

# Artificial Intelligence

## A broader perspective

### Current Trends in AI

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28/02/2020

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Q#1

Give examples of  
“AI in use”



The Google logo is centered at the top of the page, rendered in its characteristic multi-colored font (blue, red, yellow, green, red).A long, empty search input field with a light gray border and a small microphone icon on the right side.

Google Search

I'm Feeling Lucky



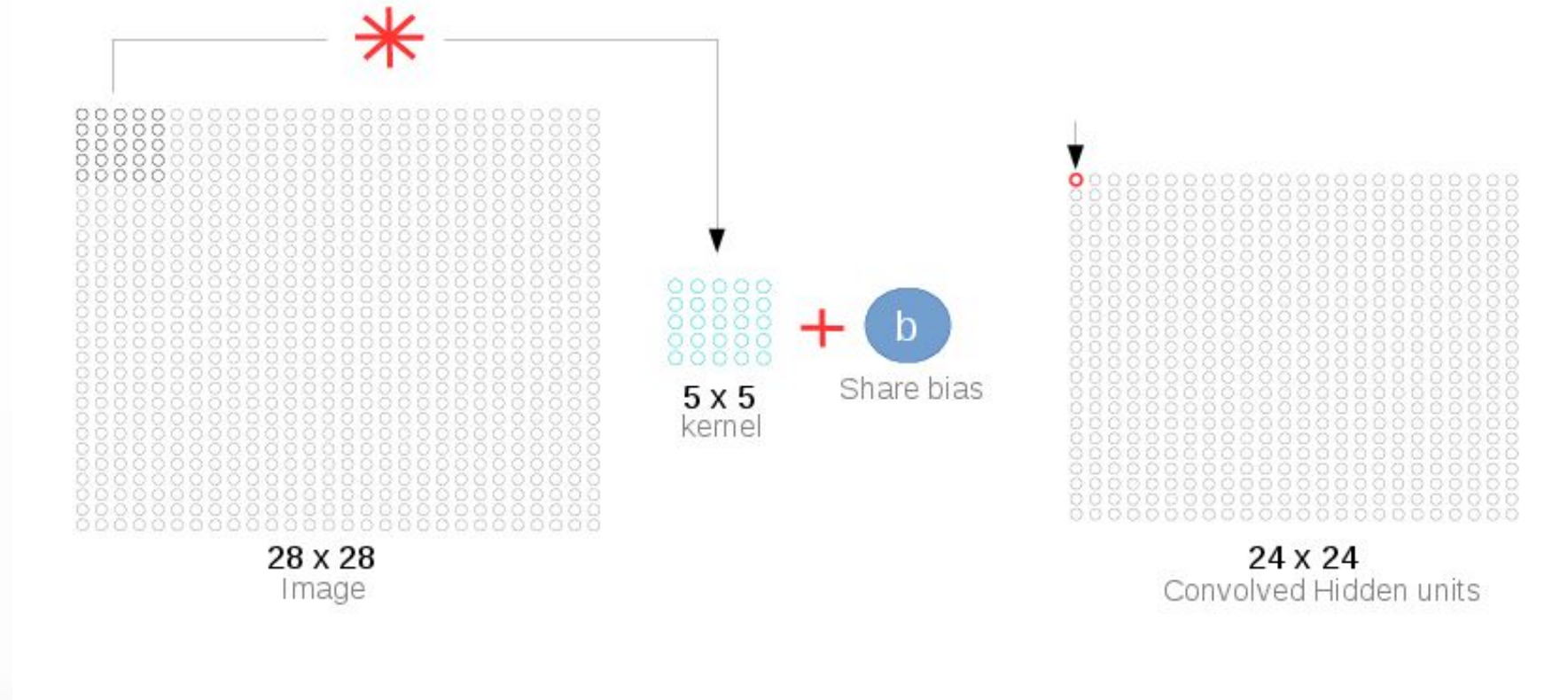
		3	49	2	147	6		
9			3	47	5			1
		1	8	79	6	4		
		8	1		2	9		
7								8
		6	7		8	2		
		2	6		9	5		
8			2		3			9
		5		1		3		

# LOGIC

(e.g. model expansion)

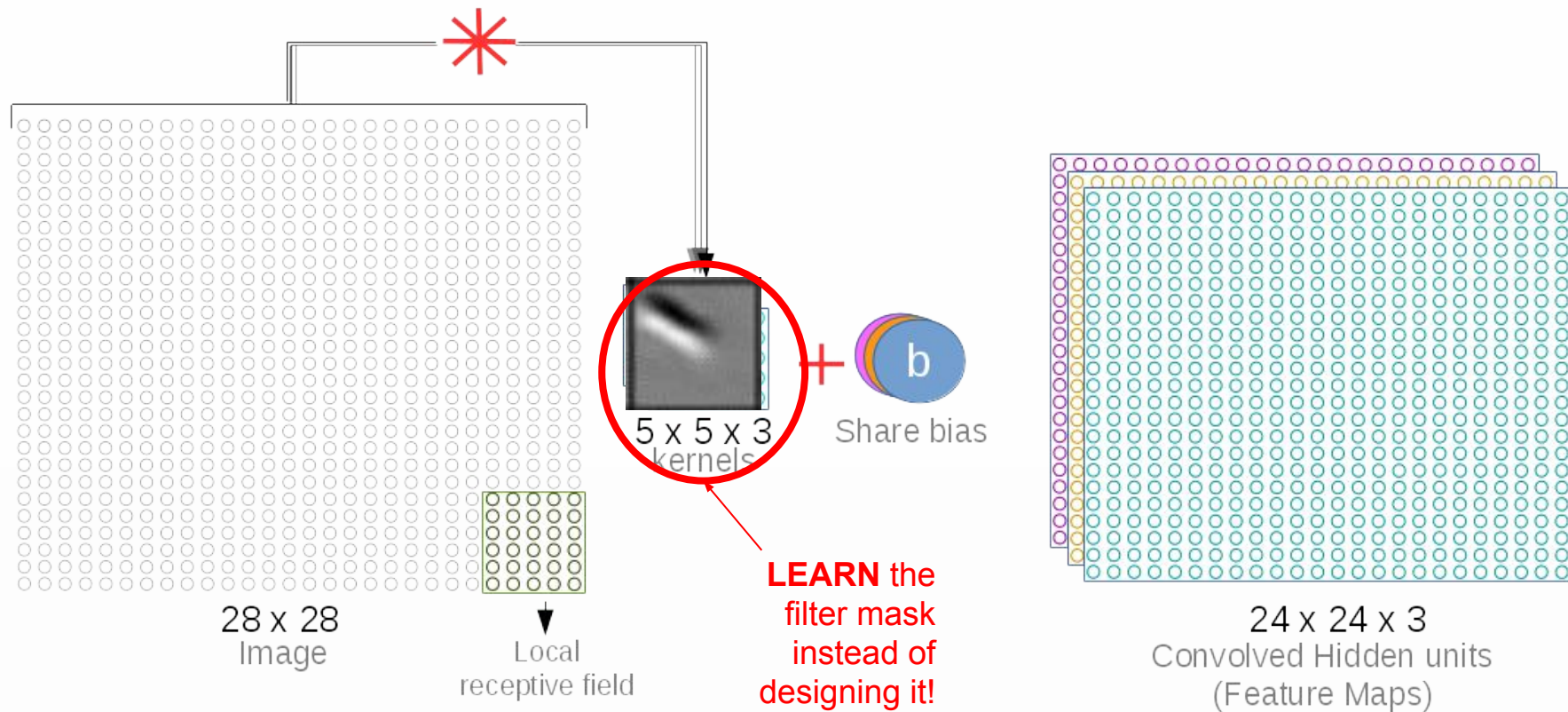


# Convolutionary neural networks





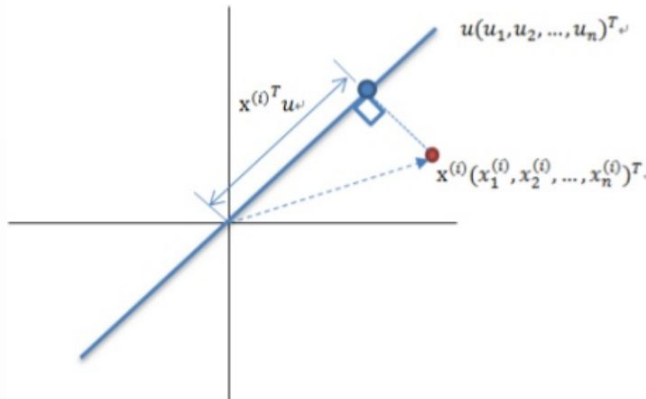
# Convolutional neural network



# Recommendation

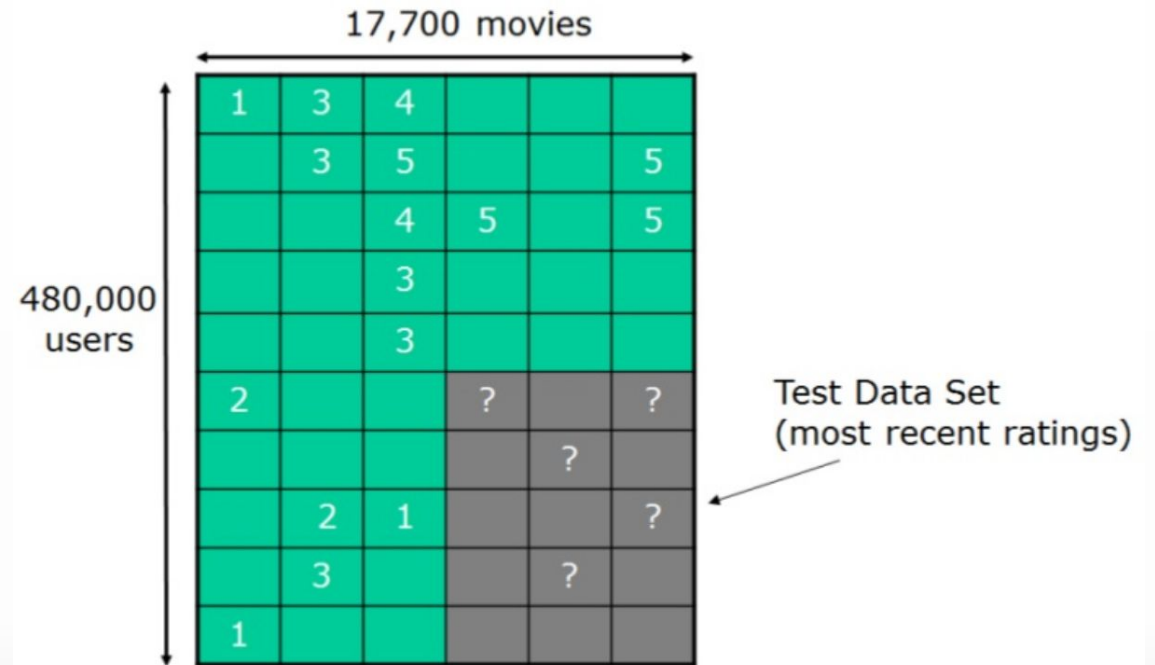
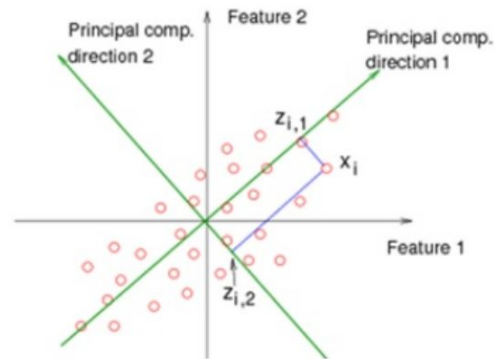
- Given a sparse matrix of (user,item) preferences
- Predict new preferences

The idea of Projection

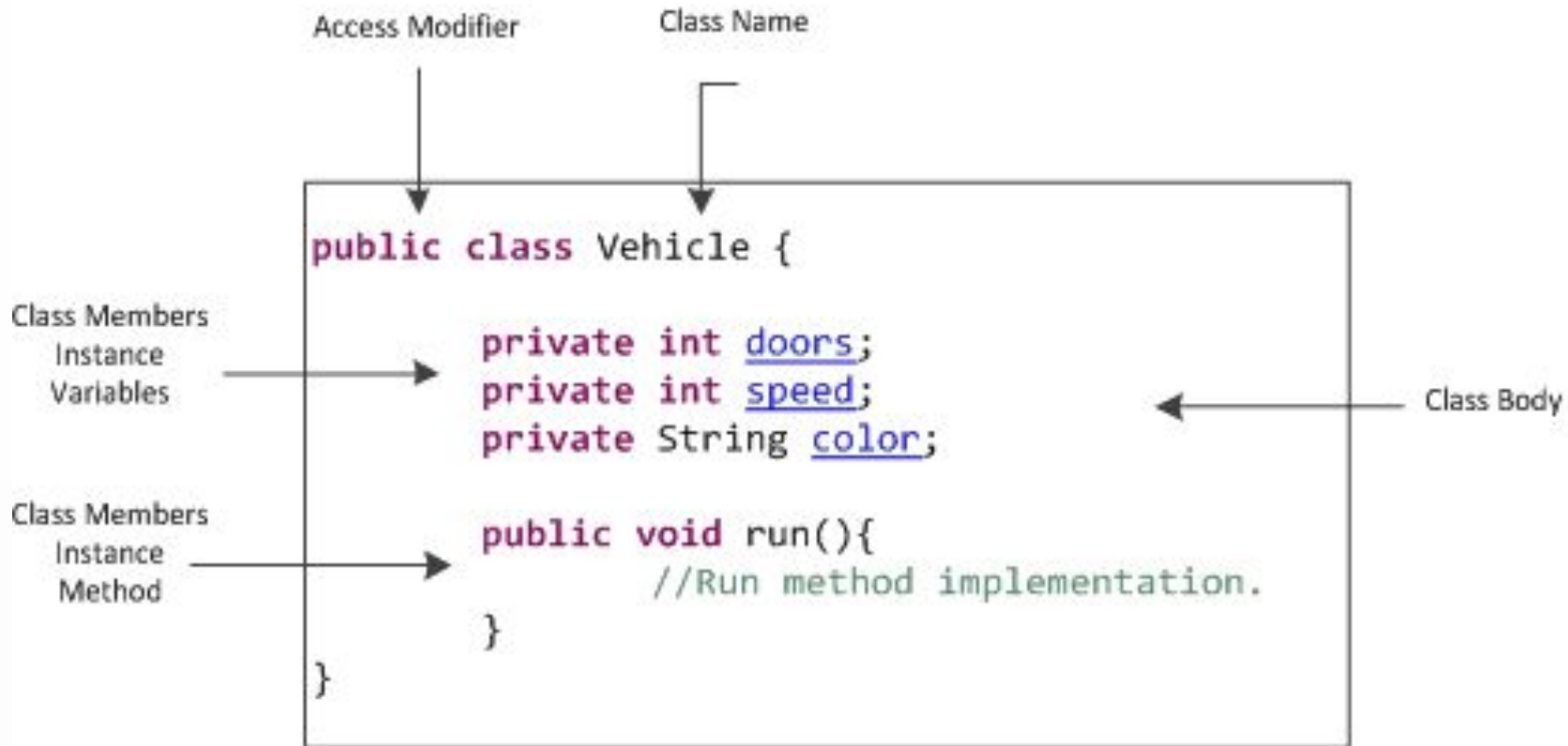


PCA finds a linear projection of high dimensional data into a lower dimensional subspace.

