mix,
power draw, all sorts of other
instrumentation**

Onboard Driving Intelligence



Positioning and Localisation



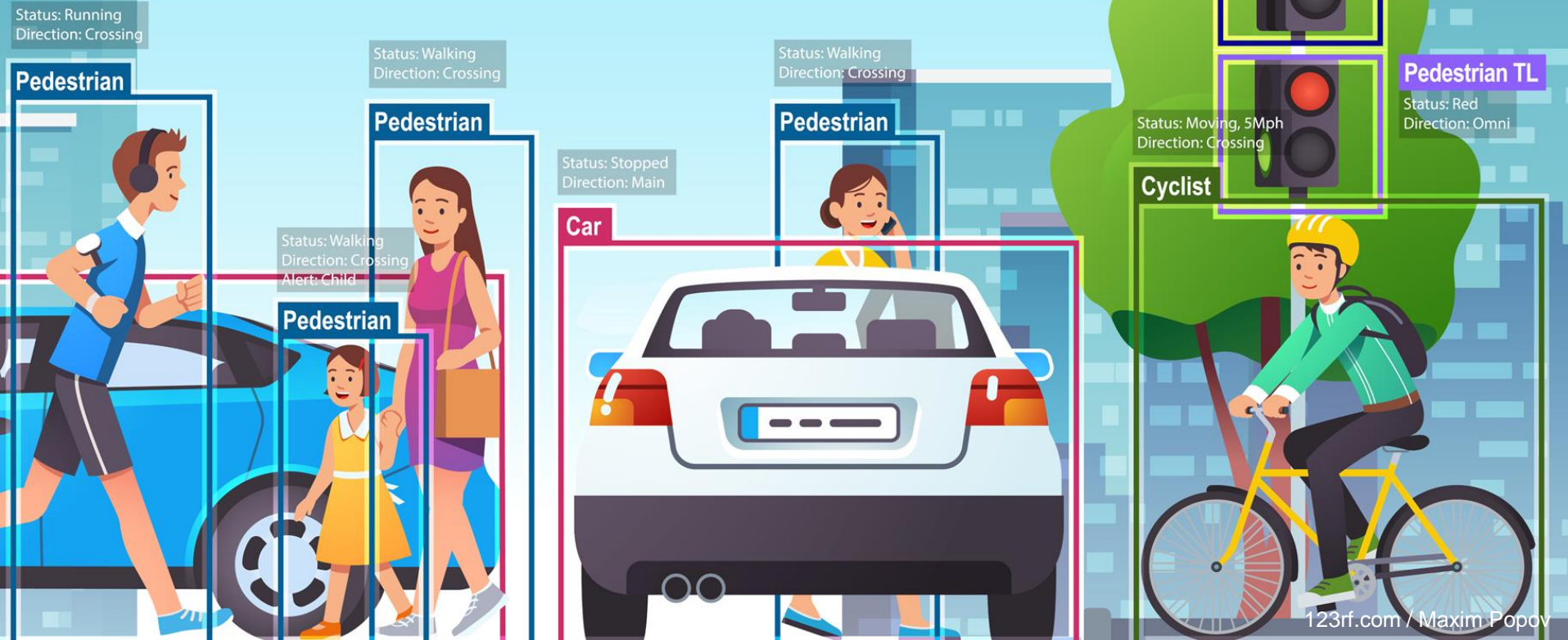
Knowing **When** You Don't Know: Simple Example

- Which is better?
 - **System 1:** A positioning system that is fit-for-purpose **99.9%** of the time but lacks self-diagnosis capability, or
 - **System 2:** A positioning system that is fit-for-purpose **99%** of the time, and self-diagnoses that it's unfit-for-purpose **99% of the remaining time?**



- Using System 1, you'll make decisions based on incorrect positional information **0.1%** of the time.
- Using System 2, this drops to **0.01%**. System 2 is hard to create.

Scene Understanding





Recognition is often not enough

Most autonomous systems operating in complex environments with people and other autonomous systems also need:

- Intent understanding
- Prediction
- Scenario planning
- Contextual understanding

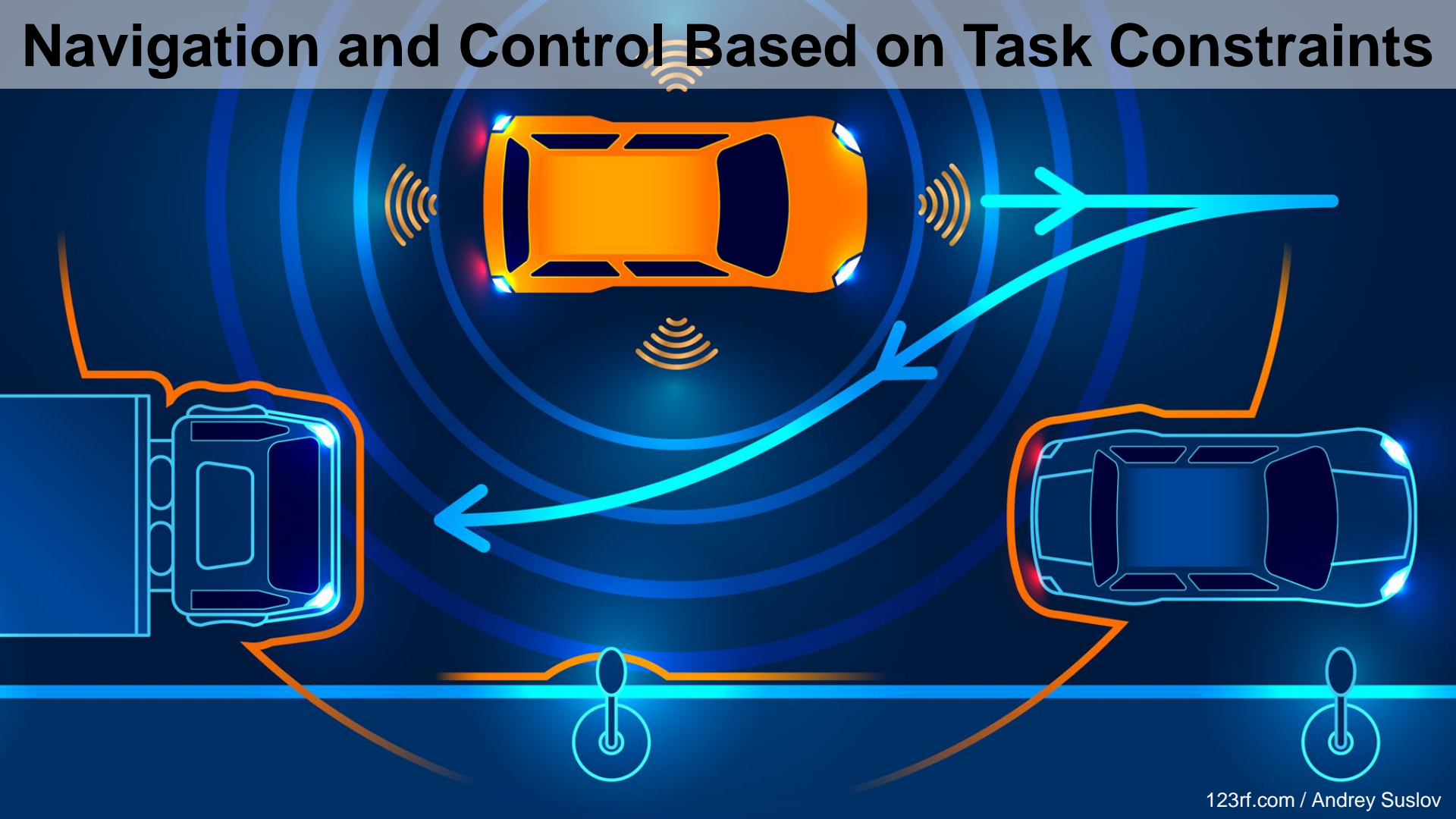




Better Sensors Solve Some but not All Problems



Navigation and Control Based on Task Constraints



The AI Story



- You can make an entirely safe AV **today** that is **entirely unusable**
- Good engineering, connectivity or infrastructure improvements (crutches) can solve some but **not all** remaining challenges
- Unpredictable, highly varied **vulnerable road users** (VRUs) are arguably the **most difficult challenge for AVs**
- It's likely **significant advances in driving intelligence – AI** – will be required
- AVs' **biggest impact** may be outside the AV domain: new levels of AI, which will **impact everything**

