



AI: What opportunities for energy efficiency

Luigi Troiano [University of Salerno]

Smart Efficiency - L'Efficienza Energetica intelligente: metodologie, soluzioni e tecnologie

Online, 25th November 2020

What it takes to end an AIDS epidemic p. 204
Polar bears suffer through lean summers p. 205
Sperm produced in ovary of mutant fish p. 204

Science

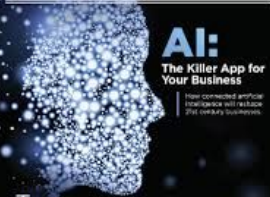
510
17 JULY 2015
sciencemag.org

MAAS



SPECIAL ISSUE
ARTIFICIAL INTELLIGENCE

Forbes



AI:
The Killer App for Your Business

TERADATA
Through predictive analytics, the possibilities for Teradata's cloud-based data platform are endless. It's not just a matter of data, it's a matter of insight.



The Economist
Artificial Intelligence
The promise and the peril

INSIDE: A 34-PAGE SPECIAL REPORT ON FINANCIAL TECHNOLOGY
How to fix America's labor crisis
The self-service economy
Time to open up Indonesia
Inside the anti-drug business
Why humans can't beat machines



TIME
2045
The Year Man Becomes Immortal

Revolution in Egypt
The future of the U.S. should be...
The Obama legacy...
The future of the U.S. should be...
The Obama legacy...
The future of the U.S. should be...
The Obama legacy...



Harvard Business Review
ITALIA
È L'ORA DELL'INTELLIGENZA ARTIFICIALE

Qualche strategia...
La strategia...
L'innovazione aumenta...
Così la rivoluzione...
delle macchine cambia...
le aziende e il modo...
di lavorare. Page 55



nature
LEARNING CURVE

Self-teaching AI helps...
A GIANT IN THE...
TELEPORTATION...
SHARE DATA IN...
THE FUTURE OF...
THE FUTURE OF...
THE FUTURE OF...



MIT Technology Review
The Artificial Intelligence Issue

The field of...
The field of...
The field of...
The field of...



TEMPI
SCACCO ALL'UMANO

Dal laboratorio della Silicon Valley all'industria delle armi, dalle braccia meccaniche delle catene di montaggio alla suggestiva distopia di Blade Runner, l'Intelligenza Artificiale si sta prendendo i nostri corpi, ma punta all'anima.



Focus
L'INTELLIGENZA ARTIFICIALE CI CAMBIERÀ LA VITA ECCO COME

OLIMPIADI COSÌ SI VINCONO LE MEDAGLIE
SCACCO ALL'UMANO
L'INTELLIGENZA ARTIFICIALE CI CAMBIERÀ LA VITA ECCO COME



San Francisco Chronicle
FRIDAY, SEPTEMBER 2, 2007

WHEN MACHINES THINK
Real brains are gathering in San Francisco to ponder the future of artificial intelligence.
For decades, scientists and writers have dreamed of a future when computers start improving themselves...
The future of...
The future of...
The future of...



POPULAR SCIENCE
THE NEW ARTIFICIAL INTELLIGENCE

THE FUTURE OF...
DETECTING...
KILLER...
ROBOTS?



WILD
JOHN MCAFEE'S LAST STAND

THE...
ROBOTS...
TAKE...
OVER!



Internazionale
L'intelligenza artificiale dominerà il mondo?

L'intelligenza artificiale dominerà il mondo?



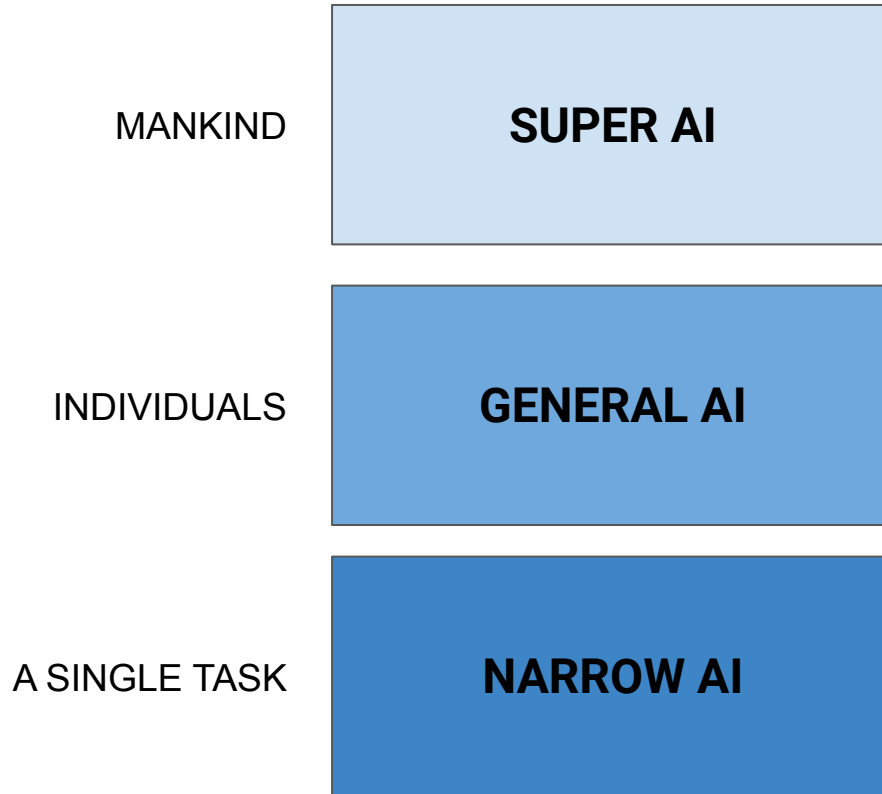
VANITY FAIR
Stefano

Beauty...
Stefano...
Elon Musk...
Il futuro di...

WHAT IS AI?

The field of computer science that studies the methods and technologies to replicate with machines those cognitive capabilities associated to human, animal or life intelligence, such as learning, reasoning, adapting and self-organizing skills in the context of partial information and limited resources.

THE AI LEVELS



#1 - AI will understand more, so it can do more - Breakthrough techniques will help AI learn with less data, better understand human language.

#2 - AI won't take your job, but it will change how you work - AI will take on easily automated tasks, while workers lean into soft skills

#3 - AI will engineer AI for trust - Component will infuse trust throughout the AI lifecycle, building confidence in AIs recommendations

#4 - AI's appetite for energy demands greener tech - The material and software AI is based on will be designed for energy efficiency

#5 - AI-powered lab assistants will discover new materials - AI will drive breakthroughs for new industry products

Sriram Raghavan - Vice President, IBM Research AI



John McCarthy

September 4, 1927 – October 24, 2011



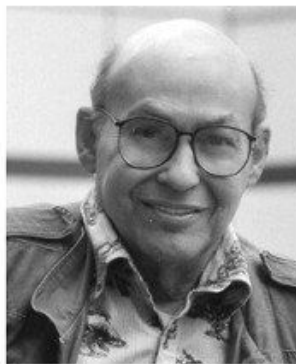
**Dartmouth Summer
Research Project on
Artificial Intelligence
(1956)**

1. Ray Solomonoff
2. Marvin Minsky
3. John McCarthy
4. Claude Shannon
5. Trenchard More
6. Nat Rochester
7. Oliver Selfridge
8. Julian Bigelow
9. W. Ross Ashby
10. W.S. McCulloch
11. Abraham Robinson
12. Tom Etter
13. John Nash
14. David Sayre
15. Arthur Samuel
16. Kenneth R. Shoulders
17. Shoulders' friend
18. Alex Bernstein
19. Herbert Simon
20. Allen Newell

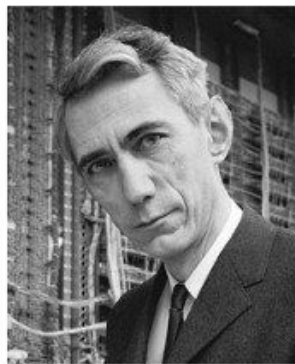
1956 Dartmouth Conference: The Founding Fathers of AI