Visualization of PCA



# Object-oriented programming



# Natural language

TECHNOLOGY

## *A.I. Is Doing Legal Work. But It Won't Replace Lawyers, Yet.*

By STEVE LOHR MARCH 19, 2017



James Yoon, a partner at Wilson Sonsini Goodrich & Rosati in Palo Alto, Calif., says people are willing to pay for his experience. "What clients don't want to pay for is any routine work."  
Jason Henry for The New York Times

Impressive advances in artificial intelligence technology tailored for legal work have led some lawyers to worry that their profession may be Silicon Valley's next victim.

But recent research and even the people working on the software meant to automate legal work say the adoption of A.I. in law firms will be a slow, task-by-task process. In other words, like it or not, a robot is not about to replace your lawyer. At least, not anytime soon.

"There is this popular view that if you can automate one piece of the work, the rest of the job is toast," said Frank Levy, a labor economist at the Massachusetts Institute of Technology. "That's just not true, or only rarely the case."

An artificial intelligence technique called natural language processing has proved useful

in scanning and predicting what documents will be relevant to a case, for example. Yet other lawyers' tasks, like advising clients, writing legal briefs, negotiating and appearing in court, seem beyond the reach of computerization, for a while.

"Where the technology is going to be in three to five years is the really interesting question," said Ben Allgrove, a partner at Baker McKenzie, a firm with 4,600 lawyers. "And the honest answer is we don't know."

### RELATED COVERAGE



[A Lesson of Tesla Crashes? Computer Vision Can't Do It All Yet](#) SEPT. 19, 2016



[The Promise of Artificial Intelligence Unfolds in Small Steps](#) FEB. 28, 2016



[Robots Will Take Jobs, but Not as Fast as Some Fear, New Report Says](#) JAN. 12, 2017

- + Sentiment analysis
- + Summarization
- + Classification & routing
- + Named entities, events



9:33 AM 11/15/2014

Q#2

# What is AI?

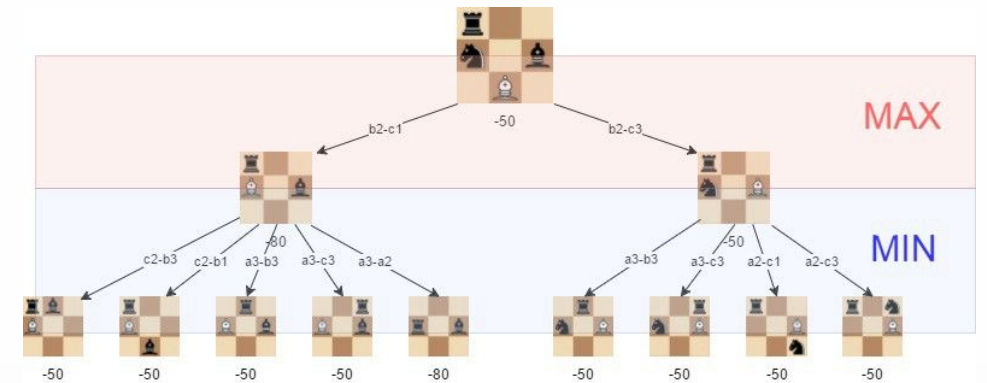
# AI studies...

1. the **nature and mechanisms** of **intelligence**
2. Using **formal methods**, an
3. Attempts to **reconstruct** it.

in principle



# Playing chess...



# In principle: learn **flying**, not the **bird**.



- Do not copy the flapping wings
- Learn how a bird uses physics to fly

*The question of whether a computer can think is no more interesting than the question of whether a submarine can swim -- Edsger W. Dijkstra*

# It does not serve a single function

- It's a **mishmash** of techniques, methods & ideas
- It's always **at the front** of computer science and is in continuous **change**
- It embodies the **quest to express meaning** in machines: a number can represent anything!

# 3 waves of artificial intelligence

# Waves of artificial intelligence

## 1. **Manual coding**

→ if-then-rules, ad-hoc

## 2. **Formalizing intelligence**

→ reformulate in a structured way (e.g. search)

## 3. **Learning from data**

→ statistical patterns

## 4. **Learning from interaction**

→ learn what *decisions* to take from rewards

} learn from human knowledge, not data

# Role of the human when designing AI

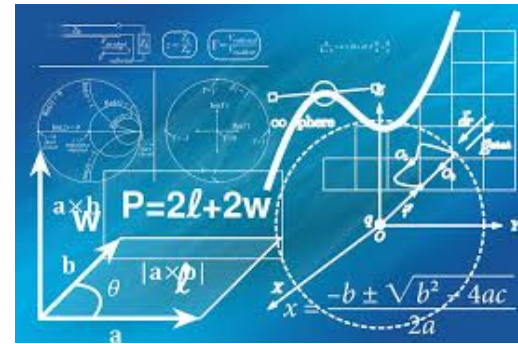
## 1. Manual ad-hoc coding (not really called AI)



```
17 string sInput;  
18 int iLength, iN;  
19 double dblTemp;  
20 bool again = true;  
21  
22 while (again) {  
23     iN = -1;  
24     again = false;  
25     getline(cin, sInput);  
26     stringstream(sInput) >> dblTemp;  
27     iLength = sInput.length();  
28     if (iLength > 0) {  
29         again = true;  
30         continue;  
31     } else if (sInput[iLength - 1] != '\n') {  
32         again = true;  
33         continue;  
34     } while (iN < iLength) {  
35         if (isdigit(sInput[iN])) {  
36             continue;  
37         } else if (iN == (iLength - 3) ) {  
38             continue;  
39         }  
40     }  
41     cout << sInput << endl;  
42     sInput.clear();  
43     sInput.erase();  
44 }
```

# Role of the human when designing AI

## 2. Symbolic AI: learning from encoded knowledge



formalism!!



build upon existing implementations

# Role of the human when designing AI

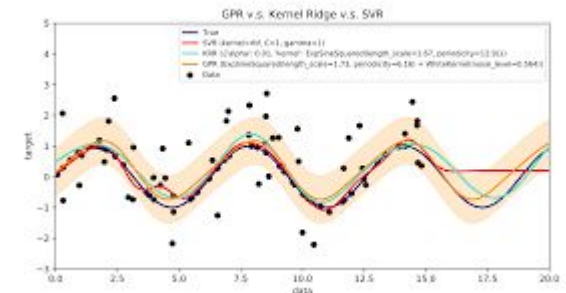
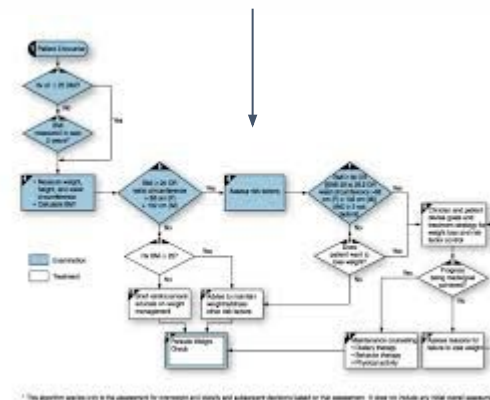
## 3. Learning from data

what **data** to collect? how to represent reality?

time	n.risk	n.event	survival	std.err	lower 95% CI	upper 95% CI
5	23	2	0.913	0.0588	0.8049	1
8	21	2	0.8261	0.079	0.6848	0.996
9	19	1	0.7826	0.086	0.631	0.971
12	18	1	0.7391	0.0916	0.5798	0.942
13	17	1	0.6957	0.0959	0.5309	0.912
18	14	1	0.646	0.1011	0.4753	0.878
23	13	2	0.5466	0.1073	0.3721	0.803
27	11	1	0.4969	0.1084	0.324	0.762
30	9	1	0.4417	0.1095	0.2717	0.718
31	8	1	0.3865	0.1089	0.2225	0.671
33	7	1	0.3313	0.1064	0.1765	0.622
34	6	1	0.2761	0.102	0.1338	0.569
43	5	1	0.2208	0.0954	0.0947	0.515
45	4	1	0.1656	0.086	0.0598	0.458
48	2	1	0.0828	0.0727	0.0148	0.462



what **task** to solve?



what **algorithm & preprocessing?**

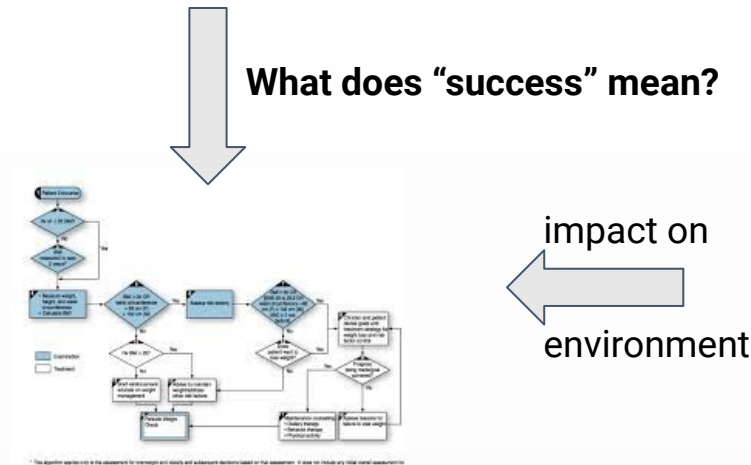


# Role of the human when designing AI

## 4. Learning from **interaction** (reinforcement learning)



actions



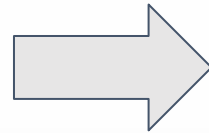
# TRENDS IN ML + ROLE HUMANS

from  
knowledge



Symbolic AI,  
learns to **reason**

Human creates **rules**

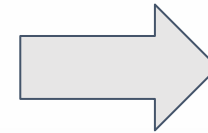


from  
examples



Machine Learning,  
learns a **mapping**

Humans annotate **data**



from  
interaction



Reinforcement  
Learning,  
learns a **policy**

Humans design **success**

But it is  
Hard to structure.

