



Lecture 08

# Deep Neural Nets

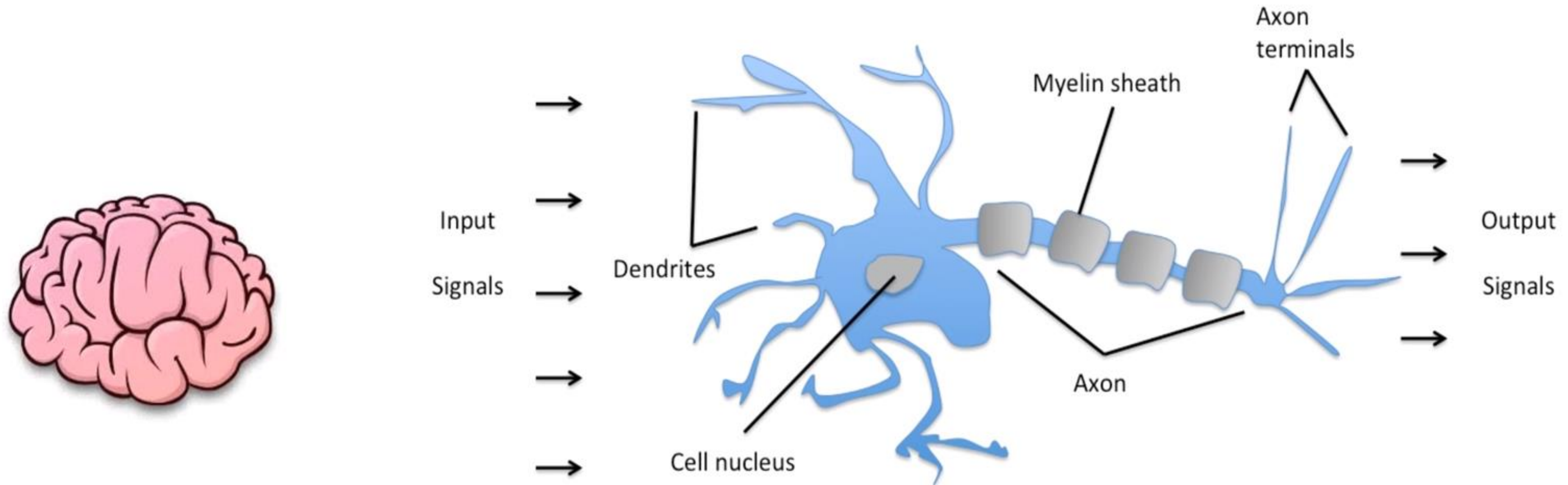
# Ultimate dream: thinking machine

- The ultimate dream of mankind is a thinking machine!