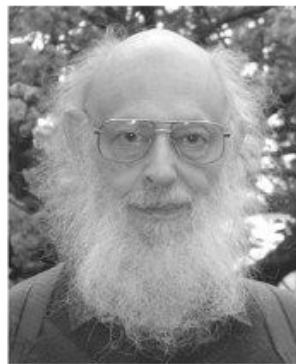
John MacCarthy



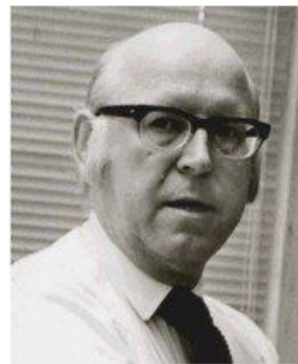
Marvin Minsky



Claude Shannon



Ray Solomonoff



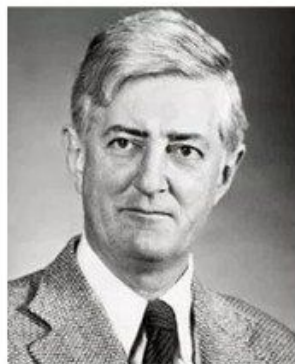
Alan Newell



Herbert Simon



Arthur Samuel



Oliver Selfridge



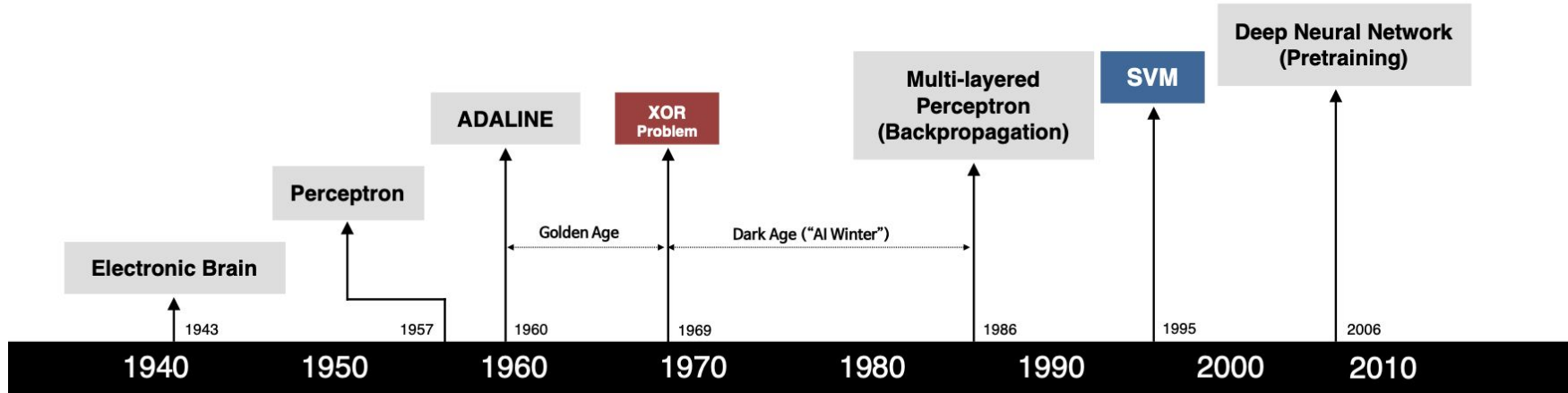
Nathaniel Rochester



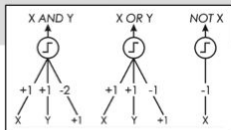
Trenchard More

Brief History of Neural Network

DEVIEW
2015



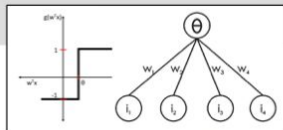
S. McCulloch - W. Pitts



- Adjustable Weights
- Weights are not Learned



F. Rosenblatt



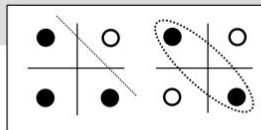
- Learnable Weights and Threshold



B. Widrow - M. Hoff



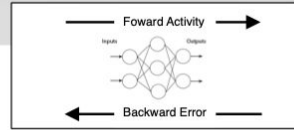
M. Minsky - S. Papert



- XOR Problem



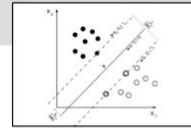
D. Rumelhart - G. Hinton - R. Williams



- Solution to nonlinearly separable problems
- Big computation, local optima and overfitting



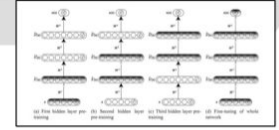
V. Vapnik - C. Cortes



- Limitations of learning prior knowledge
- Kernel function: Human Intervention

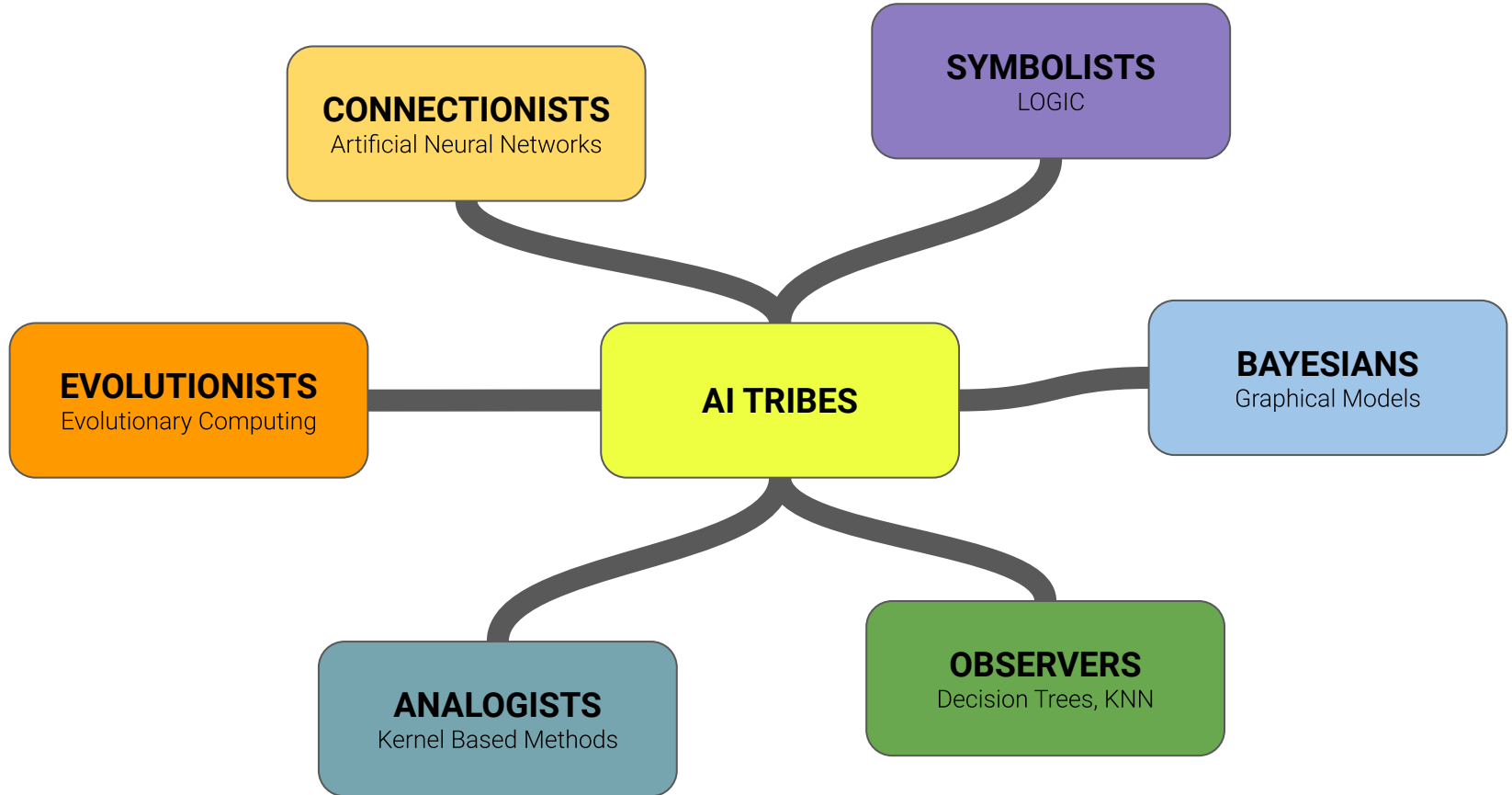


G. Hinton - S. Ruslan

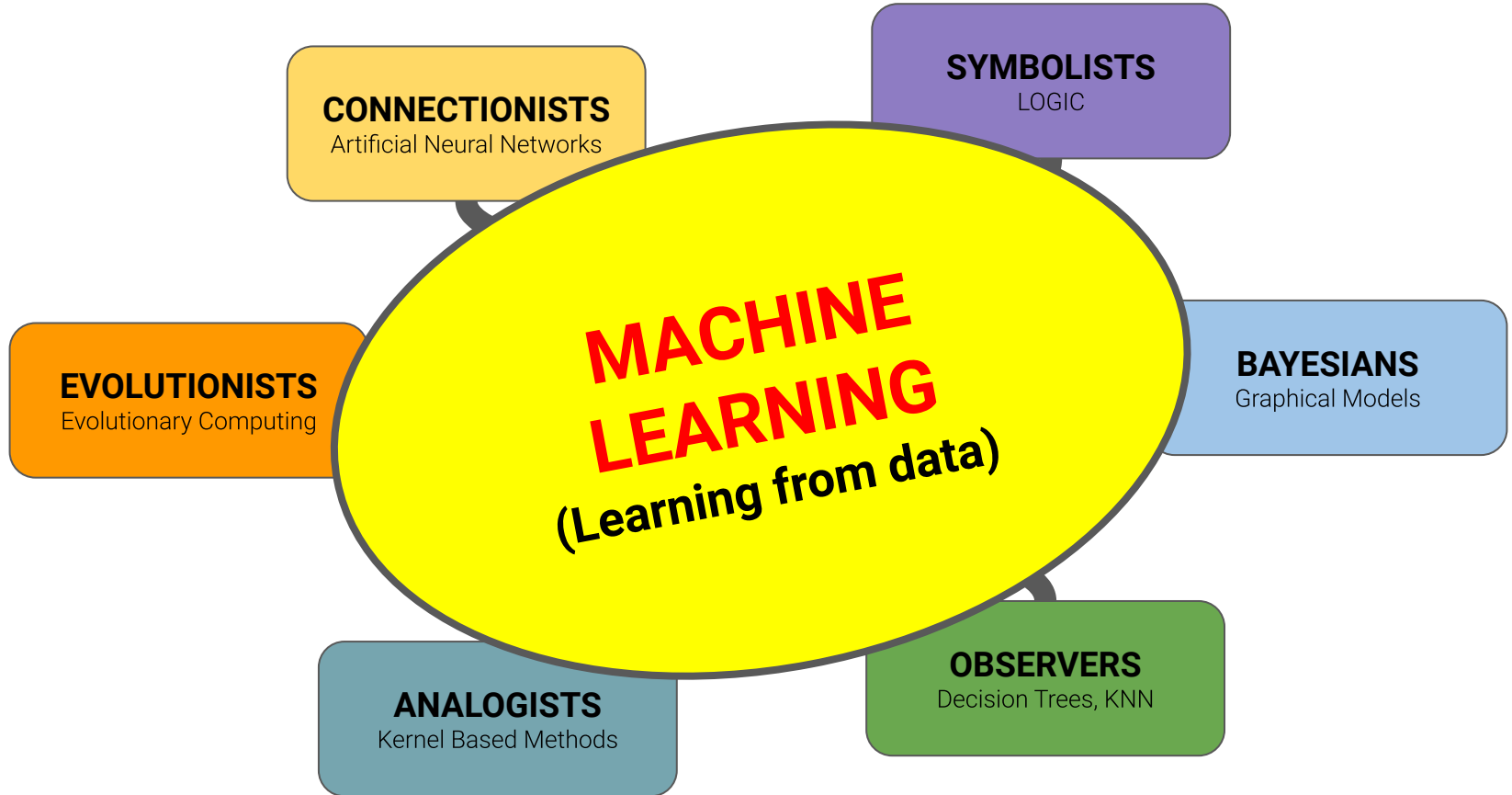


- Hierarchical feature Learning

THE AI TRIBES



DATA DRIVEN MODELS





Arthur Samuel

December 5, 1901 – July 29, 1990

ARTIFICIAL INTELLIGENCE

Early artificial intelligence stirs excitement.