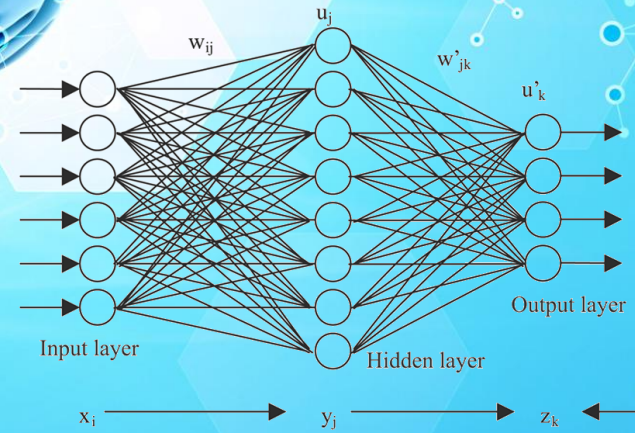


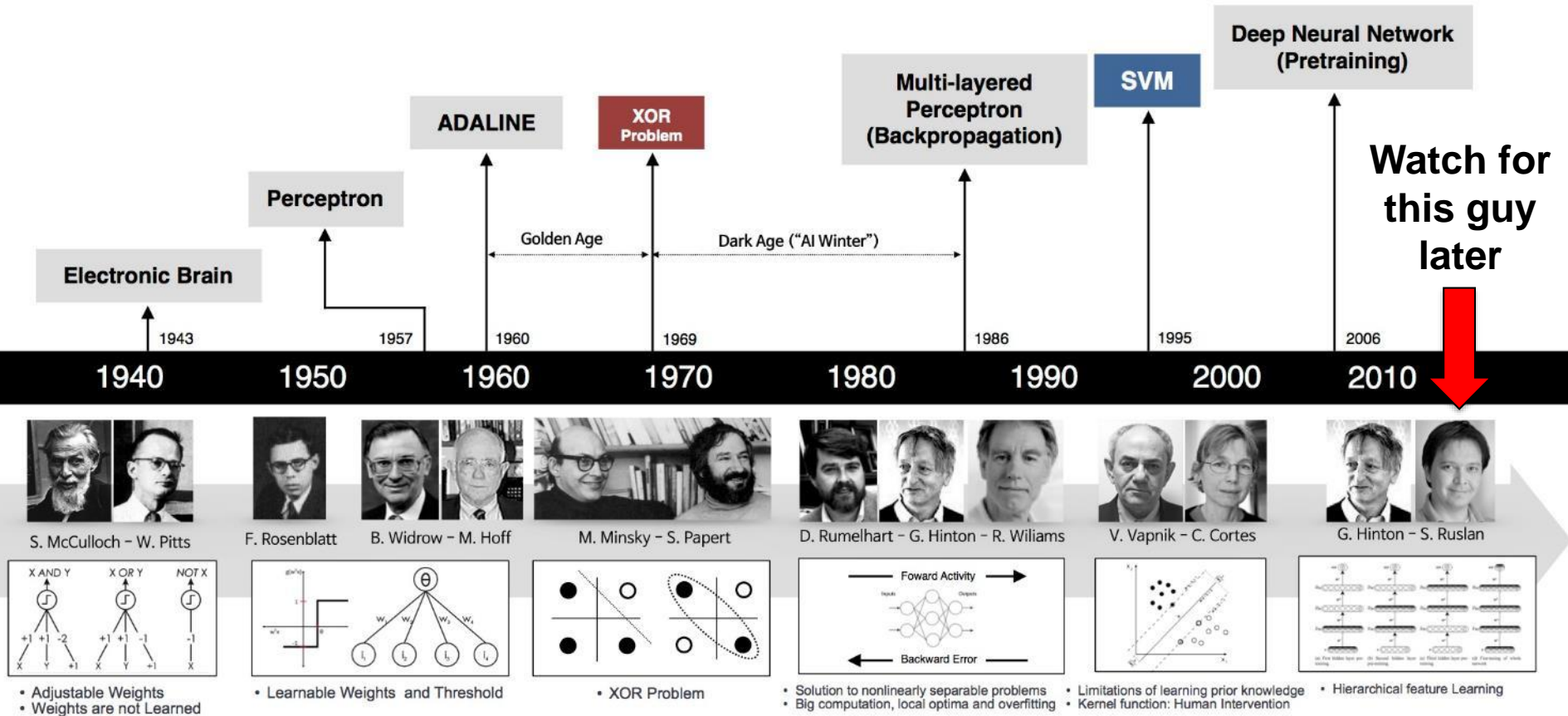
Understanding Technology Crutches

- It's critical to understand how **crutches** can and can't compensate for technology shortcomings
- E.g. failsafe remote teleop human intervention for AVs
 - Only viable in some applications
 - Critically reliant on system's ability for self-analysis



The Big One: Artificial Intelligence





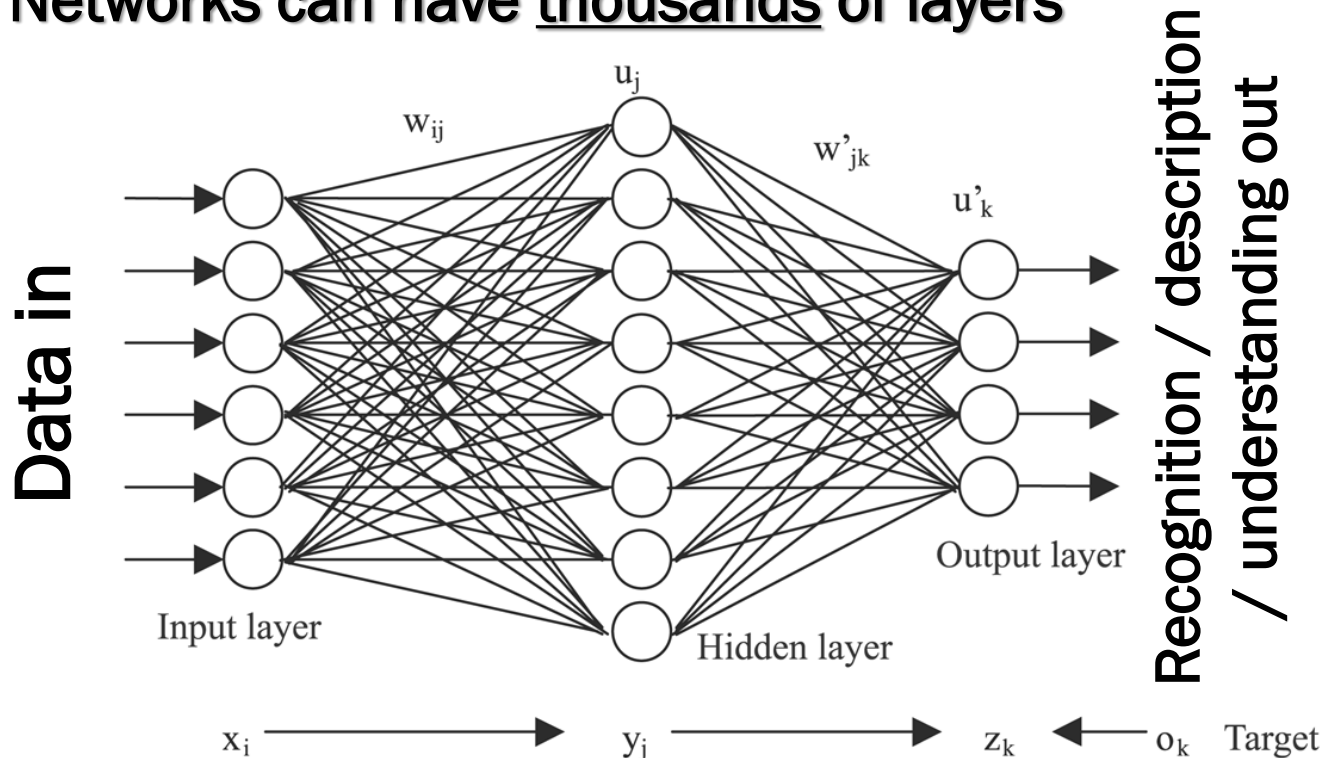
https://raw.githubusercontent.com/qingkaikong/blog/master/38_ANN_part1/figures/figure1_ANN_history.jpg

Modern Neural Network-based AI

Networks can have thousands of layers



Bio-inspired
only in a
very loose
sense



<http://www.extremetech.com/wp-content/uploads/2015/07/NeuralNetwork.png>

Worth a lot of
money

Worth a lot less
money

Modern AI is
Very Recent



Multiple AI Winters

Hype cycle

**Reduced
funding**

**Failure to
deliver**

Talent exodus

A Brief History



AI Summers?

Hype!