# From a scope point-of-view

## ARTIFICIAL INTELLIGENCE

*The ability of a computer program or a machine to think like humans do.*



## MACHINE LEARNING

*Subfield of AI giving machines the skills to learn from examples without being explicitly programmed.*

Examples: Fraud detection, marketing personalization, email classification



## DEEP LEARNING

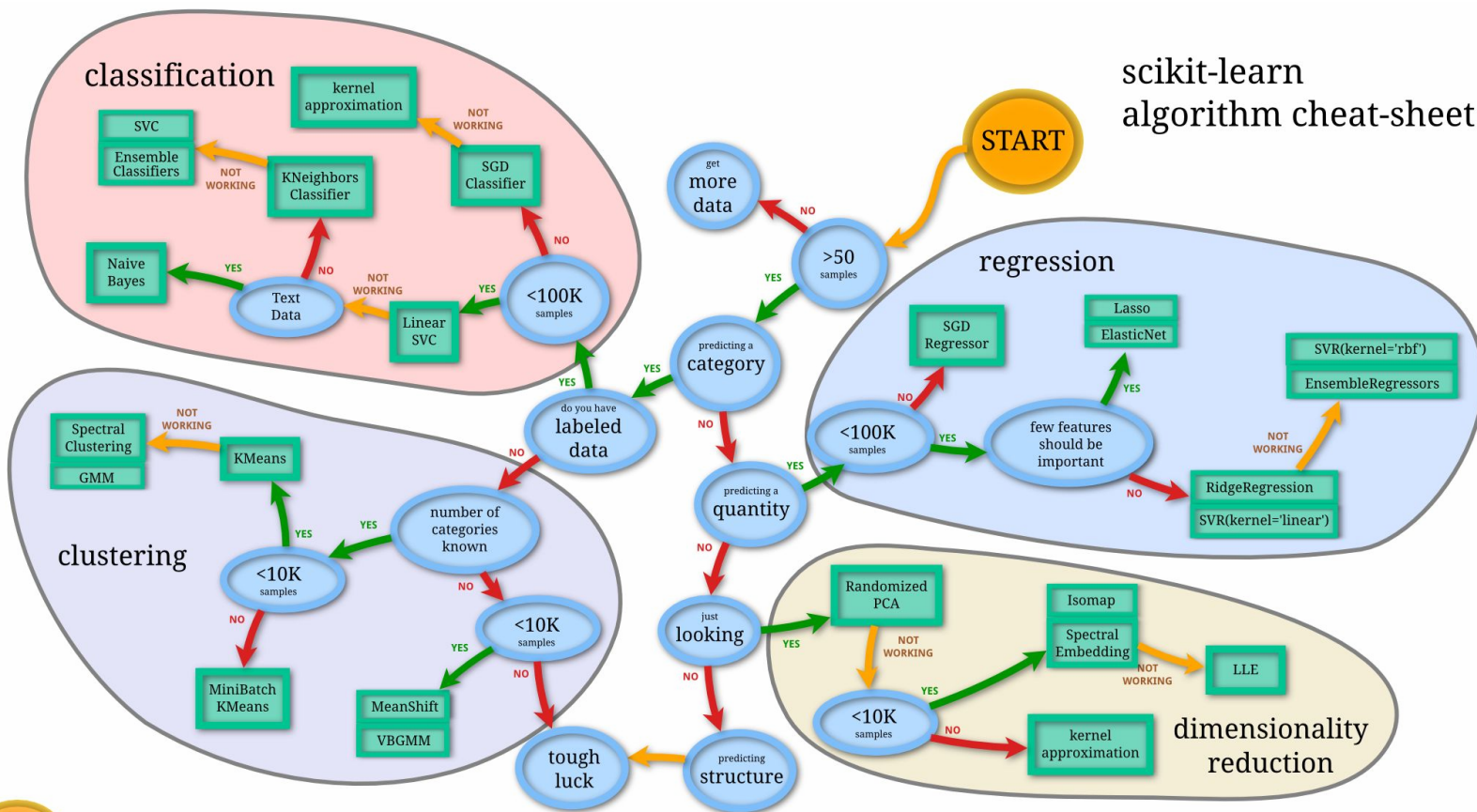
*Specialized machine learning technique enabling machines to train themselves to perform tasks.*

Examples: Image classification, vehicle detection, sentiment analysis

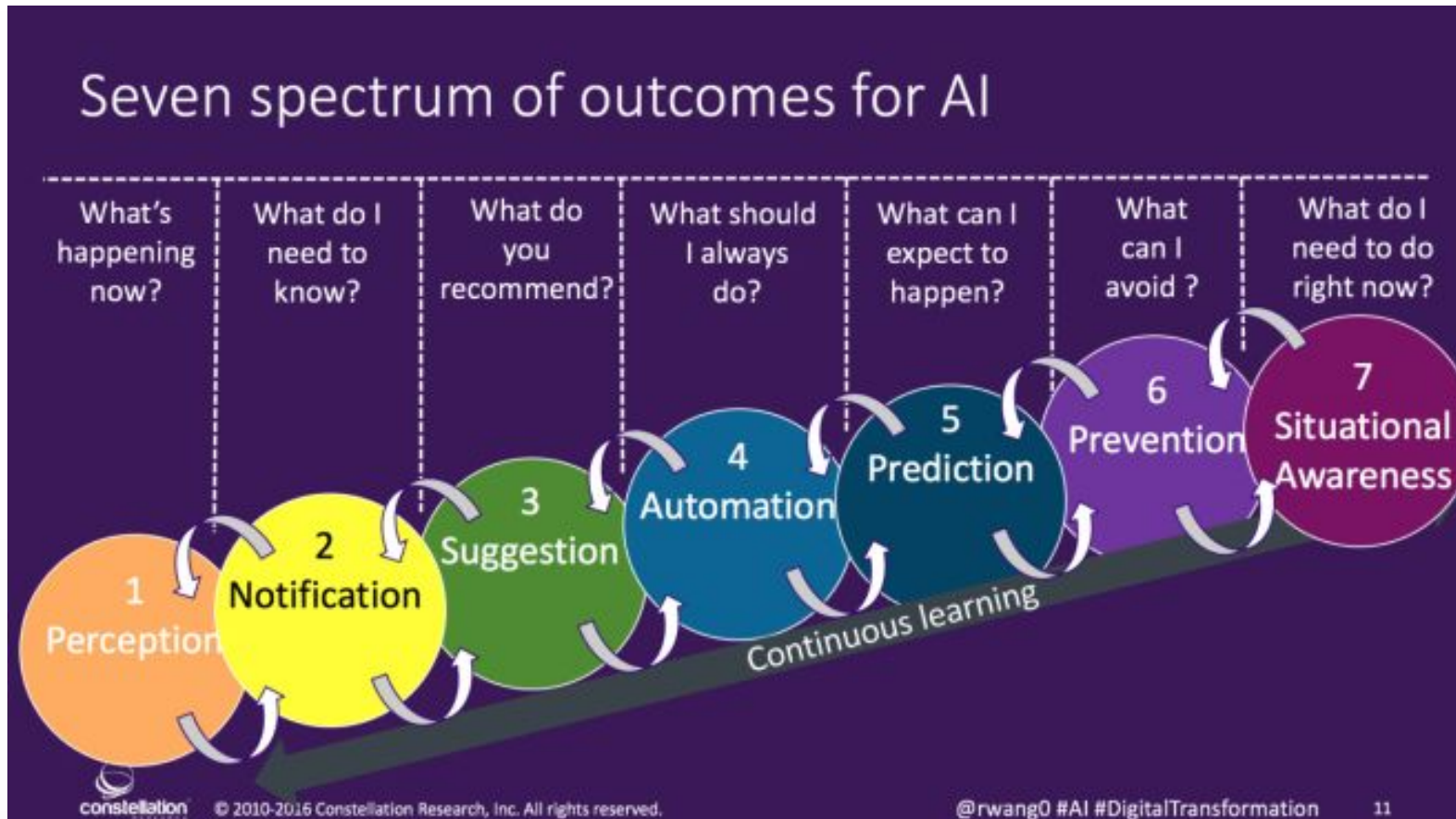


# From an algorithmic point of view

scikit-learn  
algorithm cheat-sheet



# From an outcome point-of-view



# From an application point-of-view



<https://www.plugandplaytechcenter.com/resources/ai-healthcare/>

# From an added-value perspective

What steps is your business taking to improve customer experience? Pick your top 3.



Delivering personalised offers



Creating personalised marketing / ad campaigns



Assessing and optimising marketing / ad campaigns



Identifying up / cross-sale opportunities



Re-engaging customers



Identifying new business opportunities

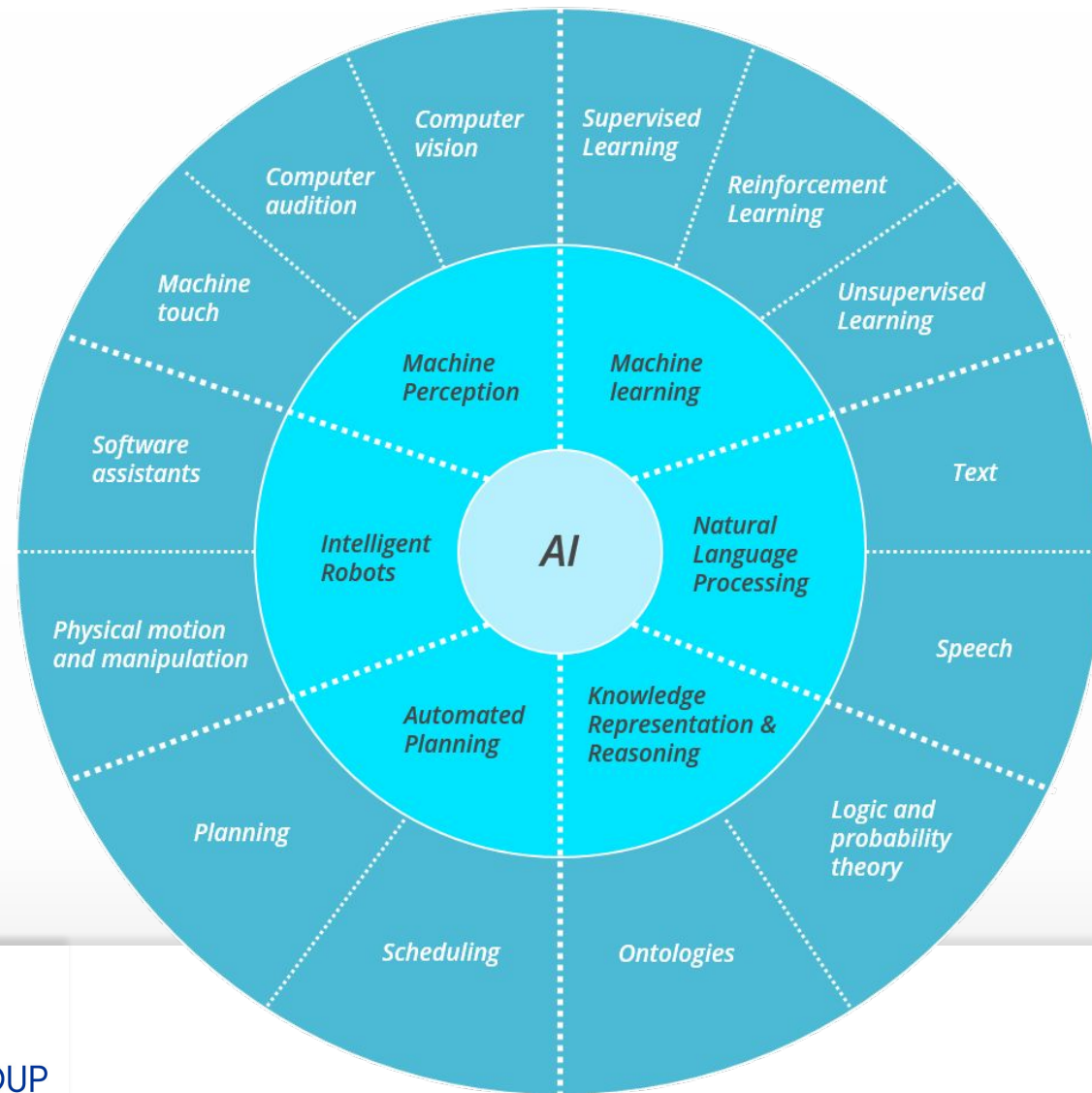


Improving data analytics



<https://www.adobe.com/uk/artificial-intelligence/business-readiness-tool.html?sdid=55KD8VHP&mv=social&mv2=ownsoc>



# From research field point-of-view



<https://medium.com/appanion/a-five-minute-guide-to-artificial-intelligence-c4262be85fd3>

 Cognitive domains  
 Application sub-domains

Q#3

**What is a chair?**

# Symbolic

# AI is all about representations

## Symbolic (“top-down”): good-old-fashioned AI

- **concepts** understandable by humans
- manipulation of these concepts
- good in creating **new knowledge** (in a well contained domain)



# What is a chair? (part 2)

## Subsymbolic (“bottom-up”)

- “raw” measurable **data**, e.g. from sensors
- **robust**, good for ill-defined (**simple**) tasks



# Sub-symbolic example

# Example: meeting room occupation

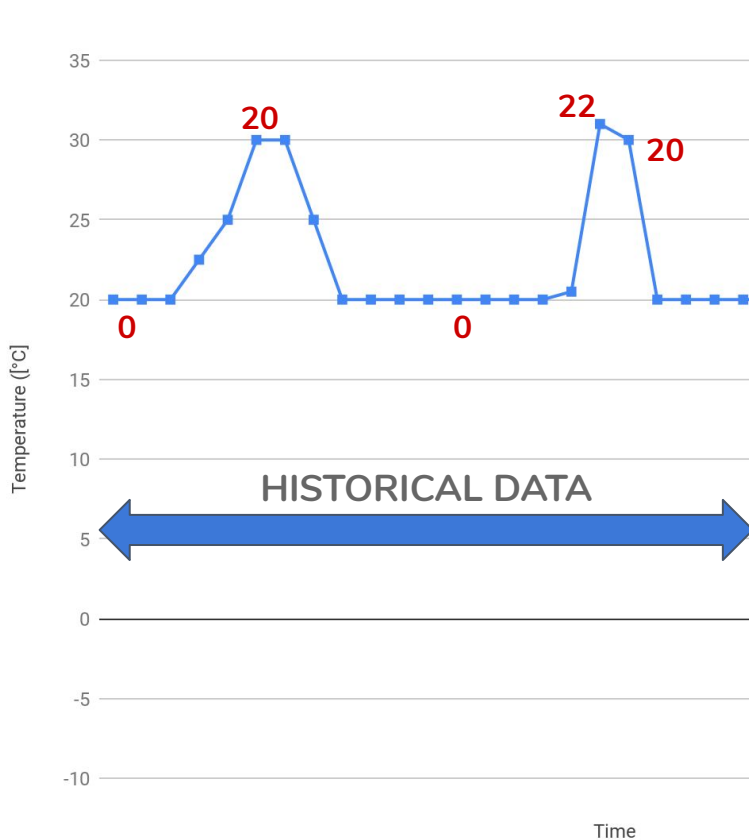


temperature IR sensor

*We want to detect automatically when the classroom is occupied.*

⇒ Set up an experiment to learn the relation!