MACHINE LEARNING

Machine learning begins to flourish.



DEEP LEARNING

Deep learning breakthroughs drive AI boom.



1950's 1960's 1970's 1980's 1990's 2000's 2010's

Since an early flush of optimism in the 1950's, smaller subsets of artificial intelligence - first machine learning, then deep learning, a subset of machine learning - have created ever larger disruptions.

THE EXPANDING UNIVERSE OF MODERN AI

"THE BIG BANG"

Big Data
GPU
Algorithms

RESEARCH



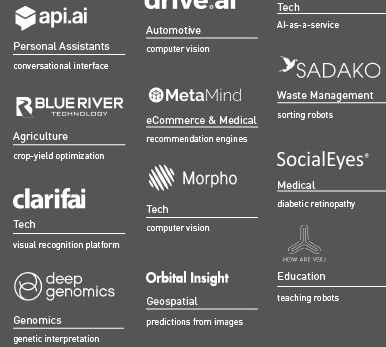
CORE TECHNOLOGY / FRAMEWORKS



AI-as-a-PLATFORM



START-UPS



1,000+ AI START-UPS
\$5B IN FUNDING

Source: Venture Scanner

INDUSTRY LEADERS



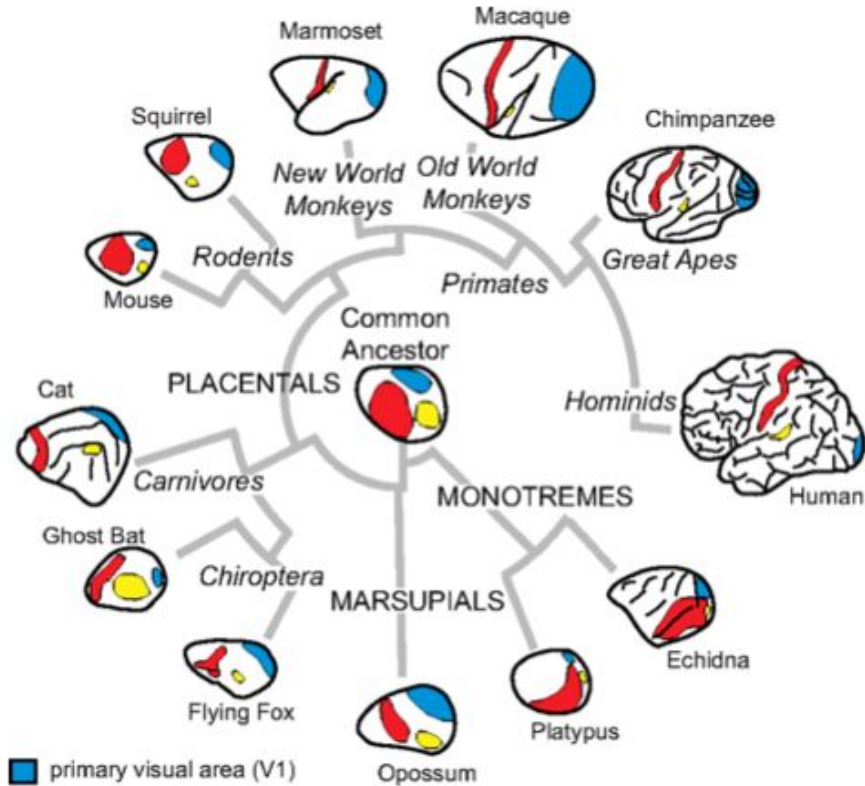


Geoffrey Hinton

December 6, 1947



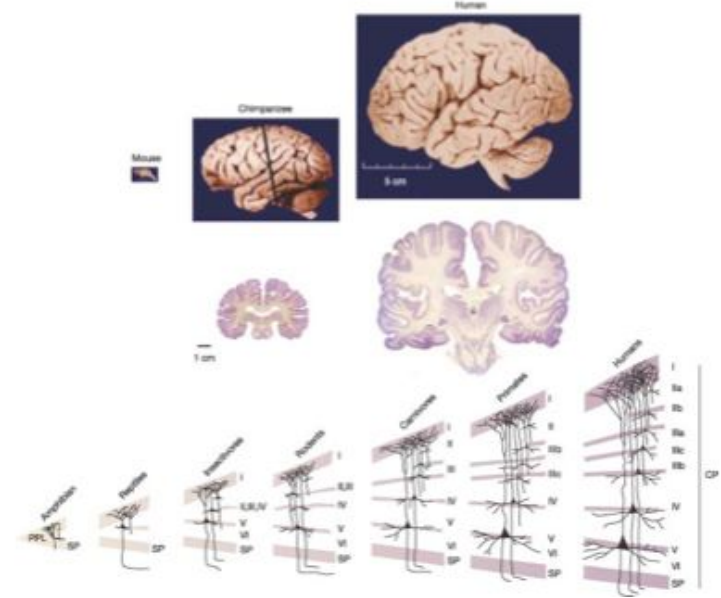
THE CORTEX



- primary visual area (V1)
- primary auditory area (A1)
- primary somatosensory area (S1)

Leah A. Krubitzer and Adele M. H. Seelke
 Cortical evolution in mammals: The bane and
 beauty of phenotypic variability
 PNAS 2012 109 (Supplement 1) 10647-10654

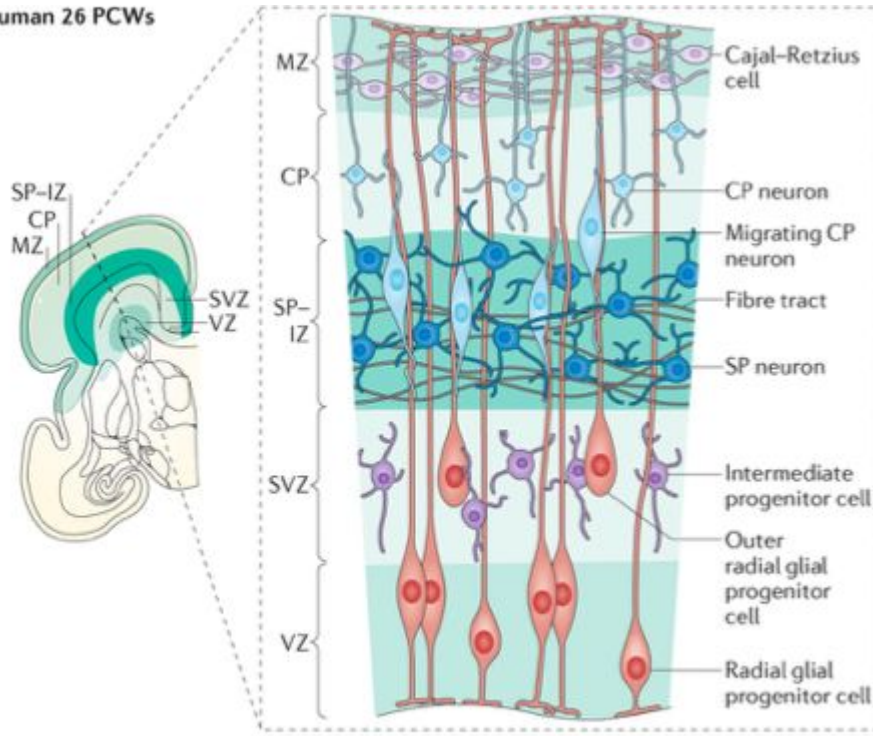
Receptive Fields (Huber & Wiesel, 1959)



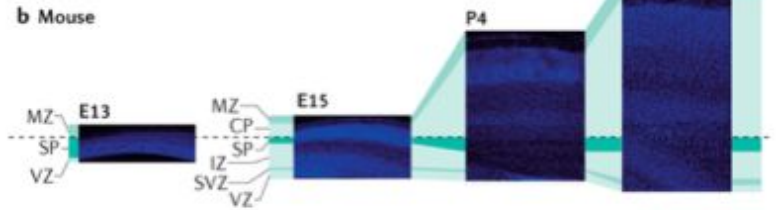
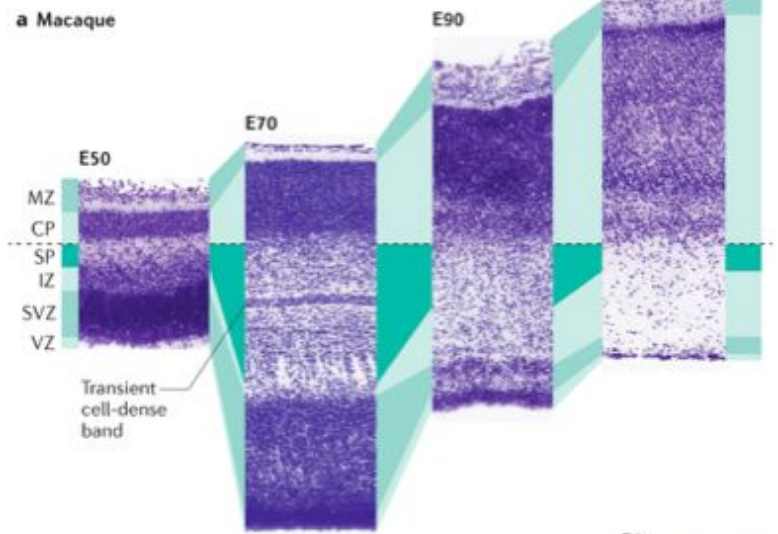
Hill, R. S. and Walsh, C. A. Molecular insights into human
 brain evolution. Nature 437, 64-67 (2005)