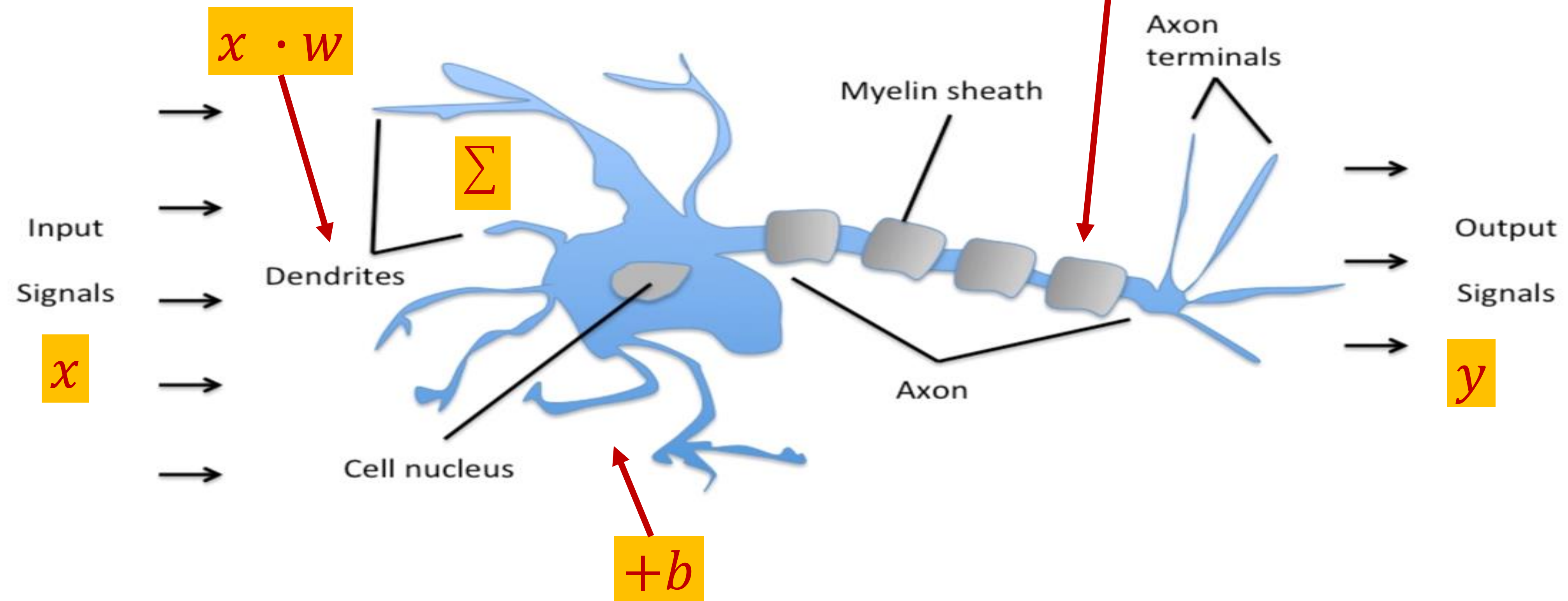
# Ultimate dream: thinking machine

## Schematic of a biological neuron

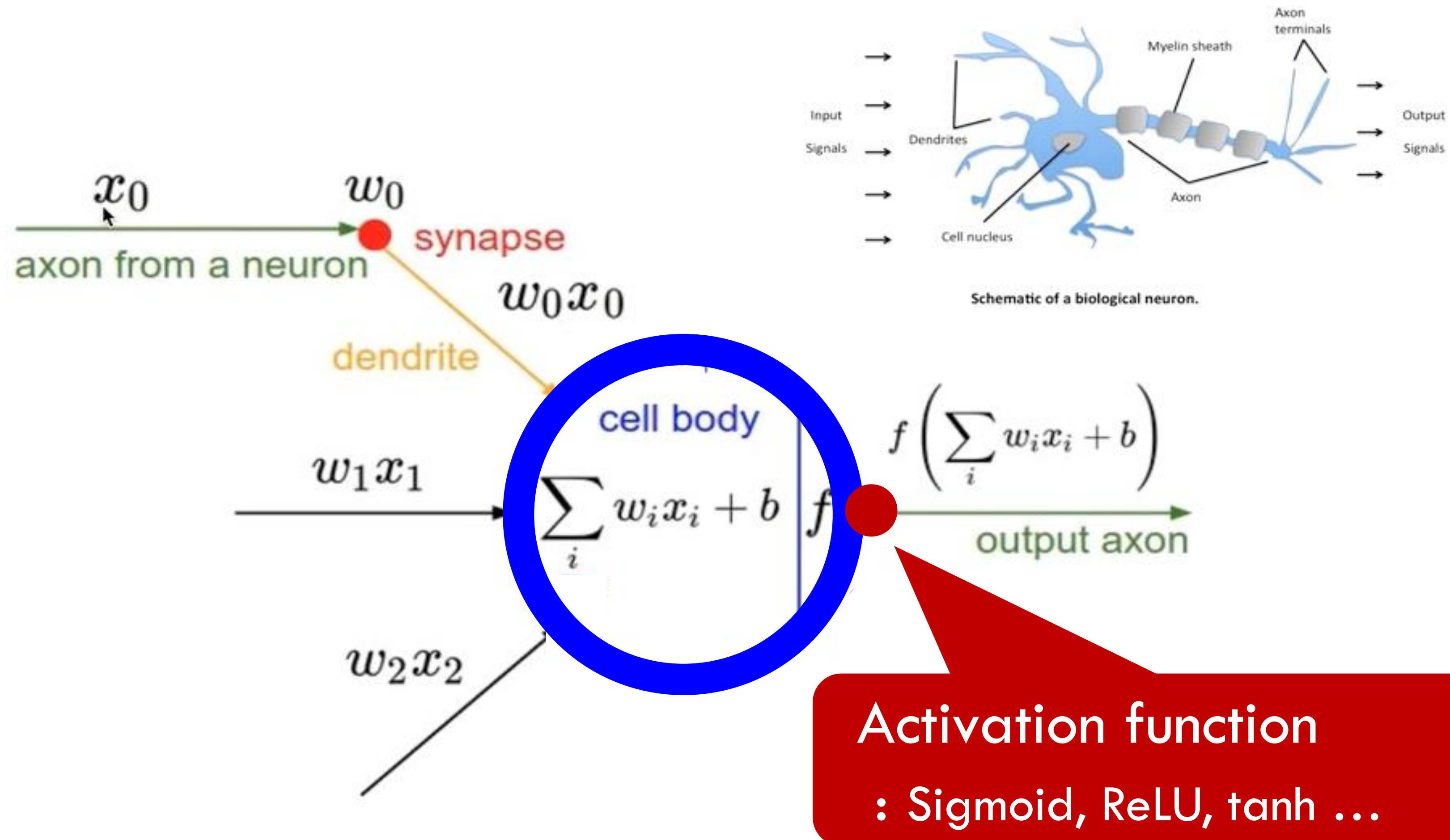


# Ultimate dream: thinking machine

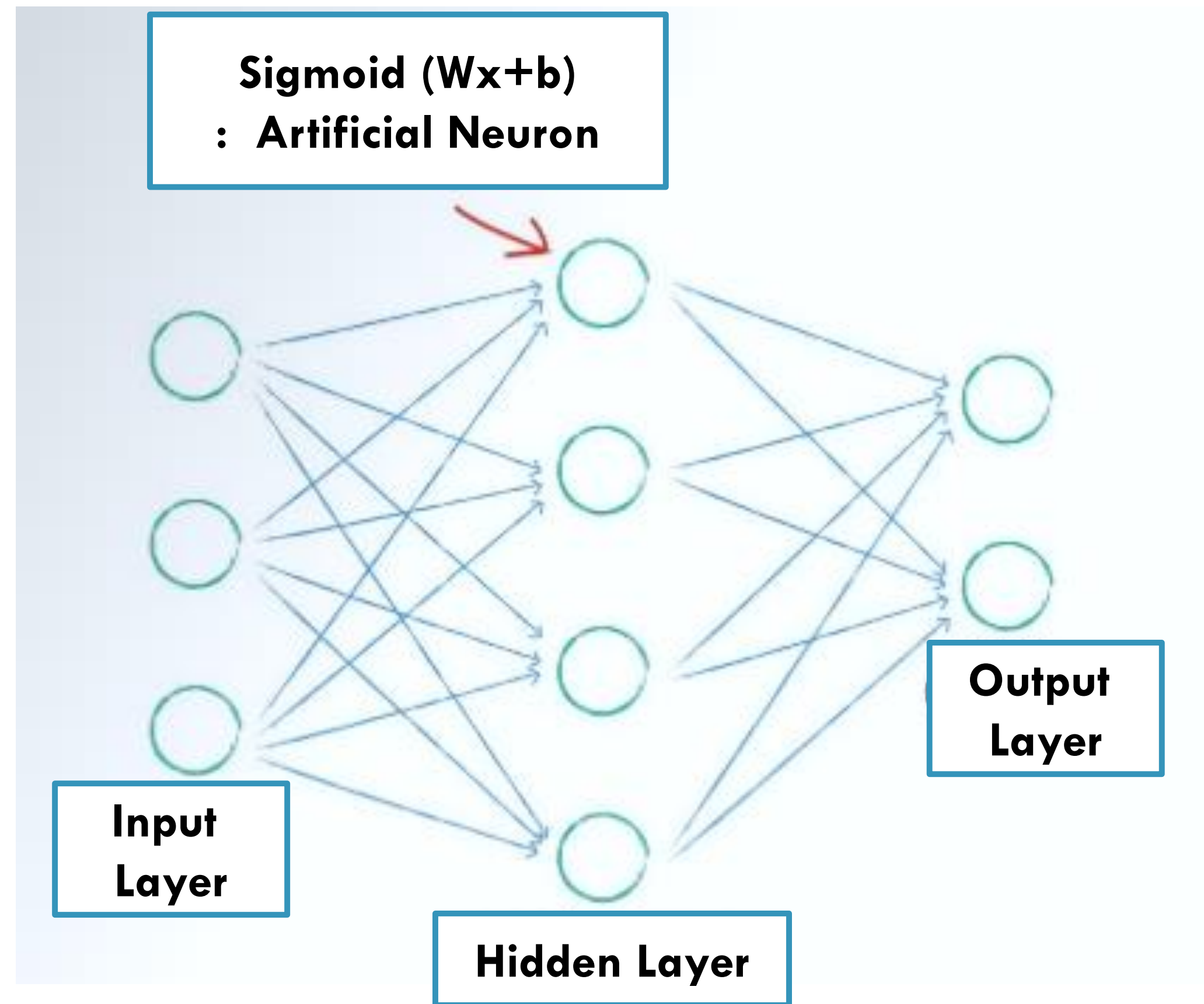
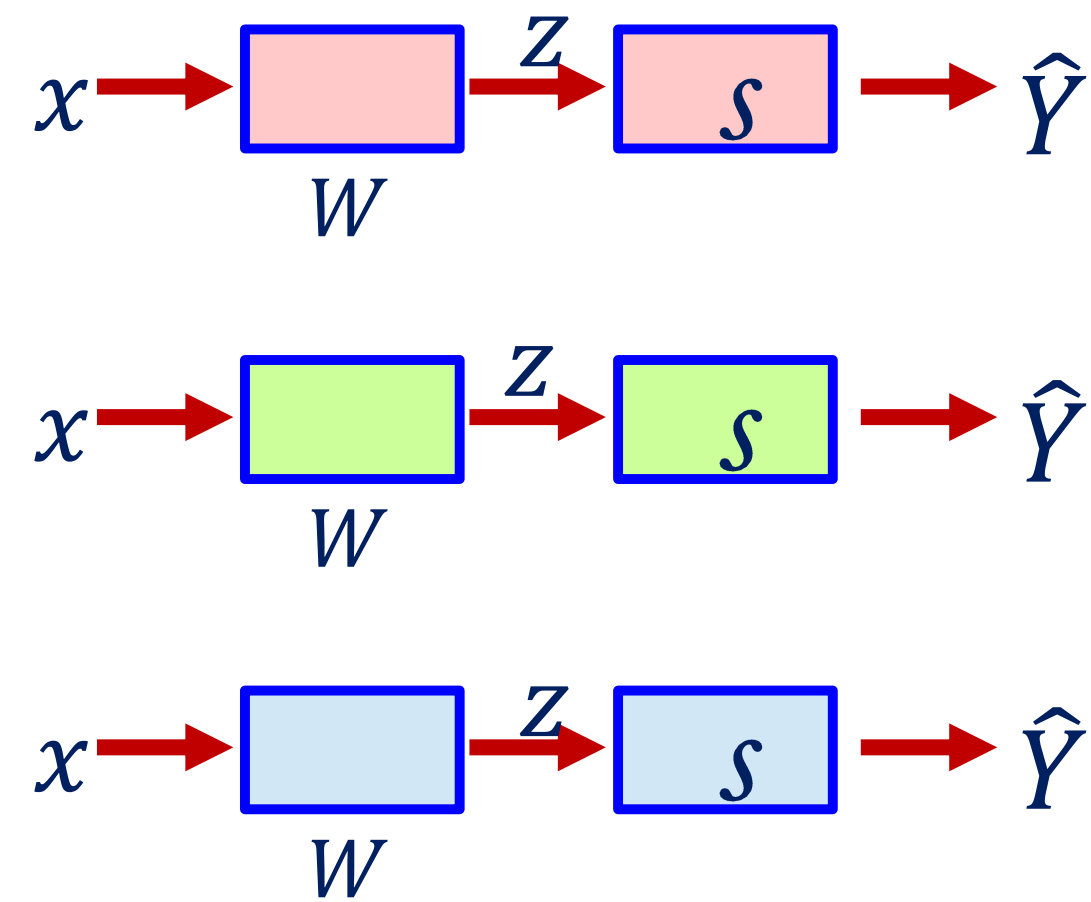
Schematic of a biological neuron