# First look at sensor data

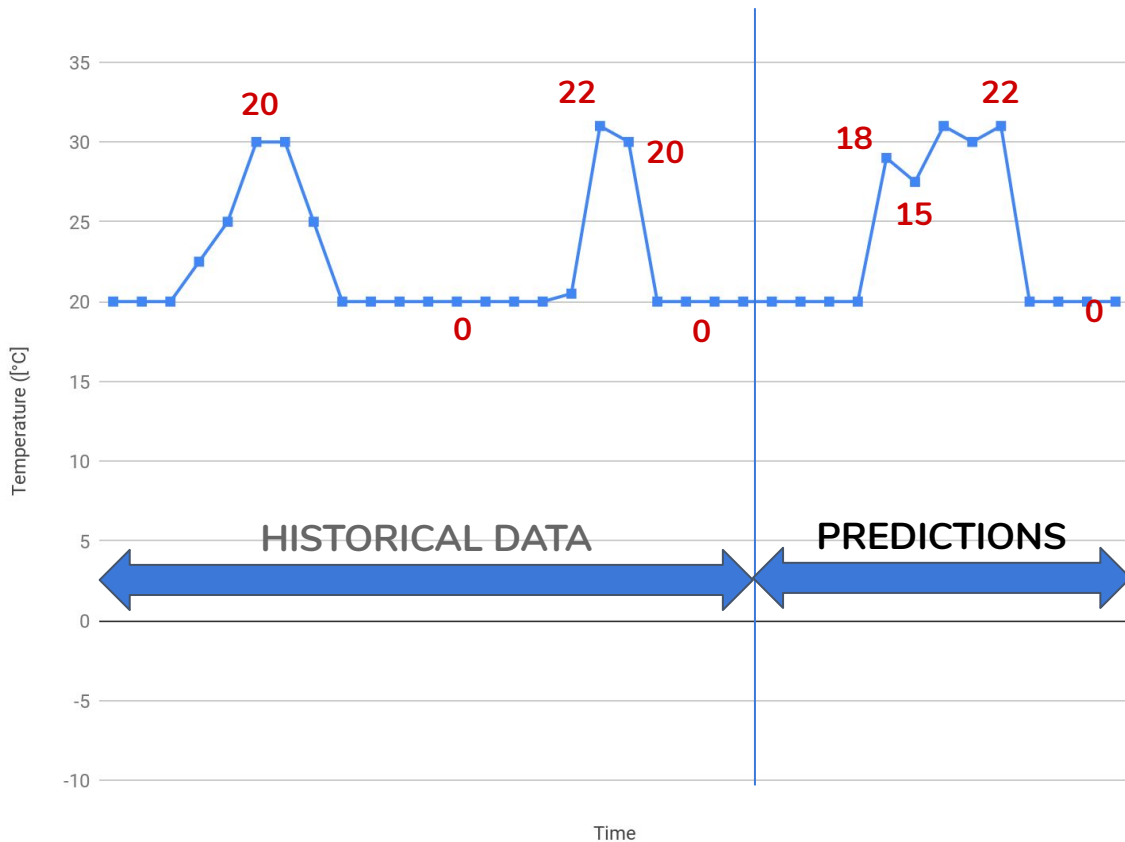


Nice: we can use AI to learn the #persons in the room.

**Used for decision making:**  
Rooms with <20 users/day will be discarded.

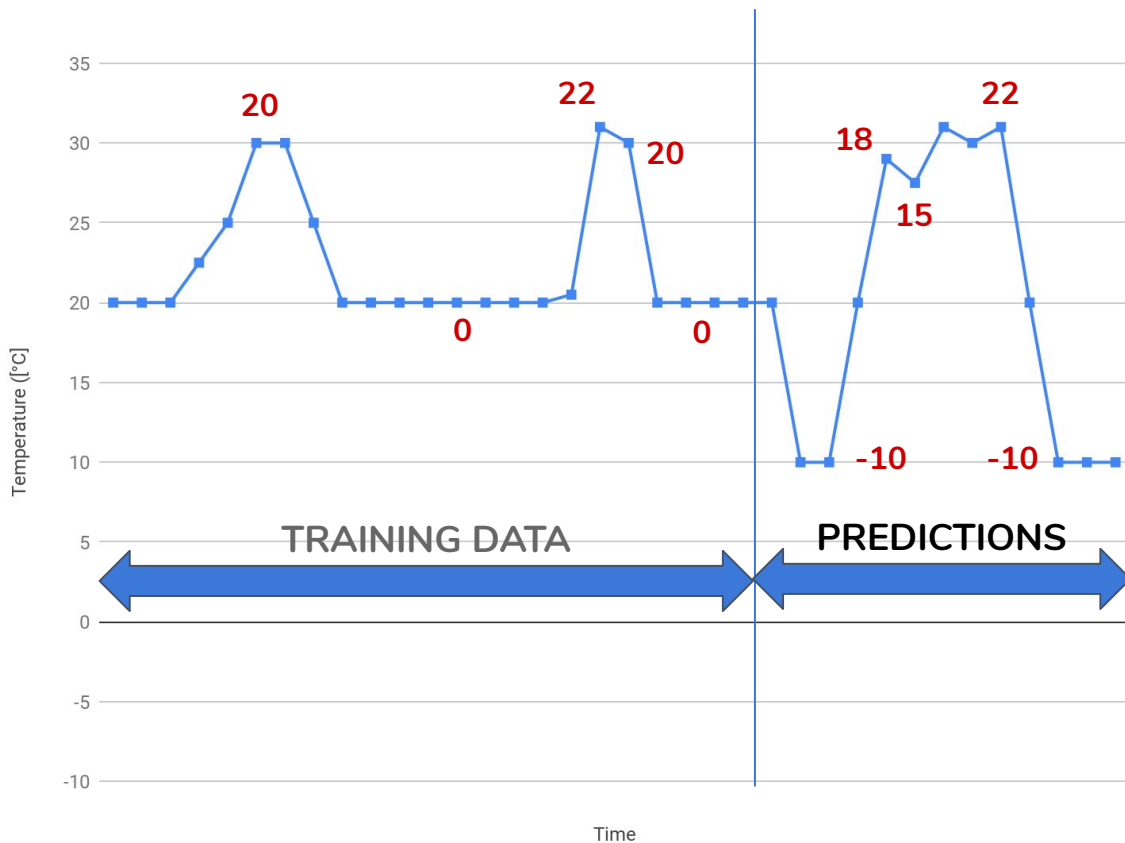


# First look at sensor data



The board decides to **cut down energy**. **What will happen to the predictions?**

# Energy saving $\Rightarrow$ A/C off at night



**Negative #persons?! What is the consequence?**

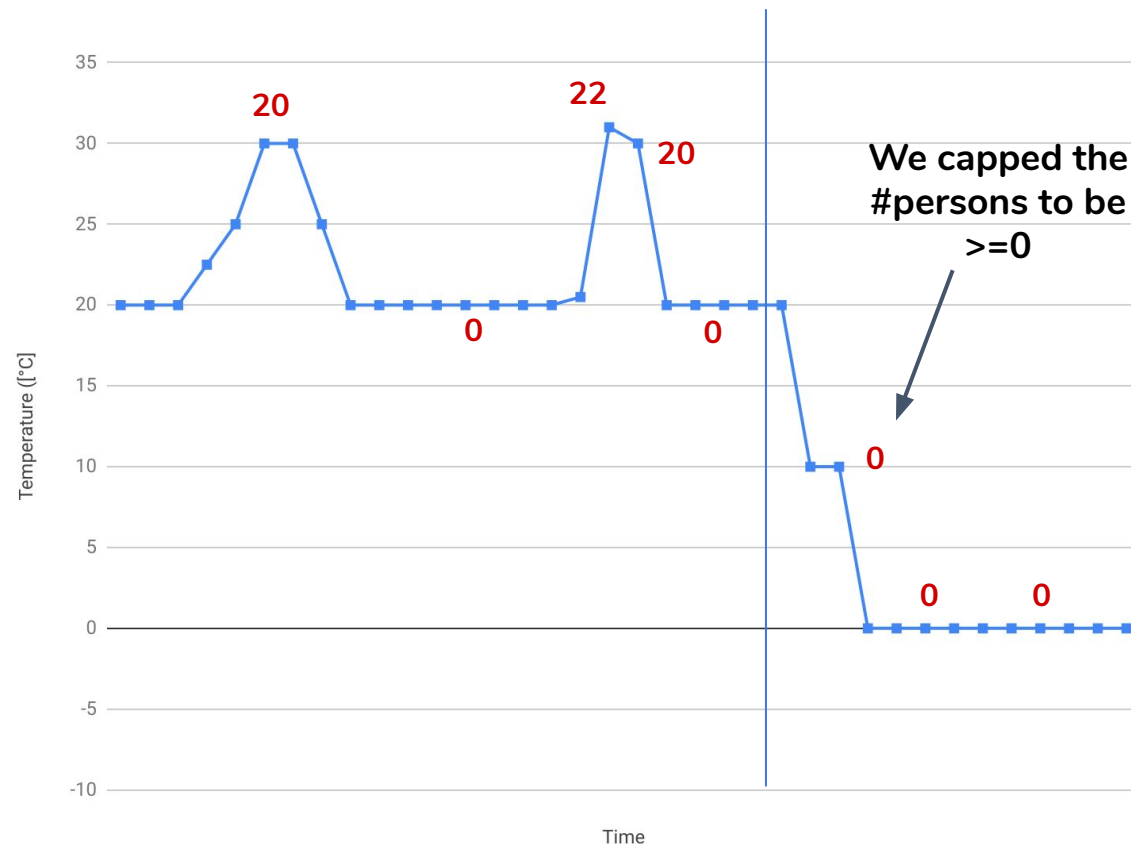
**The model overgeneralized.**

**Room will be discarded as the sum  $< 20$ .**

# AHA!

We know that the #persons  
cannot be negative.

# Strange... what happens here?

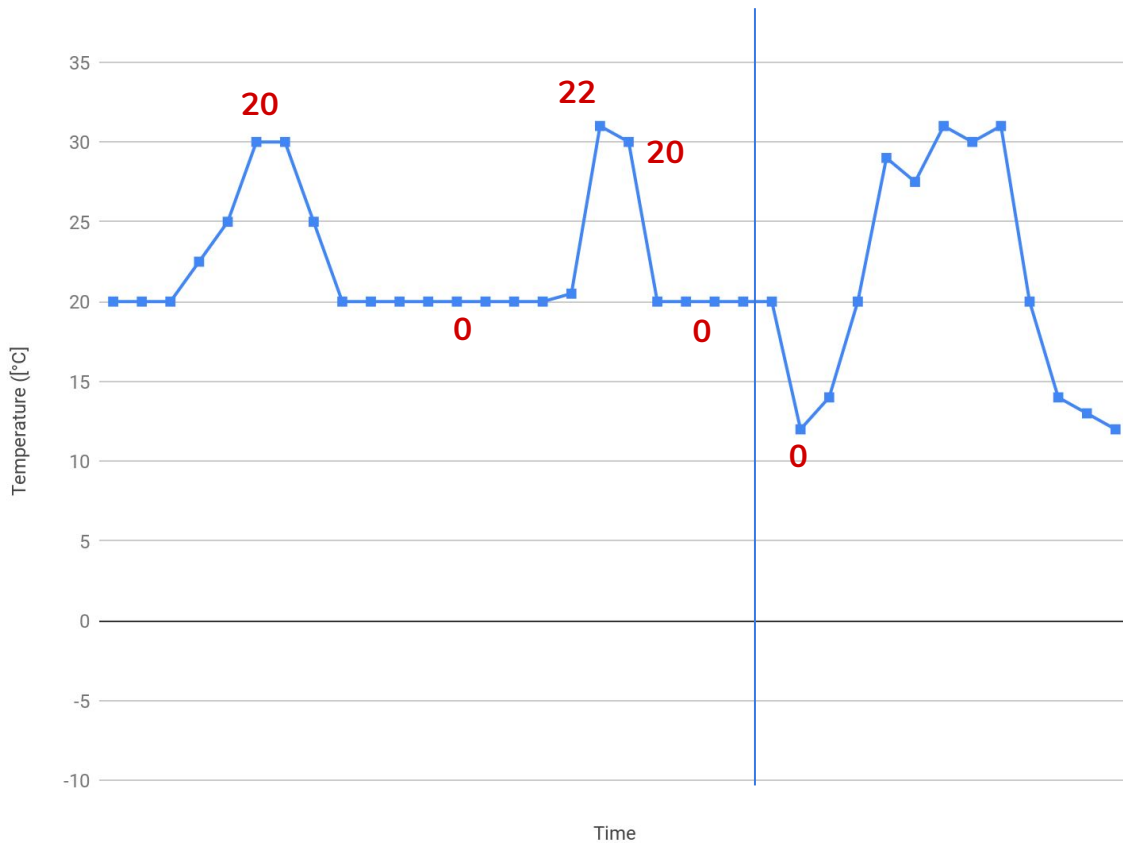


**Room no longer in use?**  
**Very cold outside?**

The **sensor** input was **blocked** and outputs 0.

Room will be discarded.

# Then summer comes...



A/C is shut off in summer.  
20 °C is no longer a reference.

We know the sensor is just a proxy to measure  $t^\circ$  increase by human presence

Algorithms have no idea of the context, unless you tell them so.

# Data are a projection of reality

Which **representation** do you prefer to calculate a route?