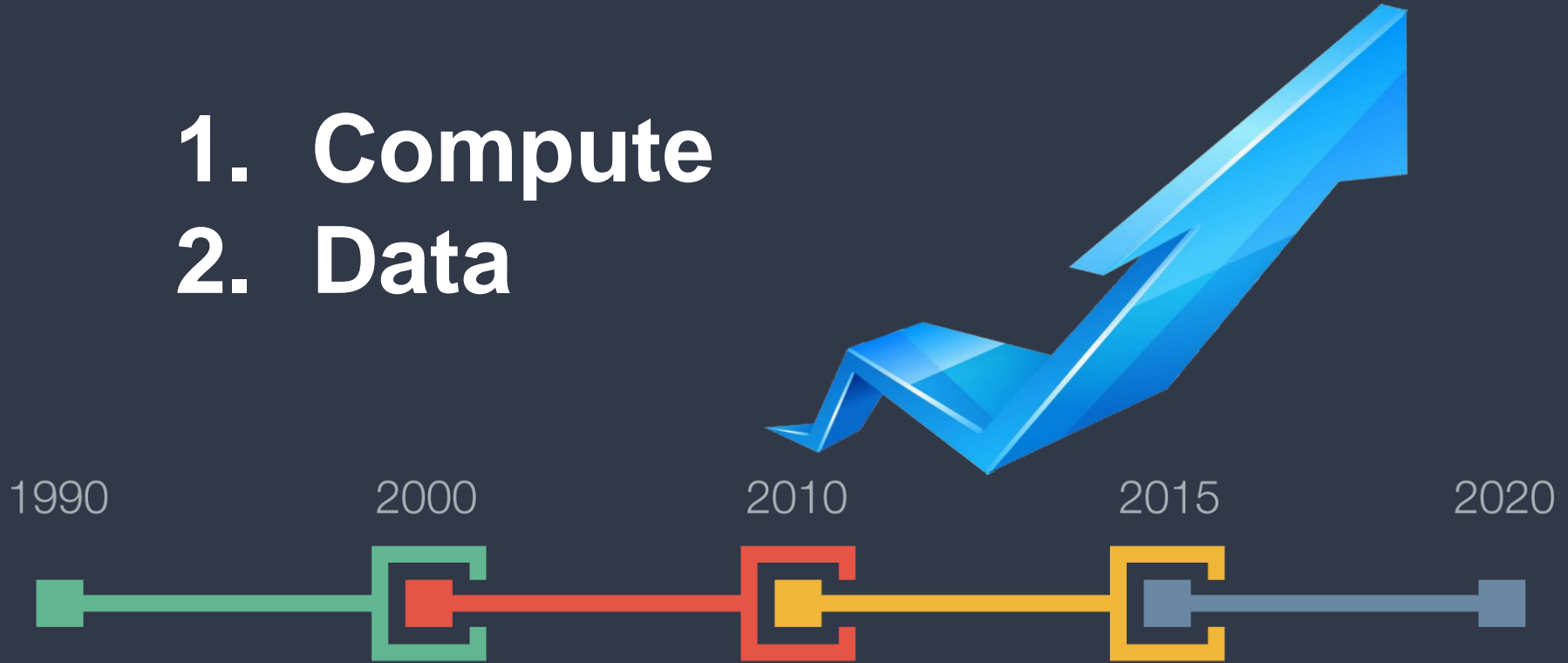
**Ridiculous funding
and money**

**Black hole for
talent**

History repeats... but never exactly the same way

The “Comeback” – What’s Changed in the Past Decade?

1. Compute
2. Data



Scale of data available

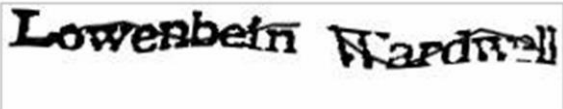
Michael

Ethan

Terese

Security Check

Enter **both** words below, **separated by a space**.
Can't read the words below? Try different words or an audio captcha.








Sick of these? [Verify your account](#).

Text in the box:

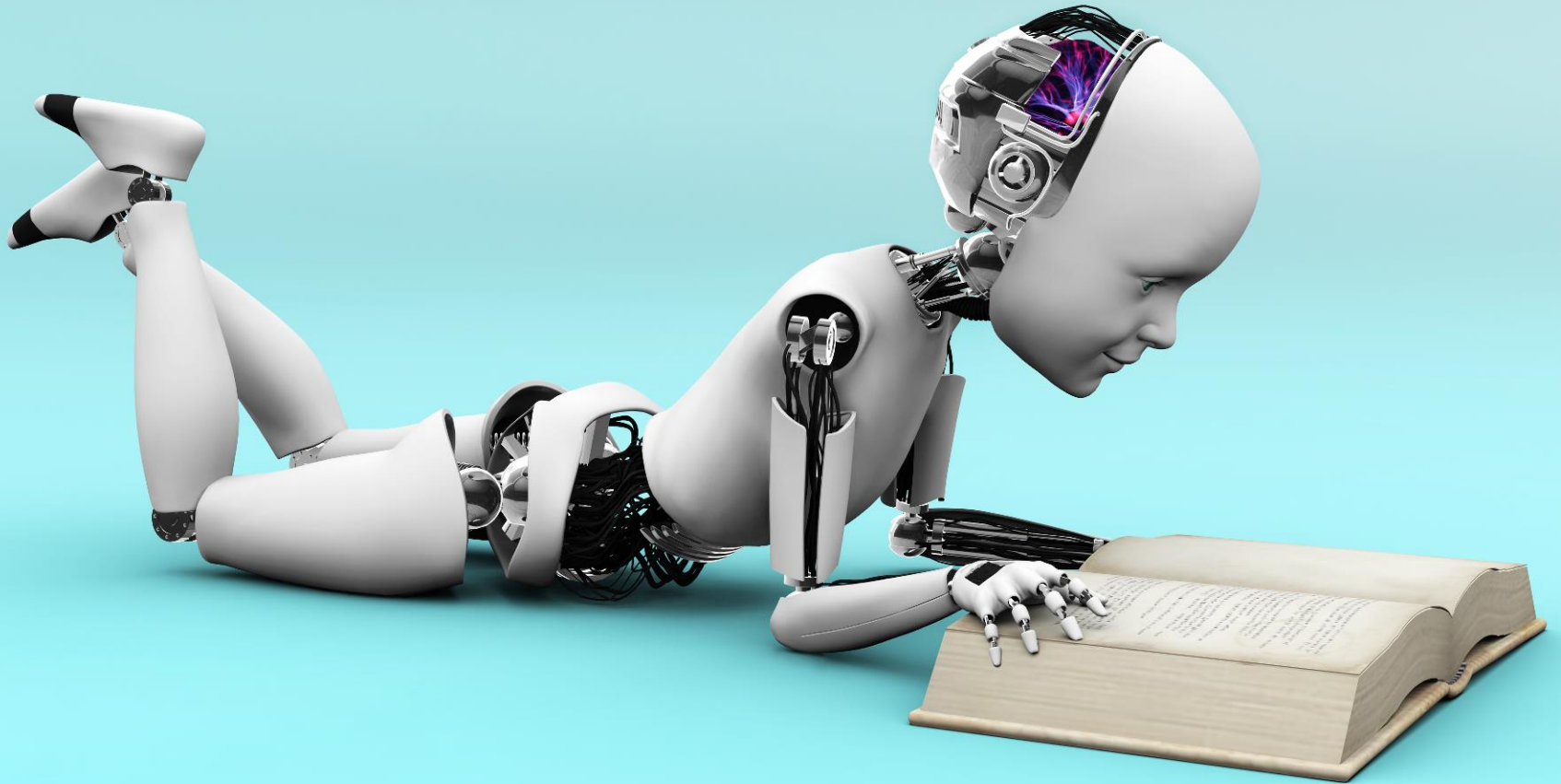
What's This?

Select all squares with **vehicles**.
If there are none, click skip.



Training AI Systems



Supervised Learning



Cat

Dog

Dog

Cat

Drawers

Bowl

Chair

Cat

Rug

Ball

Dog

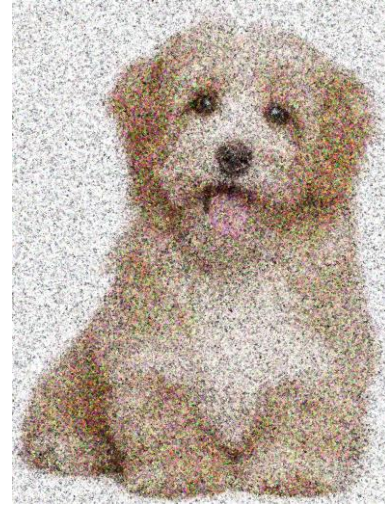
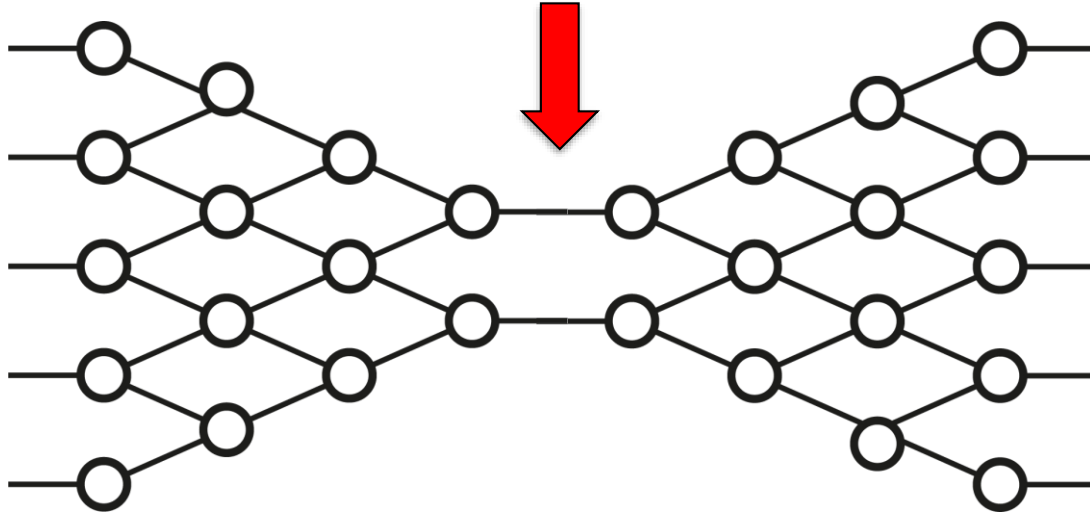
Ball