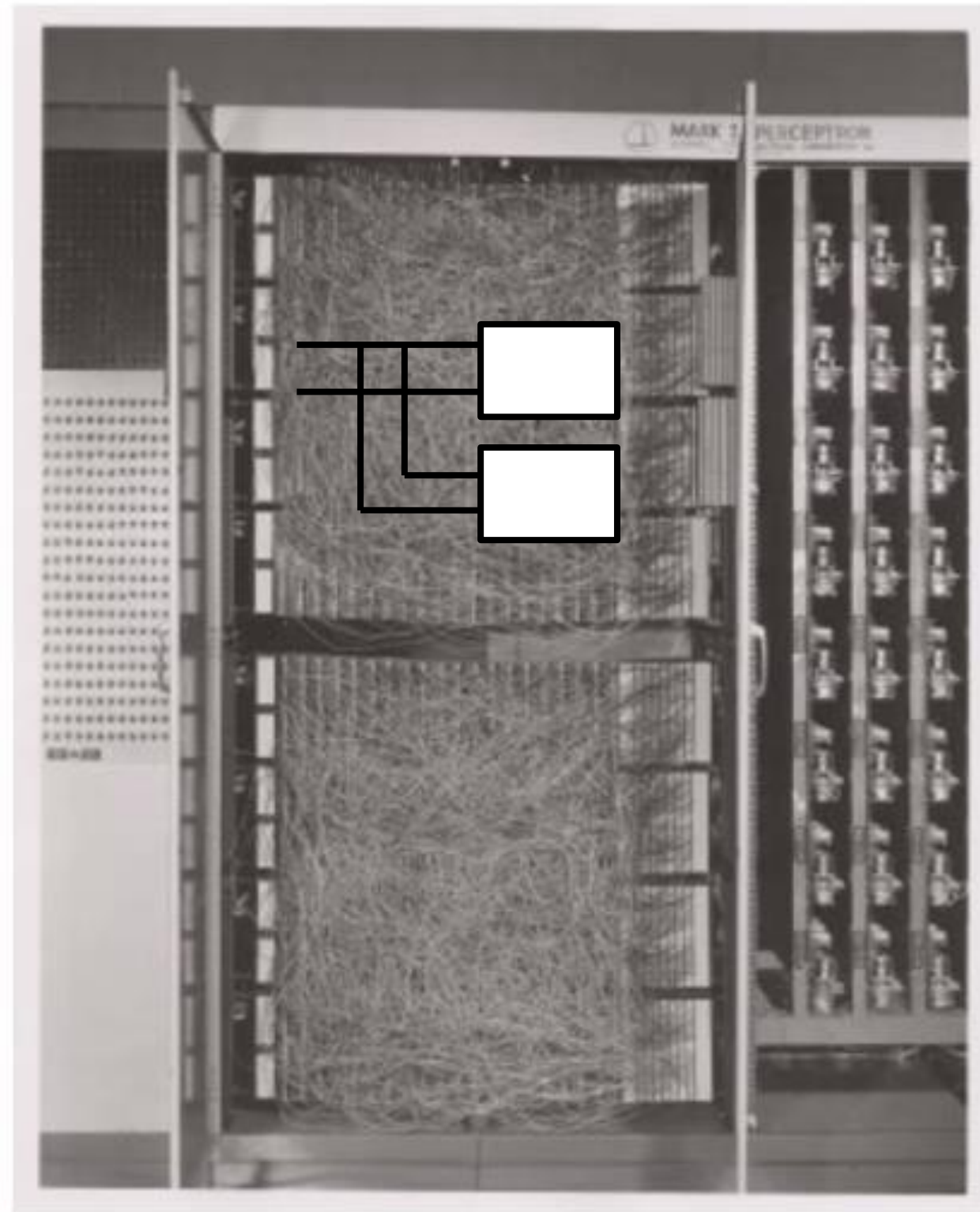
# Activation Functions



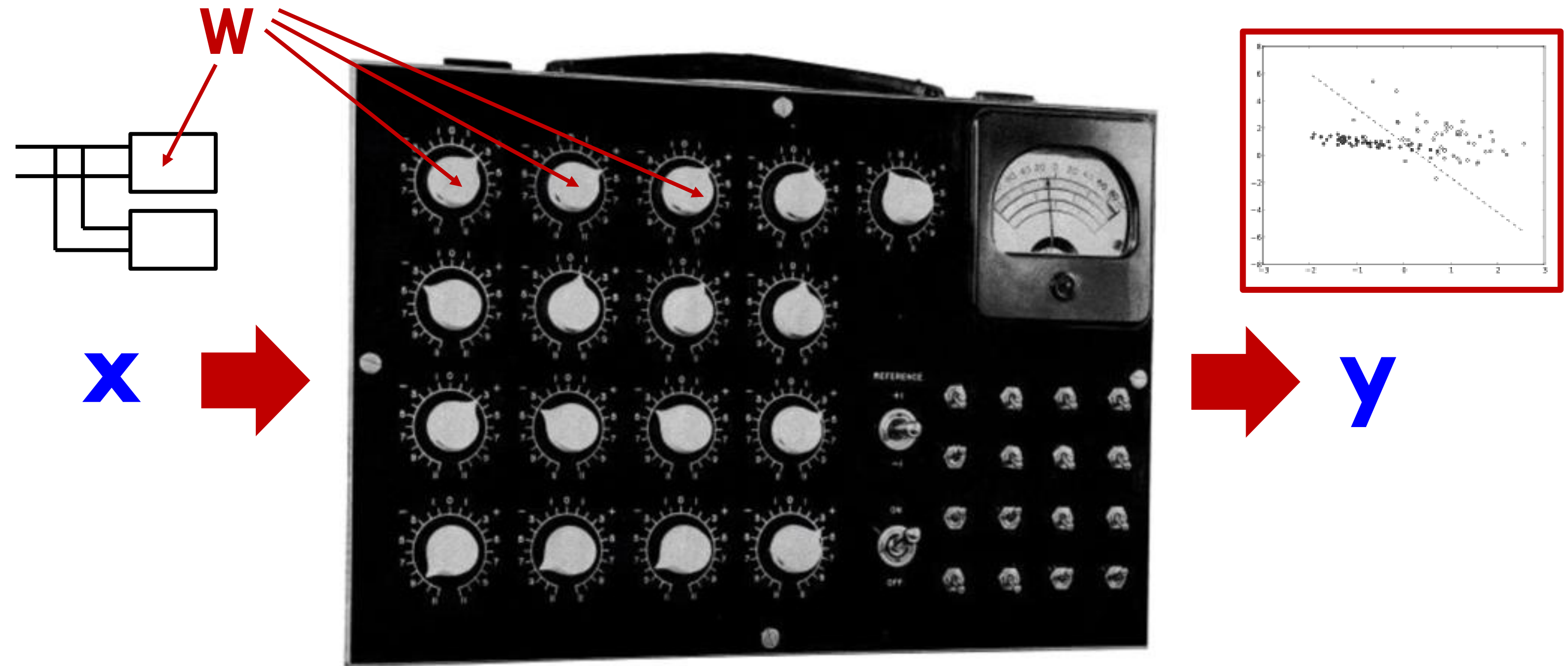
# Logistic regression units



# Hardware implementations



Frank Rosenblatt, ~1957: Perceptron



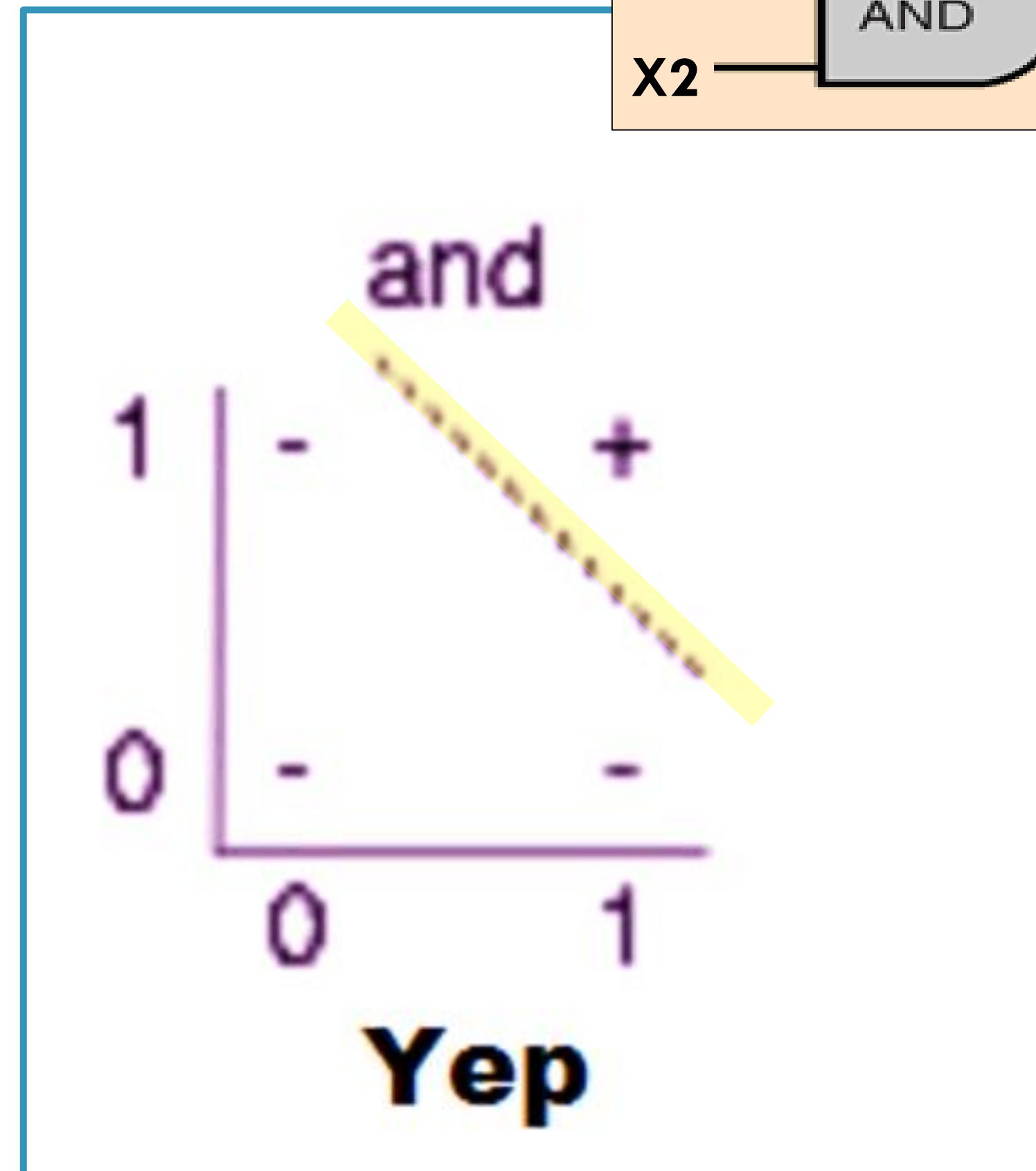
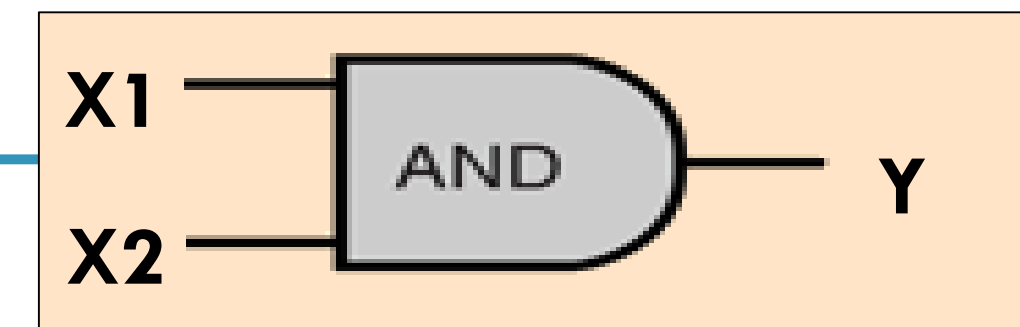
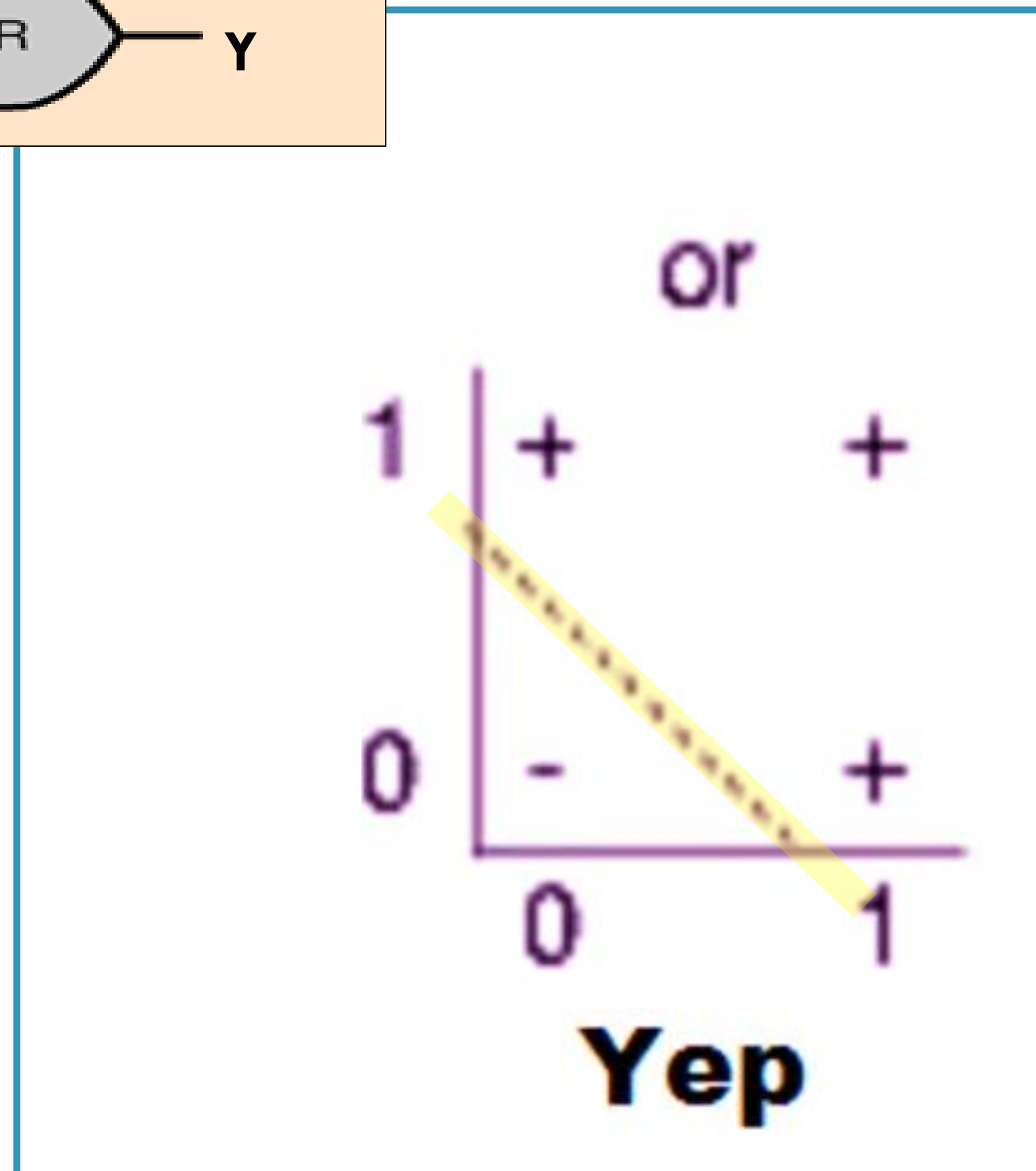
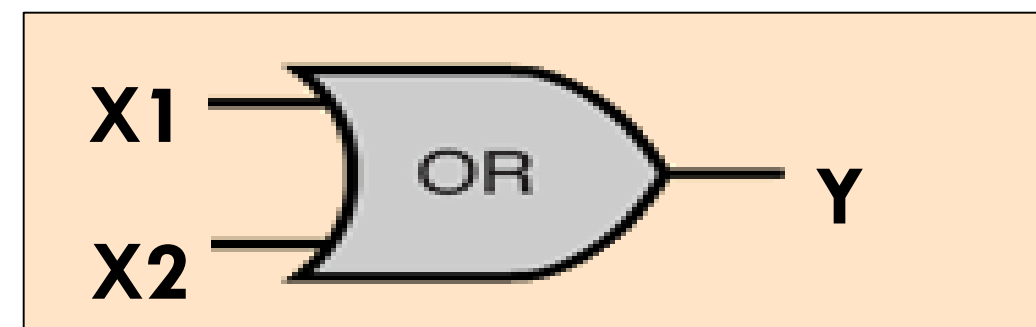
Widrow and Hoff, ~1960: Adaline/Madaline

