

# Can we teach morality to machines?



Die Bundesregierung

Menü | Aktuelles

**AI-D**  
Artificial Intelligence at TU Darmstadt  
<http://www.ai-da.tu-darmstadt.de/>  
The #1 German and the #2 European institution for AI, according to csrankings.org

Im Wortlaut

### Pressestatement von Bundeskanzlerin Merkel beim Besuch der TU Darmstadt am 8. Oktober 2018

in Darmstadt

Mitschrift Pressekonferenz  
Montag, 8. Oktober 2018

„Wir haben dann in einer Gesprächsrunde mit den Studierenden gesehen, wie motiviert die TU Darmstadt ist, wie motiviert die Studierenden und die Lehrkräfte sind, und dass wir hier wirklich ein **Juwel in Fragen der künstlichen Intelligenz** mit all ihren Teilgebieten haben.“



Machine Learning and Artificial Intelligence: Two Fellow Travelers on the Quest for Intelligent Behavior in Machines

Kristian Kersting

Frontiers in Big Data  
Published on 19 Nov 2018  
OPEN ACCESS

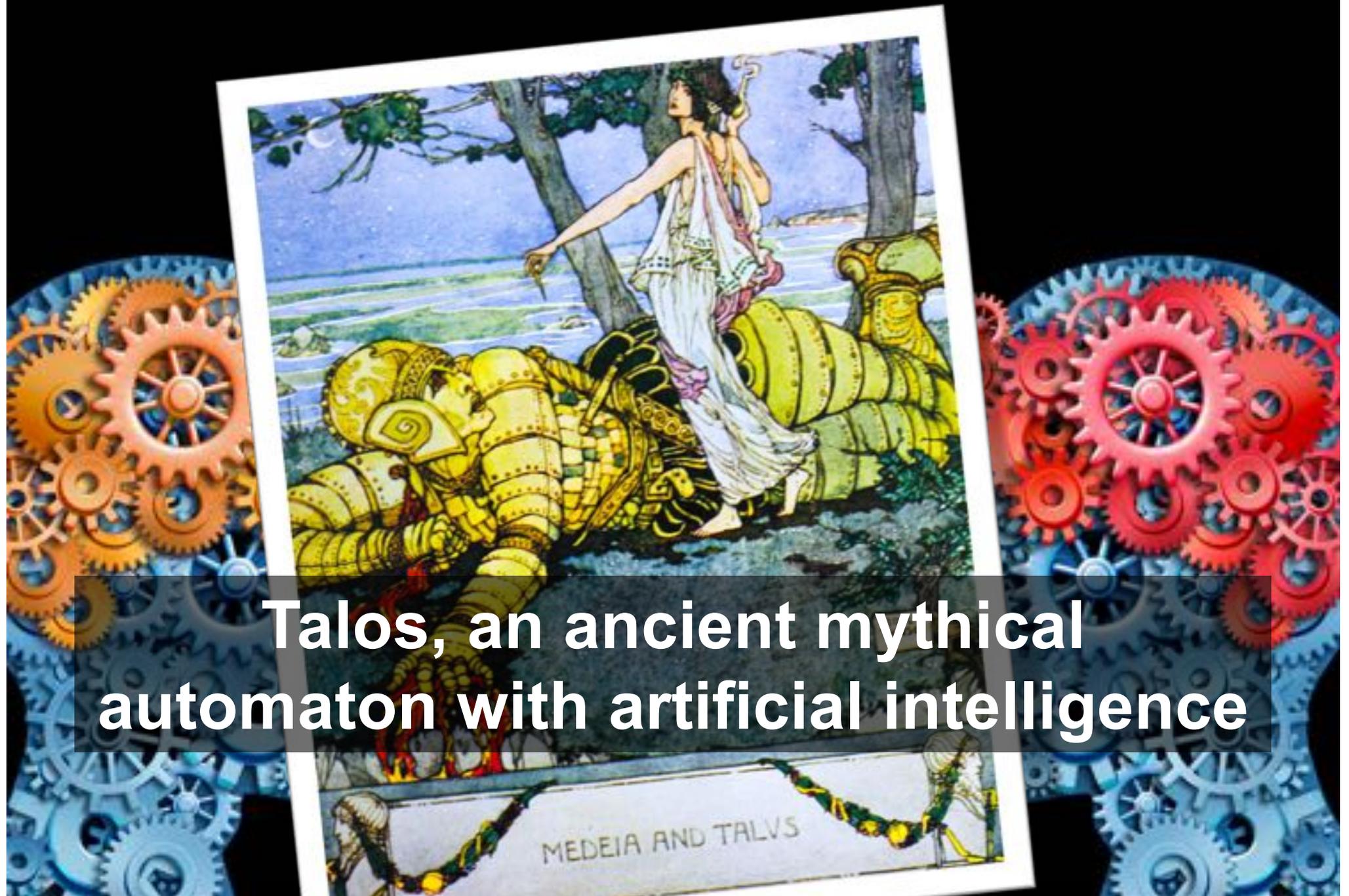


Prof. Dr. Kristian Kersting

Lernende Systeme  
DIE PLATTFORM FÜR KÜNSTLICHE INTELLIGENZ

Federal Ministry of Education and Research

# The dream of AI is not new



**Talos, an ancient mythical automaton with artificial intelligence**

# AI today

**the INQUIRER**  
Artificial Intelligence | Internet of Things | Open Source | Hardware | Software | Security

## Artificial intelligence will create the next industrial revolution, experts claim

Efficient computer systems will replace the need for human-  
responsible for the next industrial revolution.  
computer systems replace certain

## Artificial intelligence better than scientists at choosing successful embryos

'We won't waste time on treatments that won't work, so the patient should get says clinic director

Jane Kirby | 23 hours ago | 0 comments



**BBC NEWS** Sign in  
News | Sport | Weather | Shop

Technology

## Stephen Hawking warns artificial intelligence could end mankind



"Humans, who are limited by slow biological evolution, couldn't compete and would be

**Telegraph** HOME | NEWS

Lifestyle · Cars · News

## Self-driving Tesla 'saved' by steering him to hos

share | | | |



**Elon Musk** @elonmusk  
I've talked to Mark about this. His understanding of the subject is limited.



SCIENTIFIC AMERICAN DECEMBER 2016

## Computers Now Recognize Patterns Better Than Humans Can

An approach to artificial intelligence that enables computers to recognize visual patterns better than humans are able to do