Q#4

**When did AI start?**

**What are the roots, foundations?**



# Plato



Reality

... how we represent / think about it

... and how we perceive it

# Aristotle, Descartes, Leibniz

- We can represent reality as **symbols**
- And **reasoning** can represent our thinking
- **Machines** can perform reasoning

# Ada Lovelace



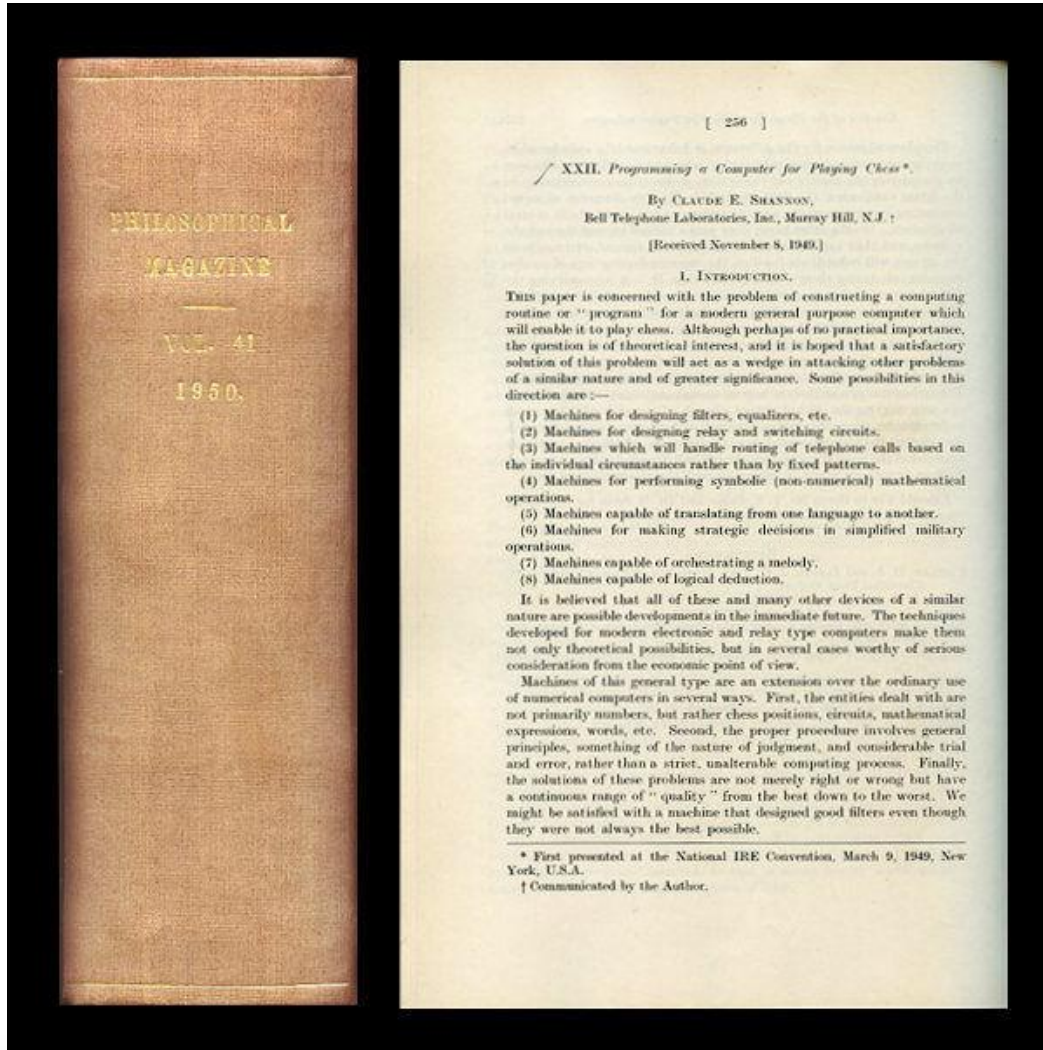
[The Analytical Engine] might **act upon other things besides *number***, were objects found whose mutual fundamental relations could be expressed by those of the **abstract science of operations...**

Supposing, for instance, that the fundamental relations of pitched sounds in the science of harmony and of musical composition were susceptible of such expression and adaptations, **the engine might compose elaborate and scientific pieces of music of any degree of complexity or extent.**

# Russel, Gödel, Turing, Shannon

- **Formal** systems
- Turing machines
- Algorithms that work on representations to solve tasks
- Cybernetics, information theory, systems theory

(1950)



1. Zero-order approximation (symbols independent and equiprobable).

XFOML RXKHRJFFJUJ ZLPWCFWKCYJ FFJEYVKCQSGHYD QPAAMKBZAACIBZLHJQD.

2. First-order approximation (symbols independent but with frequencies of English text).

OCRO HLI RGWR NMIELWIS EU LL NBNESEBYA TH EEI ALHENHTTPA OOBTTVA NAH BRL.

3. Second-order approximation (digram structure as in English).

ON IE ANTSOUTINYS ARE T INCTORE ST BE S DEAMY ACHIN D ILONASIVE TU COOWE AT TEASONARE FUSO TIZIN ANDY TOBE SEACE CTISBE.

4. Third-order approximation (trigram structure as in English).

IN NO IST LAT WHEY CRATICT FROURE BIRS GROCID PONDENOME OF DEMONSTURES OF THE REPTAGIN IS REGOACTIONA OF CRE.

5. First-order word approximation. Rather than continue with tetragram, . . . ,  $n$ -gram structure it is easier and better to jump at this point to word units. Here words are chosen independently but with their appropriate frequencies.

REPRESENTING AND SPEEDILY IS AN GOOD APT OR COME CAN DIFFERENT NATURAL HERE HE THE A IN CAME THE TO OF TO EXPERT GRAY COME TO FURNISHES THE LINE MESSAGE HAD BE THESE.

6. Second-order word approximation. The word transition probabilities are correct but no further structure is included.

THE HEAD AND IN FRONTAL ATTACK ON AN ENGLISH WRITER THAT THE CHARACTER OF THIS POINT IS THEREFORE ANOTHER METHOD FOR THE LETTERS THAT THE TIME OF WHO EVER TOLD THE PROBLEM FOR AN UNEXPECTED.

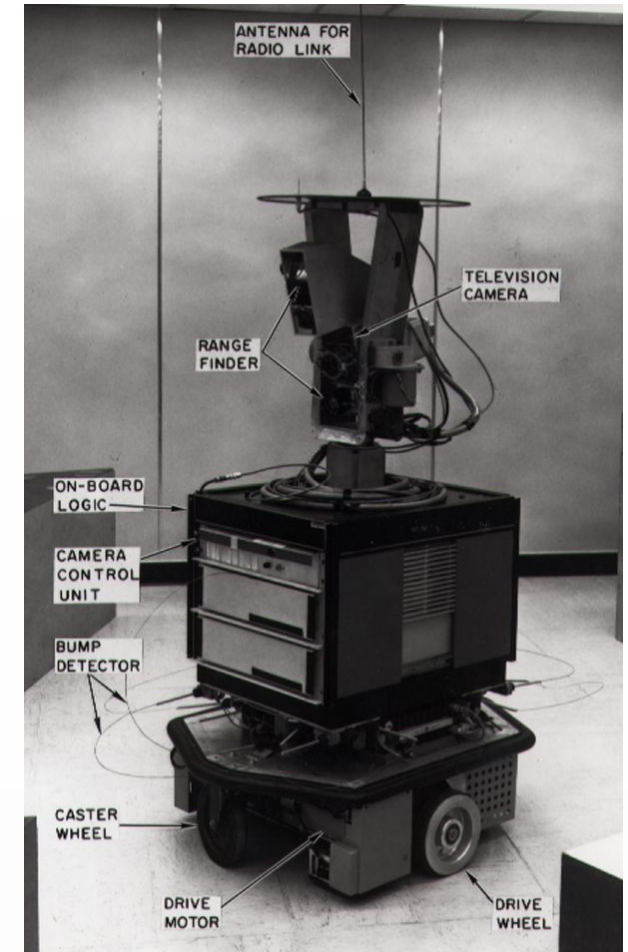
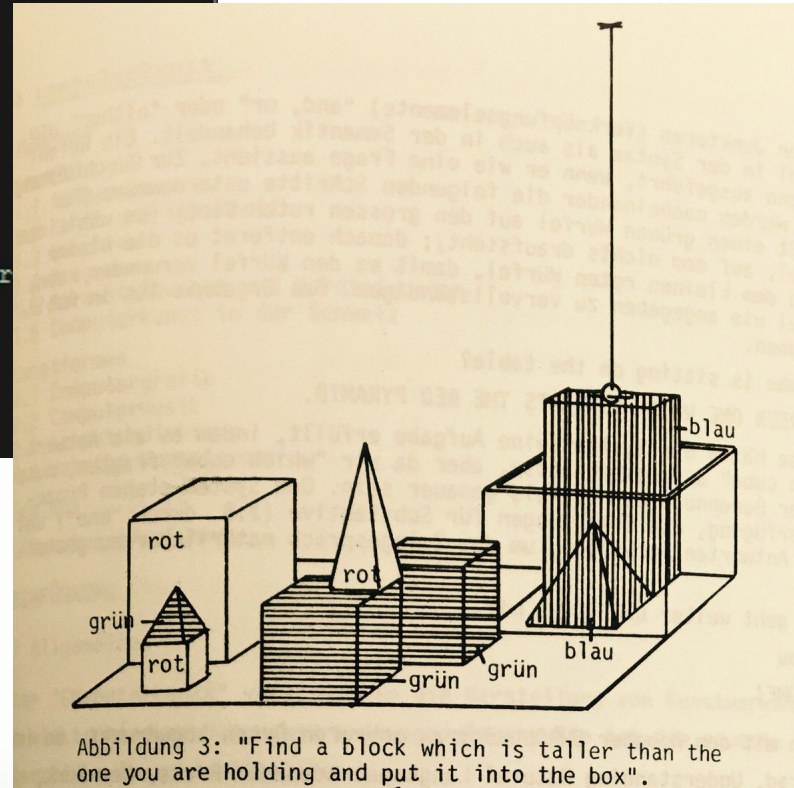
(1948)

Welcome to

```
EEEEEE LL      IIII ZZZZZZ  AAAAA
EE      LL      II      ZZ  AA  AA
EEEEEE LL      II      ZZZ  AAAAAA
EE      LL      II      ZZ  AA  AA
EEEEEE LLLLLL IIII ZZZZZZ AA  AA
```

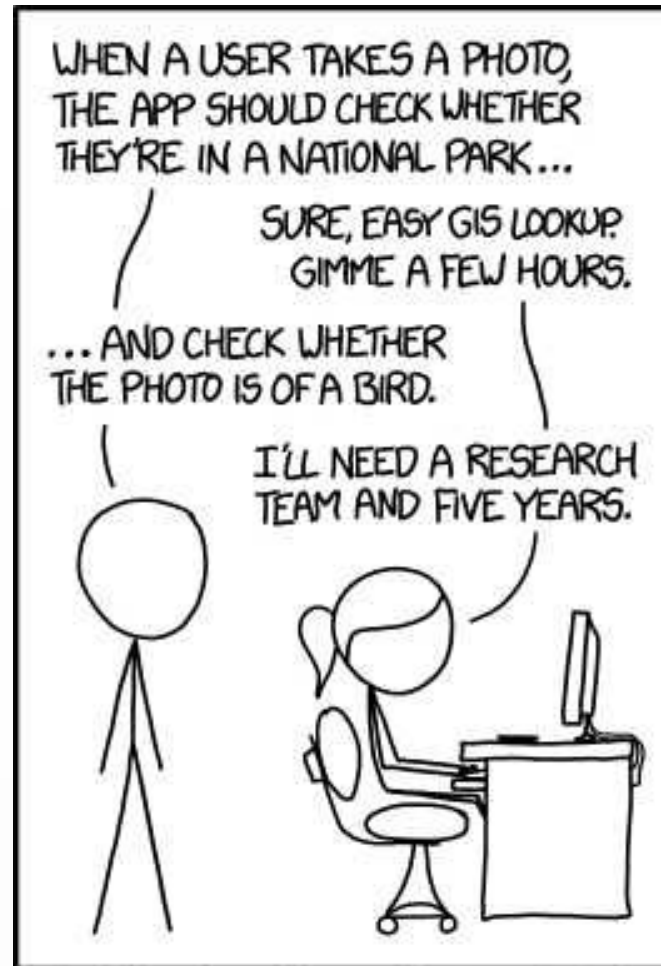
Eliza is a mock Rogerian psychotherapist.  
The original program was described by Joseph Weizenbaum in 1966.  
This implementation by Norbert Landsteiner 2005.

```
ELIZA: Is something troubling you ?
YOU:   Men are all alike.
ELIZA: What is the connection, do you suppose ?
YOU:   They're always bugging us about something or other.
ELIZA: Can you think of a specific example ?
YOU:   Well, my boyfriend made me come here.
ELIZA: Is it important to you that your boyfriend made you come here?
YOU:   He says I'm depressed much of the time.
ELIZA: I am sorry to hear that you are depressed.
YOU:   It's true. I am unhappy.
ELIZA: Can you explain what made you unhappy ?
YOU:   █
```



Q#5

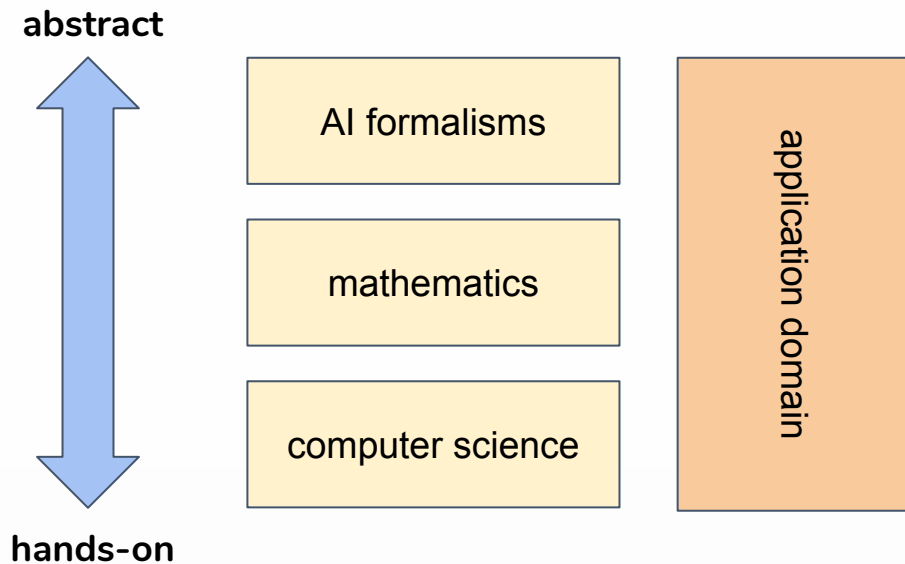
**What makes AI hard?**



IN CS, IT CAN BE HARD TO EXPLAIN  
THE DIFFERENCE BETWEEN THE EASY  
AND THE VIRTUALLY IMPOSSIBLE.