# False Promises

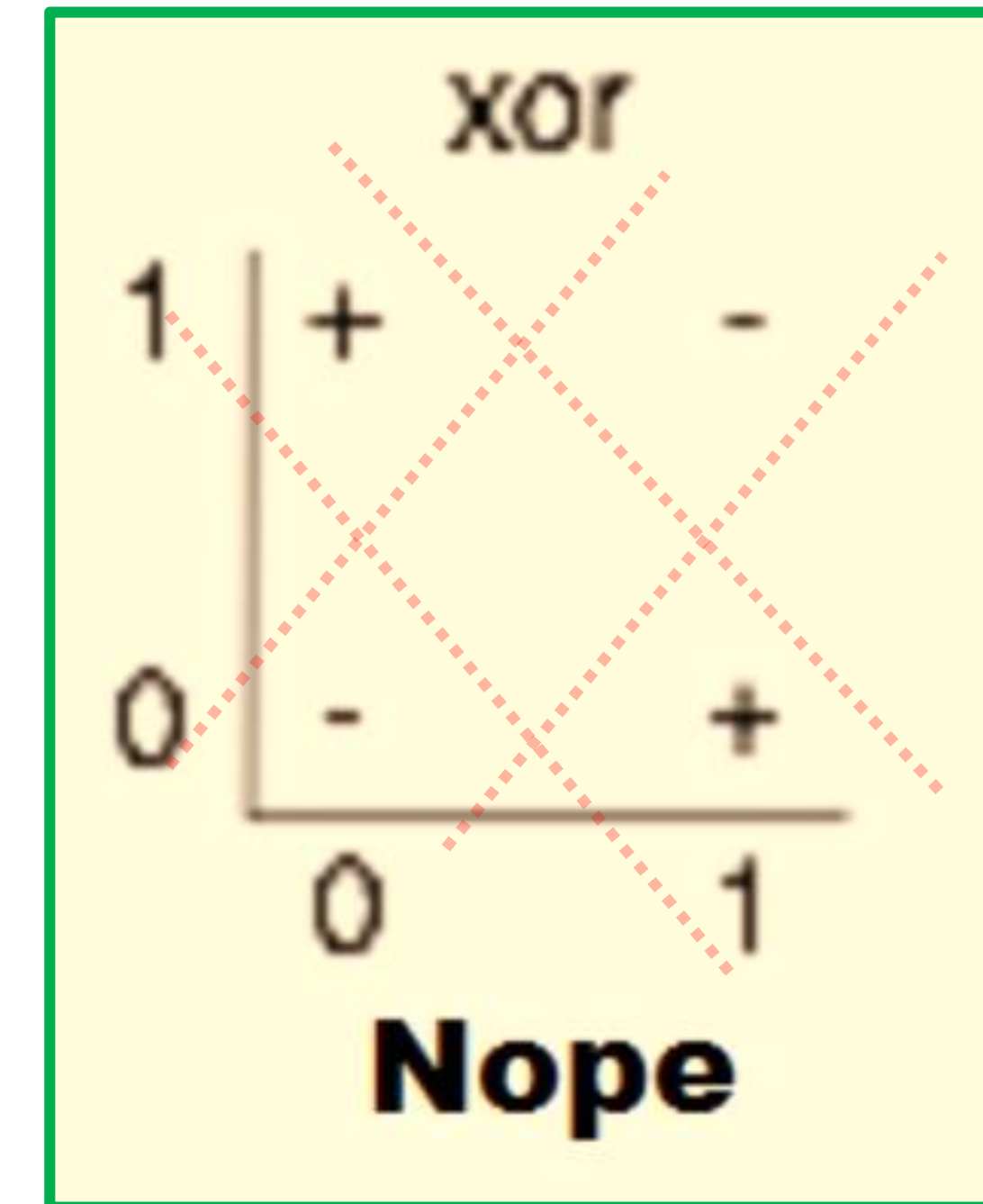
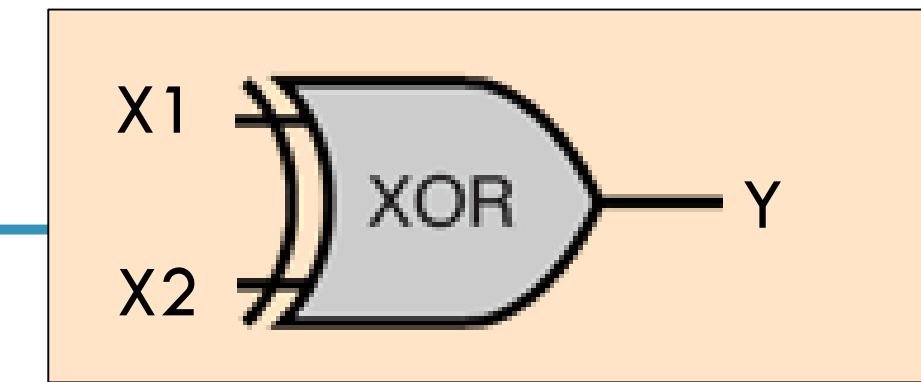
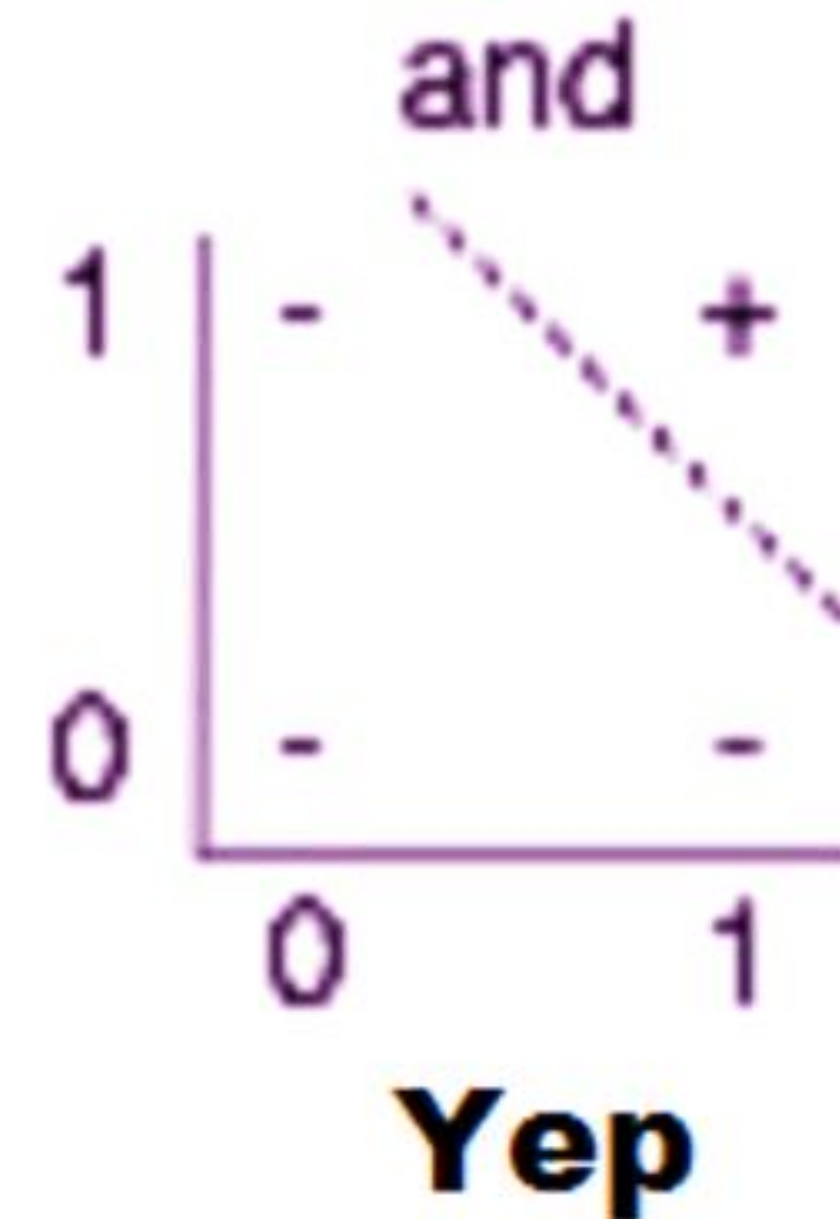
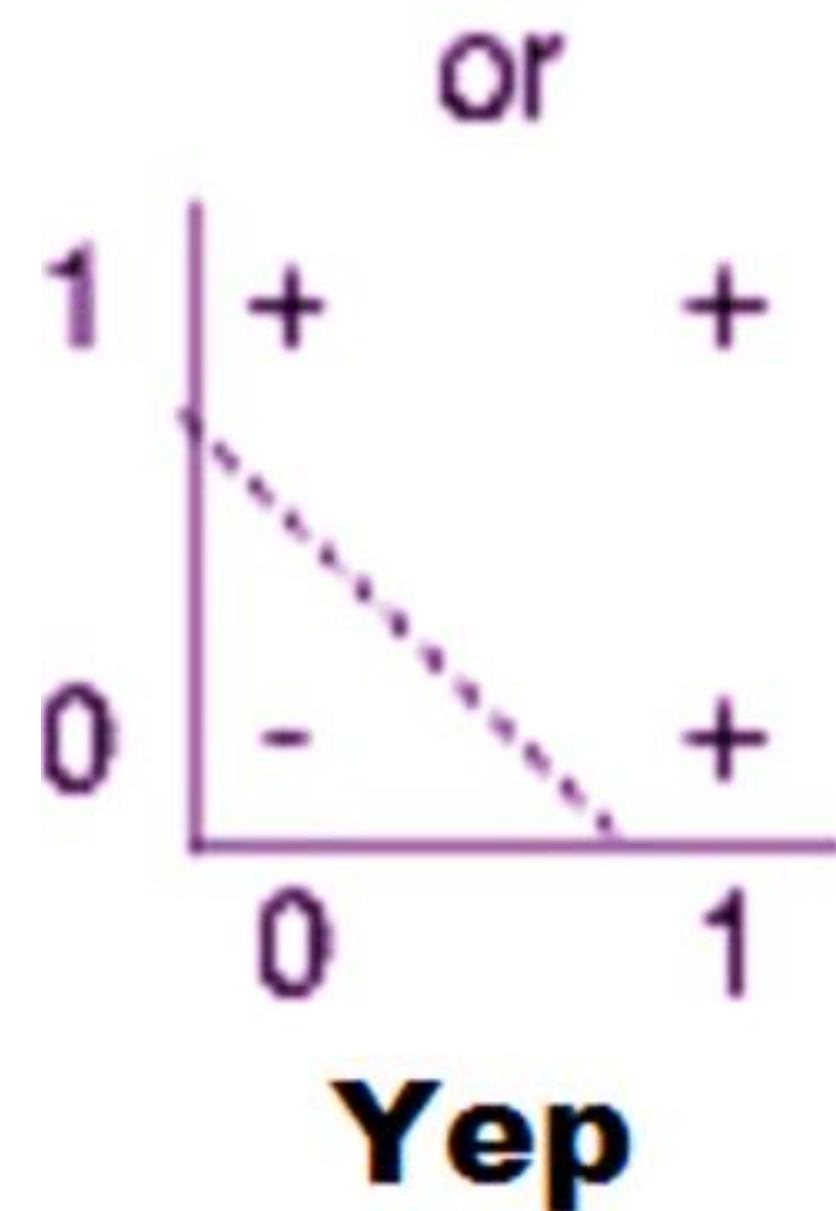
- “The Navy revealed the embryo of an electronic computer today that it expects will be able to walk, talk, see, write, reproduce itself and be conscious of its existence ... **Dr. Frank Rosenblatt**, a research psychologist at the Cornell Aeronautical Laboratory, Buffalo, said Perceptrons might be fired to the planets as mechanical space explorers”

*New York Times July 08, 1958*

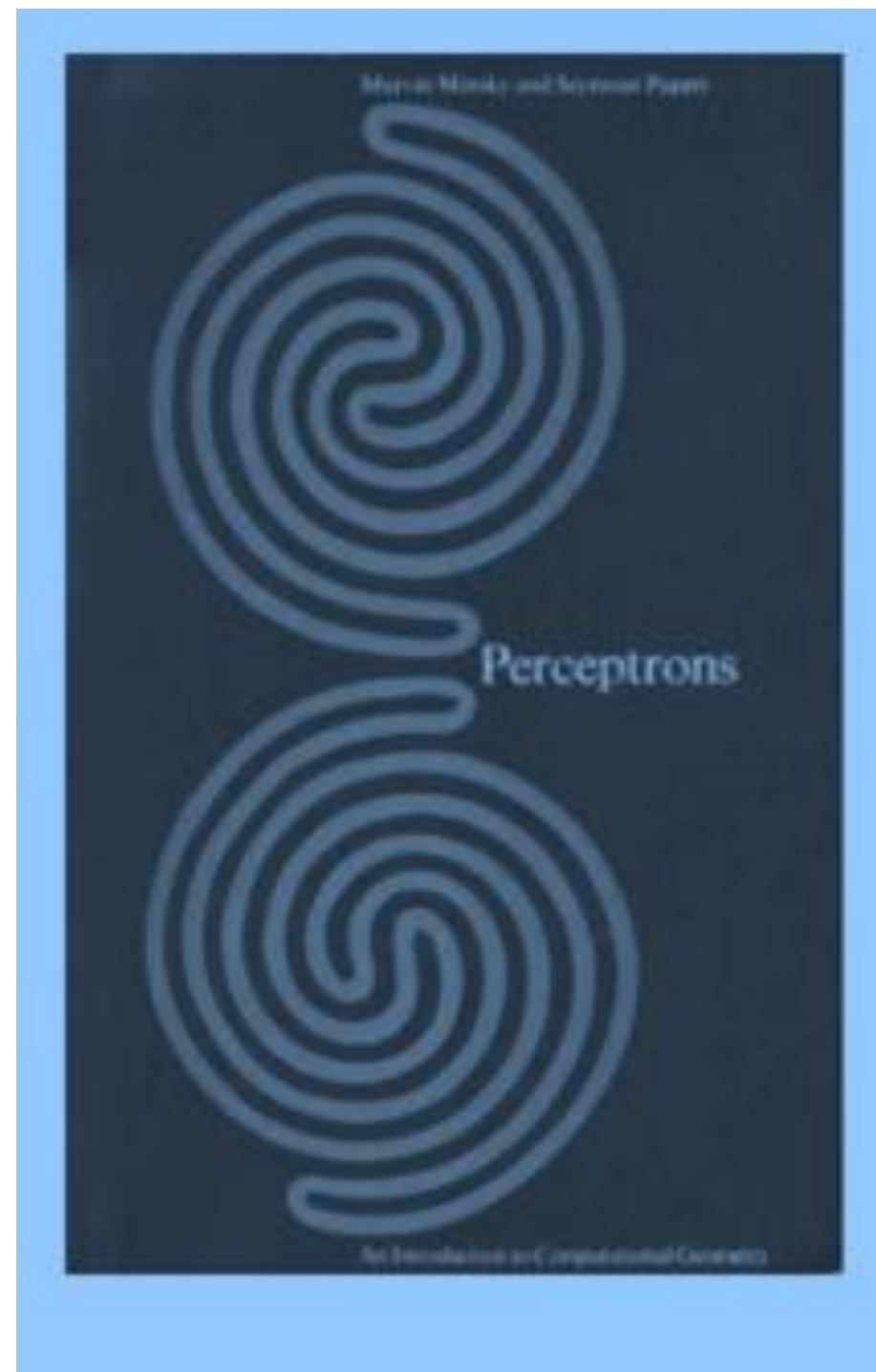
# (Simple) AND/OR problem: linearly separable?