THE CORTEX

Human 26 PCWs



Nature Reviews | Neuroscience

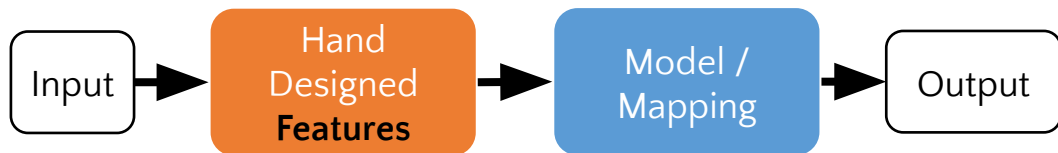


Nature Reviews | Neuroscience

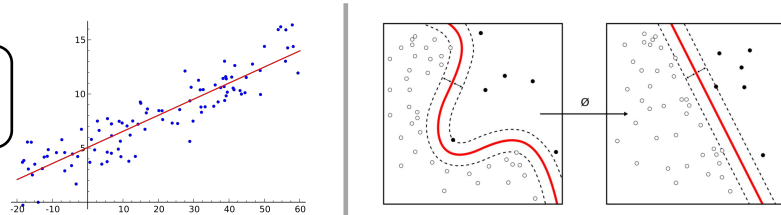
Hoerder-Suabedissen A. and Molnár Z. Development, evolution and pathology of neocortical subplate neurons. Nature Reviews Neuroscience 16, 133–146 (2015)

A CHANGE IN THE WORKFLOW

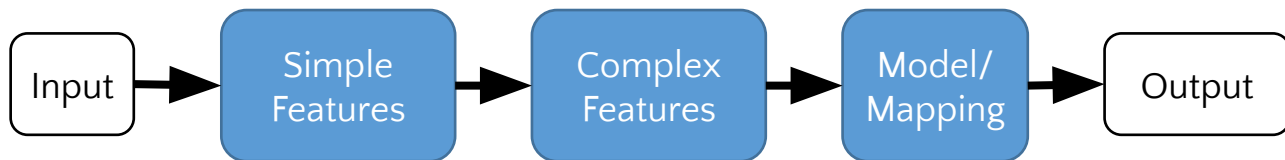
Classic Machine Learning [1990 : now]



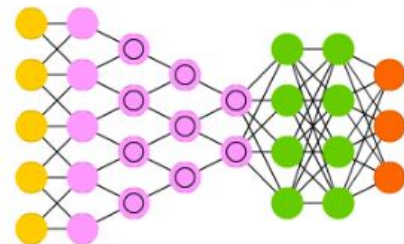
Examples [Regression and SVMs]



Deep/End-to-End Learning [2012 : now]



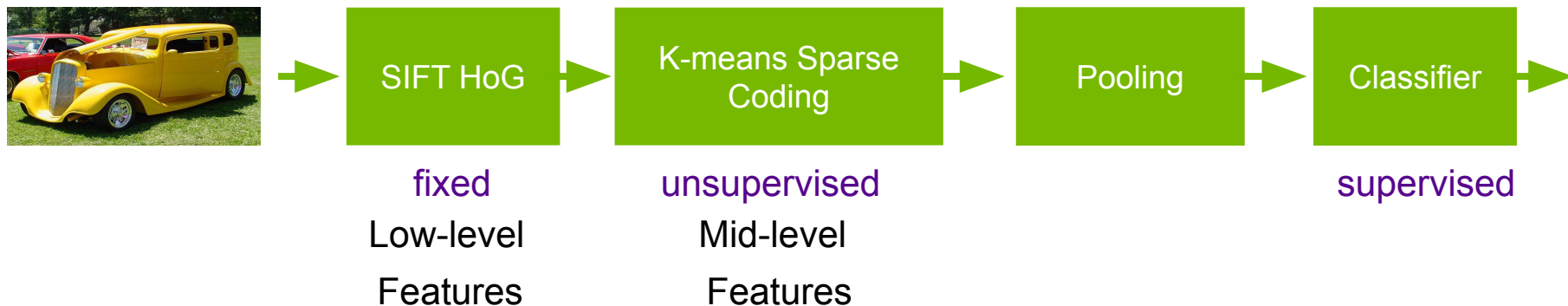
Example [Conv Net]



ARCHITECTURE OF “MAINSTREAM” PATTERN RECOGNITION SYSTEMS

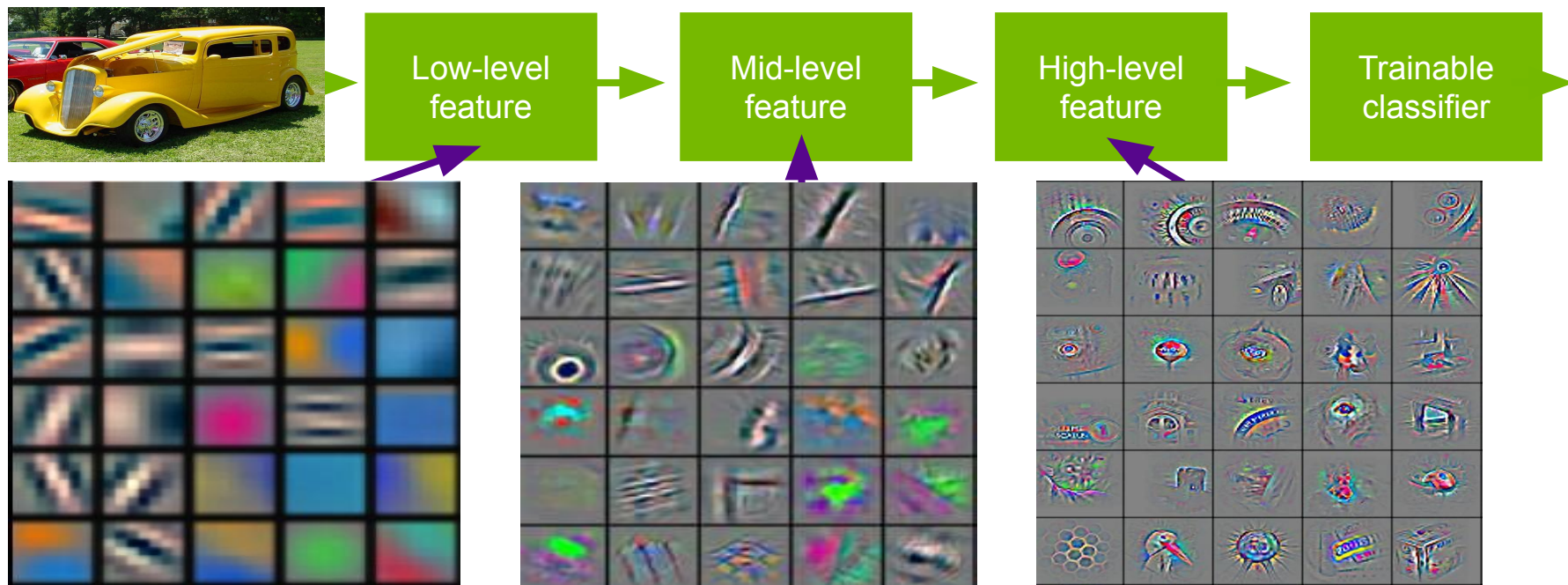
– Modern architecture for pattern recognition

– Speech recognition: early 90's – 2011



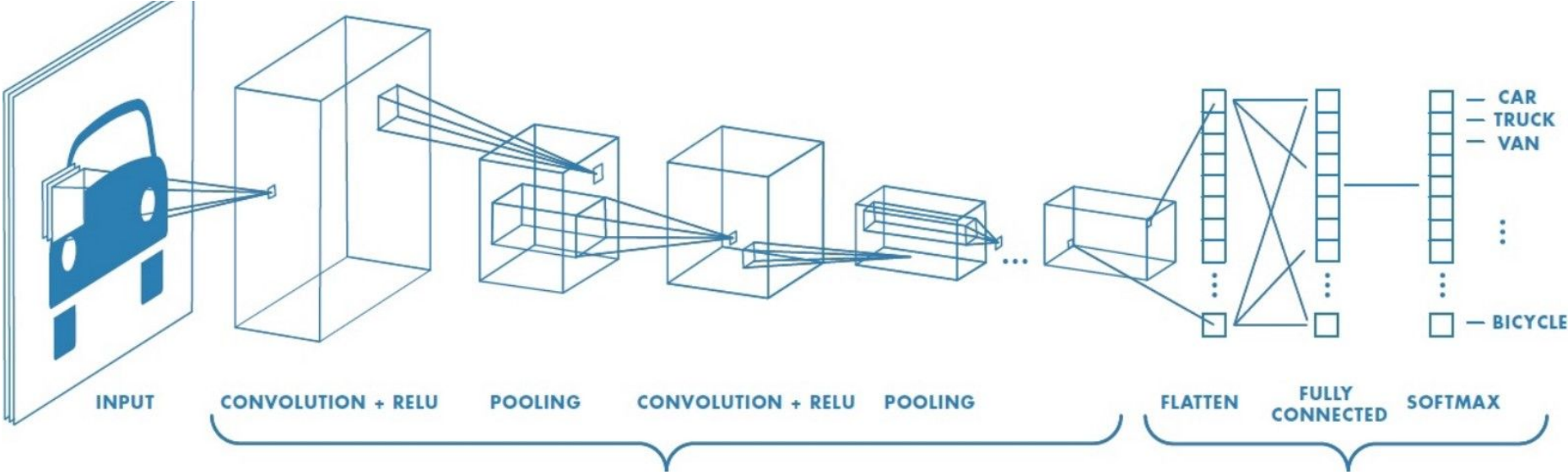
DEEP LEARNING = LEARNING HIERARCHICAL REPRESENTATIONS

It's **deep** if it has **more than one stage** of non-linear feature transformation