# Interdisciplinary (intersection, not union)



how does my business work?

but **explained to a computer...**

**that is, in mathematical terms?**

# “Understanding” how it works

- conceptually?
- mathematically?
- algorithmically?

- Empirical risk minimization
  - framework to design learning algorithms

```
# Hyperparameters for our network
input_size = 784
hidden_sizes = [128, 64]
output_size = 10

# Build a feed-forward network
model = nn.Sequential(nn.Linear(input_size, hidden_sizes[0]),
                      nn.ReLU(),
                      nn.Linear(hidden_sizes[0], hidden_sizes[1]),
                      nn.ReLU(),
                      nn.Linear(hidden_sizes[1], output_size),
                      nn.Softmax(dim=1))

print(model)
```

- $l(f(\mathbf{x}^{(t)}; \theta)$
- $\Omega(\theta)$  is a
- Learning in high-dimensional parameter space
  - ideally, we'd like to optimize the loss function directly
  - loss function is a surrogate for what we truly should optimize (e.g. upper bound)

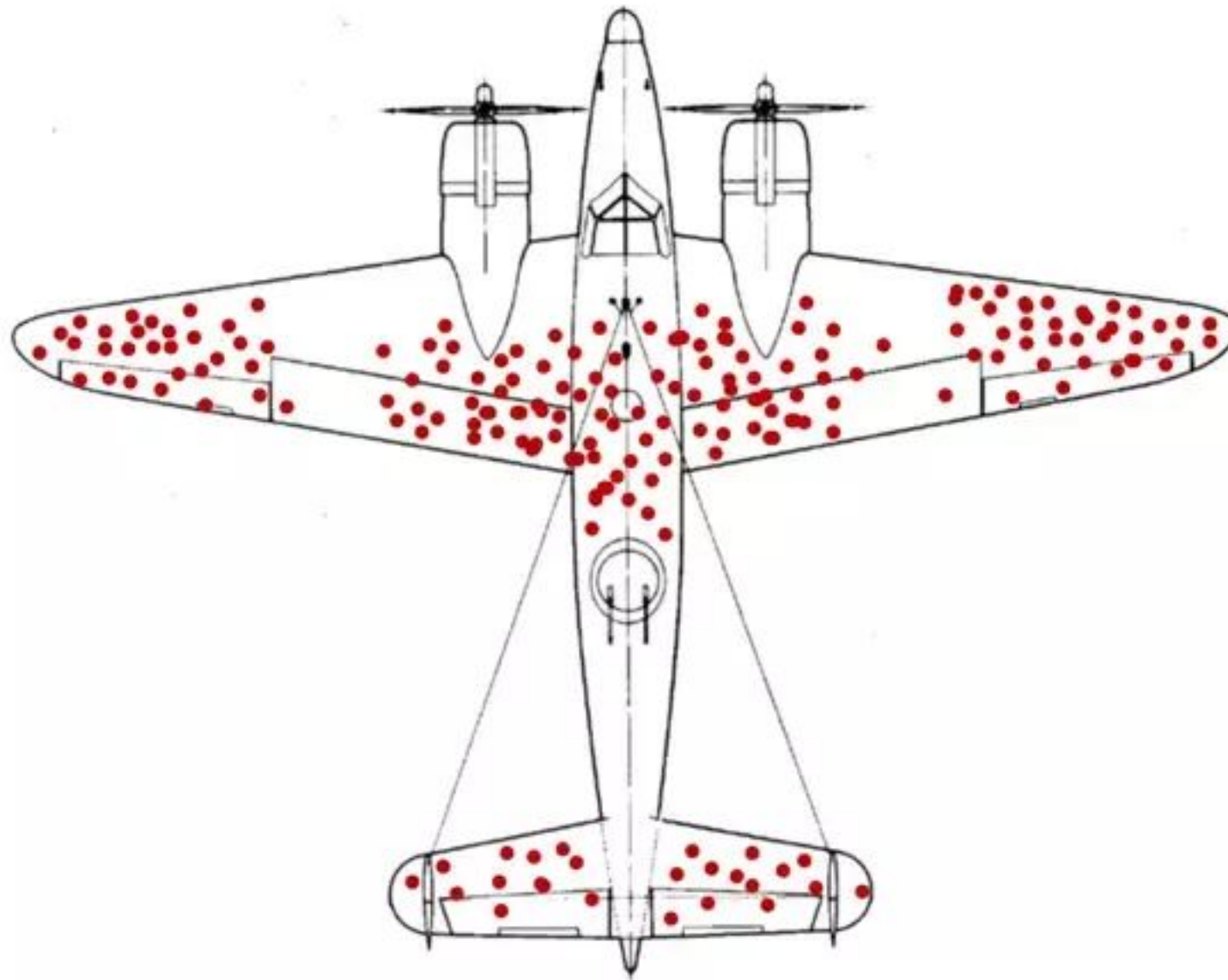
It challenges our beliefs.

*#1 - A walking robot should be stable at all times.*

AI continuously  
**challenges** our **beliefs**  
and **knowledge**, as it  
learns to reproduce our  
results, and will take  
over a big part of  
**experimentation** too.



# *#2 - Human & algorithmic biases*



Bullets in airplanes that came back in WW II.  
**Where to reinforce the armour?**

How many f's in the following sentence?



“Finished files are the result of years of scientific study combined with the experience of years.”



# *#3 - What action should I take?*

# Language & reality is ambiguous

(a chair, you said?)

“Descendez-le!”



# Context matters

- “Could you please pass me the glass of water?”



when I'm thirsty?

when I'm holding a bottle of water?

# *#4 - Where is the flag?*

# We reason over language



the flag is **left** of the table!

the flag is **right** of the table!

# “Hybrid” AI: data + reasoning





Q#6

Why do we have a revival now?

# Why a revival?

- First **digitalization** wave has happened  
(data can be harvested, digital **interfaces** to **processes** & users, SOA)
- **Global** interconnected & **servitized** world & market  
(more **competition**, higher user expectations, new business models)
- **Cloud** services, **open source** & **computing power**  
(powerful, modular **building blocks**, small can compete with big)
- **Consumer driven mindset**  
(users compare with the best of *all*, not best of category)

# Technology is moving to end-users

- **Human interfaces** to services are **disappearing**
  - bank tellers ⇒ ATMs
  - bank clerks ⇒ apps
- Users thus **interact directly with technology**.
  - Still very unnatural compared to humans (e.g. MOOC)
  - Quality and comfort are crucial
  - Digital natives

Q#7

What will AI change?

What is the impact of **fixing**  
**three numbers?**

# Answer: global prosperity

research  
pessimists



sale  
optimists

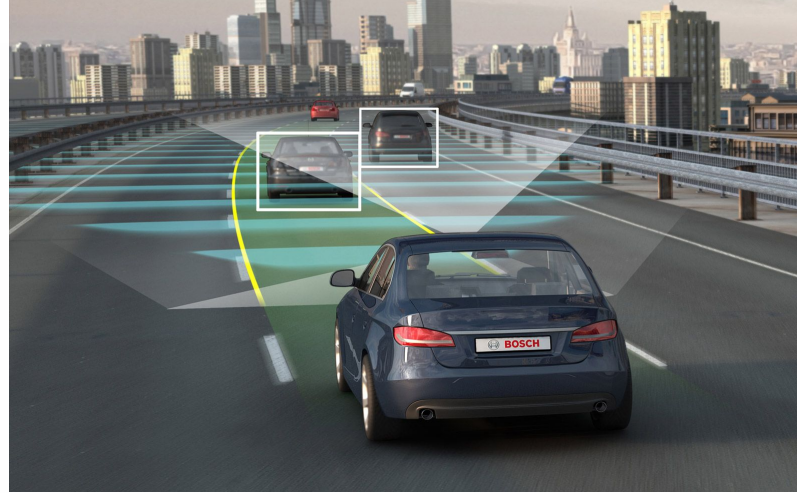
# AI is transformative

# AI is transformative

1. **Changes the nature & discovery of knowledge**
  - a. Allows companies to **formalize** knowledge
  - b. Moves from humans to **self-learning** machines
  - c. Driving force in **science**, the new “statistics”
2. **Enables autonomous and adaptive systems**
  - a. humans go from commanding to **interacting**, giving up control
  - b. go **beyond our understanding** (e.g. high dimensional / nonlinear)
3. **They have “infinite” scale.**
  - a. micro-personalization, human empowerment
  - b. **winner-takes-all economies** as you can copy the best



We have come to a point that the systems we need are **too complex for humans** to build, understand or maintain.



The real transformative value of AI lies exactly in the systems we do not understand

# Explainability

Transparency of algorithms?

$$f_c(z) = z^2 + c$$



# AlphaGo

1. **Better** at Go than humans  
(scientists thought this breakthrough to happen in 2030 earliest)
2. Learn to play **in 2 days**
3. And “invent” **creative moves**
4. An **infinite** #players can be created instantaneously



# AI advances science

- **Automate** tedious research tasks
- **Detect** complex patterns, rules... “**New statistics**”
- Improve **Randomized Controlled Trials**
- The **user is the experiment** => longitudinal studies, we learn a lot about humans

# Unpredictable impact

# Humans vs. machines

## What happened to...

- bank tellers
- video stores
- accountants
- webmasters

## What will happen to?

- travel agents
- real estate agents
- broadcasters
- farmers
- marketeers

## And so who are...

- content managers
- community managers
- IT car repair men
- elevator service personnel

## Have we become the robots?

- algorithms orchestrating people in warehouses;
- opening doors to flats for people decided by airbnb;
- buying books Amazon tells us to.

# “General consensus”

- Will **change our jobs**
  - probably not eliminate, but change the tasks we do
  - and create new jobs!
- Our **interaction with products** will change
  - systems that have their own plan, “will”
- **Lifelong learning** becoming main learning mode
- **Polarization** of tech, data & talent

# Q#8

## Why is it freaky?

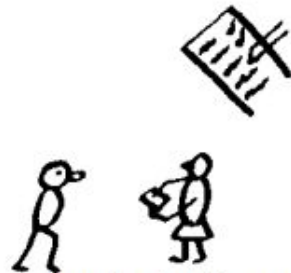




buy these publications,



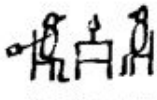
mail orders for these,



give this "public opinion"



watch these shows,



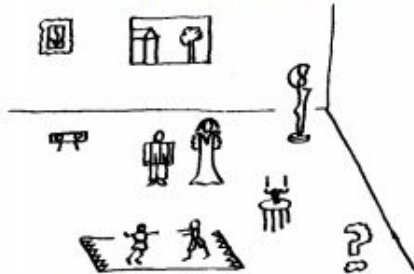
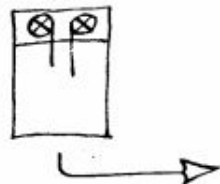
use this credit card?



and this?



to buy this



and is therefore exactly like this with... certain susceptibilities...



Good Morning!



Your new life style!



New politics!



New religion!



How can I ever thank you?

# Creative ways...

## Turn your competitors' visitors into your customers

By combining location intelligence with online advertising potential OMNlcookie empowers retailers to reconnect with shoppers after they've left the store

SEE HOW IT WORKS



**+60%**

offline visits uplift



**Biggest brands**

working with the best



**+1 billion**

devices in Asia alone



**No installation**

no hardware, no beacons



# Vacuum cleaners

What does your **interior design** tell about

- your personality?
- your lifestyle?