# (Simple) XOR problem: linearly separable?

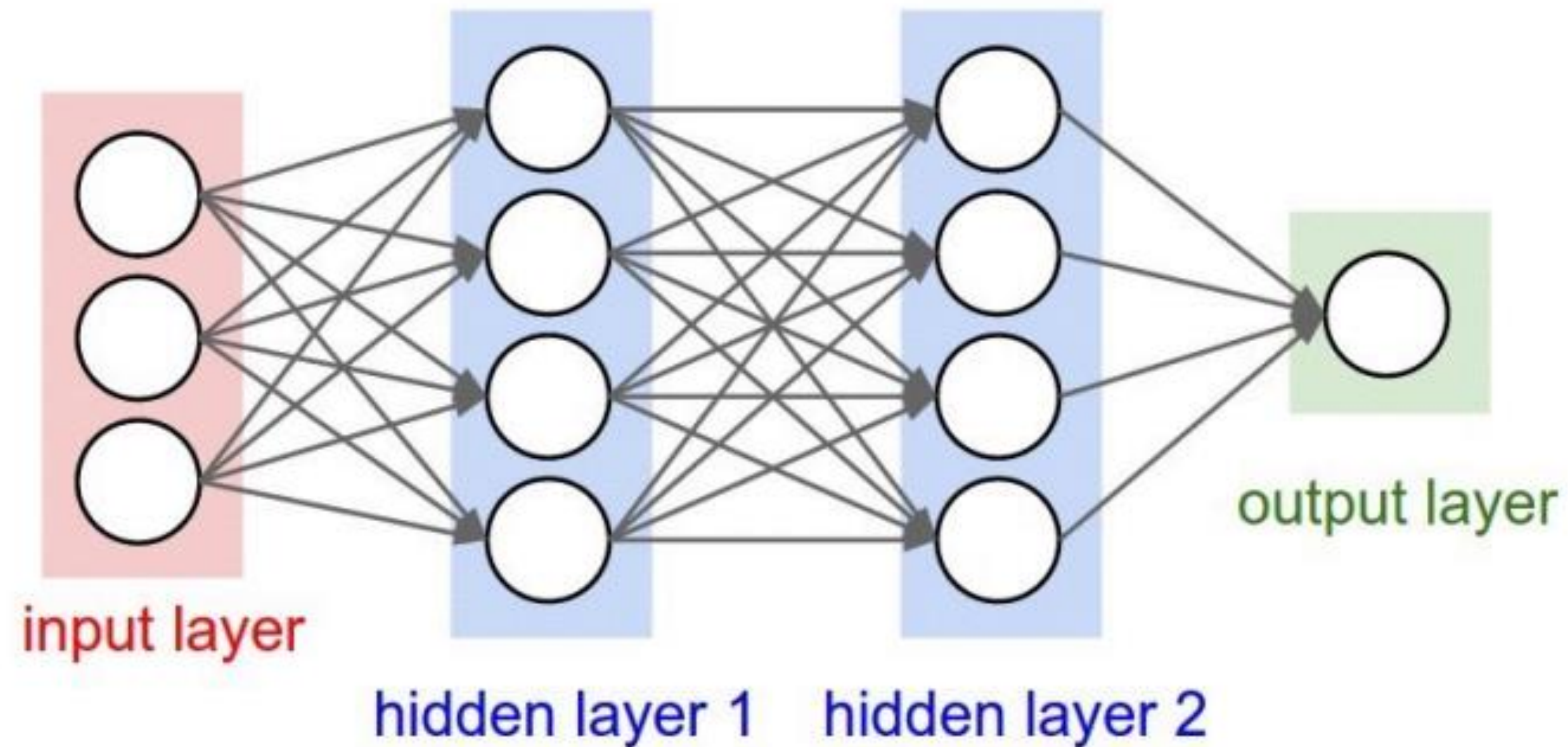


# Perceptrons (1969) : by Marvin Minsky, founder of the MIT AI Lab



- We need to use **MLP, multilayer perceptrons** (multilayer neural nets)
- No one on earth had found a viable way to train MLPs good enough to learn such simple functions.

No one on earth had found a viable way to train

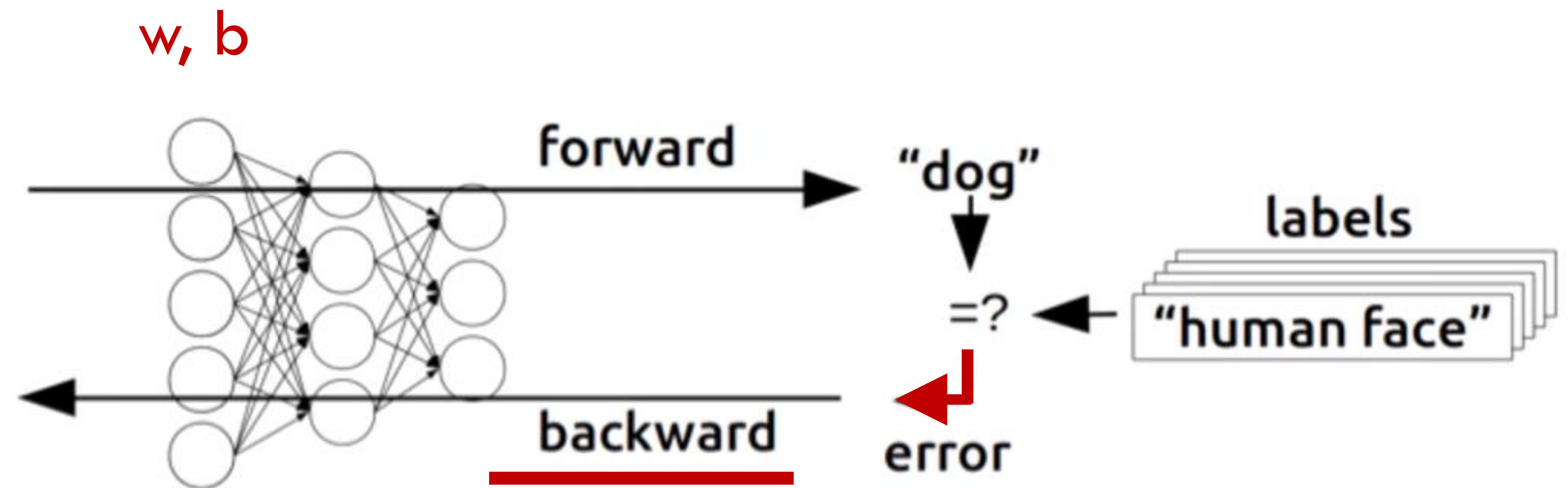
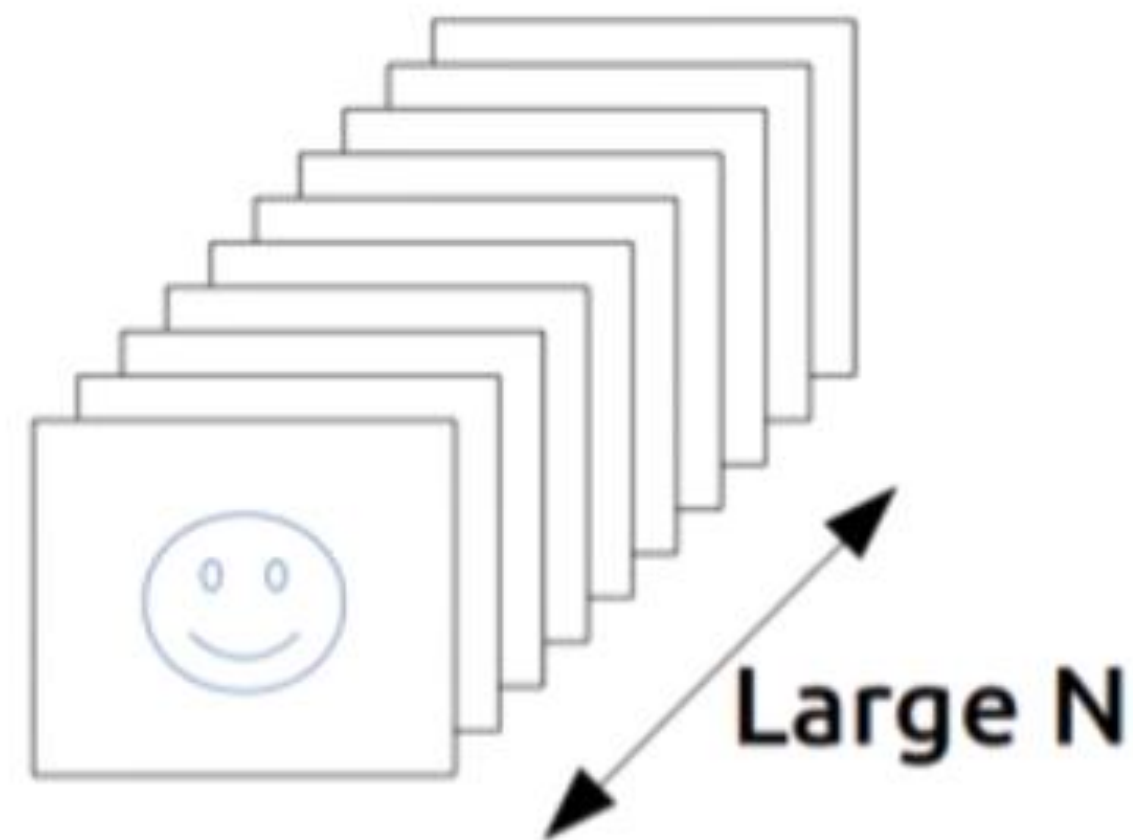