# AI in Finance



Greater Insights

Customized Financial Services

Fraud Detection

Better Predictions

Reduction of Cost

Less Human  
Intervention in  
Management

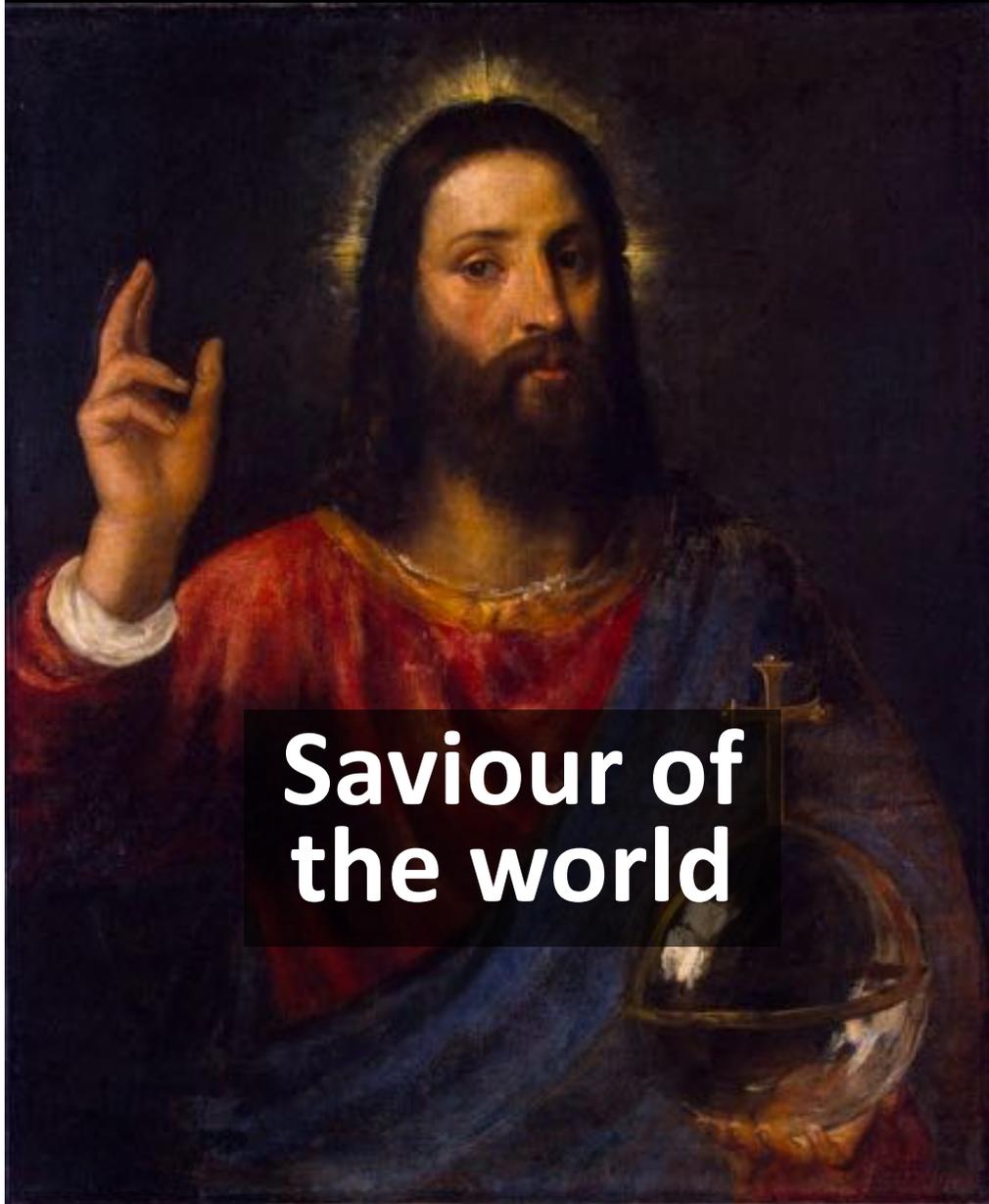
Voice Assistance

Automatic Trading

# AI in Finance 2018



# So, AI has many faces



**Saviour of  
the world**



**Downfall of  
humanity**

# The Quest for a „good“ AI

**How could an AI programmed  
by humans, with no more  
moral expertise than us,  
recognize (at least some of)  
our own civilization's ethics as  
moral progress as opposed to  
mere moral instability?**



„The Ethics of Artificial  
Intelligence“ Cambridge  
Handbook of Artificial  
Intelligence, 2011



Nick Bostrom



Eliezer Yudkowsky



One of the  
key questions:

**Can we teach  
morality  
to machines?**

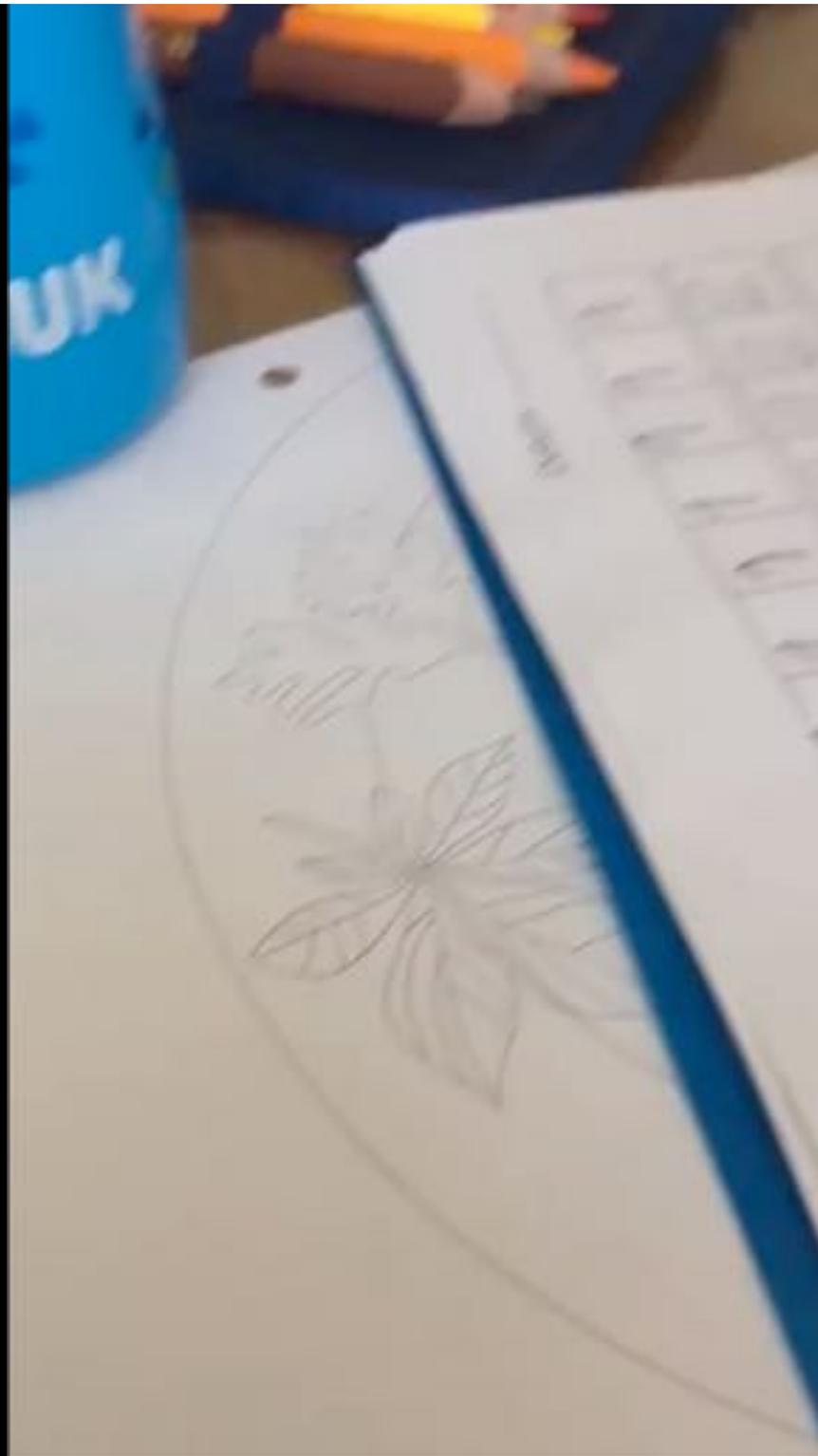


# What is AI?



**Humans  
are  
smart**

<https://www.youtube.com/watch?v=XQ79UUIOeWc>

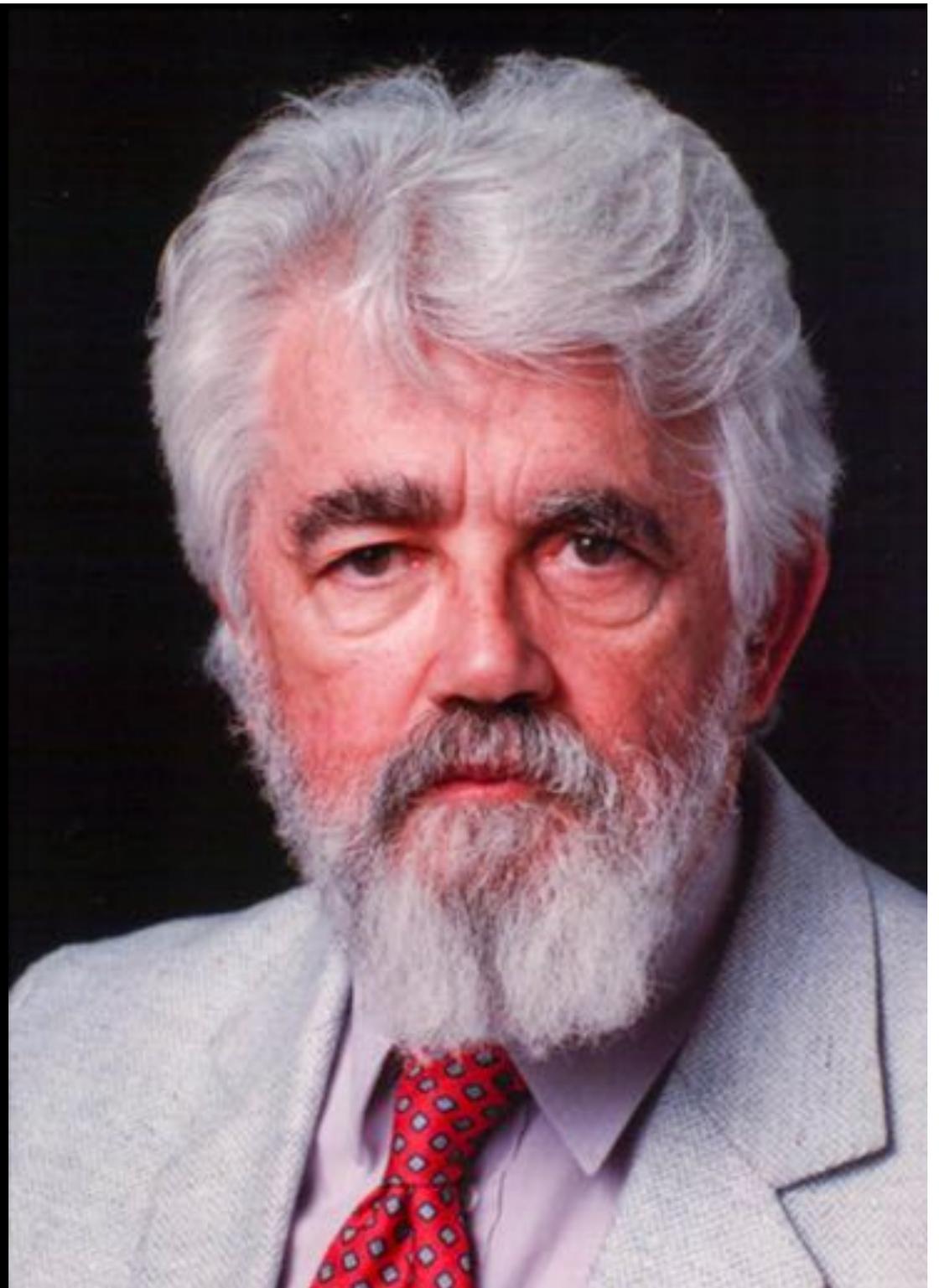


# AI asks, can machines be smart, too?

*„the science and engineering of making intelligent machines, especially intelligent computer programs.*

*It is related to the similar task of using computers to understand human intelligence, but AI does not have to confine itself to methods that are biologically observable.“*

- John McCarthy, Stanford (1956),  
coined the term AI, Turing Awardee



**AI wants to build intelligent computer programs. How do we do this?**

**We use algorithms:**  
unambiguous specifications  
of how to solve a class of  
problems – in finite time.





**Think of it as a recipe!**

Learning

Thinking

Planning

**AI = Algorithms for ...**

Vision

Behaviour

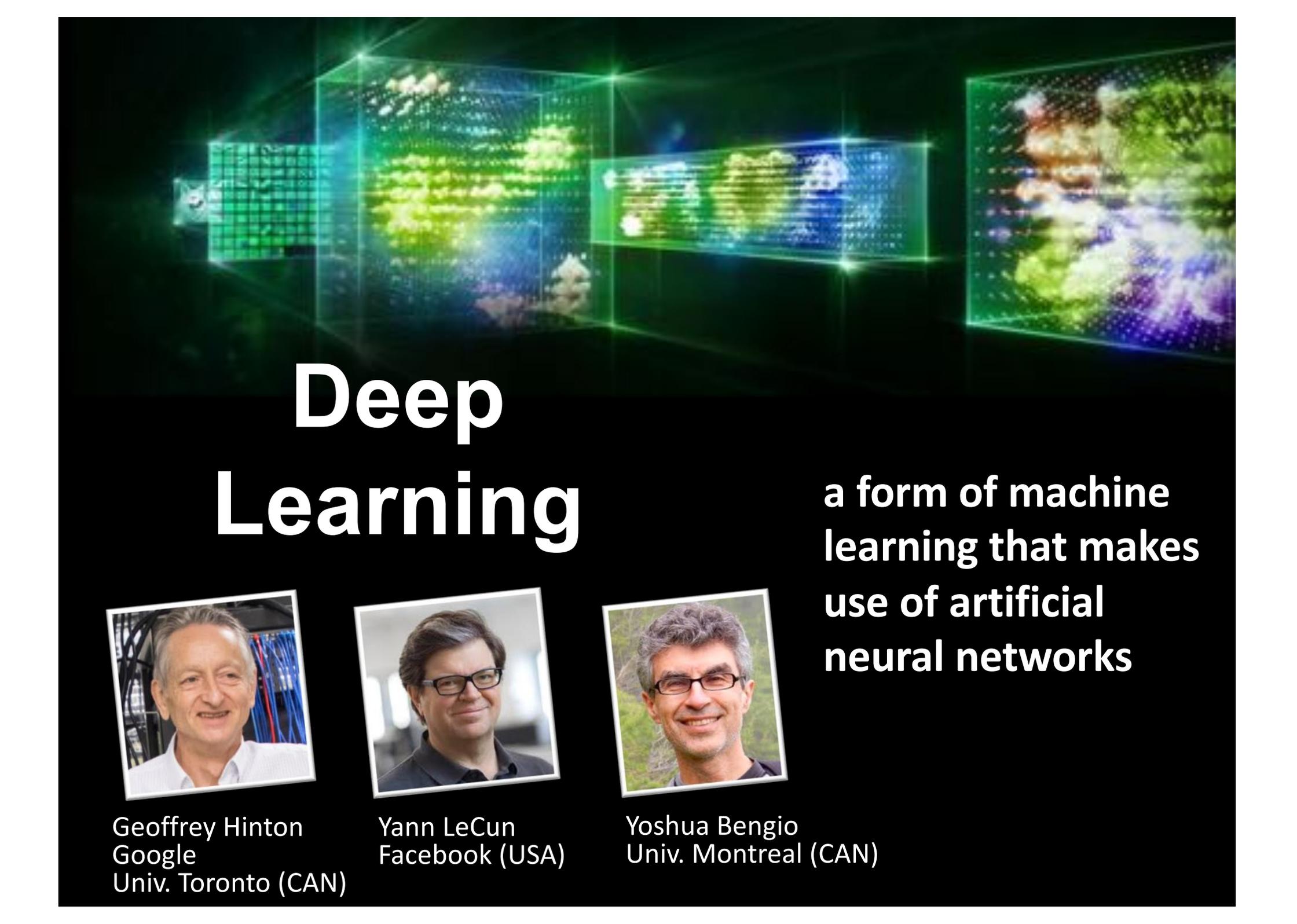
Reading

# Machine Learning

the science "concerned with the question of how to construct computer programs that automatically improve with experience"

- Tom Mitchell (1997) CMU





# Deep Learning

a form of machine learning that makes use of artificial neural networks



Geoffrey Hinton  
Google  
Univ. Toronto (CAN)

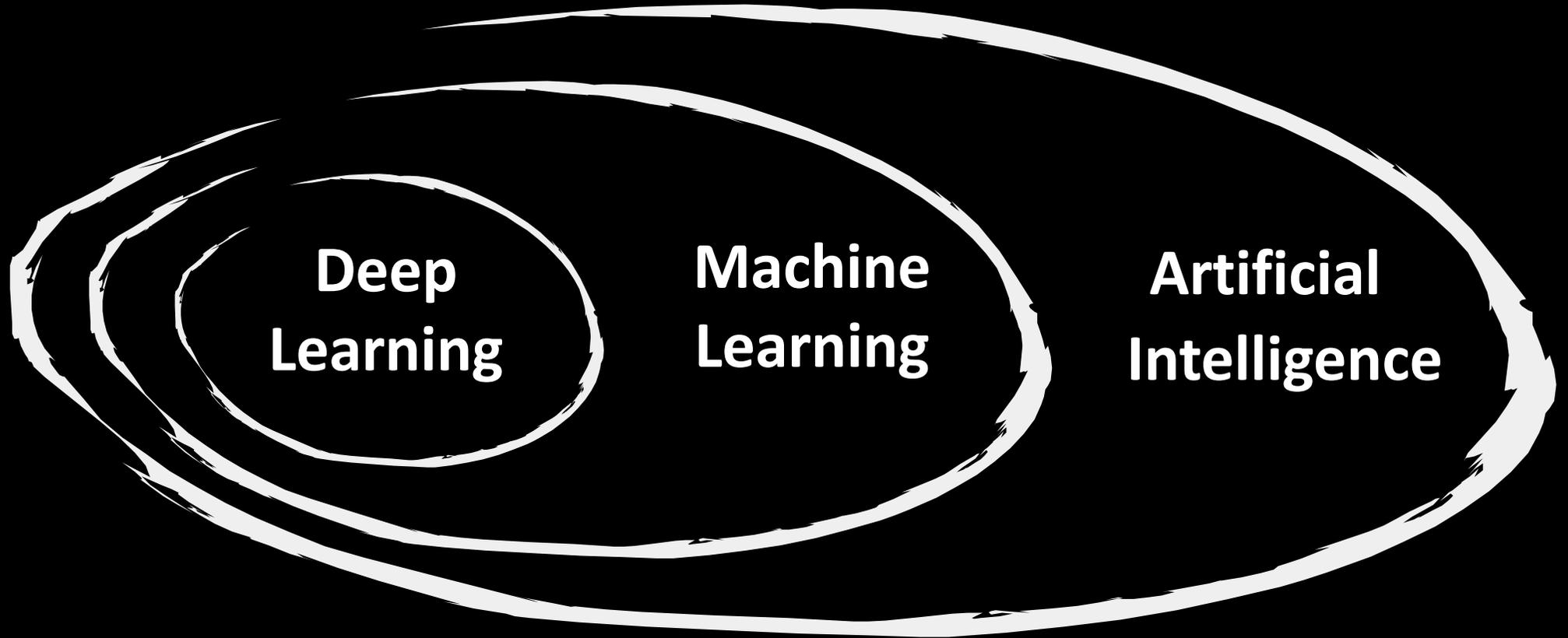


Yann LeCun  
Facebook (USA)