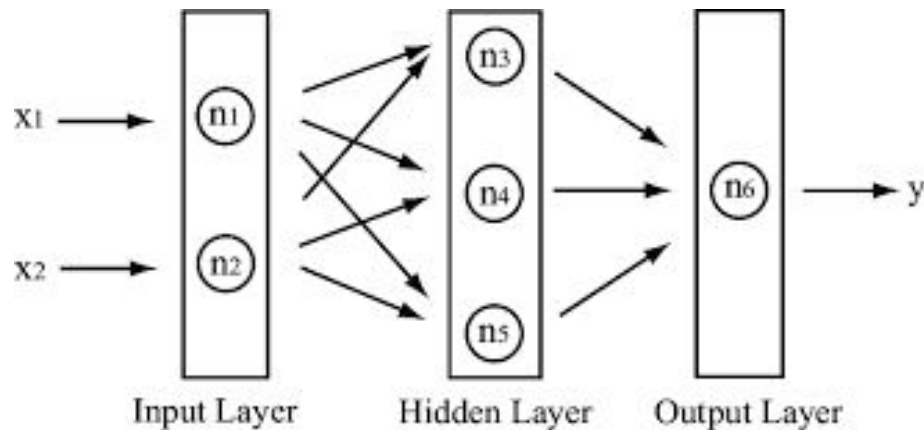
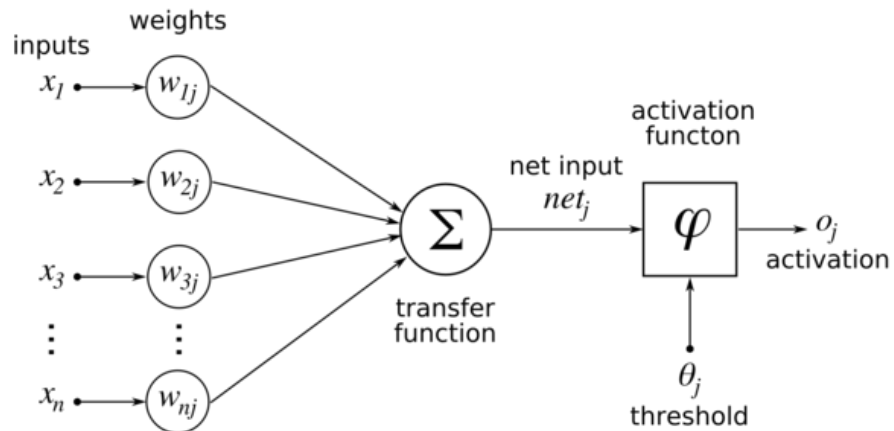
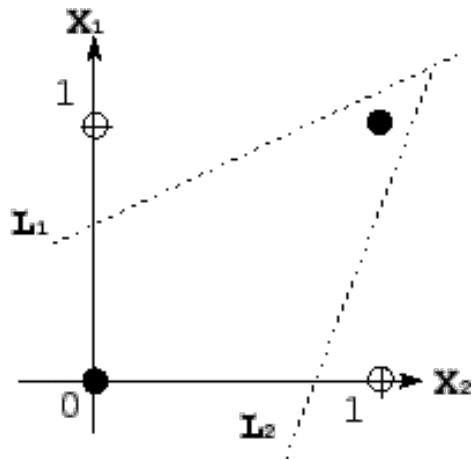
Feature visualization of convolutional net trained on ImageNet from [Zeiler & Fergus 2013]

CONVOLUTIONAL NEURAL NETWORK (CNN)

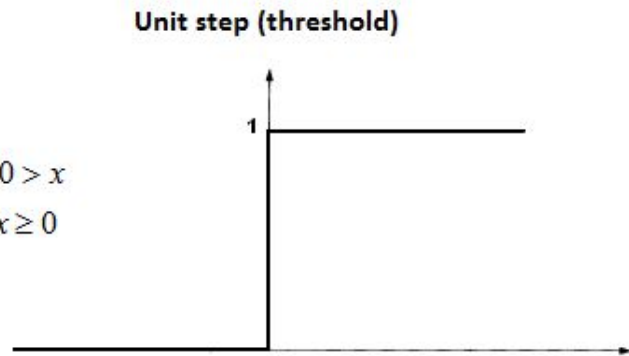


X_1	X_2	Y
0	0	0
0	1	1
1	0	1
1	1	0

$Y = X_1 \oplus X_2$



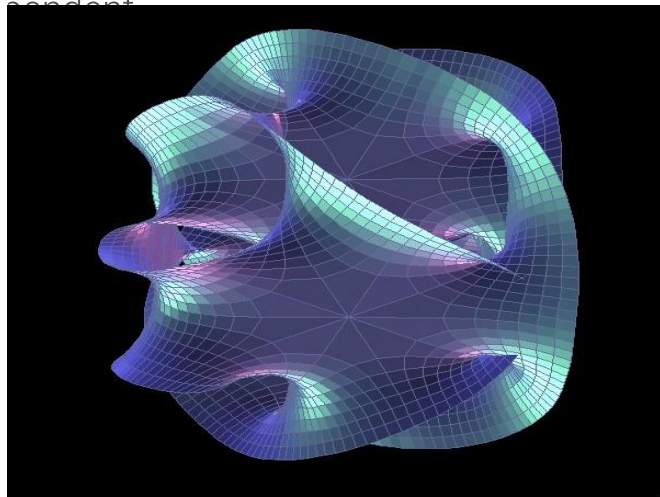
$$f(x) = \begin{cases} 0 & \text{if } 0 > x \\ 1 & \text{if } x \geq 0 \end{cases}$$



The manifold hypothesis

Discovering the hidden structure in high-dimensional data

- Learning representations of data:
 - Discovering & disentangling the independent explanatory factors
- The manifold hypothesis:
 - Natural data lives in a low-dimensional (non-linear) manifold



Discovering the hidden structure in high-dimensional data

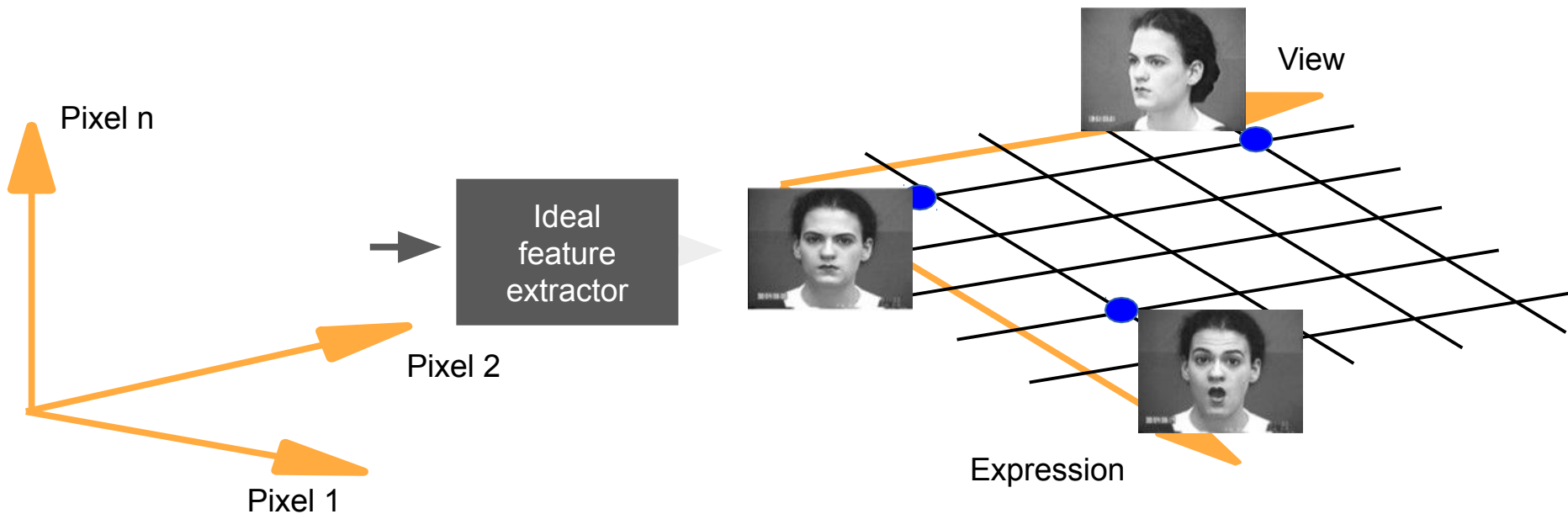
- Example: all face images of a person
 - 1000x1000 pixels = 1,000,000 dimensions
 - But the face has 3 Cartesian coordinates and 3 Euler angles and humans have less than about 50 muscles in the face
 - Hence the manifold of face images for a person has <56 dimensions
- The perfect representations of a face image:
 - Its coordinates on the face manifold
 - Its coordinates away from the manifold
- We do not have good and general methods to learn functions that turns an image into this kind of representation