\*Marvin Minsky, 1969

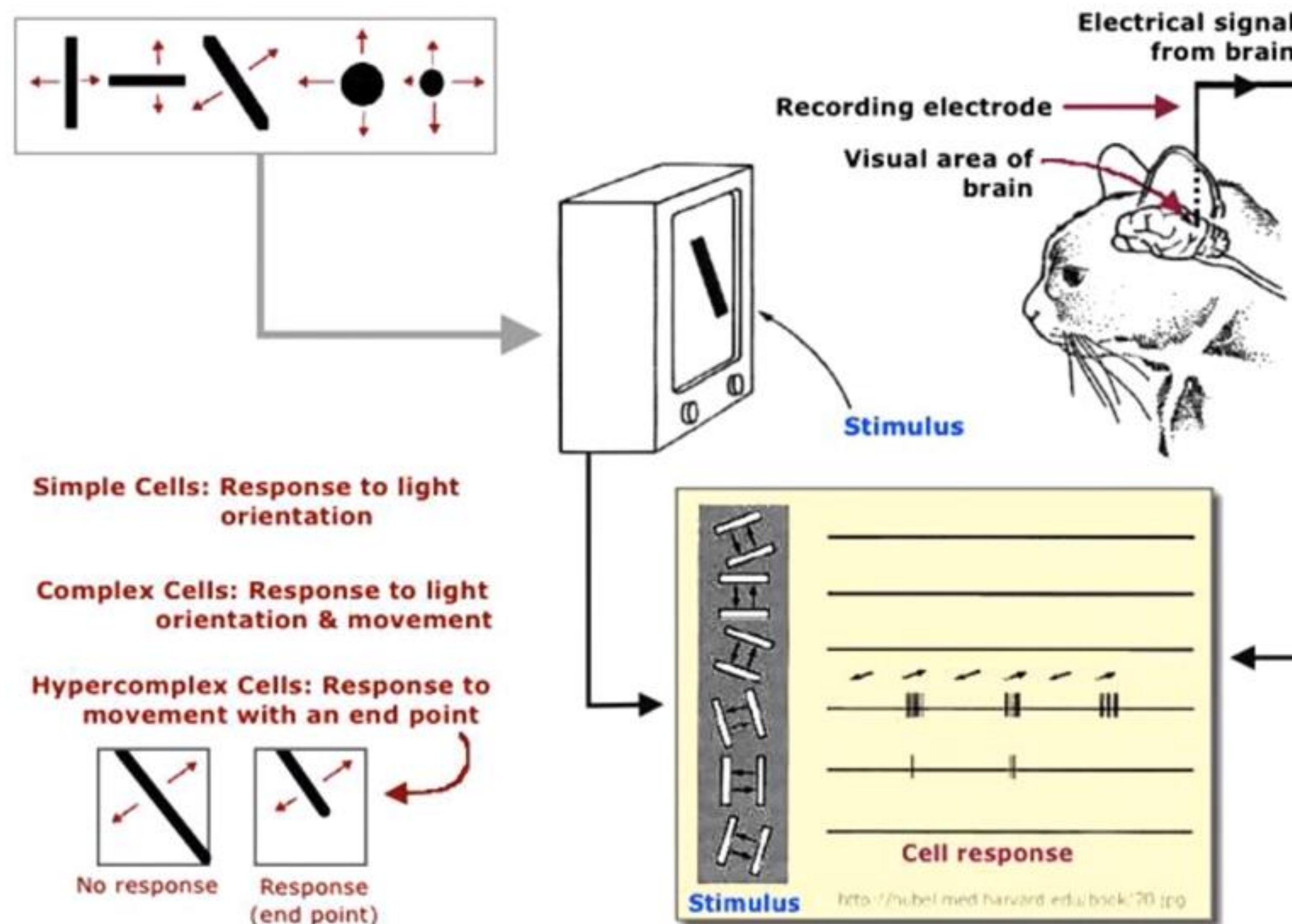
# Backpropagation : (1974, 1982 by Paul Werbos, 1986 by Hinton)



## Training



# Visual neurophysiology

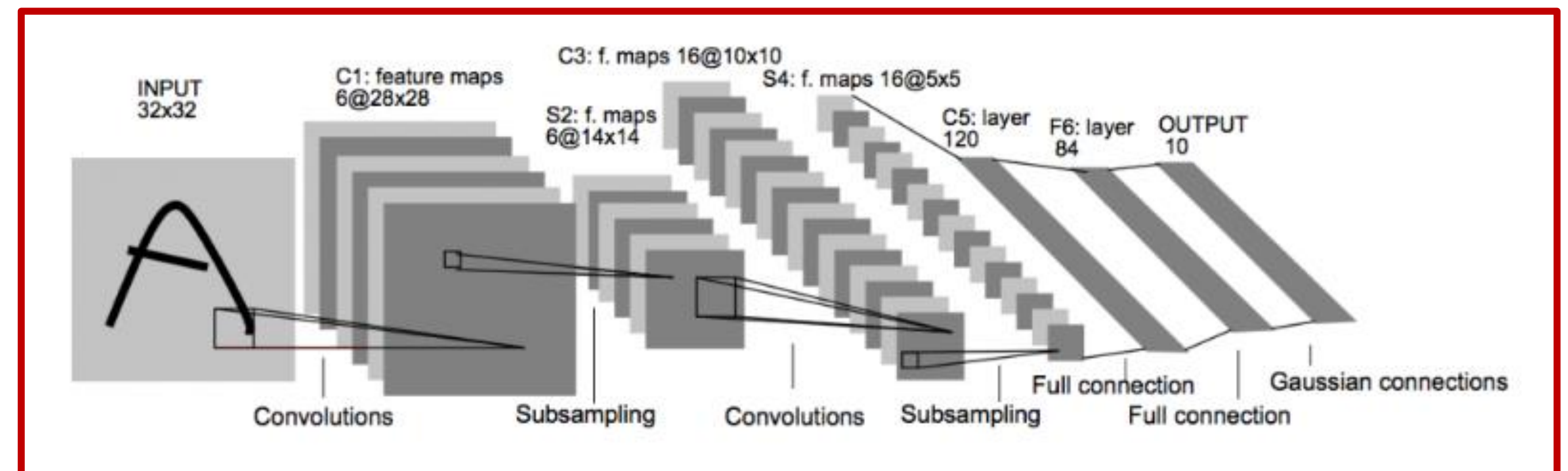
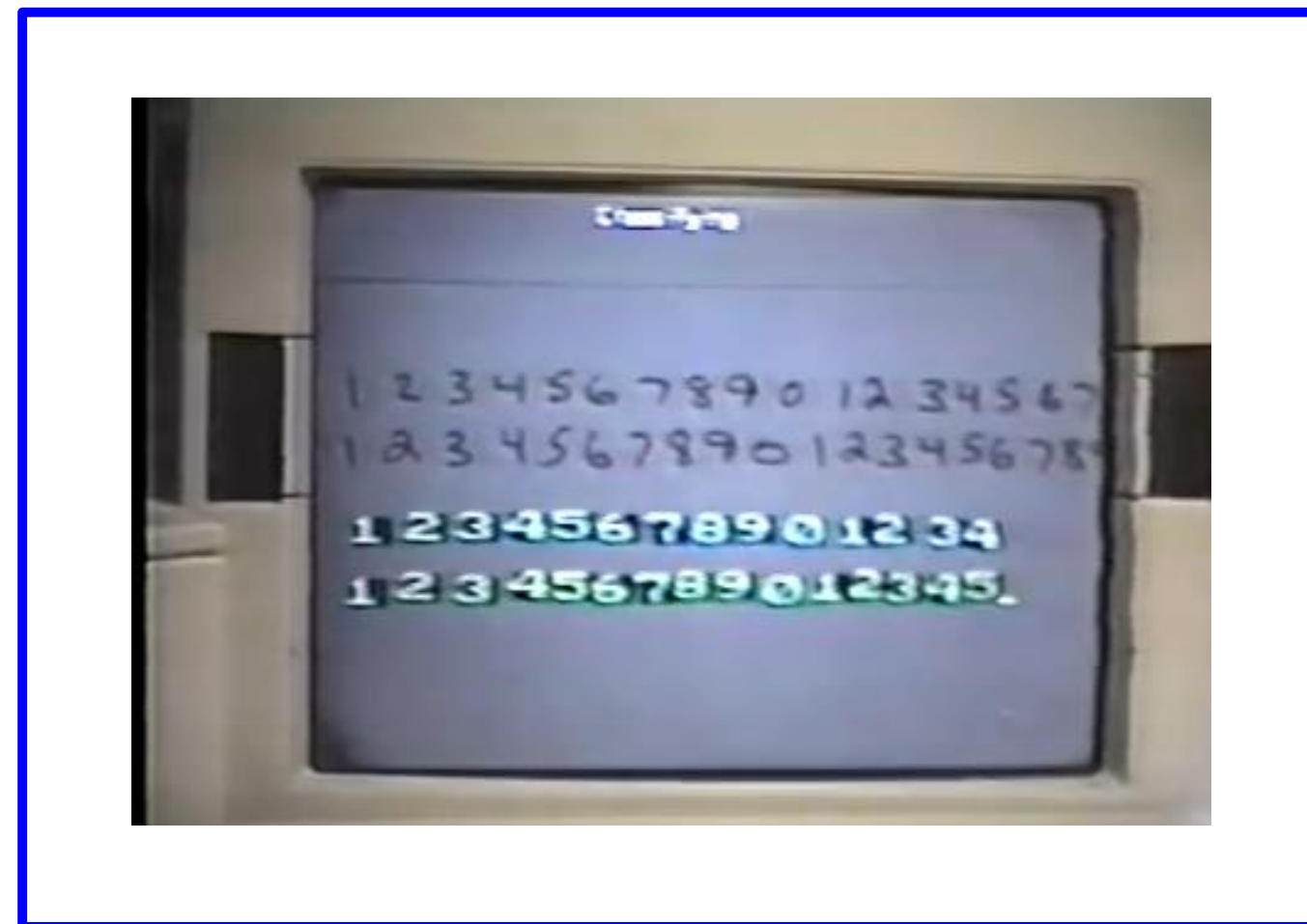


Hubel & Wiesel, 1959

# CNN : Convolutional Neural Networks (by Yann Lecun )

Yann Lecun (1989)

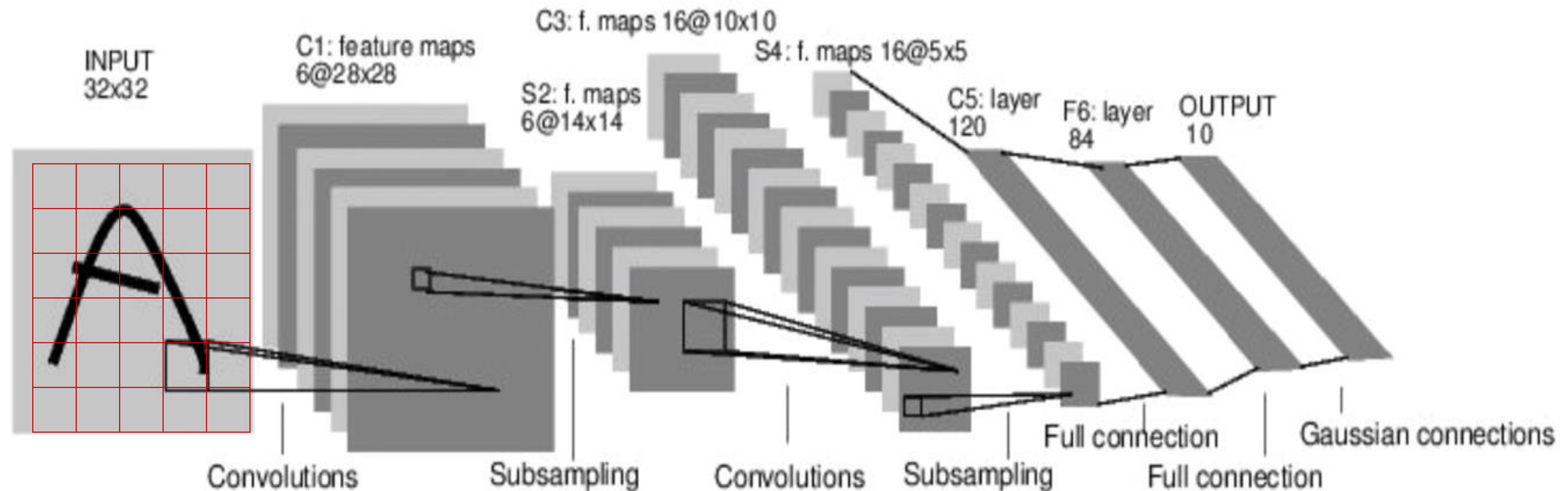
“Handwritten digit recognition with a back-propagation network”



Yann Lecun (1998)

“Gradient-Based Learning Applied to Document Recognition”

# CNN : Convolutional Neural Networks

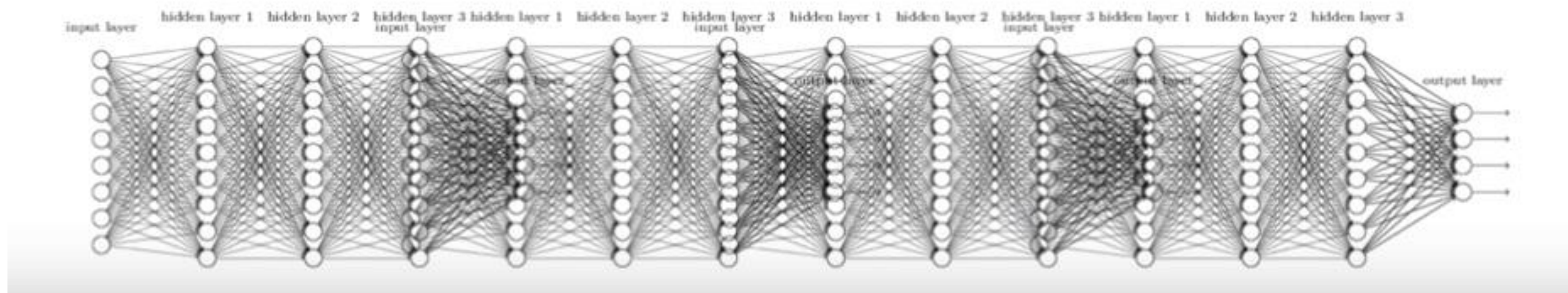


“At some point in the late 1990s, one of these systems was reading 10 to 20% of all the checks in the US.”