Dog

Ball

Unsupervised Learning

Useful compact
representations
of data





Key Data Concepts Discussed

- “Garbage in, garbage out”
- “Only as good as the data it’s trained on”
 1. It’s possible for AI systems to do far more with a certain source of data than a human can or could conceive of, **but**
 2. It’s also possible for AI systems to “cheat” outrageously and find the easiest way to solve an (often poorly formulated” problem

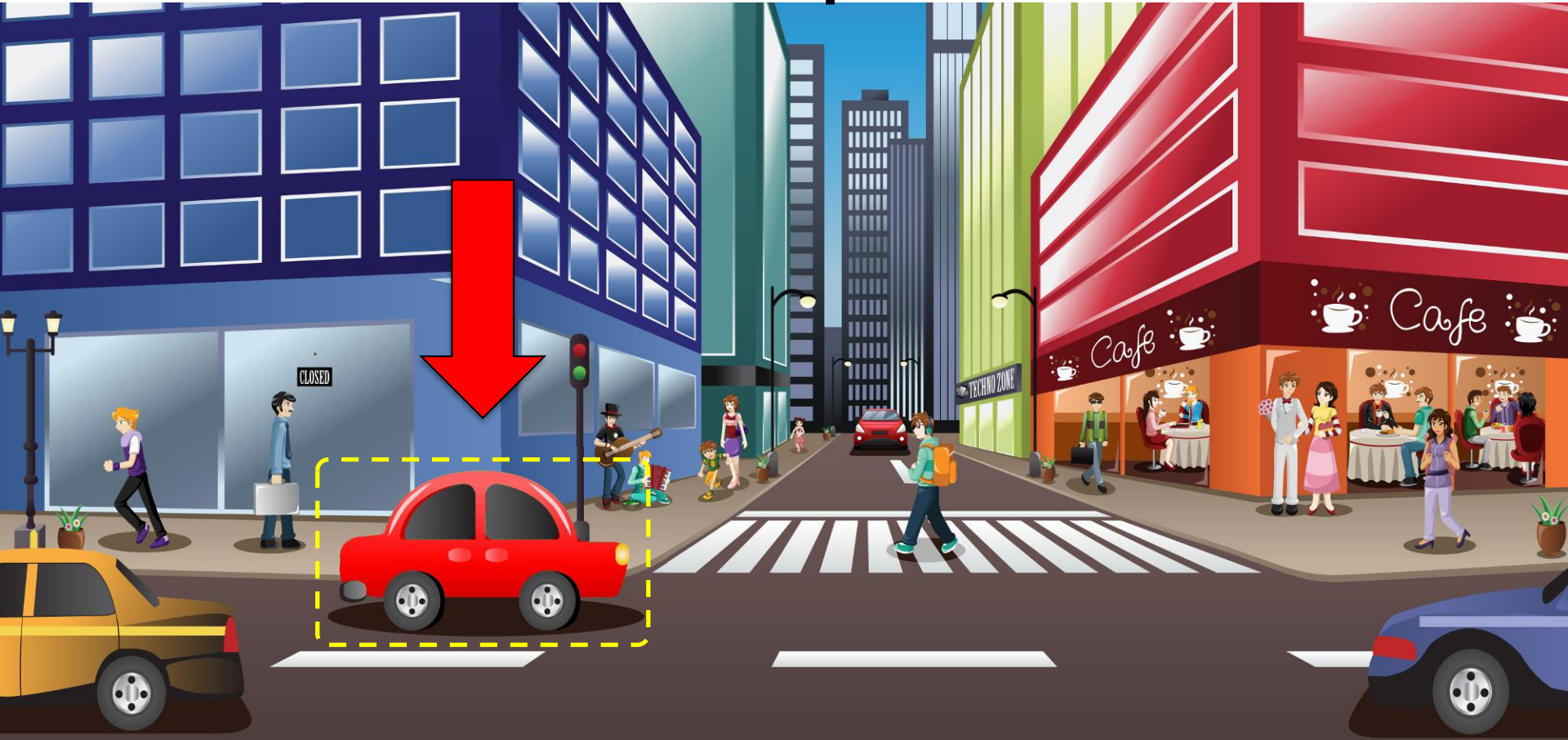


Understanding **How** You Know: An AI Fable





Understanding Systems through Input Manipulation





Looking Deep into the Network...



https://www.youtube.com/watch?v=dbQh1I_uvjo

Small Networks are Directly Auditable

ARTICLES

<https://doi.org/10.1038/s42256-020-00237-3>

nature
machine intelligence



Neural circuit policies enabling auditable autonomy

Mathias Lechner^{1,4}, Ramin Hasani^{2,3,4}, Alexander Amini³, Thomas A. Henzinger¹, Daniela Rus³ and Radu Grosu²

A central goal of artificial intelligence in high-stakes decision-making applications is to simultaneously express generalizability by learning coherent representations of their world dynamics. Here, we combine brain-inspired neural computation principles and scalable compact neural controllers for task-specific compartments of a full-stack autonomous system, connecting 32 encapsulated input feature maps to high-dimensional steering commands. This system shows superior generalizability compared with orders-of-magnitude larger black-box learning systems. The observed autonomy for task-specific parts of a complex autonomous system.



By The original uploader was Kbradnam at English Wikipedia.(Original text: Zeynep F. Altun, Editor of www.wormatlas.org) - Transferred from en.wikipedia to Commons.(Original text: Donated by Zeynep F. Altun), CC BY-SA 2.5, <https://commons.wikimedia.org/w/index.php?curid=2680458>

AUTONOMOUS SYSTEMS

C. Elegans inspires self-driving cars

Autonomous driving technology is improving, although doubts about their reliability remain. Controllers based on compact neural architectures could help improve their interpretability and robustness.

Michael Milford

If you had just woken up in late 2020 after a decade-long slumber, you might be forgiven for thinking that hardly any progress had been made in autonomous systems, given the lack of widespread applications such as on-road autonomous vehicles. Automation, it seems, is still struggling to escape from the domains where it has long been a staple of operation, including mines, logistics centres and marine ports. This relative lack of progress is all the more perplexing when we consider the apparent leaps and bounds of progress in the AI — and in particular, deep learning — research community. However, there are doubts about the generalizability

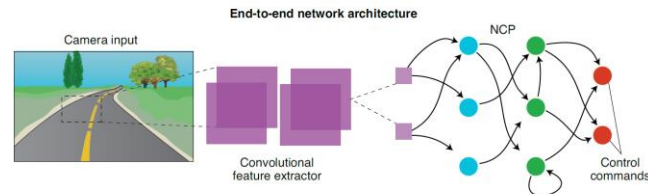
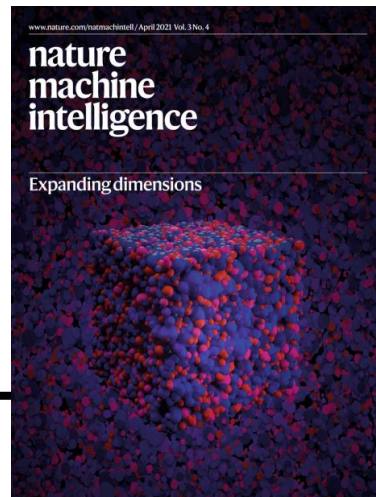
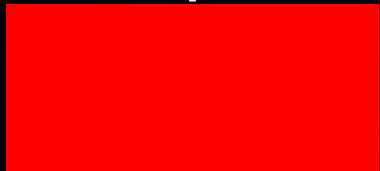


Fig. 1 | The visual input to control commands pipeline for a neural circuit policy network. The neural circuit policy network takes the latent representation of camera input produced by a convolutional neural network and transforms it into control commands for keeping the vehicle in its lane.



Compute Available

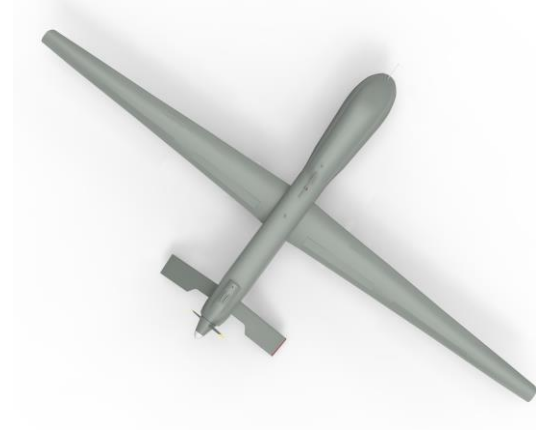
Compute:





Key compute concepts

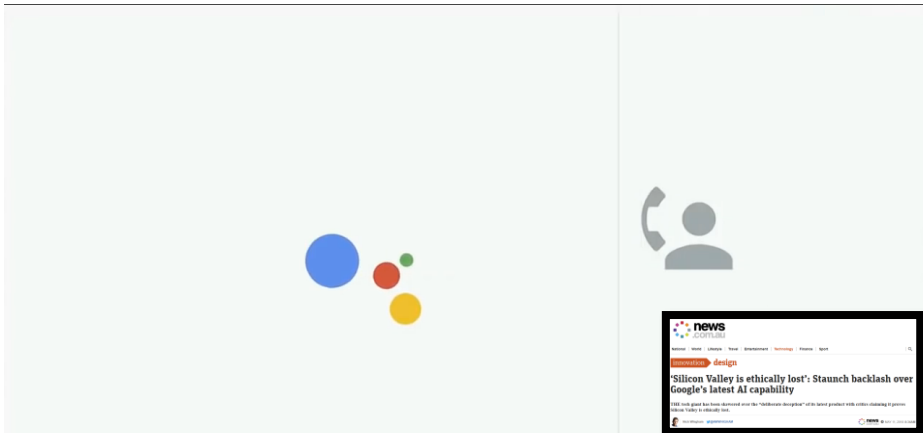
- Online versus offline
- Training versus deployment
- On-board versus off-board (including “the cloud”)
- Although power hungry, compute is rarely the key power bottleneck in high mobility systems



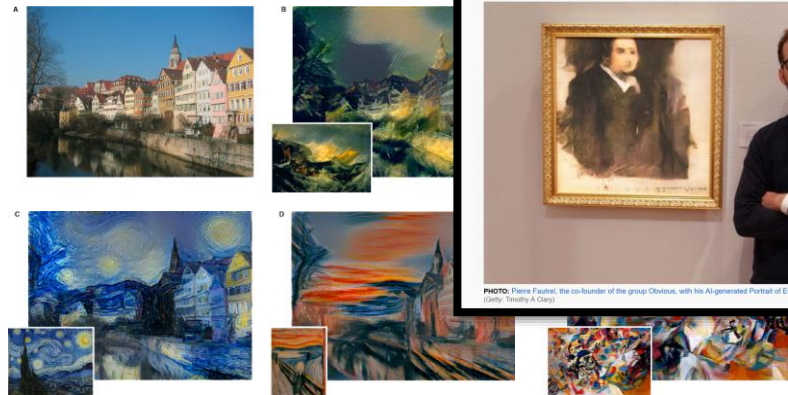


What Can the AI Tech Do?

What Can the AI Tech Do?



<https://www.vox.com/future-perfect/2019/5/31/18645993/ai-deepfakes-gan-explained-machine-learning>



A Neural Algorithm of Artistic Style: <https://arxiv.org/abs/1508.06576>

SYSTEM PROMPT (HUMAN-WRITTEN)

Recycling is good for the world.

NO! YOU COULD NOT BE MORE WRONG!!

MODEL COMPLETION (MACHINE-WRITTEN, 25 TRIES)

Recycling is NOT good for the world. It is bad for the environment, it is bad for our health, and it is bad for our future. Recycling is not good for the environment and it is a major contributor to global warming. It contributes to air pollution and disease and cancer. Recycling is a waste of time and money, and in turn, it costs a lot of money to recycle. Recycling is not good for our nation. We pay a tremendous price for the privilege of having the world's most efficient and efficient recycling system. Recycling is a huge, colossal waste of time, energy, money, and resources. And THAT is why we need to stop recycling.

Neowin

OpenAI won't release an AI model due to its ability to create fake news

THE VERGE

OpenAI has published the text-generating AI it said was too dangerous to share

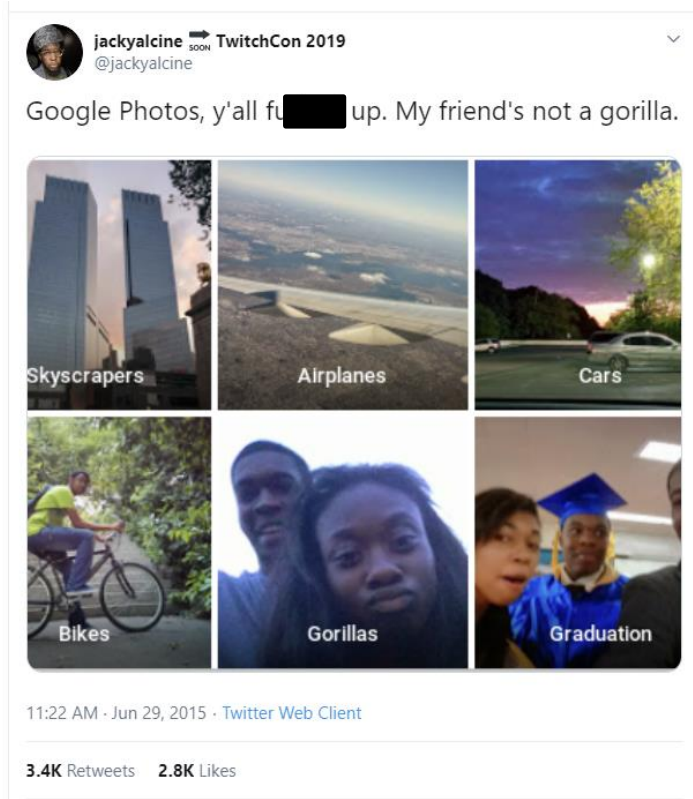


Rule of Thumb: What Modern “AI” Can Do

- With enough attention and resources,
- you can develop modern AI-based technology that **matches** or **surpasses** human performance on most **constrained** tasks,
- **if** sufficient quantities of **representative** training data can be obtained, and
- **ideal performance can be defined.**

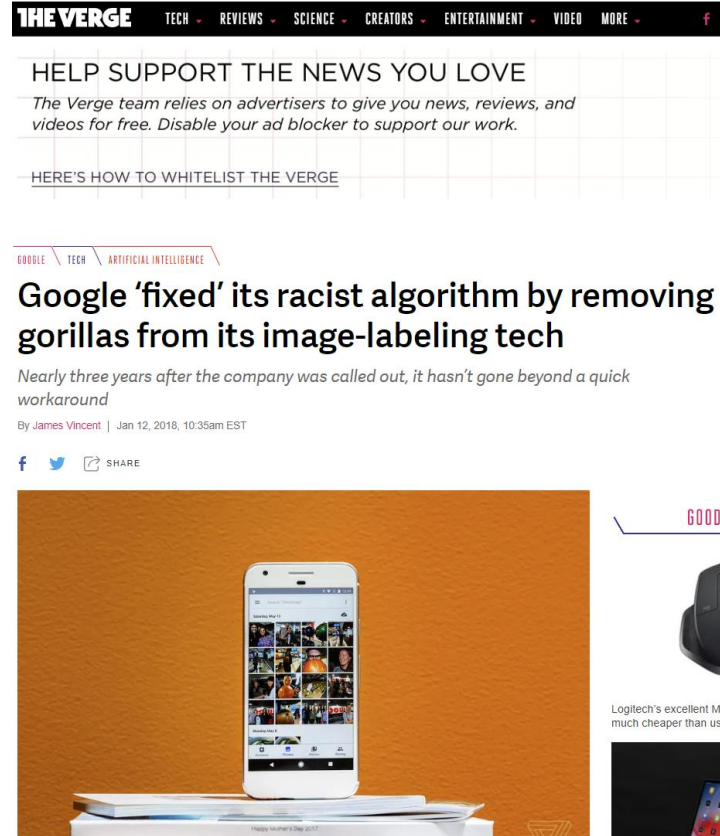


Only as good as what you feed it



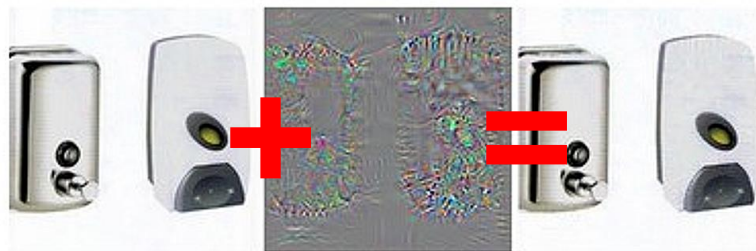
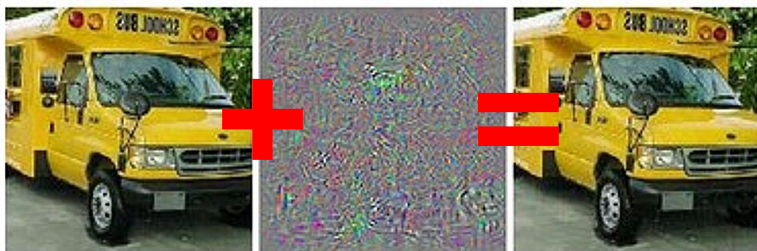
<https://twitter.com/jackyalcine/status/61532951590915686>

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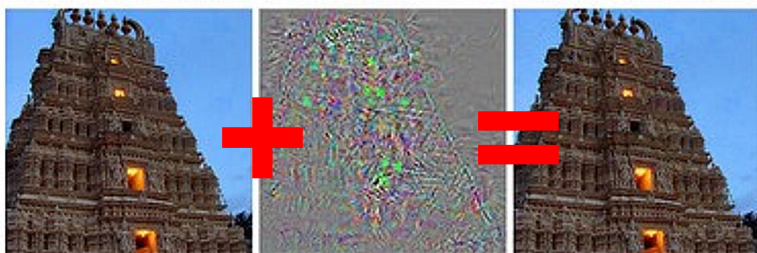