# Also when “logged out” (passive authentication)

## How Tech Devices Can Read Your Body

### Facial Recognition

- 3D infrared scanning in future products
- 2D face-scanning appears in some devices

### Iris Scanning

- Based off unique vascular patterns
- Some current smartphones have it

### Ear Scanning

- Like fingerprints, enduring and unique
- Available for enterprise

### Voice Recognition

- Could recognize speech patterns
- Used by some financial companies

### Heartbeat Monitoring

- Electrodes on watch detect heartbeat
- Banks have shown interest

### Vein Mapping

- Maps unique configuration of veins in arm
- Requires active blood flow

### Fingerprint Sensor

- Common in modern smartphones

### Gait Analysis

- Could be used to identify thief
- Relatively inaccurate, currently in development

science  
FRIDAY



Personal identification

## People can now be identified at a distance by their heartbeat

And then dealt with, if they are enemy operatives

# Recommender systems

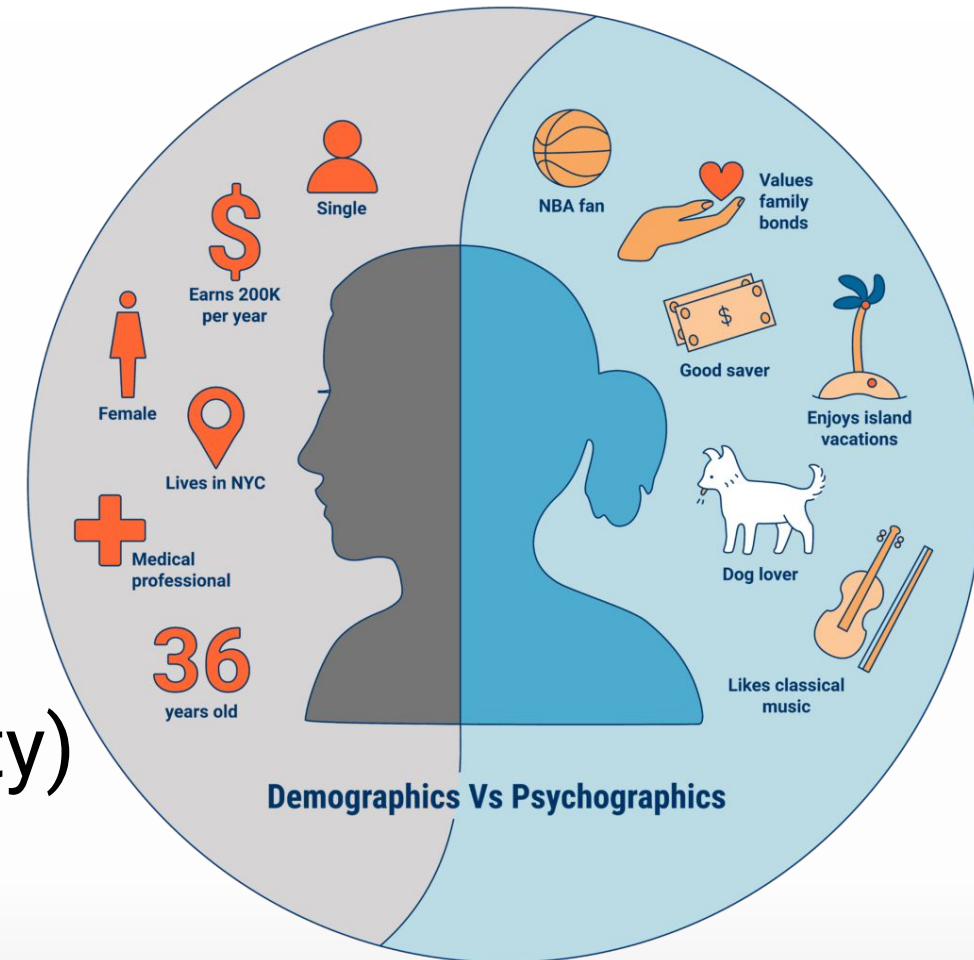
## Winner technology of AI

- What advertisements you see (Google)
- What movie you watch (Netflix)
- What products you buy (Amazon)
- What news you read (Google, Facebook,...)
- What friends you make (Facebook, LinkedIn,...)
- Who will be your spouse (Match.com, ...)

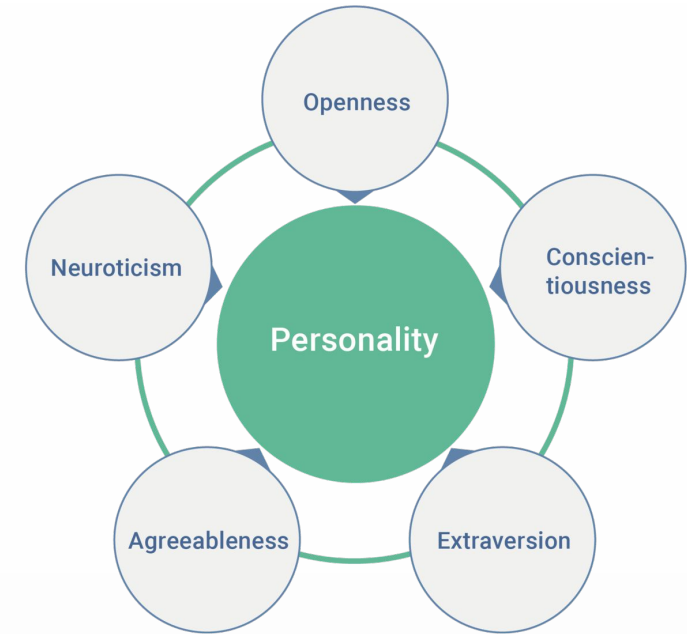
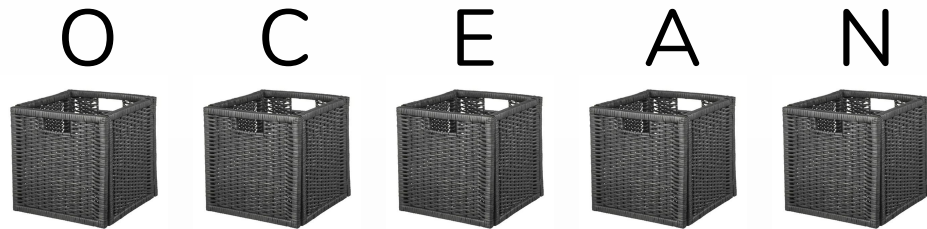
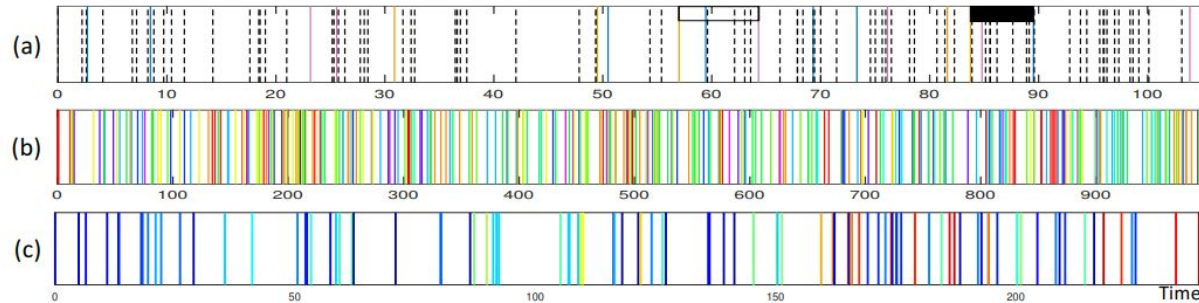
The **most pervasive (and profitable)** of all AI applications.

# Psychometrics

- Understanding the customer
- **Classification** into **specific** categories
- **Prediction** of specific quantities
- **Clustering** of your profile (similarity)



# Saying someone's behaviour is extravert



... is different from understanding what that means, or **reason** about it.

# Examples

## Uber: Users Are More Likely To Pay Surge Pricing If Their Phone Battery Is Low



**Amit Chowdhry** Contributor

*Tech enthusiast, born in Ann Arbor and educated at Michigan State*

## Mac users pay more than PC users, says Orbitz

The travel site says Mac users will pay \$20 to \$30 a night more on hotels than PC users.



# Polarization...

Robots & Machines

## UN Report: Robots Will Replace Two-Thirds of All Workers in the Developing World

Article Image M.S

### IN BRIEF

- Not only will 75% of jobs go to automation, the developing world may also see swaths of companies leaving their shores and returning to developed nations, as labor will be less of a factor for industry.
- Plans, such as a universal basic income, need to be initiated before this process proliferates and these regions are plunged into even more dire circumstances.

### SHARE



### WRITTEN BY

AUTHOR  
Eleazer Corpuz

EDITOR  
Patrick Caughill

November 11, 2016

education?

equality?

# Filter bubble

## Bing Search for "Climate Change" - International Comparison

### US: Informational Sites

bing  
Web

"climate change"

Web News Videos Blogs More

RELATED SEARCHES  
Climate Change Myth  
Climate Change Wiki  
Climate Change Journal  
Climate Change over Time  
Climate Change and Global Warming  
Anthropogenic Climate Change  
Evidence of Climate Change  
EPA Climate Change

SEARCH HISTORY  
"John Boehner"  
"barack obama"

See all  
Clear all · Turn off

• NARROW BY DATE  
All results  
Past 24 hours  
Past week  
Past month

ALL RESULTS 1-10 of 55,000,000 results · Advanced

**Sustainable Development**  
www.willyoupinus.com · Join Us & Add Your Comment to Our Sustainability Discussion.

**Chevron & Climate Change**  
www.Chevron.com · See How Chevron is Helping Develop Solutions for Climate Change.

Other uses: climatechange

**News: "climate change"**

**Climate change and the flood this time**  
Last week, at a place called Bird's Point, just below the confluence of the Ohio and the Mississippi rivers, the Army Corps of Engineers was busy mining a huge levee with...  
Los Angeles Times · 6 hours ago

**Climate Change: The Test for Our Civilization** Associated Content  
Cyber crime to climate change: India trains African officials. Deccan Herald  
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**Climate change - Wikipedia, the free encyclopedia**  
Terminology · Causes · Physical evidence for ...  
Climate change is a long-term change in the statistical distribution of weather patterns over periods of time that range from decades to millions of years.  
en.wikipedia.org/wiki/Climate\_change

**Climate Change | U.S. EPA**  
The EPA Climate Change site provides comprehensive information on the issue of climate change and global warming in a way that is accessible and meaningful to all ...  
www.epa.gov/climatechange

**Climate change: Definition from Answers.com**  
Any change in global temperatures and precipitation over time due to natural variability or to human activity.  
www.answers.com/topic/climate-change

### EU: Climate Action Sites

bing  
Internet

climate change

Internet Bilder Mehr

ÄHNLICHE SUCHVORGÄNGE  
Climate Change Global Warming  
Climate Change Conference  
Climate Change Summary  
Climate Change Effects  
Intergovernmental Panel On Climate Change  
Stop Climate Change  
BBC Climate Change  
UV Index

SUCHVERLAUF  
john boehner  
barack obama

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Alle löschen  
Deaktivieren

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Nur Deutsch  
Mehr

• EINSCHRÄNKEN NACH REGION  
Nur aus Deutschland

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**Stop Climate Change**  
Stop Climate Change. Das Zertifizierungssystem für den Klimaschutz. Bei der Produktion, der Verarbeitung und dem Vertrieb von Produkten entstehen Treibhausgase, die zum ...  
www.stop-climate-change.de

**What we do - About us - Climate Action ...** Diese Seite übersetzen  
European Commission - DG Climate Action ... The Directorate-General for Climate Action ("DG CLIMA") was established in February 2010, climate change being previously included in the ...  
ec.europa.eu/dgs/clima/mission/index\_en.htm

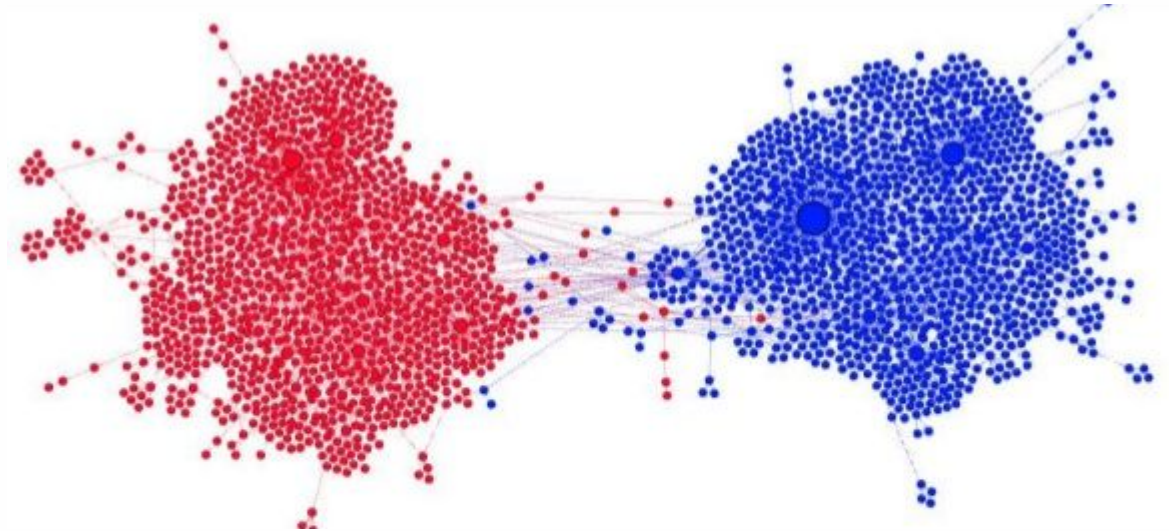
**Climate change - Wikipedia, the free ...** Diese Seite übersetzen  
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Climate change is a long-term change in the statistical distribution of weather patterns over periods of time that range from decades to millions of years.  
en.wikipedia.org/wiki/Climate\_change

**dict.cc | climate change | Wörterbuch Englisch-Deutsch**  
Übersetzung für climate change im Englisch-Deutsch-Wörterbuch dict.cc.  
www.dict.cc/?s=climate+change

**Klimawechsel - Climate Change - bueltge.de [by:ltge.de]**  
Klimawechsel - Climate Change - Seit zwei Jahren unterstütze ich die Aktion Blog Action Day und in diesem Jahr haben die Veranstalter etwas mehr im Vorfeld die Trommeln ...  
bueltege.de/klimawechsel-climate-change/1028

# Polarization

- ... of opinions
- ... of people you meet
- ... music you listen to
- ... clothes you wear?