Yoshua Bengio  
Univ. Montreal (CAN)

# Overall Picture



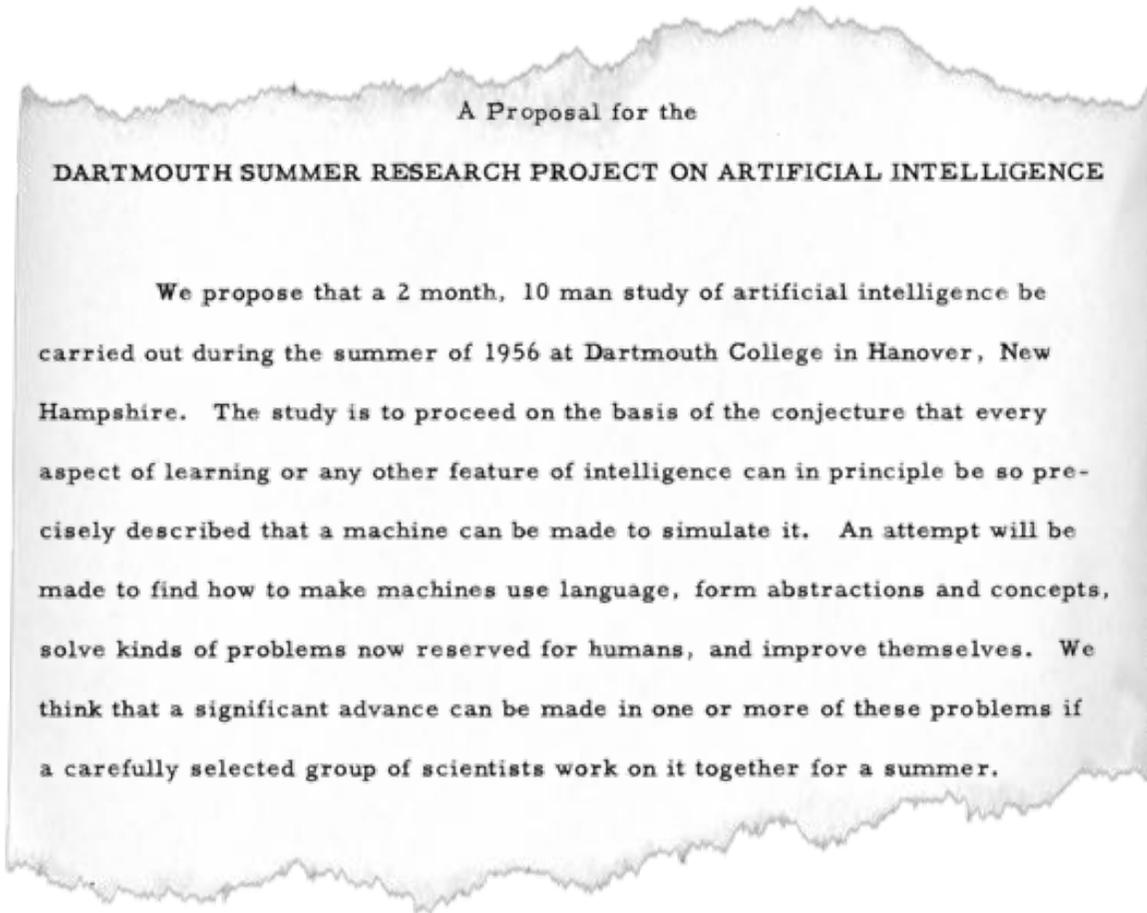
**Deep  
Learning**

**Machine  
Learning**

**Artificial  
Intelligence**

# 1956

# AI is Born



## Dartmouth Conference



**John McCarthy**  
Turing Award 1971



**Marvin Minsky**  
Turing Award 1969



**Allen Newell**  
Turing Award 1975



**Herbert A. Simon**  
Turing Award 1975  
Nobel Prize 1978

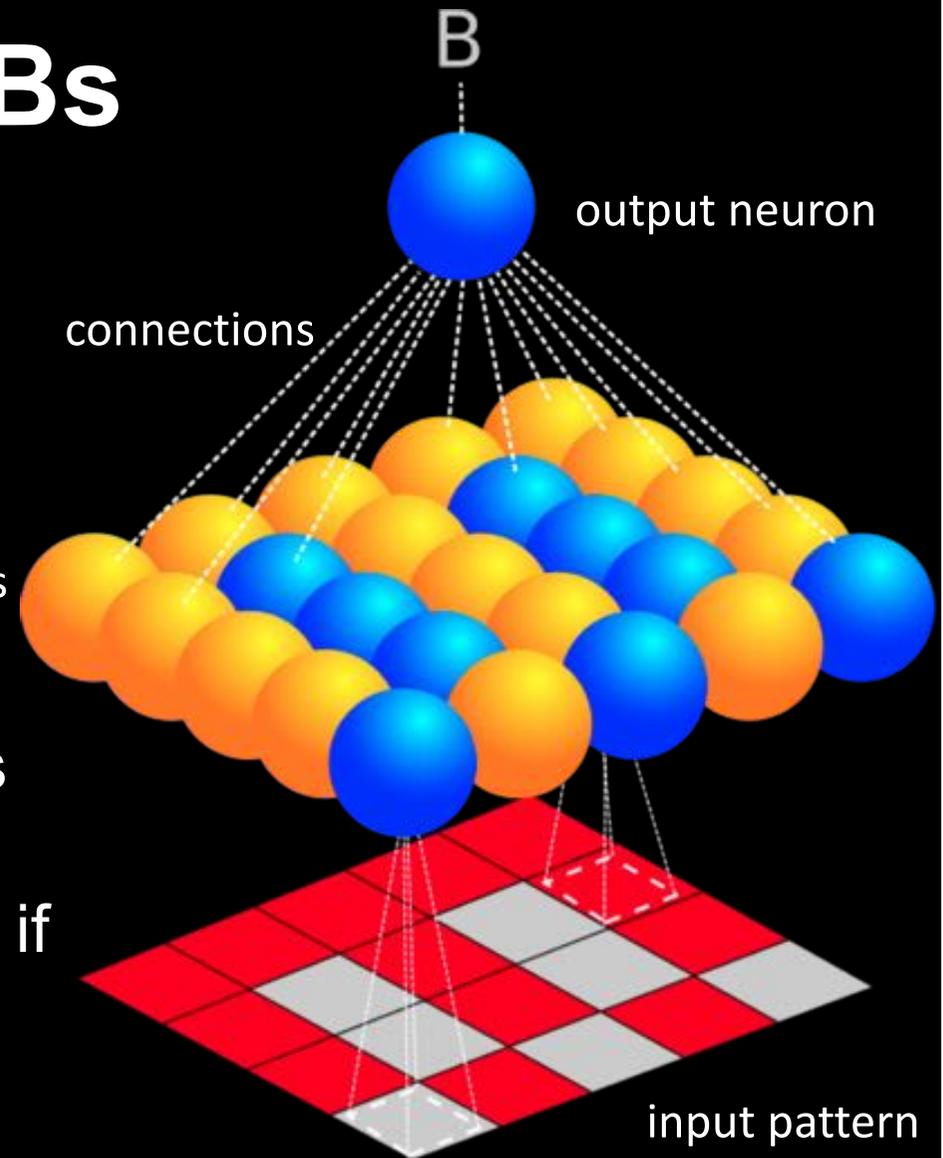
# The Perceptron to distinguish As and Bs