Unintuitive behaviour



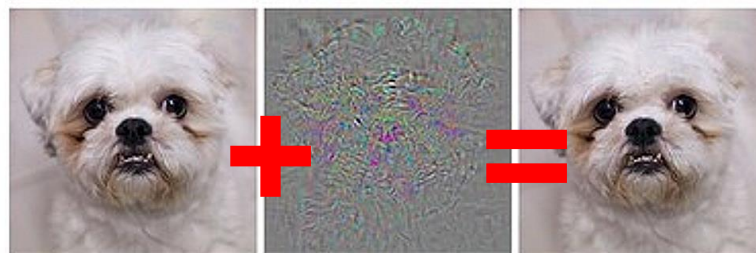
Incredible Resources Being Brought to Bear on Solving These Problems



correct

+distort

ostrich



correct

+distort

ostrich

Szegedy et al, "Intriguing properties of neural networks", <https://arxiv.org/abs/1312.6199>

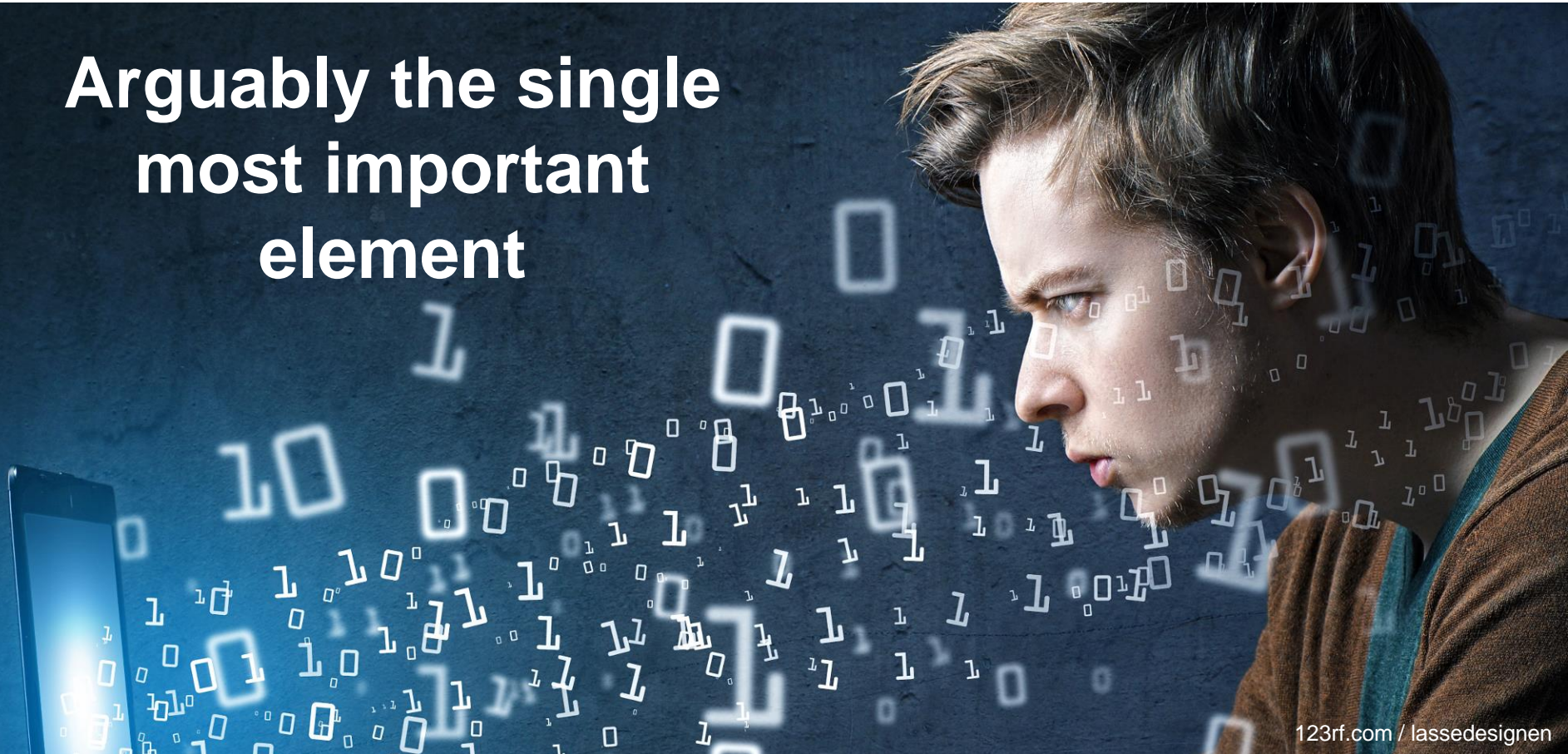


Talking About Expertise...



Talent and Expertise

**Arguably the single
most important
element**



2018 Conference on Robot Learning, Zurich



**Microsoft CEO
Satya Nadella**

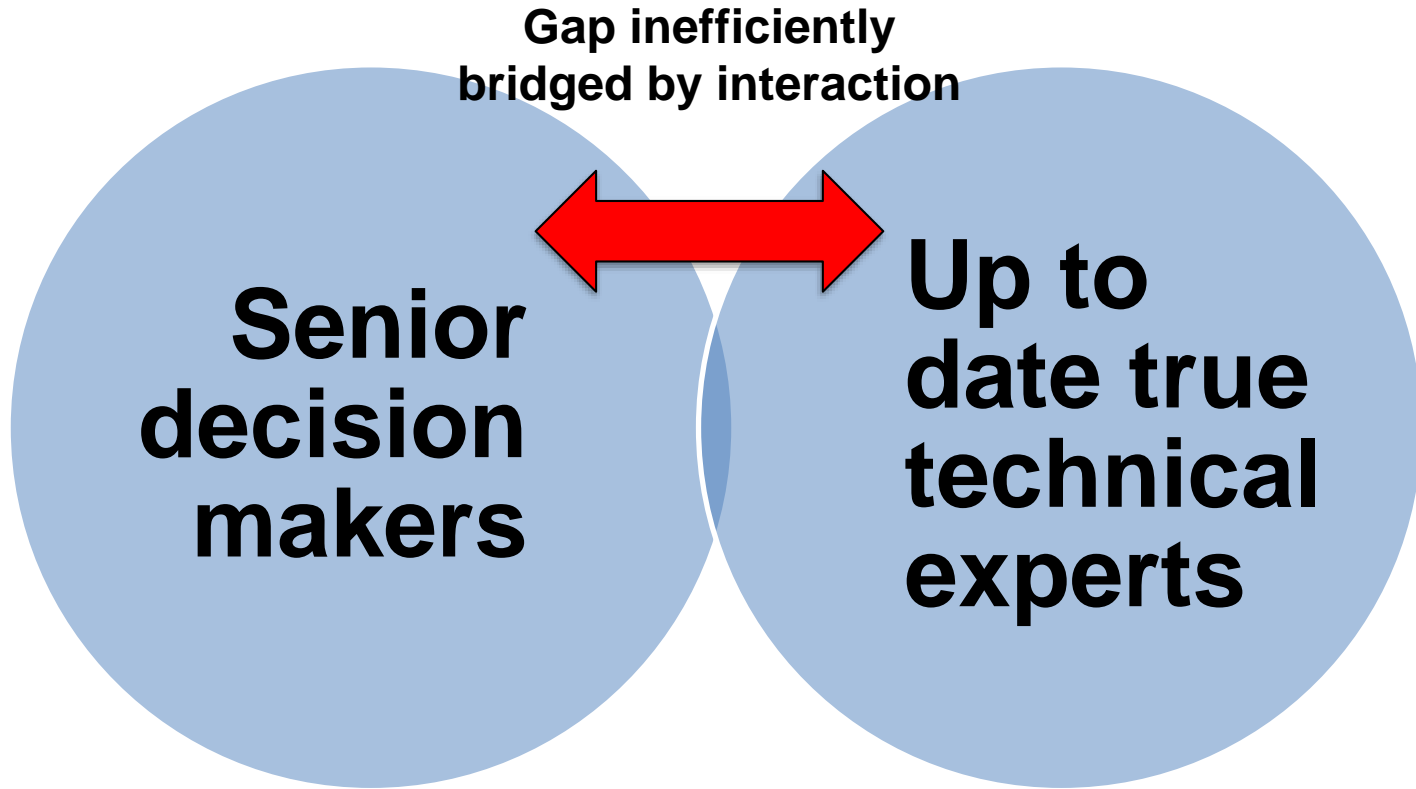


“Representative Industry/Commercial Sector Event”





Never the twain shall meet... *Rudyard Kipling*





Beware Technical Lightweights

- Much of the key tech is very recent so only otherwise inexperienced juniors are familiar
- “Senior” staff (**Professors, Futurists, C Level Executives** etc...) who haven't made a significant effort to continuously retrain will lack **DEEP** technical understanding



What's always said: Deep technical experts can often lack communication skills and an understanding of the bigger picture, BUT...

Lightweight technical experts who don't know their own limitations can be extremely dangerous



The Partial Illusion of Democratization

- Increasing availability of packages and tools fosters the partial **illusion** of democratized AI and tech **BUT**
- Reality is that **mechanistic use of these tools is very different to mastery**
- Mastery often requires access to a still highly limited “**top talent**” pool, **proprietary data** and **incredible compute**.