1.2	Face/not face
-3	Pose
0.2	Lighting
-2...	Expression

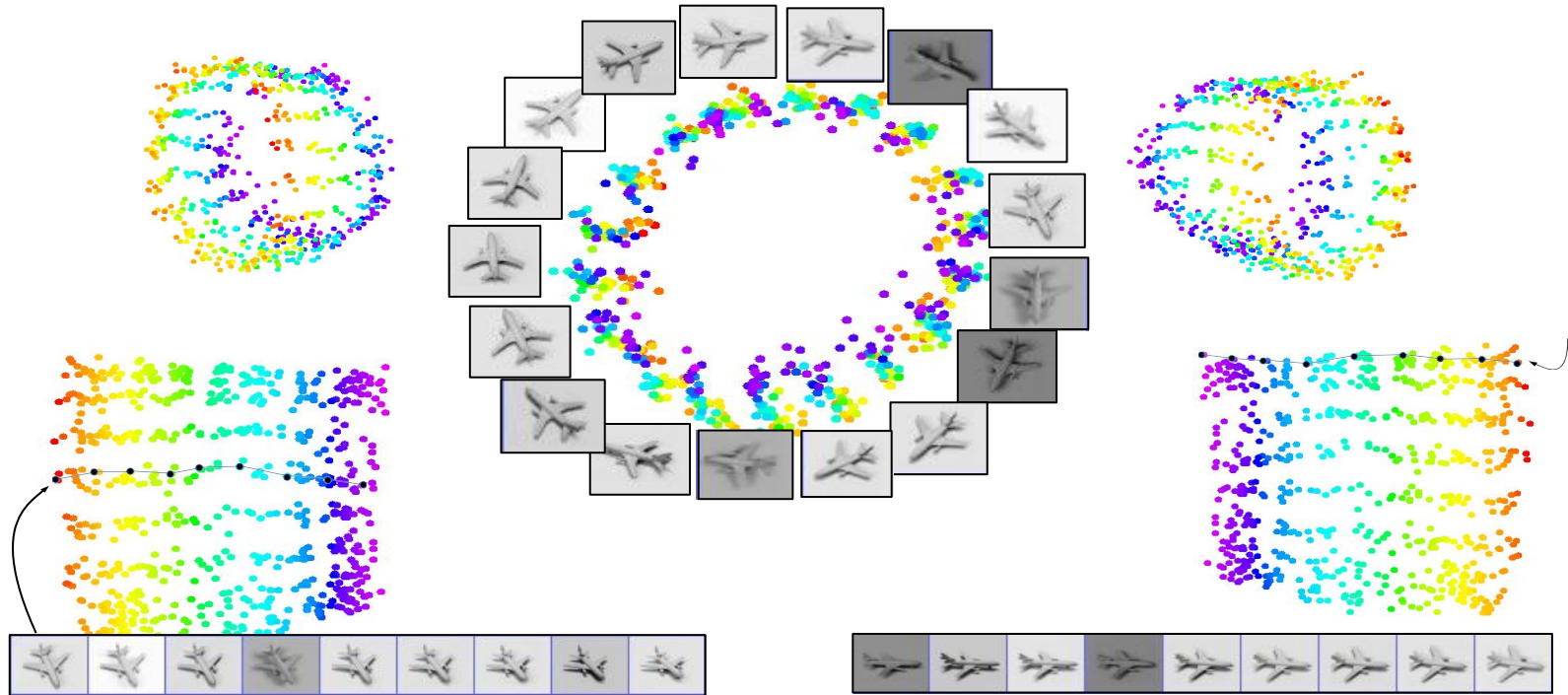
Disentangling factors of variation

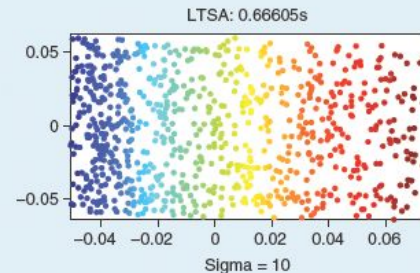
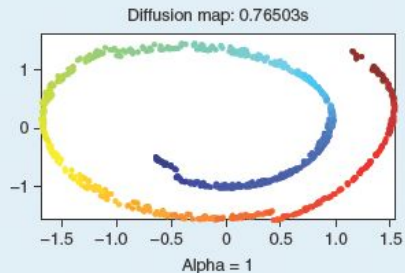
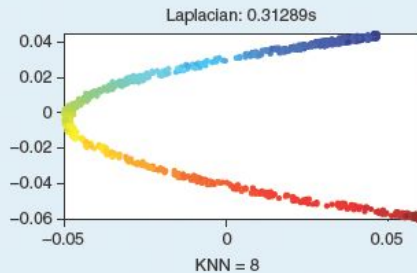
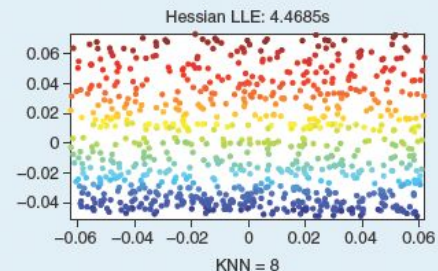
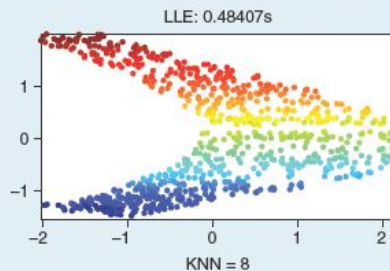
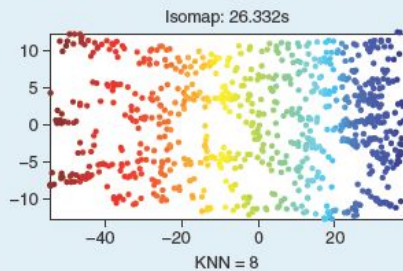
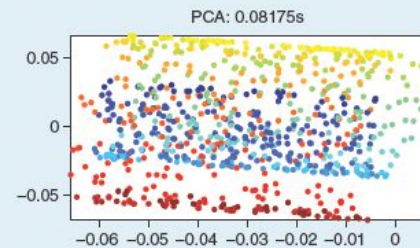
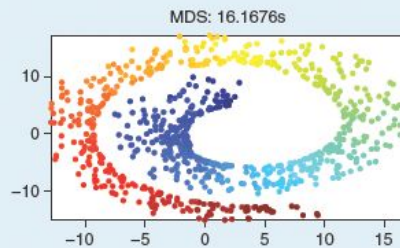
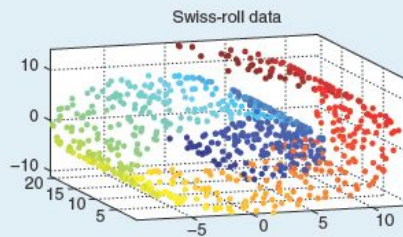
The ideal disentangling feature extractor



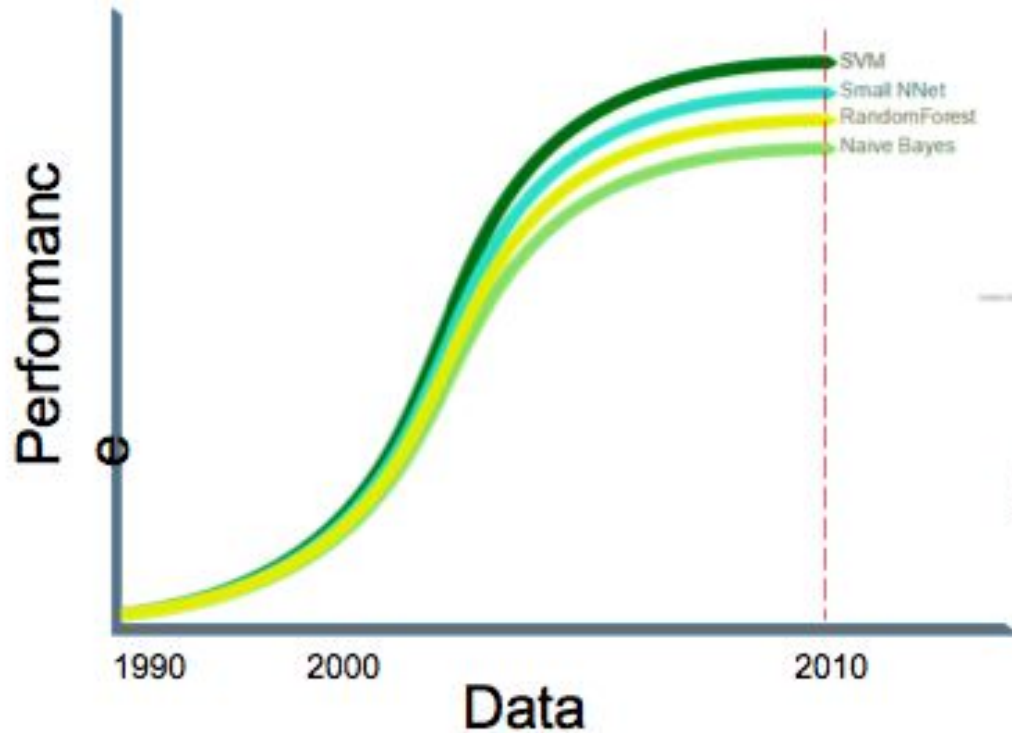
Data manifold & invariance: Some variations must be eliminated

– Azimuth-Elevation manifold. Ignores lighting. [Hadsell et al. CVPR 2006]