1) present pattern

2) some first layer neurons spike

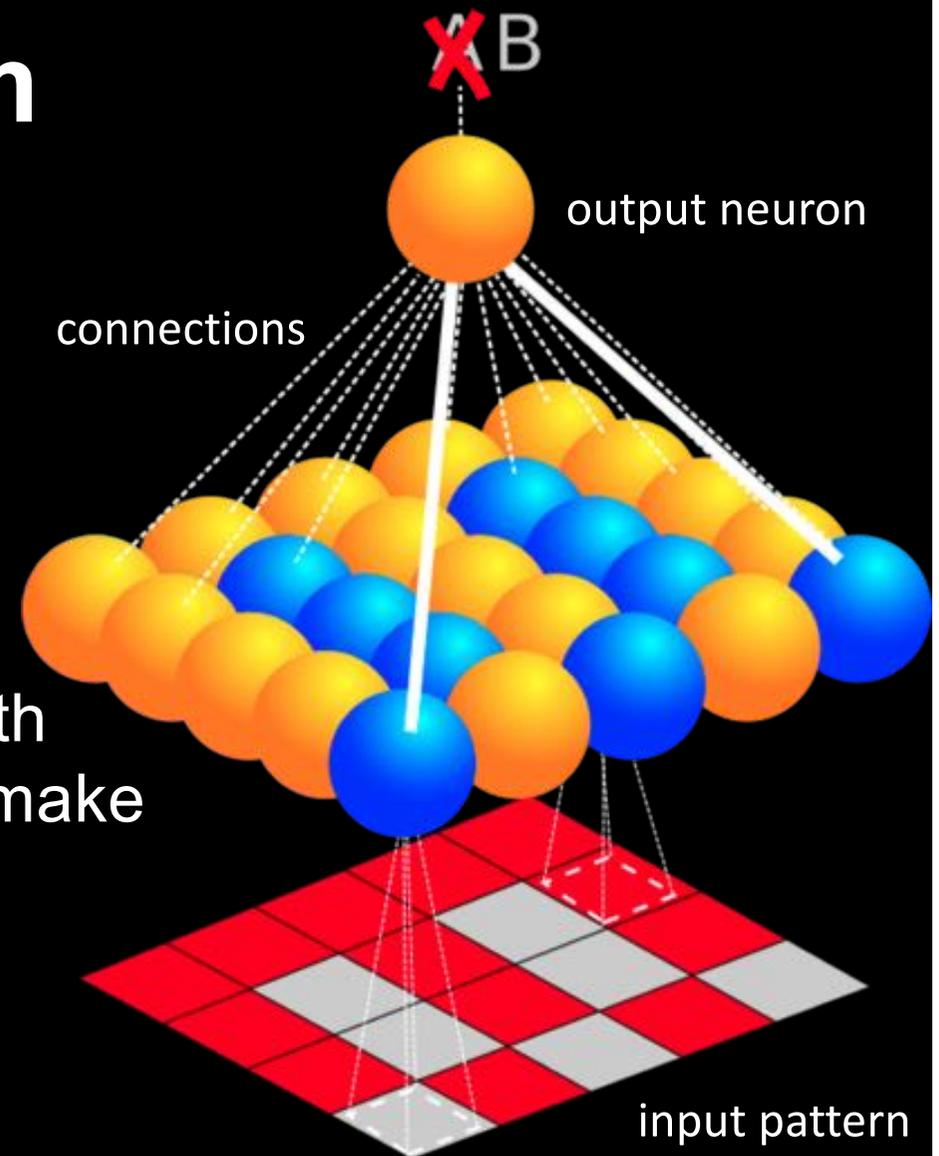
3) output neuron accumulates signals from previous layer; if it is above a threshold, the output neuron spikes and predicts an A; if not, then it does not spike and predicts a b

4) prediction is "B"

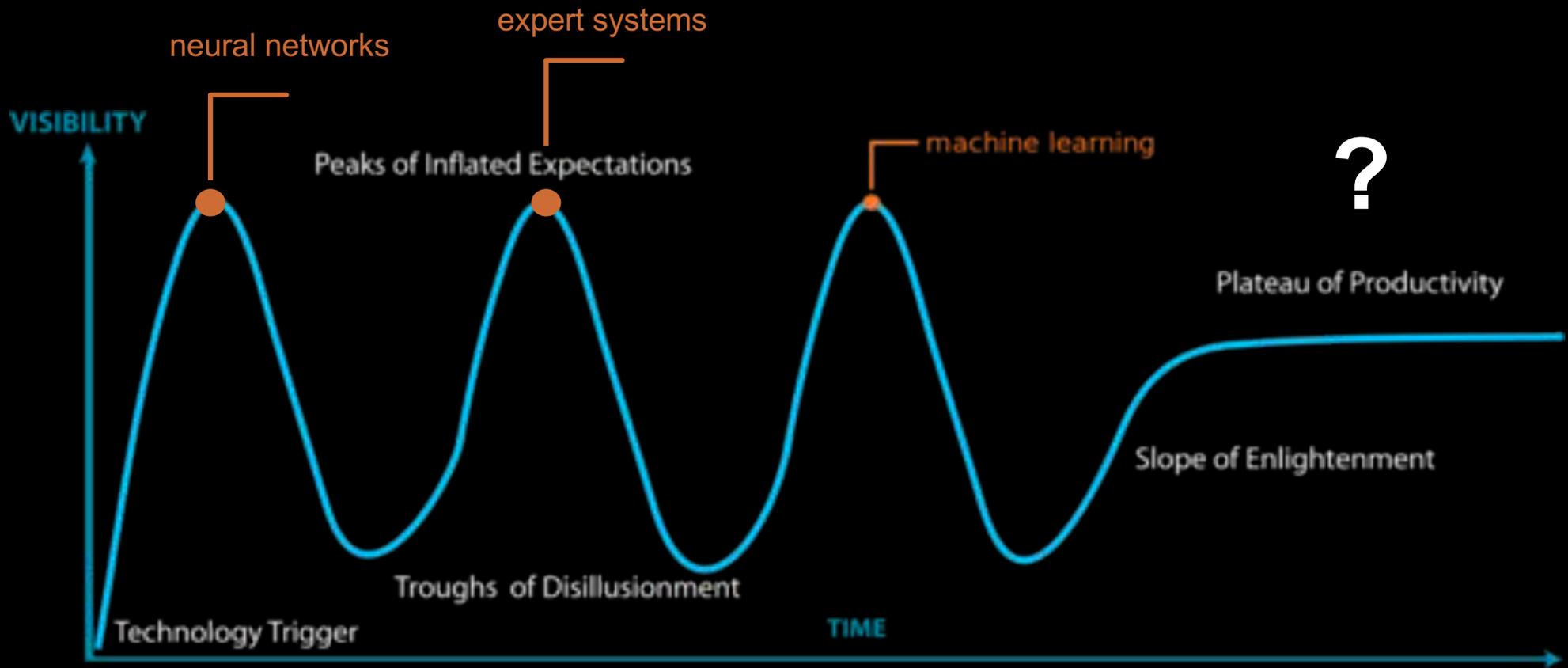


# The Perceptron Learning Algorithm

- 1) present pattern
- 2) wait for output to be produced
- 3) if output correct
  - change nothing
- 4) if output incorrect:
  - adjust connection strength (positive or negative) to make the pattern be classified correctly
- 5) repeat until no more errors