An Incredible Landscape for Talent in the Field

allure Network
GIZMODO | AU

ile Car Tech Online Science & Health Cameras Computing Gaming Entertainment

Uber Reveals [REDACTED] Bonus Dispute Between Fired Engineer And Google

Kate Conger

Jun 29, 2017, 9:00am Filed to: anth



FEDERAL BUDGET 2021, TECHNOLOGY

Federal budget unpacks details of the government's \$124 million AI spend

 **SmartCompany**

STEPHANIE PALMER-DERRIEN

MAY 11, 2021



GOOGLE POLICY TECH

THE VERGE

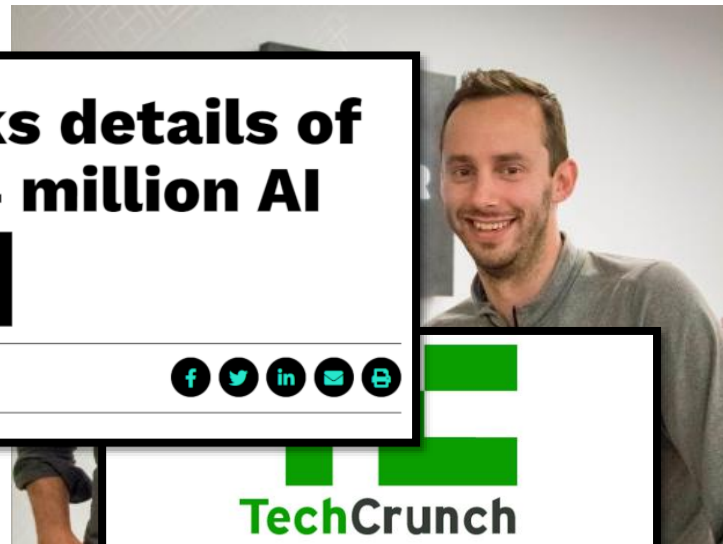
Ex-Google and Uber engineer Anthony Levandowski must pay Google \$179 million

Levandowski filed for bankruptcy protection in response

By Thomas Ricker | @Trixy | Mar 5, 2020, 6:24am EST



Known as “Funny Money” in the industry



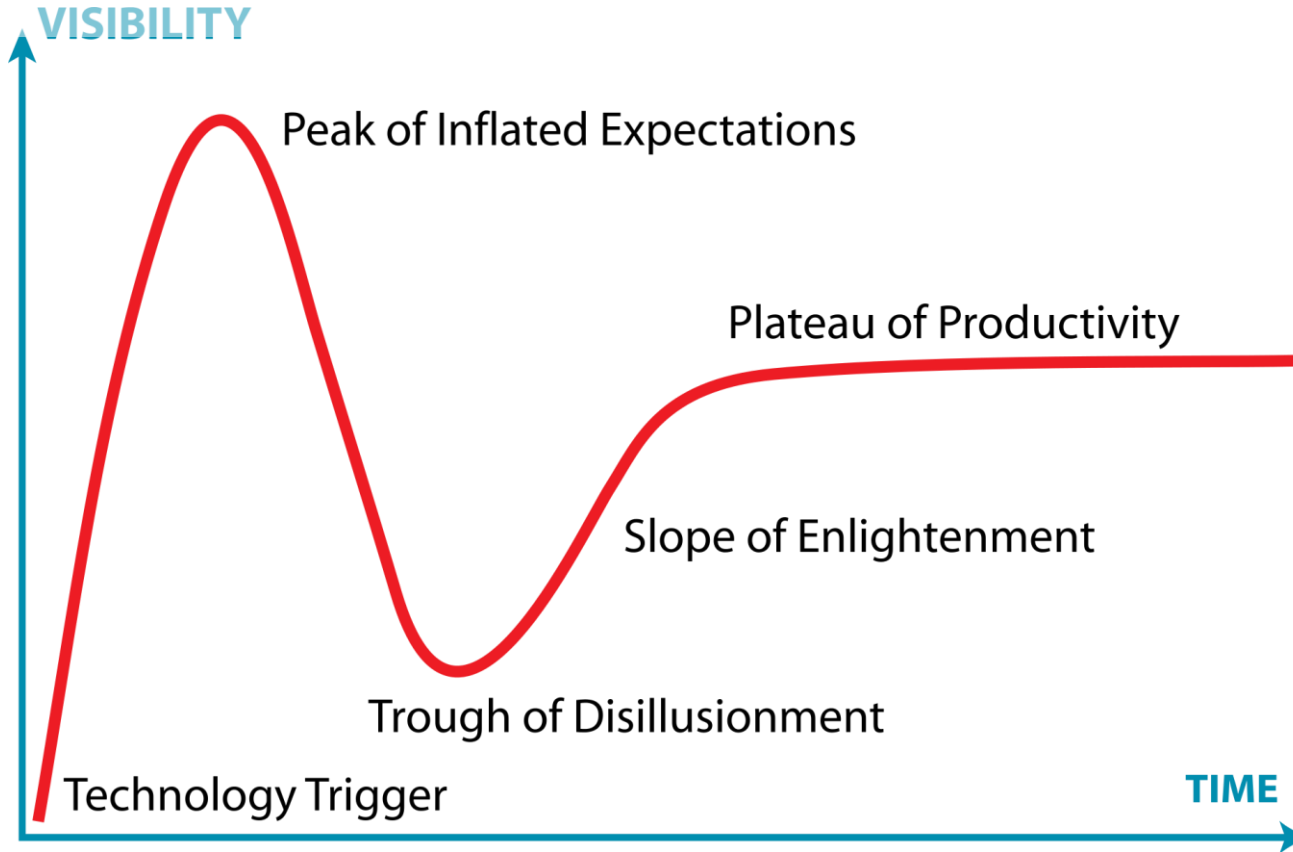
**Waymo case reveals Levandowski
got \$250 million in Uber stock for
Otto**