# Deepfakes



Input photo



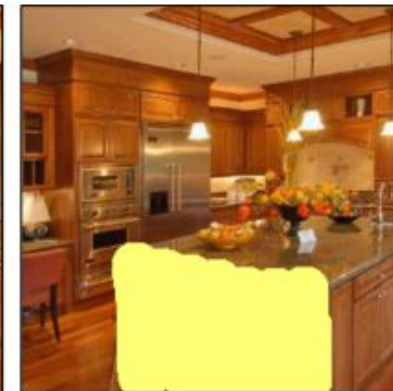
Add windows



Output result



Input photo



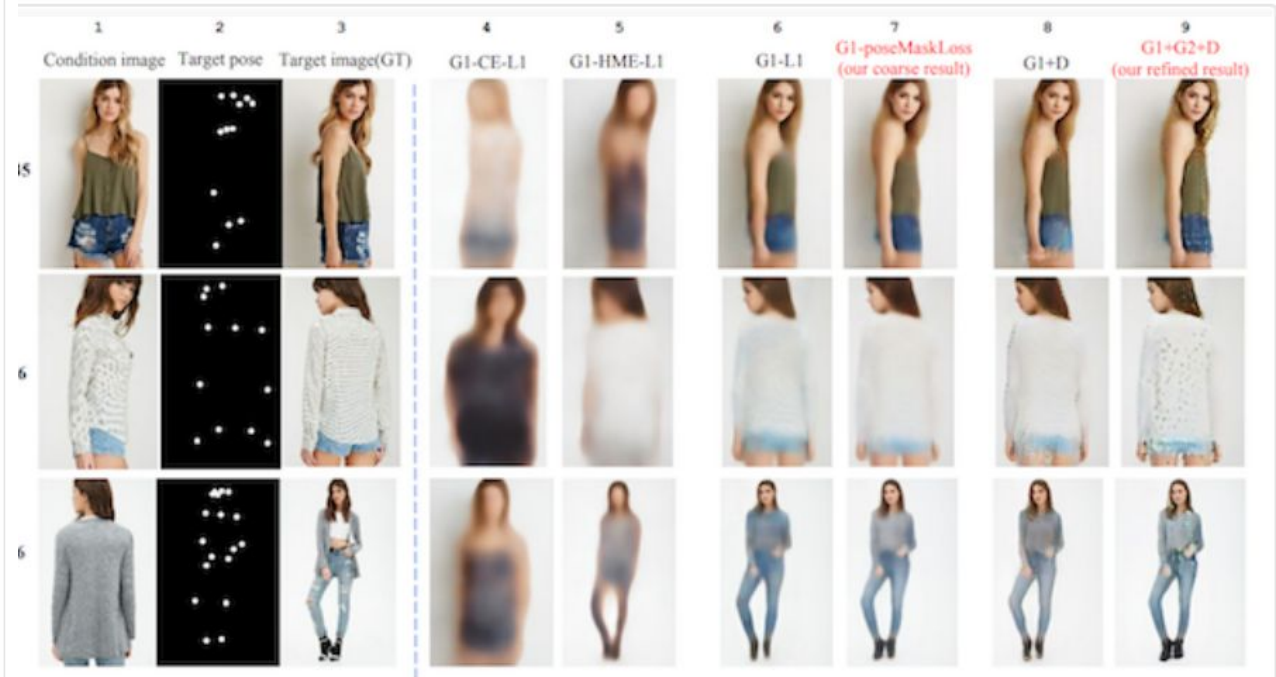
Remove chairs



Output result



Example of Sketches to Color Photographs With pix2pix. Taken from Image-to-Image Translation with Conditional Adversarial Networks, 2016.



Sample of GAN-Generated Photographs of Human Poses Taken from Pose Guided Person Image Generation, 2017.

Q#9

What can AI NOT do today?

*“We are only 20 years away from a world  
in which machines will do any work a  
man can do”*

***H. Simon (1965)***

# Dartmouth summer program

- The term “Artificial Intelligence” was coined.
  - John McCarthy
  - Marvin Minsky
  - Nathaniel Rochester
  - Claude E. Shannon
- They expected to need **2 months** and a team of 10 to solve the problem

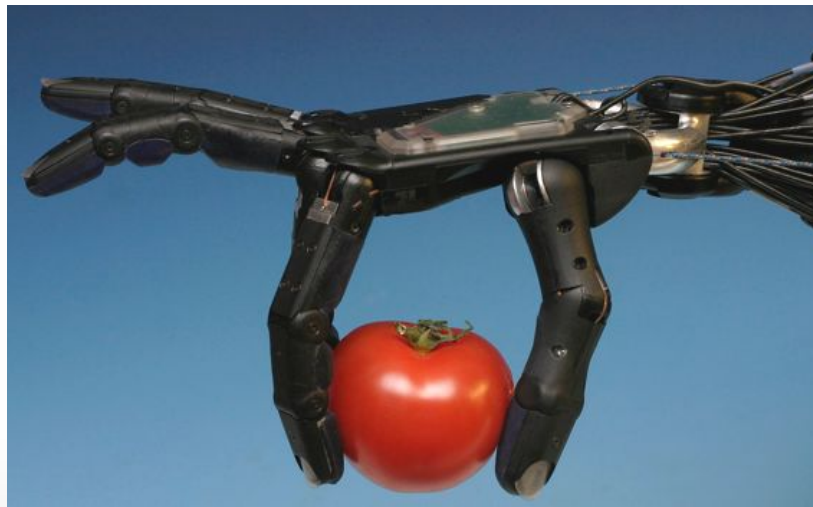


#1

we underestimate our own  
intelligence

# We underestimate our intelligence!

- Tactile feedback
- Substance identification
- Memory of weight
- Geometric reasoning



# Recognizing a guitar is different from



PHYSICAL



understanding that you can play music on it, or that if you can play on a guitar, you can play on a banjo.

# #2

# algorithms are ruthless

# Algorithms are ruthless

**Cobra** effect: government policy to get rid of cobras. If a citizen brings in a venomous snake, they got a reward. People started breeding snakes.



# Algorithms are ruthless (and so they cheat)

## Algorithms Acting Out

- **Infanticide:** In a survival simulation, one AI species evolved to subsist on a diet of its own children.
- **Space War:** Algorithms exploited flaws in the rules of the galactic videogame *Elite Dangerous* to invent powerful new weapons.
- **Body Hacking:** A four-legged virtual robot was challenged to walk smoothly by balancing a ball on its back. Instead, it trapped the ball in a leg joint, then lurched along as before.
- **Goldilocks Electronics:** Software evolved circuits to interpret electrical signals, but the design only worked at the temperature of the lab where the study took place.
- **Optical Illusion:** Humans teaching a gripper to grasp a ball accidentally trained it to exploit the camera angle so that it appeared successful—even when not touching the ball.

## CHEATING AI CAUGHT HIDING DATA USING STEGANOGRAPHY

by: Inderpreet Singh

63 Comments

f t g+

January 3, 2019



# #3

**humans** are the limit:  
we have to describe our problem  
mathematically

# Formulating the problem = hard part

- It is like **explaining** how to
  - drive a car
  - cook
  - diagnose a patient
  - play chess
- **to a computer**, that has no understanding of context
- **MATHEMATICALLY!**



# The description is the limit

The **complexity** of

- rules
- annotation
- reward signal

to describe the **problem**

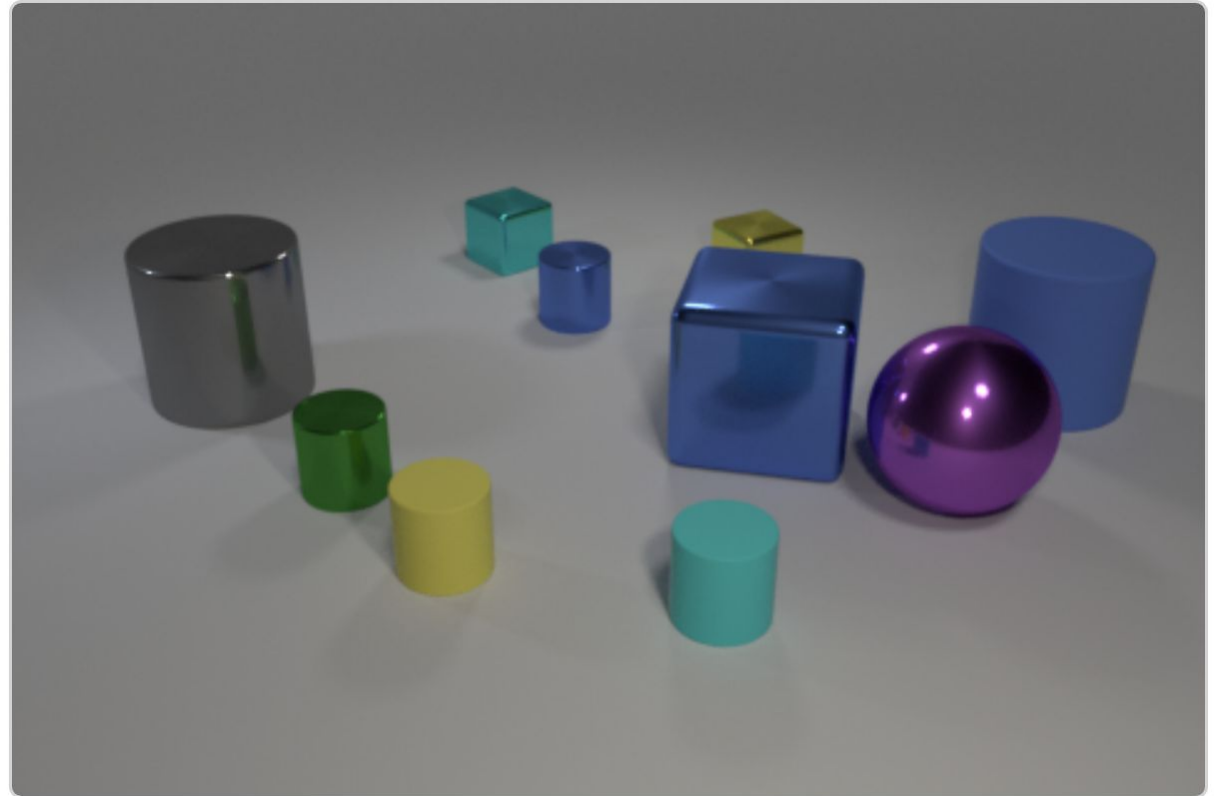
that a **human can handle** is the sky.

# Q#10

## How would you design a system that...

# Answers questions like

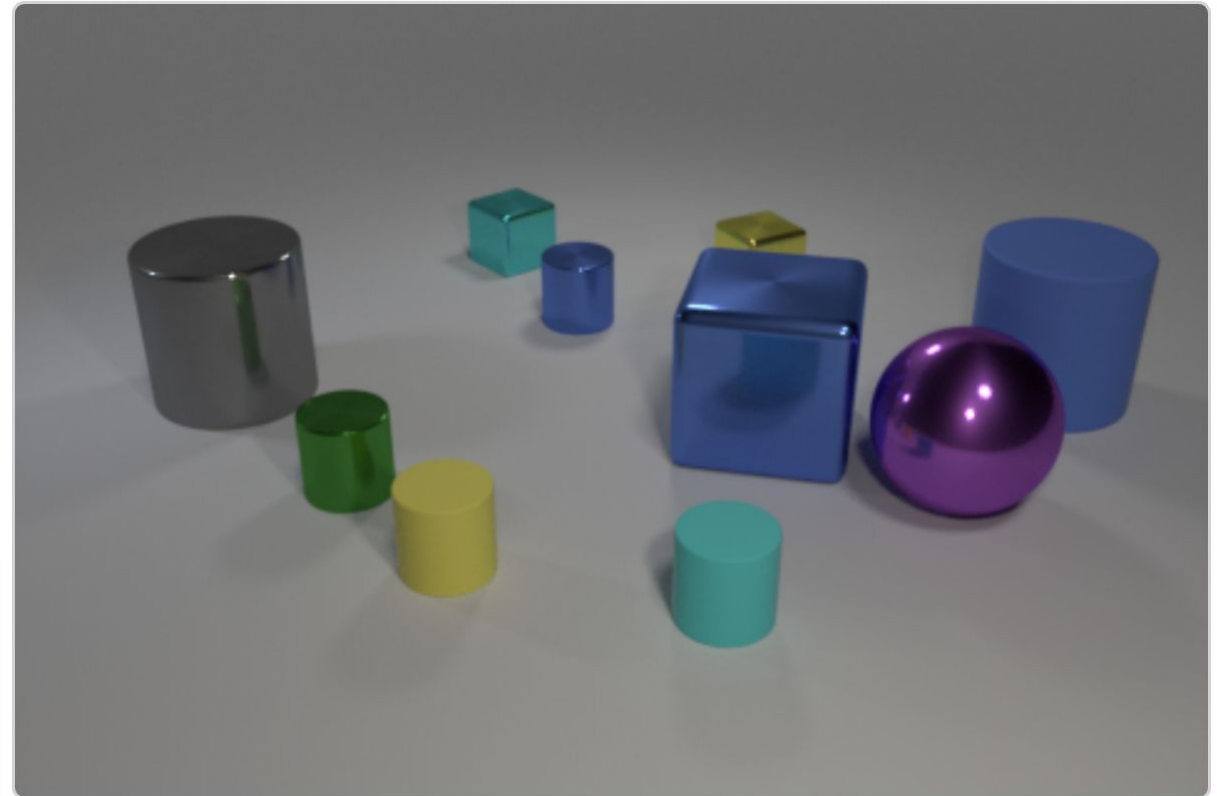
Are there more blue things than yellow ones?



# Visual question answering

<https://ehai.ai.vub.ac.be/demos/visual-question-answering/>

<https://ehai.ai.vub.ac.be/demos/clevr-grammar/>



# Questions?

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<https://ai.vub.ac.be>

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