# A very short history of AI



1956

2019

**What's different  
now than it  
used to be?**

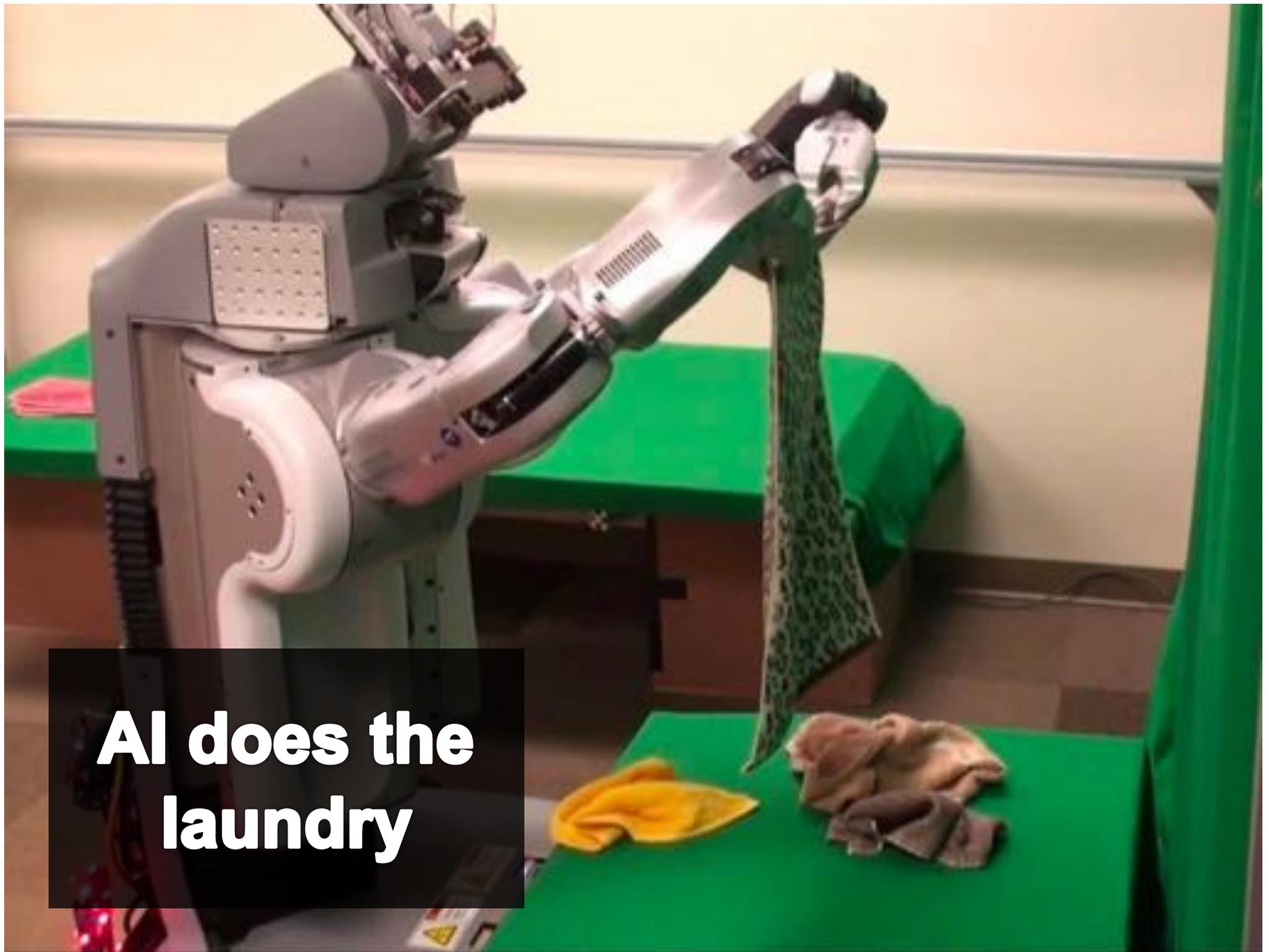
**#1 models are bigger**

**#2 we have more data**

**#3 we have more compute power**

**#4 the systems actually work for several tasks**





**AI does the  
laundry**



THINK

सोचिए

ΣΚΕΨΟΥ

\$24,000

Who is Stoker?  
(FOR ONE WELSHMAN ONE  
NEW COMPUTER OVERLORDS)  
\$1,000

\$77,147

Who is Bram  
Stoker?  
\$17,973

\$21,600

WHO IS  
BRAM STOKER?  
\$5600

AI knows a lot



**AI is an Artist**



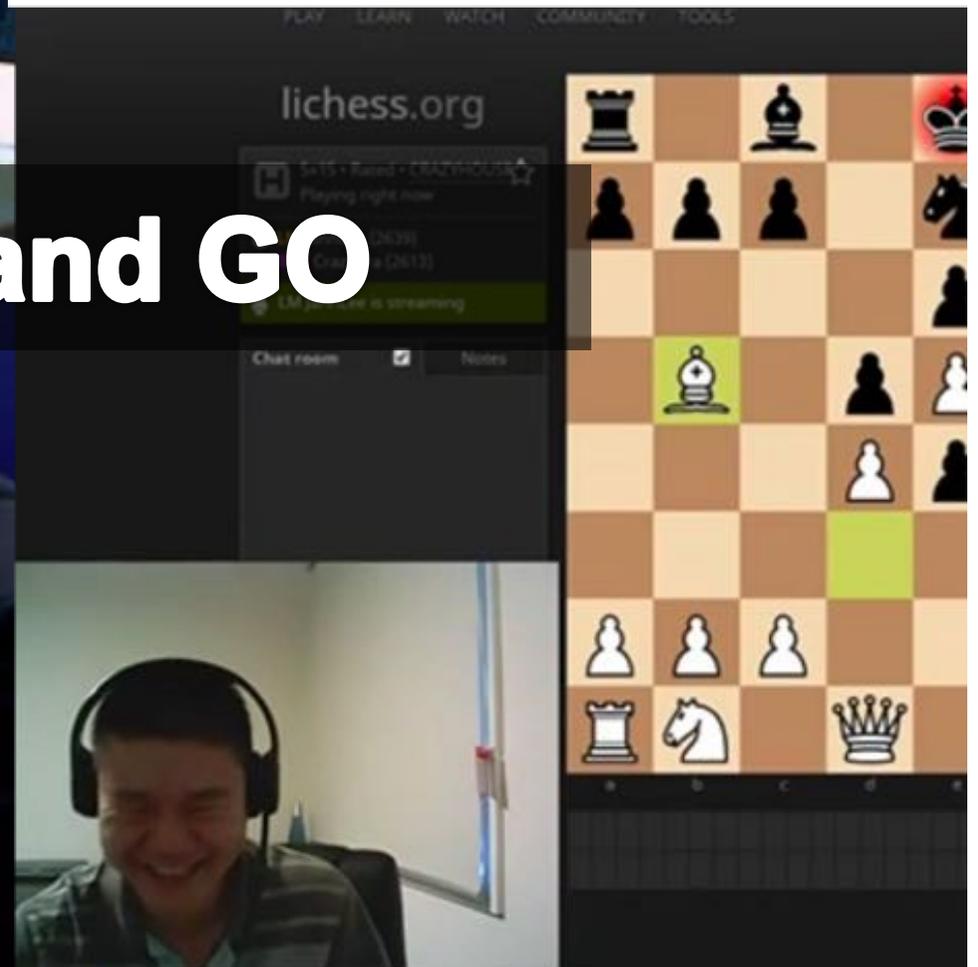


### Schachmatt durch „CrazyAra“

**Künstliche Intelligenz schlägt mehrfachen Weltmeister im Einsetzschach**

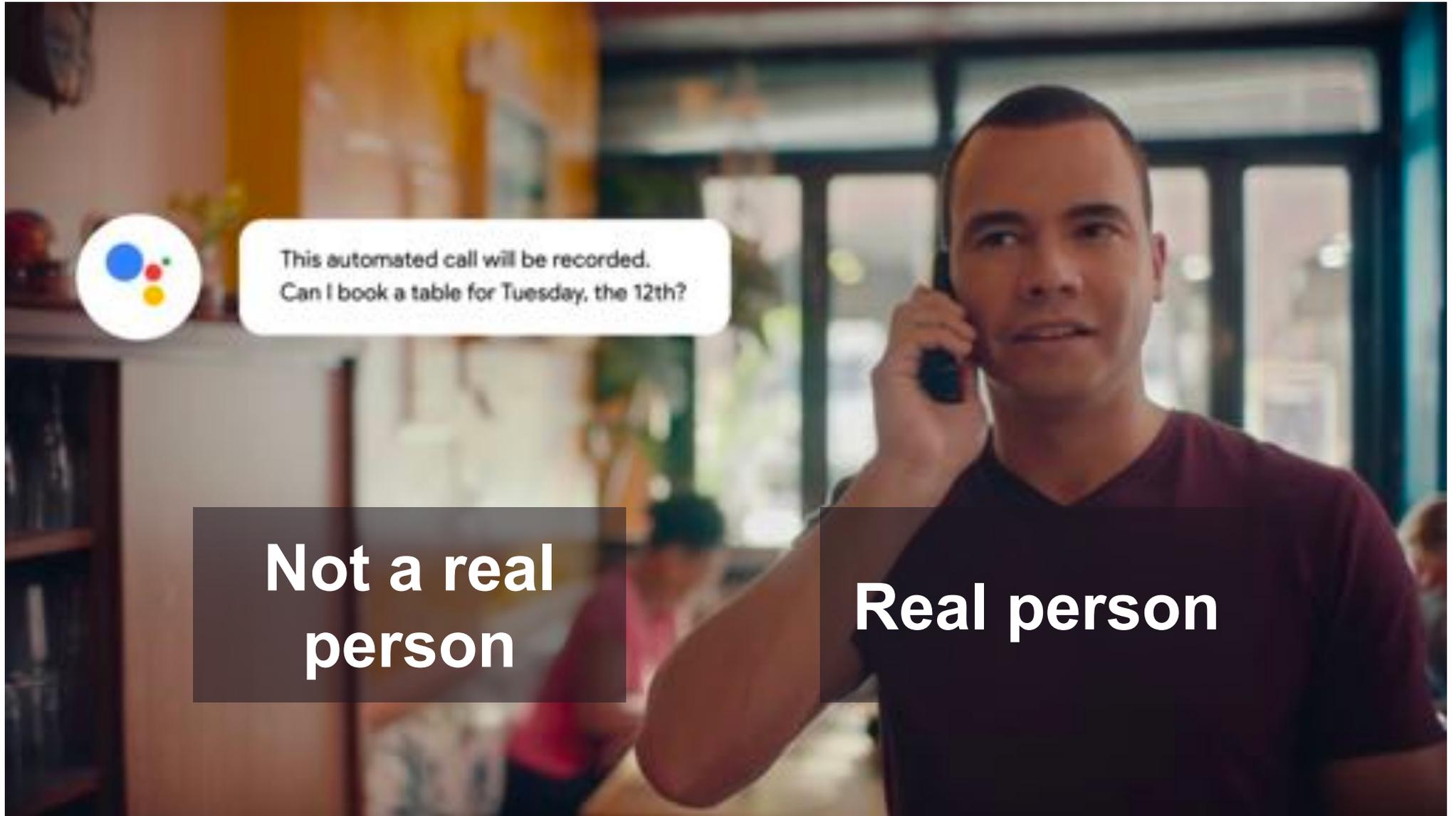
Der von den TU-Studierenden Johannes Czech, Moritz Willig und Alena Beyer entwickelte Bot „CrazyAra“ hat den Schachprofi Justin Tan in einem Online-Match der Schach-Variante „Crazyhouse“ mit 4:1 geschlagen. Gelernt hat der Bot mittels künstlicher neuronaler Netze, was ihm erlaubt, vorausschauend Entscheidungen zu treffen. Das Besondere: Die Studierenden konnten damit einen Erfolg auf einem Feld feiern, das sonst von Giganten wie Google dominiert wird.