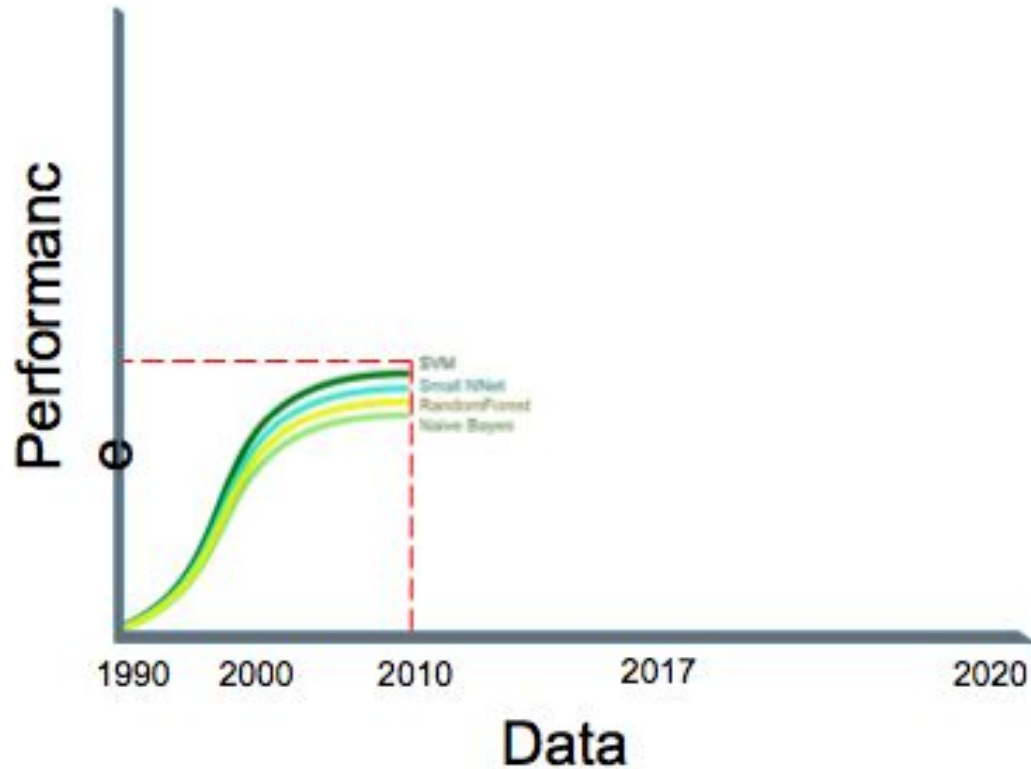




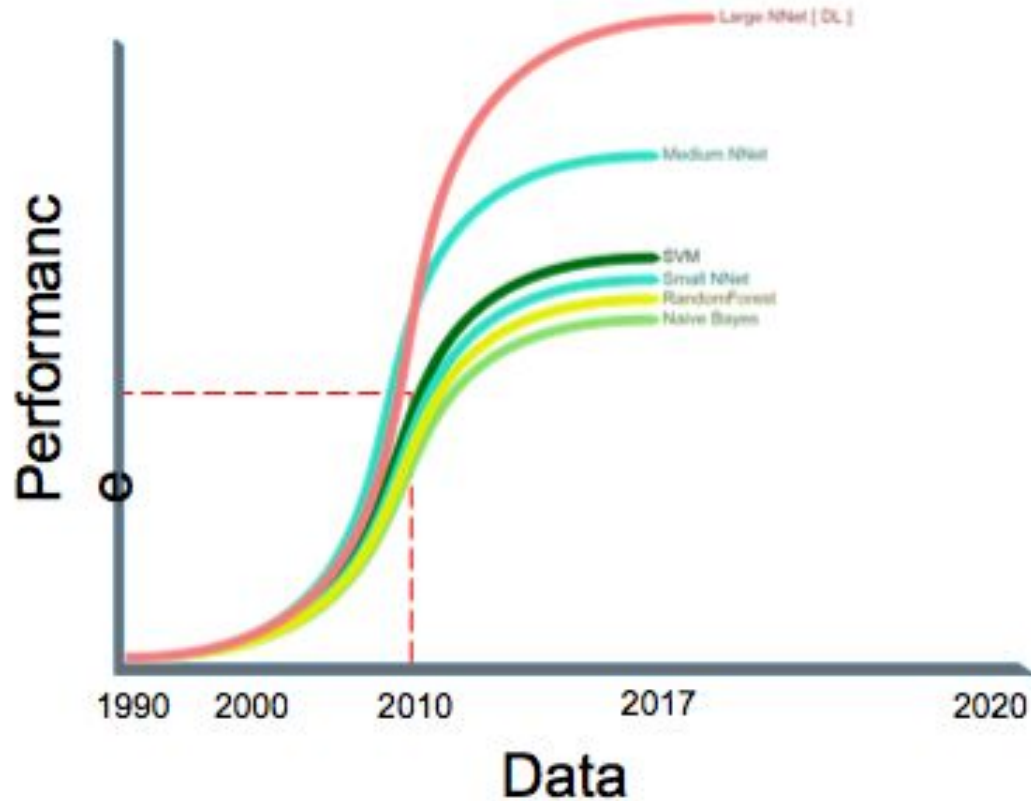
THE EXPONENTIAL GROWTH OF DATA



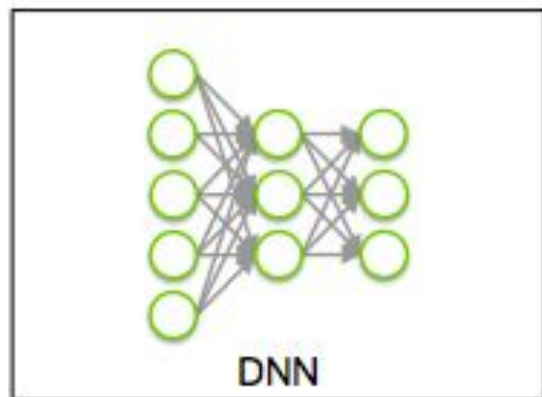
THE EXPONENTIAL GROWTH OF DATA



THE EXPONENTIAL GROWTH OF DATA



THE BIG BANG IN MACHINE LEARNING



WIRED

LARGE SCALE SUCCESS APPLICATION

- COMPUTER VISION
- NATURAL LANGUAGE PROCESSING
- GAMES
- REALISTIC REPRODUCTION

OPPORTUNITIES FOR ENERGY EFFICIENCY

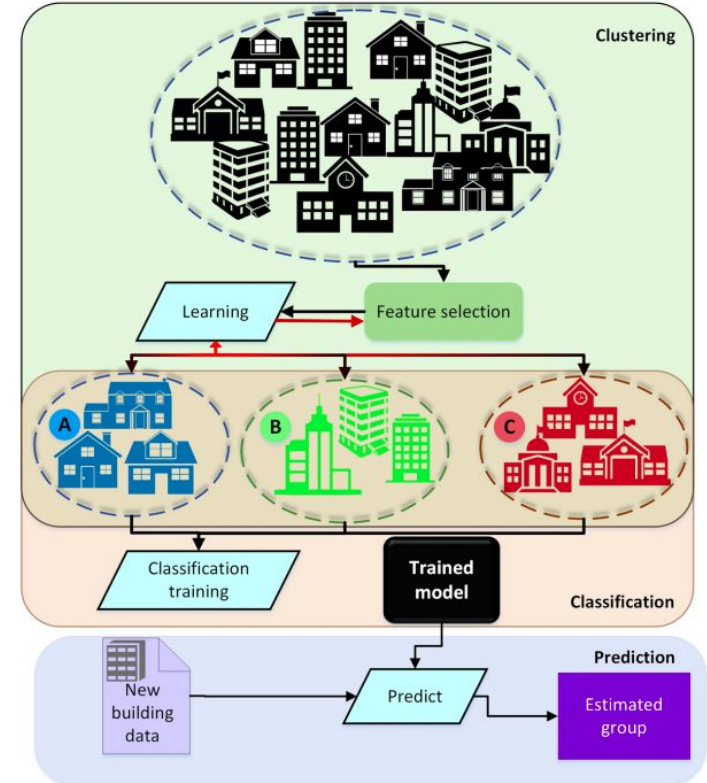
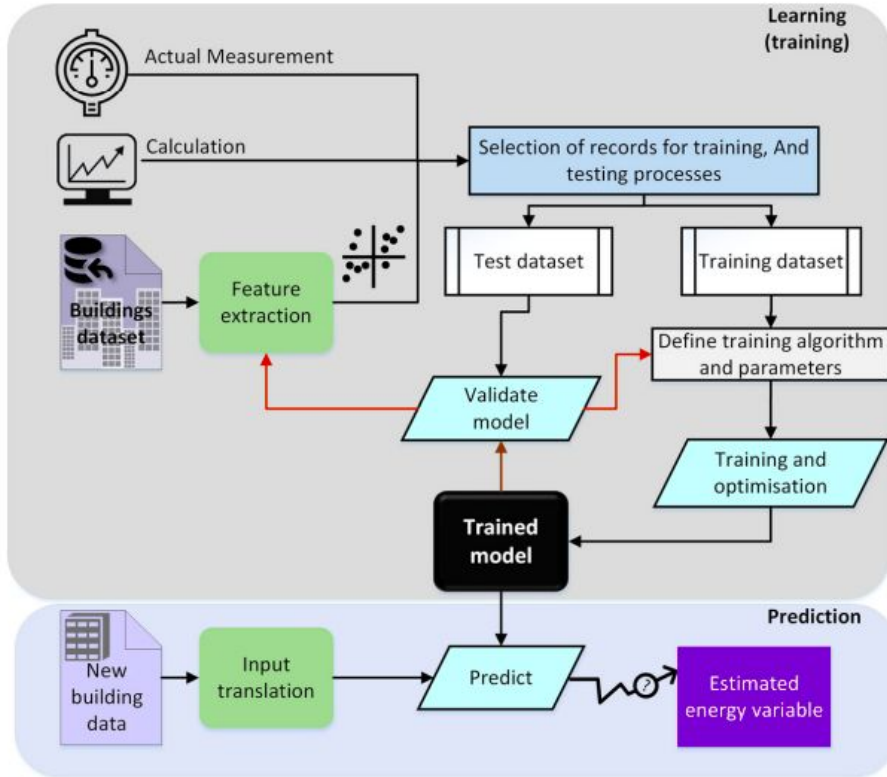
AI can help to:

1. Efficiently monitor and analyse the energy consumption and conditions of a building
2. This identifies where improvements can be made for energy and costs savings
3. AI solutions can also optimise the indoor comfort and conditions