*[LeNet-5, LeCun 1980]*

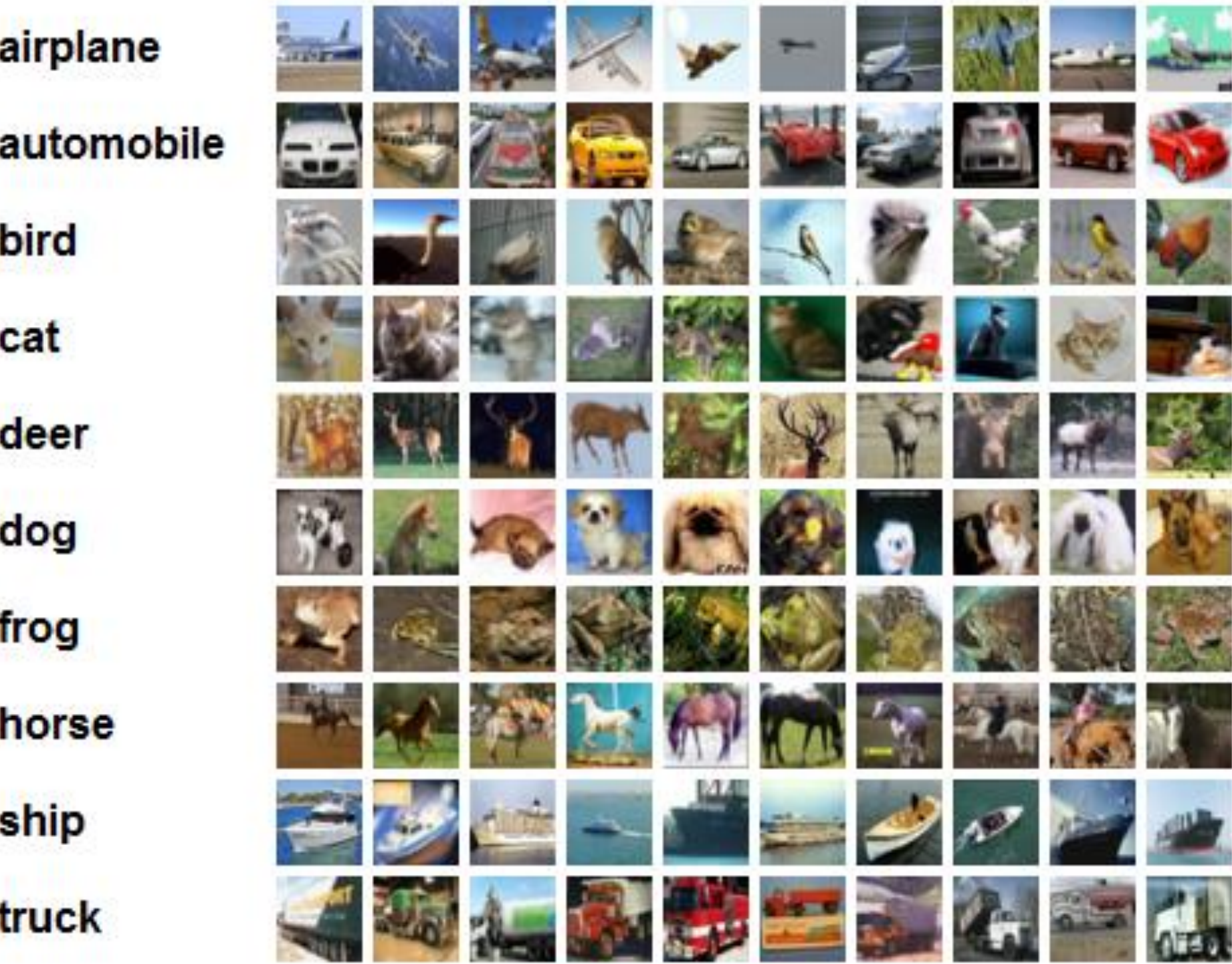
# A Big Problem

- Backpropagation just did not work well for **normal neural nets** with many layers
- Other rising machine learning algorithms: **SVM, RandomForest**, etc.
- 1995 “Comparison of Learning Algorithms For Handwritten Digit Recognition” by LeCun et al. found that this **new approach** worked better



# CIFAR

## CIFAR-10 data set



CIFAR

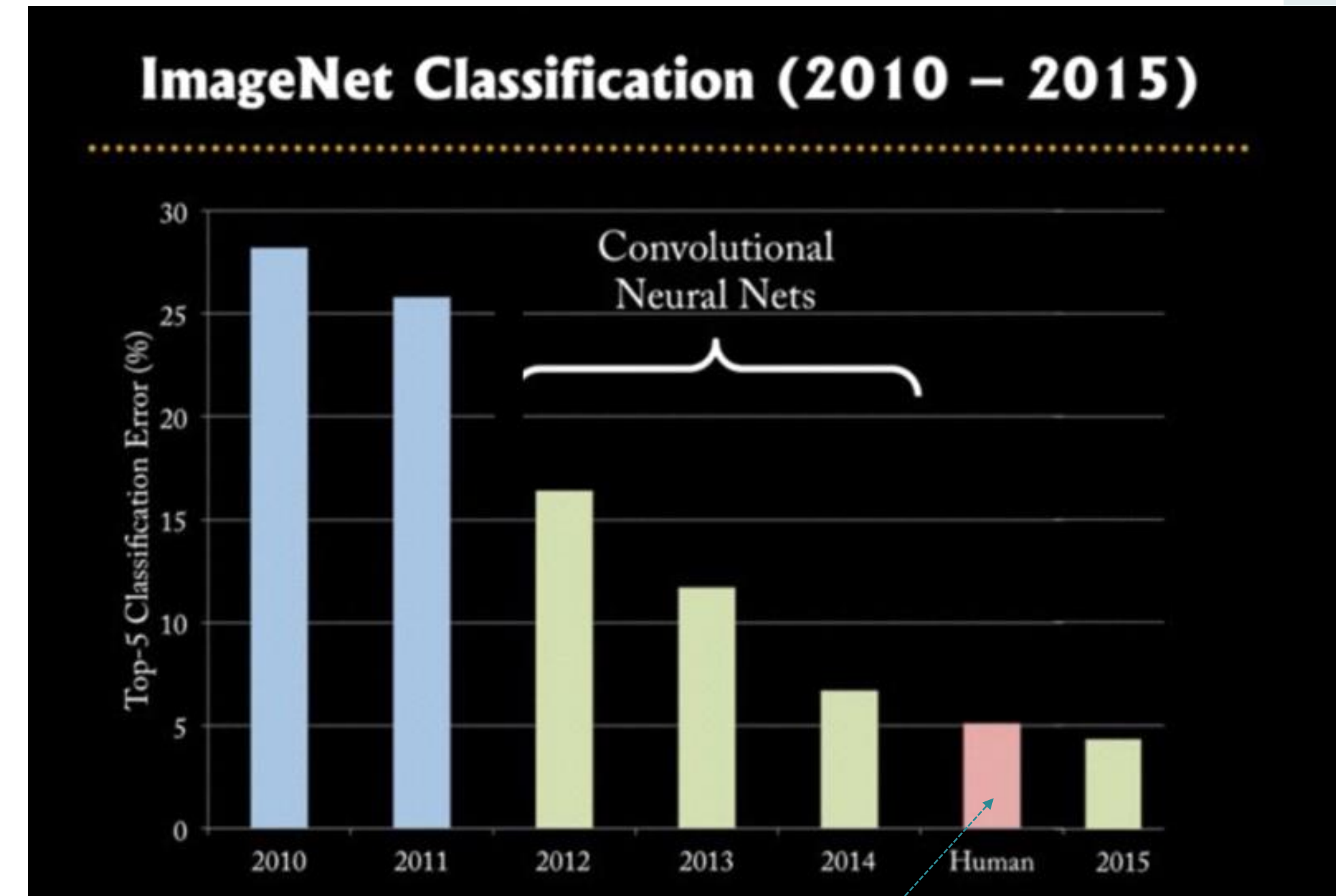
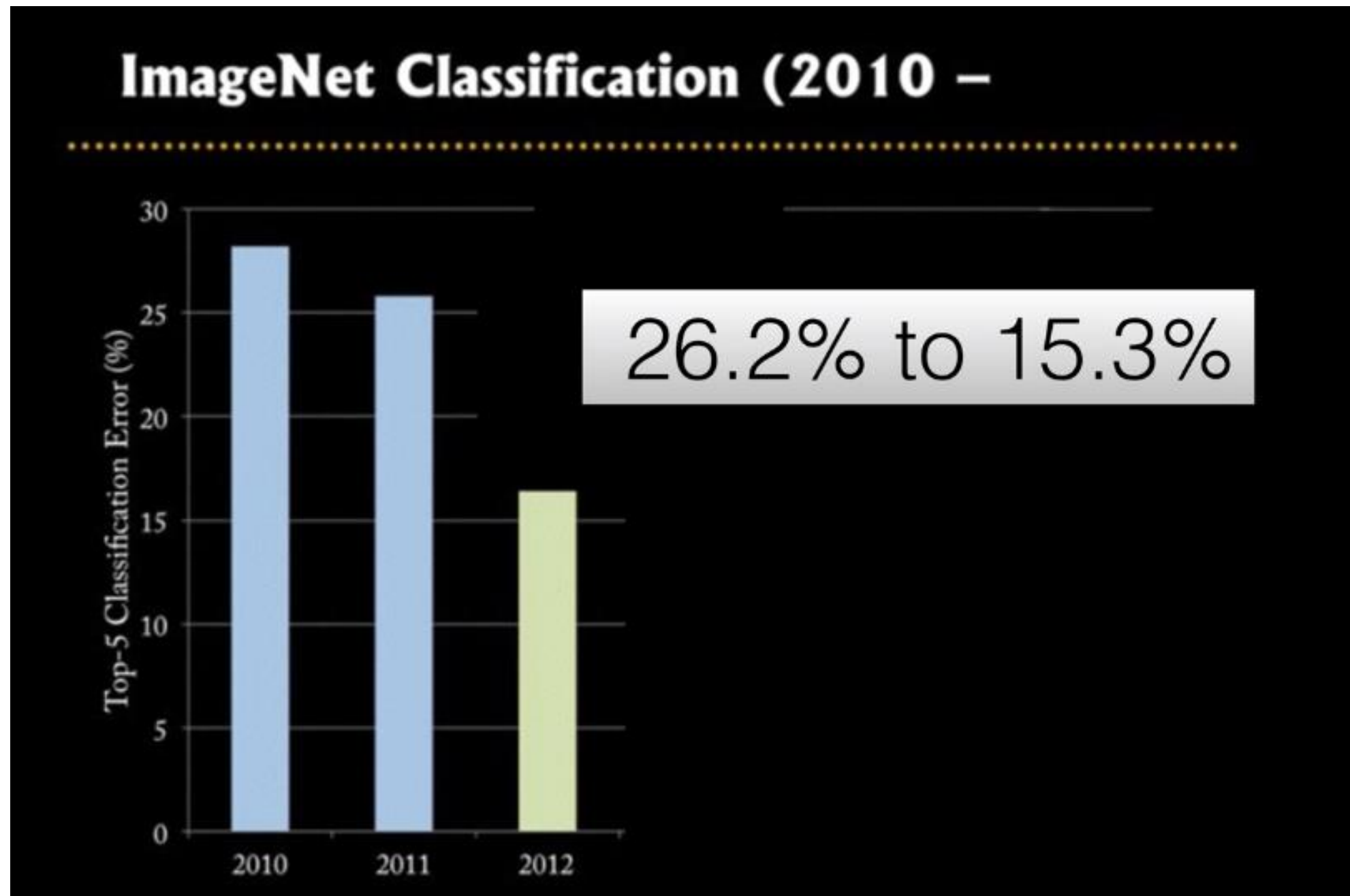
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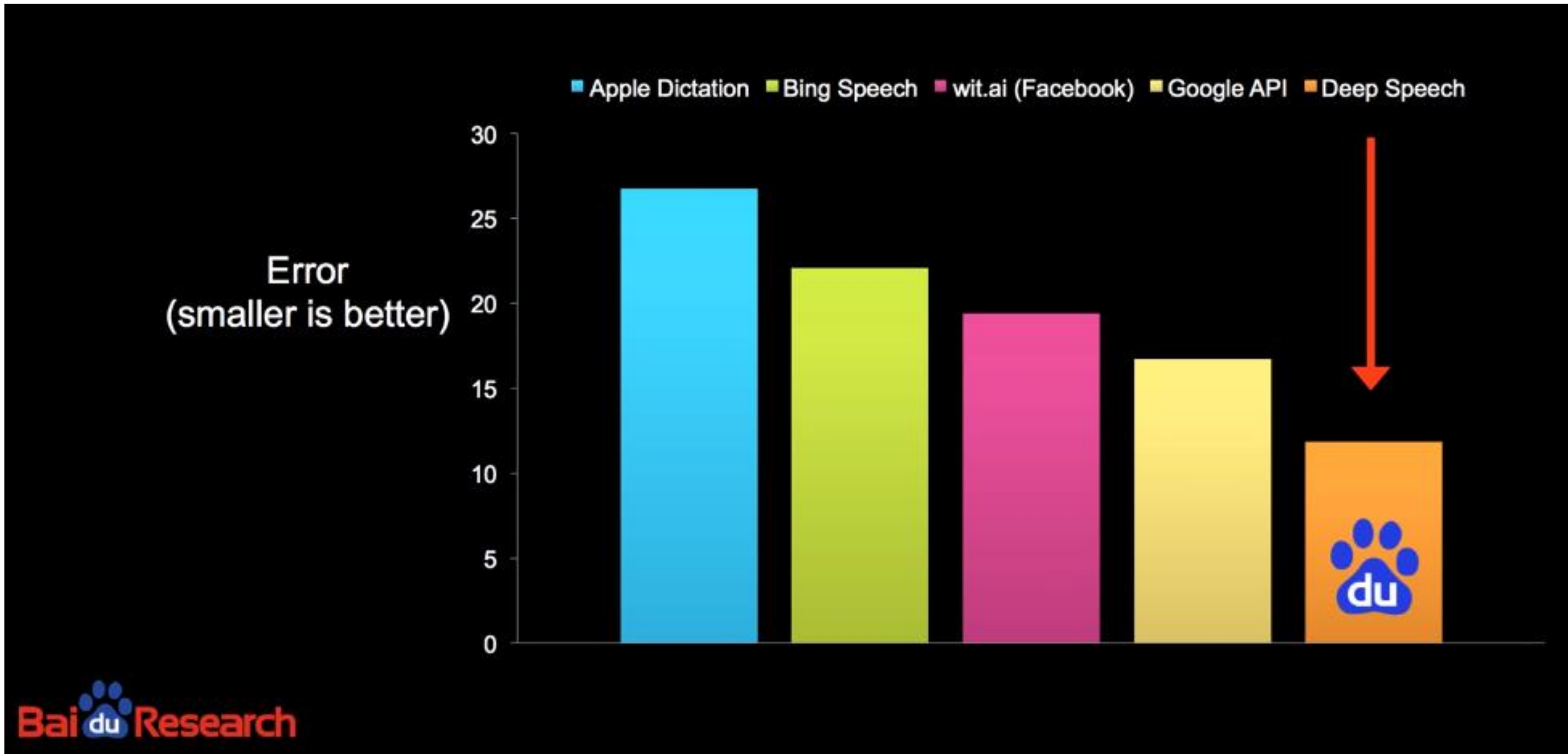
## Breakthrough in 2006 and 2007 by Hinton and Bengio