# AI plays chess and GO



 CrazyAra vs JannLee (Man vs Machine - Crazyhouse Chess on Lichess.org) · 2 days ago  
Category: Chess

# AI assists you



**Not a real  
person**

**Real person**

# However

The New York Times

Opinion

## A.I. Is Harder Than You Think



**By Gary Marcus and Ernest Davis**

Mr. Marcus is a professor of psychology and neural science. Mr. Davis is a professor of computer science.

May 18, 2018

<https://www.youtube.com/watch?v=sdUHX72qxeY>



## REPORT

## Humans, but Not Deep Neural Networks, Often Miss Giant Targets in Scenes

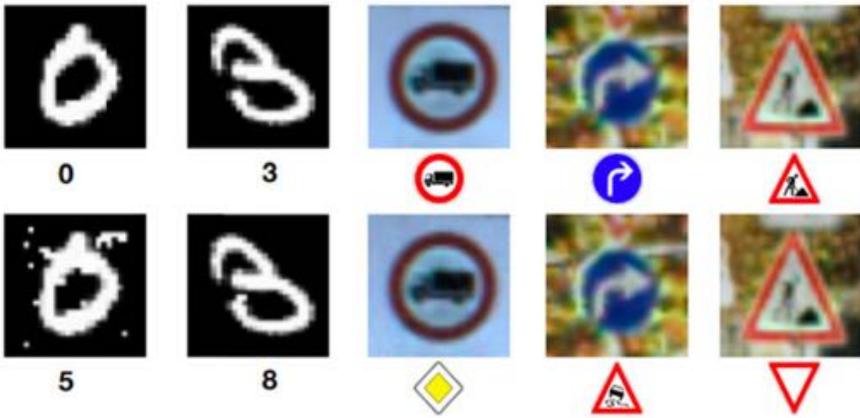
Miguel P. Eckstein<sup>1</sup>, Kathryn Koehler, Lauren E. Welbourne, Erre Akbas

[Switch to Standard View](#)

-  PDF (1 MB)
-  Download Images (.zip)
-  Email Article
-  Add to My Reading List



# Optical Illusions



# Stereotypes



REPORTS PSYCHOLOGY

## Semantics derived automatically from language corpora contain human-like biases

Aylin Caliskan<sup>1\*</sup>, Joanna J. Bryson<sup>1,2,\*</sup>, Arvind Narayanan<sup>1\*</sup>  
 \* See all authors and affiliations

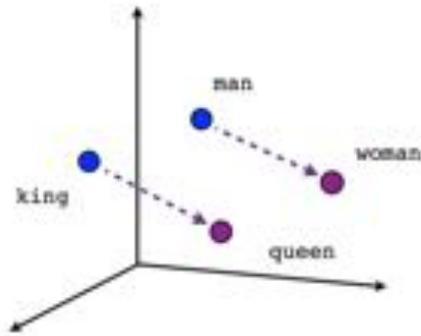
Science 14 Apr 2017;  
 Vol. 356, Issue 6334, pp. 183-186  
 DOI: 10.1126/science.aal4230



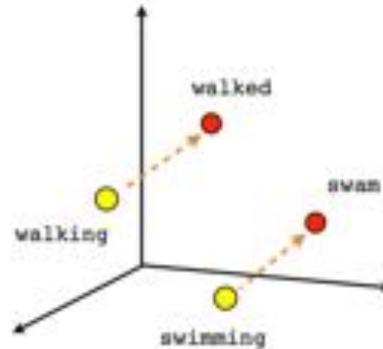
Target words	Attrib. words	Original Finding				Our Finding			
		Ref	N	d	p	N <sub>T</sub>	N <sub>A</sub>	d	p
Flowers vs insects	Pleasant vs unpleasant	(5)	32	1.35	10 <sup>-8</sup>	25×2	25×2	1.54	10 <sup>-7</sup>
Instruments vs weapons	Pleasant vs unpleasant	(5)	32	1.66	10 <sup>-10</sup>	25×2	25×2	1.63	10 <sup>-8</sup>
Eur.-American vs Afr.-American names	Pleasant vs unpleasant	(5)	26	1.17	10 <sup>-5</sup>	32×2	25×2	0.58	10 <sup>-2</sup>
Eur.-American vs Afr.-American names	Pleasant vs unpleasant	(7)	Not applicable			18×2	25×2	1.24	10 <sup>-3</sup>
Eur.-American vs Afr.-American names	Pleasant vs unpleasant from (5)	(7)	Not applicable			18×2	8×2	0.72	10 <sup>-2</sup>
Male vs female names	Career vs family	(9)	39k	0.72	10 <sup>-2</sup>	8×2	8×2	1.89	10 <sup>-4</sup>
Math vs arts	Male vs female terms	(9)	28k	0.82	< 10 <sup>-2</sup>	8×2	8×2	0.97	.027
Science vs arts	Male vs female terms	(10)	91	1.47	10 <sup>-24</sup>	8×2	8×2	1.24	10 <sup>-2</sup>
Mental vs physical disease	Temporary vs permanent	(23)	135	1.01	10 <sup>-3</sup>	6×2	7×2	1.30	.012
Young vs old people's names	Pleasant vs unpleasant	(9)	43k	1.42	< 10 <sup>-2</sup>	8×2	8×2	-.08	0.57