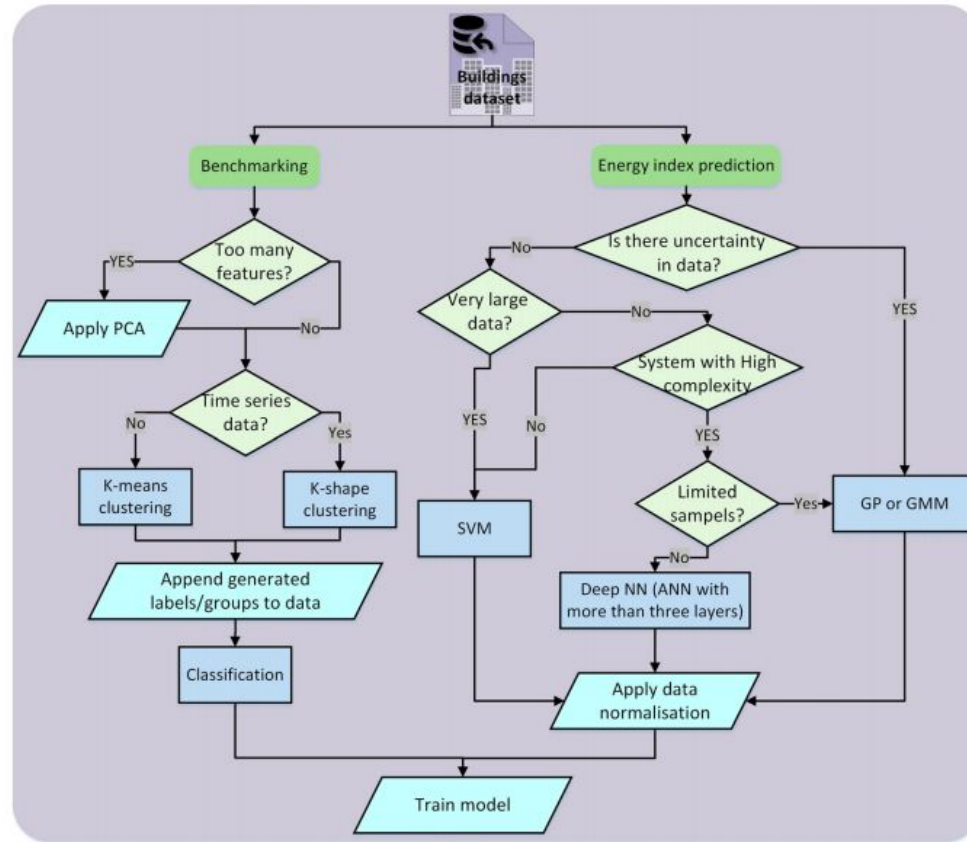
Areas of application:

- Building Diagnostics
 - Understanding the energy profile of buildings
- Building Design
 - Assisting the designer in making choices
- Building Supply
 - Optimization of the energy provisioning,
- Building Automation
 - Control of electrical, heating and other systems

MODELS IN PRACTICE



APPLICATION



CHALLENGES

A MODERN ENTERPRISE HAS TO CONSIDER

- SKILLS
- STRATEGY
- ENVIRONMENT

SKILLS

AN AI SCIENTIST IS PROFICIENT IN:

- Data Science (***)
- Coding (**)
- IT Architecture (*)
- Domain (***)
- HPC (**)

AI ADOPTION IN DIFFERENT COUNTRIES BY INDUSTRY

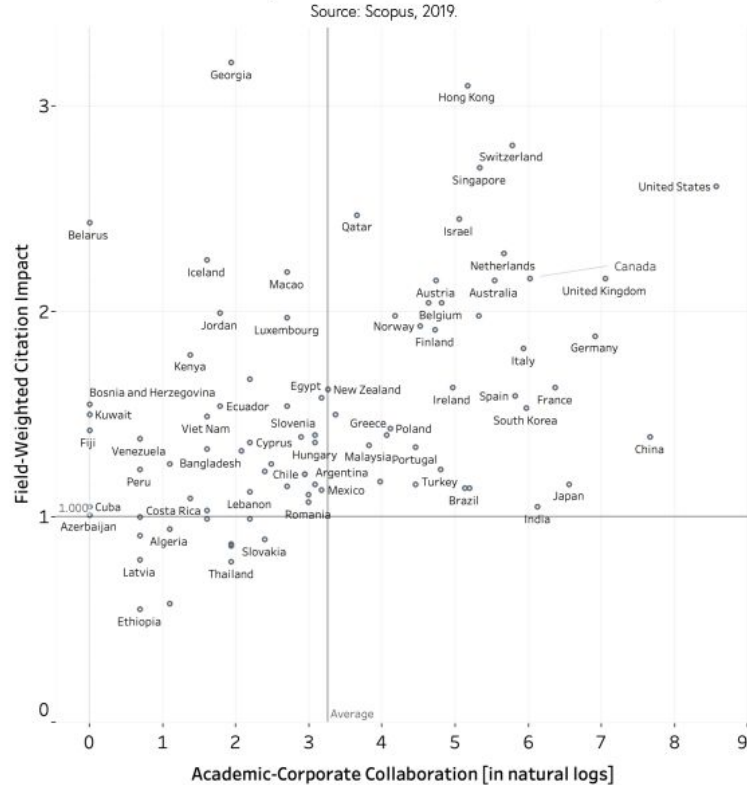
EXHIBIT 2 | Across countries, technology companies are leaders in leveraging AI
Share of active players in AI by country/industry cluster



Note: Values denote the percentage share of active players in each country and/or industry. Colors highlight their relative positioning. "n.a." denotes clusters with insufficient survey statistics.³

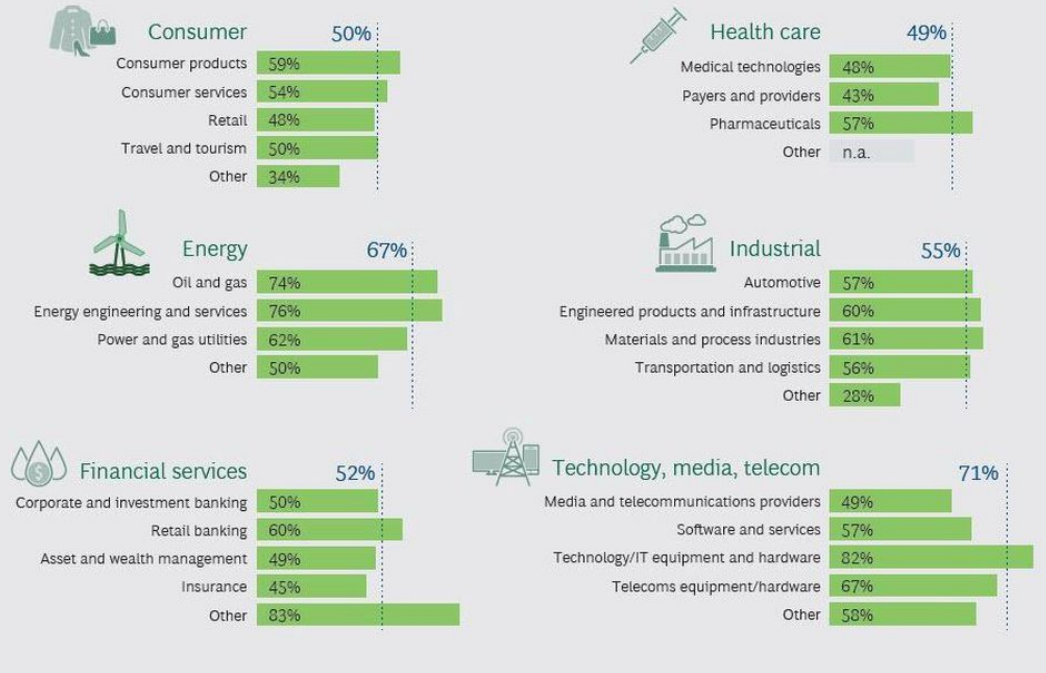
ENVIRONMENT

Four Quadrants for Overall AI Citation Impact (vertical axis) and the Total number of Academic-Corporate AI Papers (horizontal axis) Source: Scopus, 2019.



AI ADOPTION BY INDUSTRY

EXHIBIT 3 | Leadership on AI adoption is scattered within industries
Share of active players by industry



Let's be inspired by nature, but not too much

- It's nice imitate Nature,
- But we also need to **understand**
 - How do we know which details are important?
 - Which details are merely the result of evolution, and the constraints of biochemistry?
- For airplanes, we developed aerodynamics and compressible fluid dynamics.
 - We figured that feathers and wing flapping weren't crucial
- **QUESTION: What is the equivalent of aerodynamics for understanding intelligence?**



L'Avion III de Clément Ader, 1897

(Musée du CNAM, Paris)

His Eole took off from the ground in 1890, 13 years before the Wright Brothers, but you probably never heard of it.

SCHOOLS OF THOUGHTS

Daniel Newman (Futurum) identifies 5 schools of thoughts concerning AI attitude:

- Utopian Thought
- Dystopian Thought
- Tech-Optimistic Thought
- The Realist Thought
- Lack of Productivity Thought

WHAT I WOULD LIKE BY AI SYSTEMS

- ACCOUNTABILITY
- TRANSPARENCY
- TESTABILITY
- RELIABILITY
- SAFETY



"Assuming the computer industry can keep producing better hardware, I think 'business as usual' is going to take us a long way. Obviously, if we get big conceptual breakthroughs, it'll take us further. I think one of the big breakthroughs that's going to come is we're going to understand the brain."

Geoffrey Hinton (2016)



Luigi Troiano

(Asst.) Professor of Data Science, Big Data and AI at...

University of Sannio
Università degli Studi del Sannio-
Benevento

[View profile](#)

LinkedIn

THANK YOU

<https://www.linkedin.com/in/luigitroiano/>