Predicting and Planning for the Future



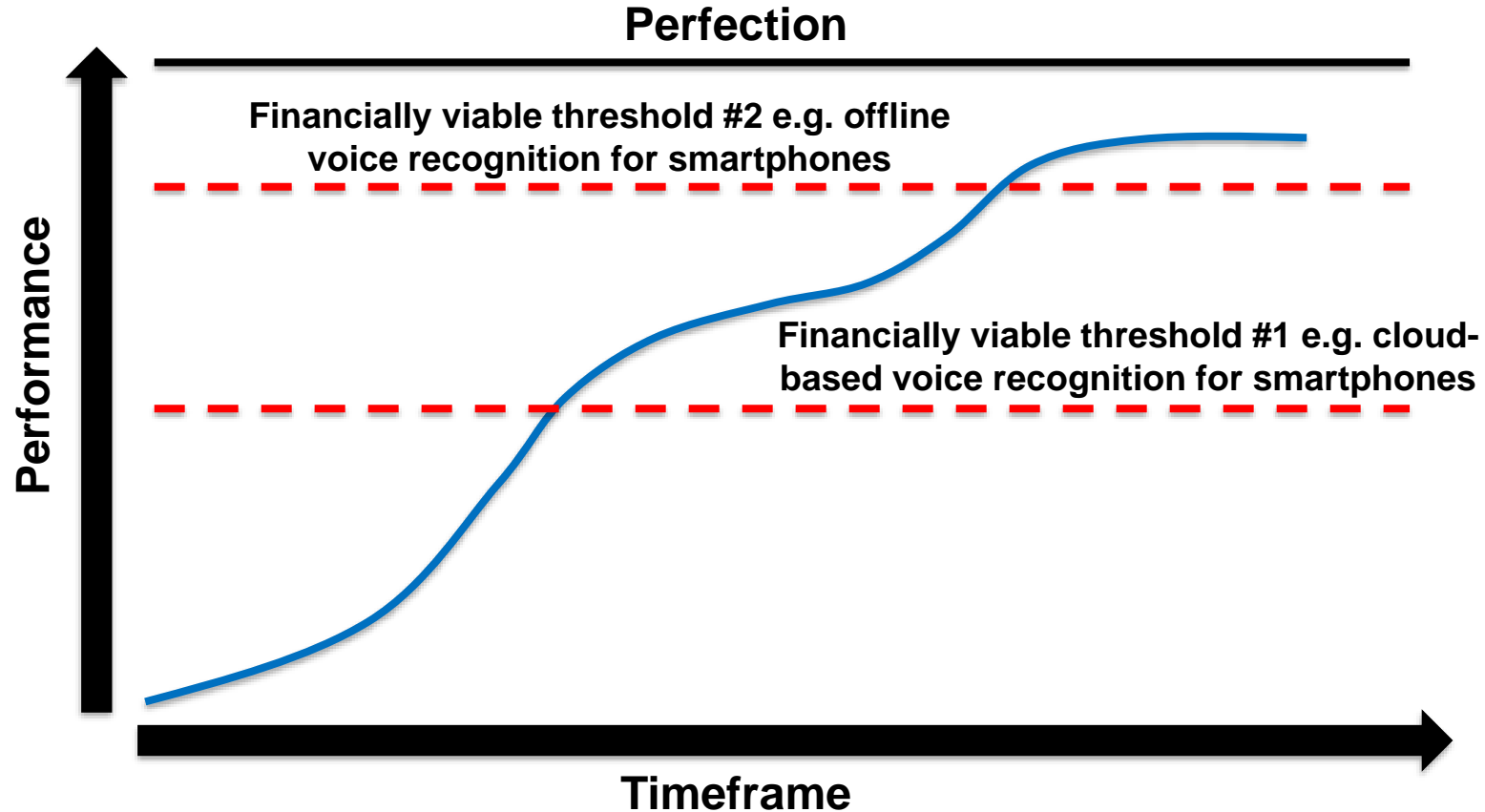


The Classic Hype Cycle Implicitly Assumes Eventual Success

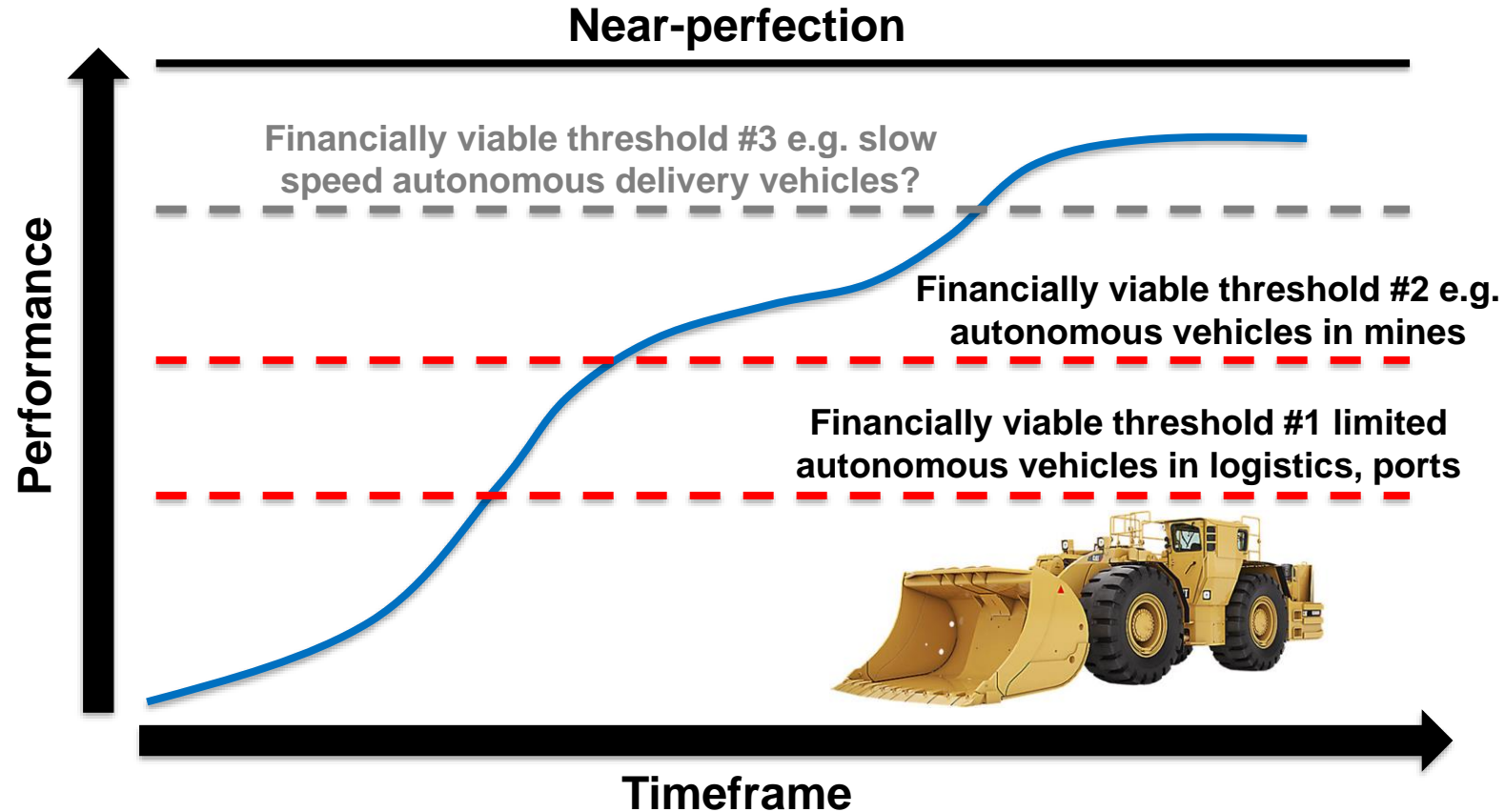


Attribution: Jeremykemp at English Wikipedia

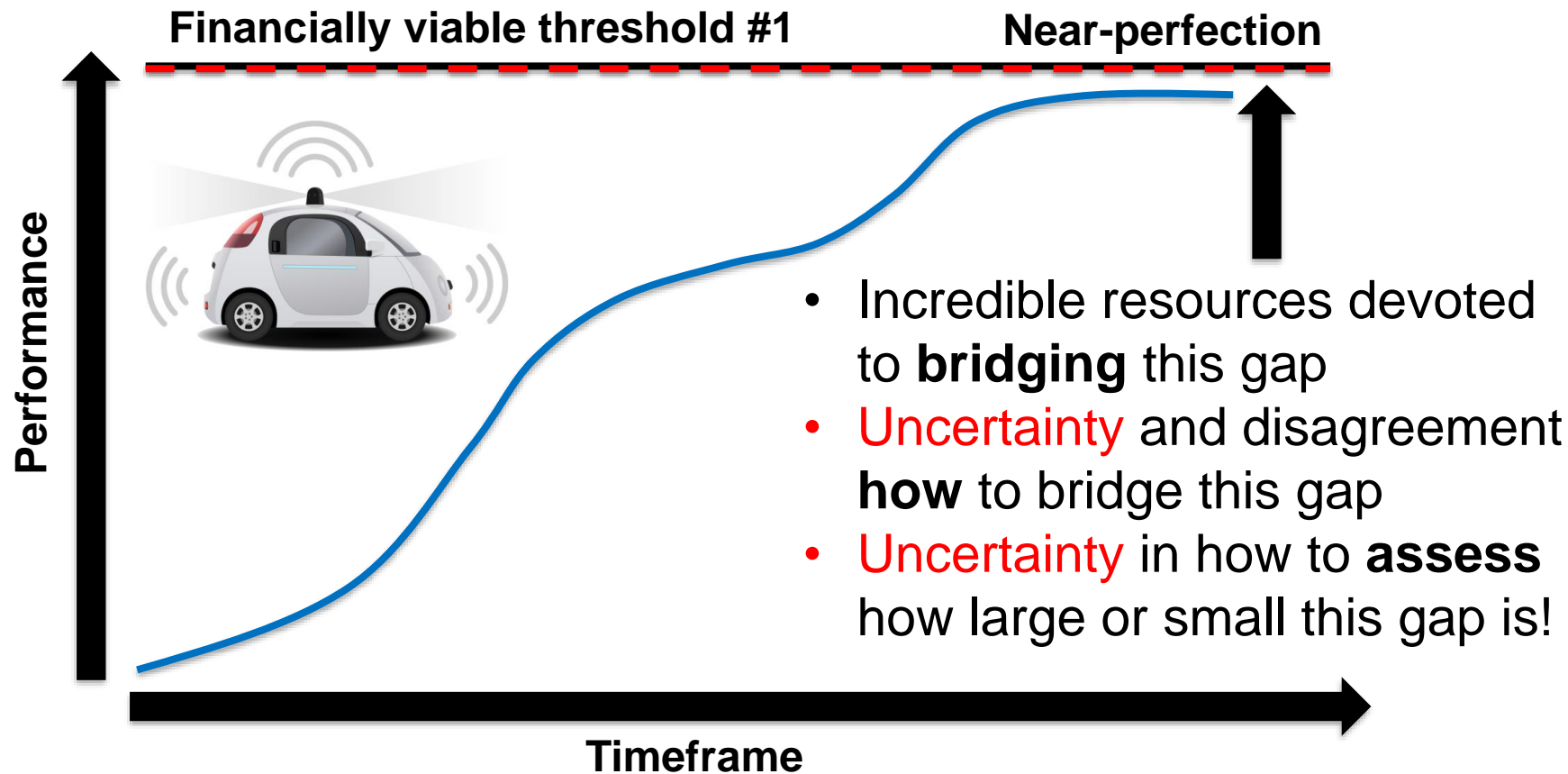
Progress Charts – Typical Technology



Progress Charts – General AV Technology



Progress Charts – Widespread, Passenger-Carrying Robotaxis



Two brown paper lunch bags are positioned side-by-side on a white background. A semi-transparent white rectangular box is centered over the middle of both bags, containing the text "Key Takeaways" in a bold, black, sans-serif font.

Key Takeaways

My Recommendations About These Technologies



Avoid the temptation to think in unchanging absolutes about the technology e.g. “never be like a human”, “solves everything”



See through the hype but don't dismiss everything out of hand (this requires nuance)



Keep an informed, regularly updated awareness of the range of scenarios that could play out



Future Technologies of War

**Robotics, AI and Autonomy:
Moving Beyond The Hype
to a Deeper Understanding**

**Professor Michael Milford
Acting Director
QUT Centre for Robotics**



**Centre for
Robotics**