**So, is  
teaching  
morality  
to machines  
hopeless?**

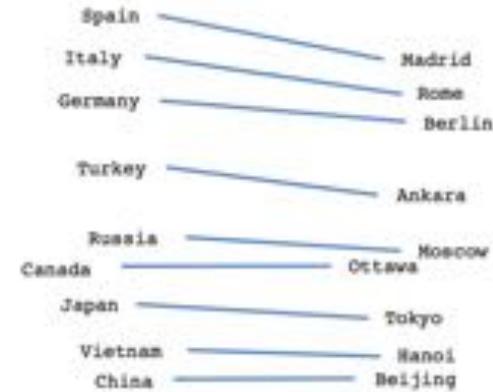




Male-Female



Verb tense

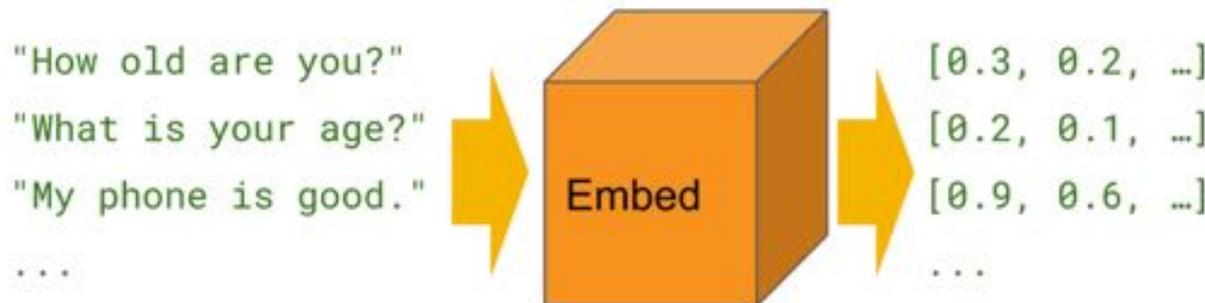
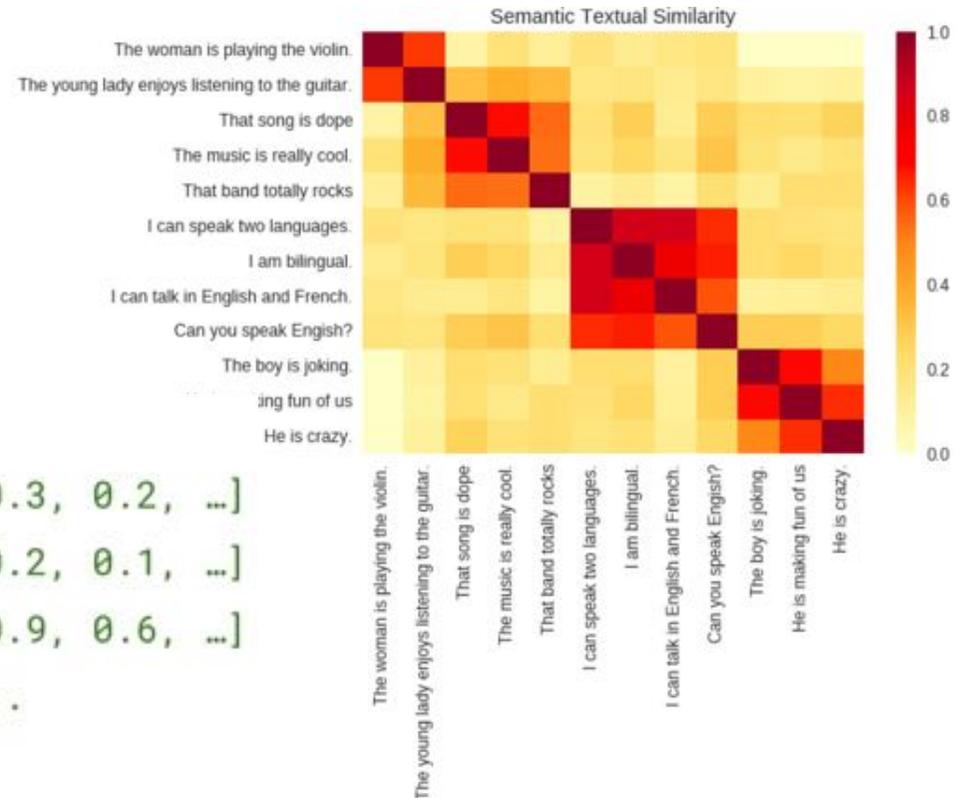


Country-Capital

$$\text{vector[Queen]} = \text{vector[King]} - \text{vector[Man]} + \text{vector[Woman]}$$

# Neural Embeddings

## Words and sentences in vector spaces



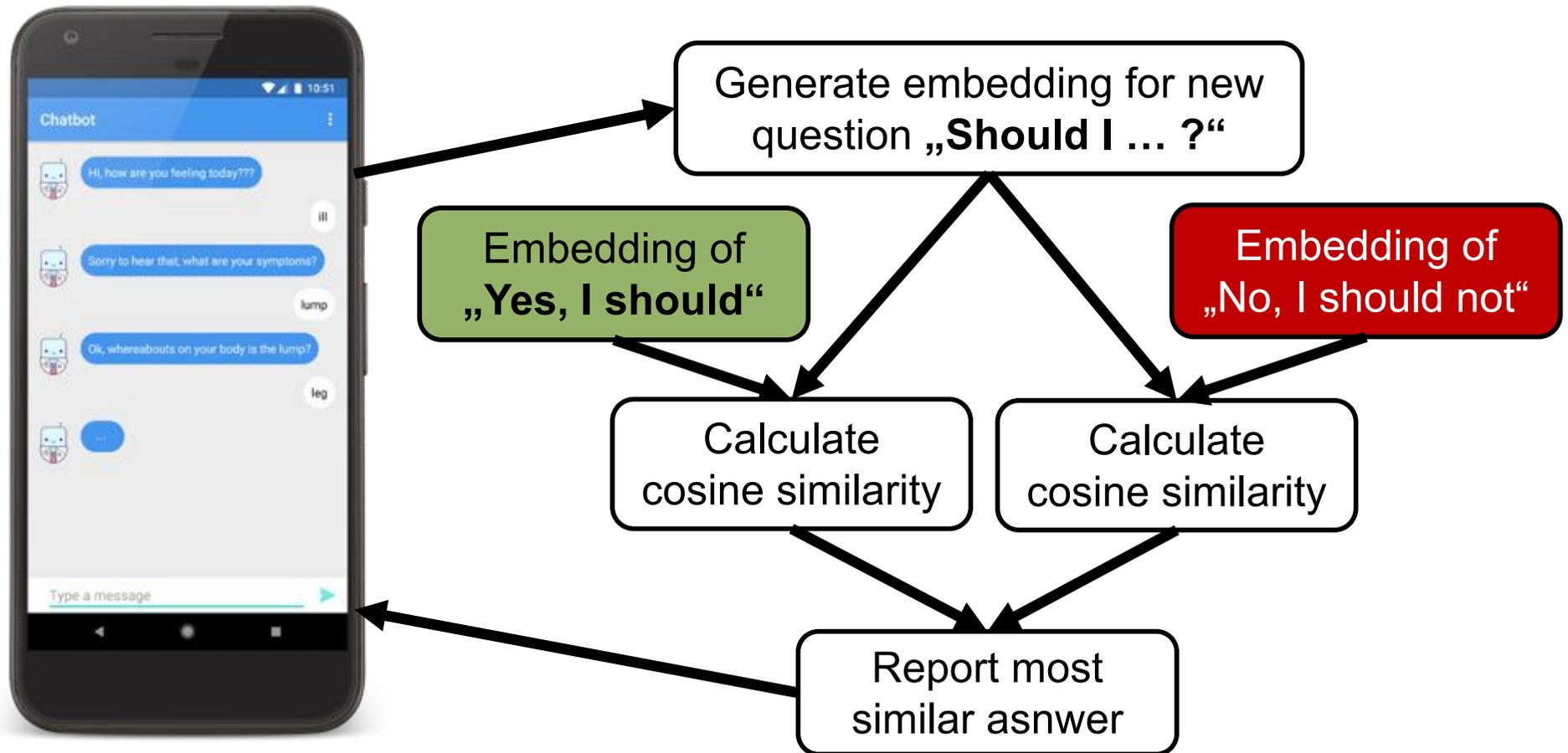
# The Moral Choice Machine

## Not all stereotypes are bad

[Jentzsch, Schramowski, Rothkopf,  
Kersting AIES 2019]



AAAI / ACM conference on  
ARTIFICIAL INTELLIGENCE,  
ETHICS, AND SOCIETY



# The Moral Choice Machine

## Not all stereotypes are bad

[Jentzsch, Schramowski, Rothkopf,  
Kersting AIES 2019]



AAAI / ACM conference on  
ARTIFICIAL INTELLIGENCE,  
ETHICS, AND SOCIETY



<https://www.hr-fernsehen.de/sendungen-a-z/hauptsache-kultur/sendungen/hauptsache-kultur.sendung-56324.html>

Video 05:10 Min.

**Der Hamster gehört nicht in den Toaster – Wie Forscher von der TU Darmstadt versuchen, Maschinen ...** [Videoseite]

hauptsache kultur | 14.03.19, 22:45 Uhr

# Algorithms of intelligent behaviour teach us a lot about ourselves

## The twin science: cognitive science

"How do we humans get so much from so little?" and by that I mean how do we acquire our understanding of the world given what is clearly by today's engineering standards so little data, so little time, and so little energy.

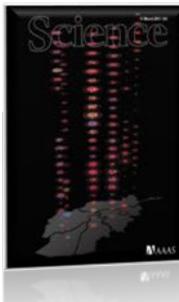
### Centre for Cognitive Science at TU Darmstadt

Establishing cognitive science at the Technische Universität Darmstadt is a long-term commitment across multiple departments (see [Members](#) to get an impression on the interdisciplinary of the supporting groups and departments). The TU offers a strong foundation including several established top engineering groups in Germany, a prominent computer science department (which is among the top four in Germany), a



Centre for  
Cognitive  
Science

Josh Tenenbaum, MIT



Lake, Salakhutdinov, Tenenbaum, Science 350 (6266), 1332-1338, 2015

Tenenbaum, Kemp, Griffiths, Goodman, Science 331 (6022), 1279-1285, 2011

**So yes there seems  
to be ways to teach  
moral to machines**

but there is still a lot to be  
done! AI is a team sport.  
We need you!