- Neural networks with many layers really could be trained well, if **the weights are initialized in a clever way** rather than randomly.
- **Deep machine learning methods are more efficient for difficult problems** than shallow methods.
- **Renaming to Deep Nets, Deep Learning.**

# Classification Error Rate



# Speech recognition errors



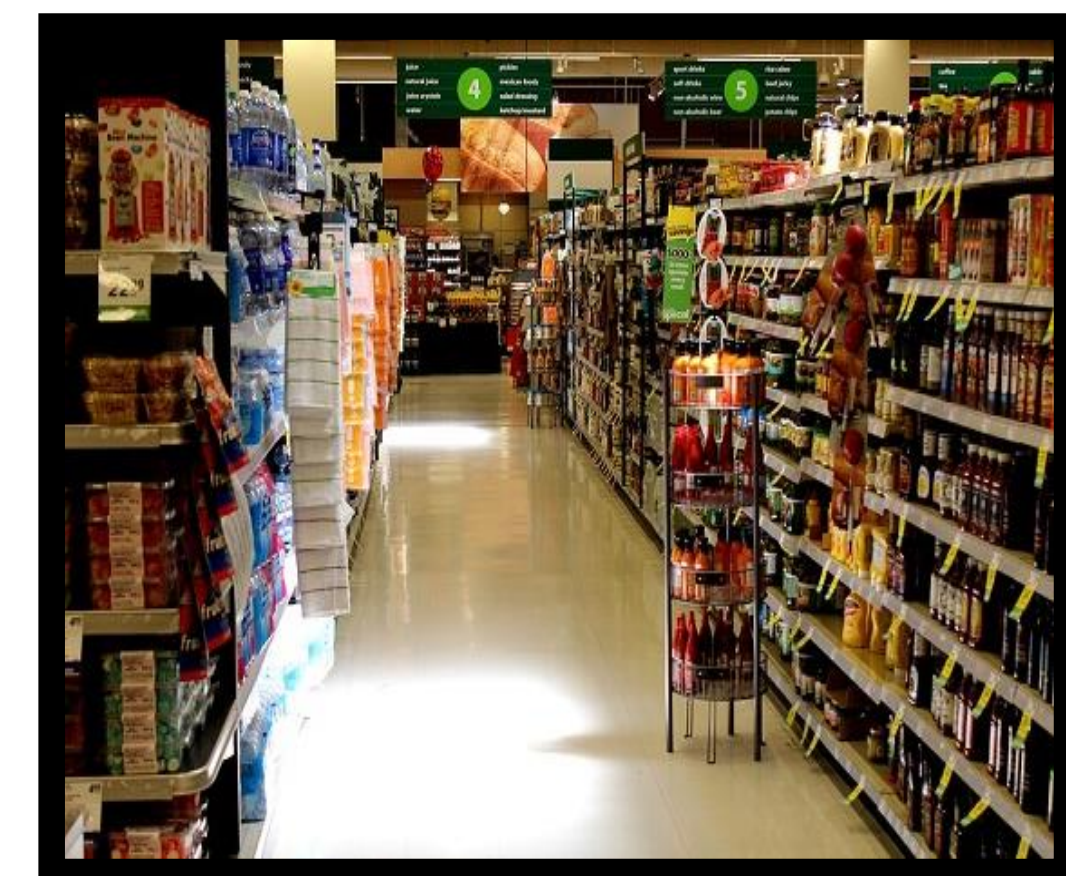
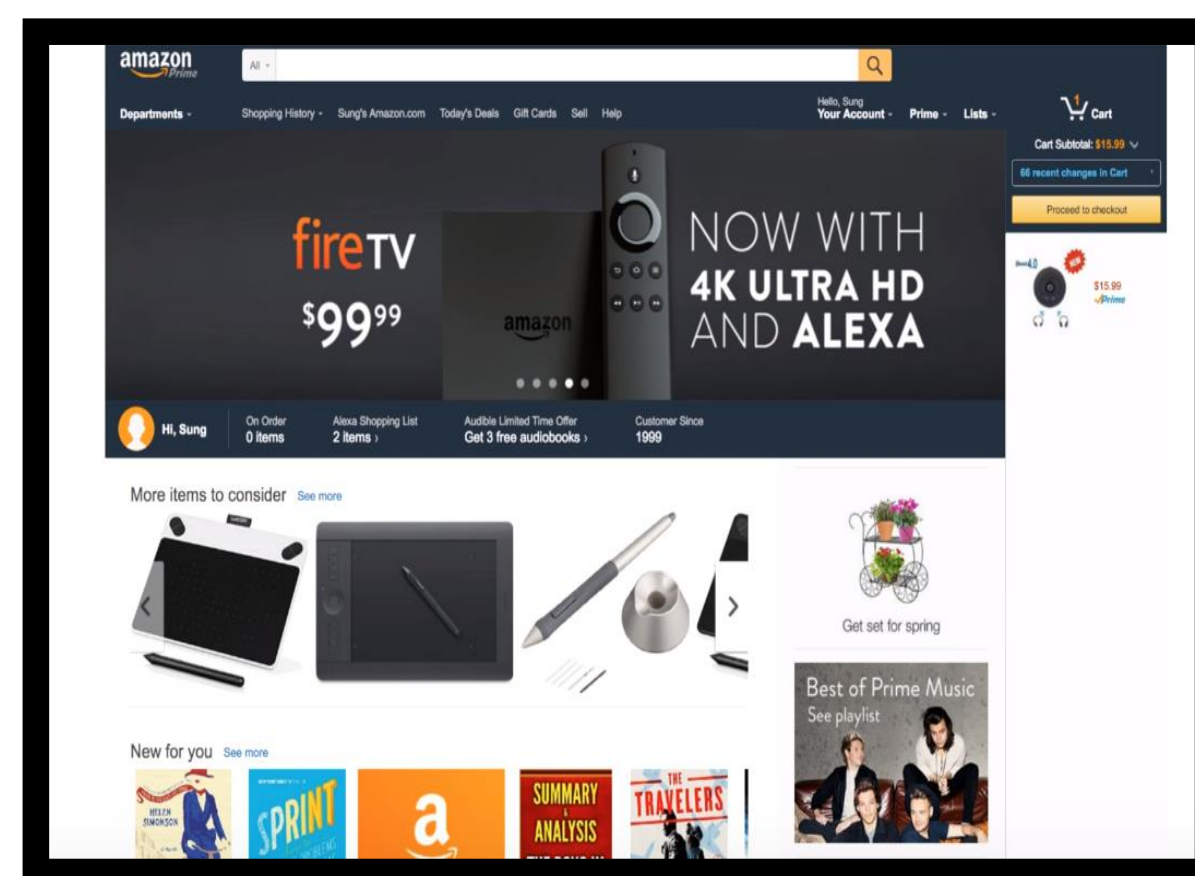
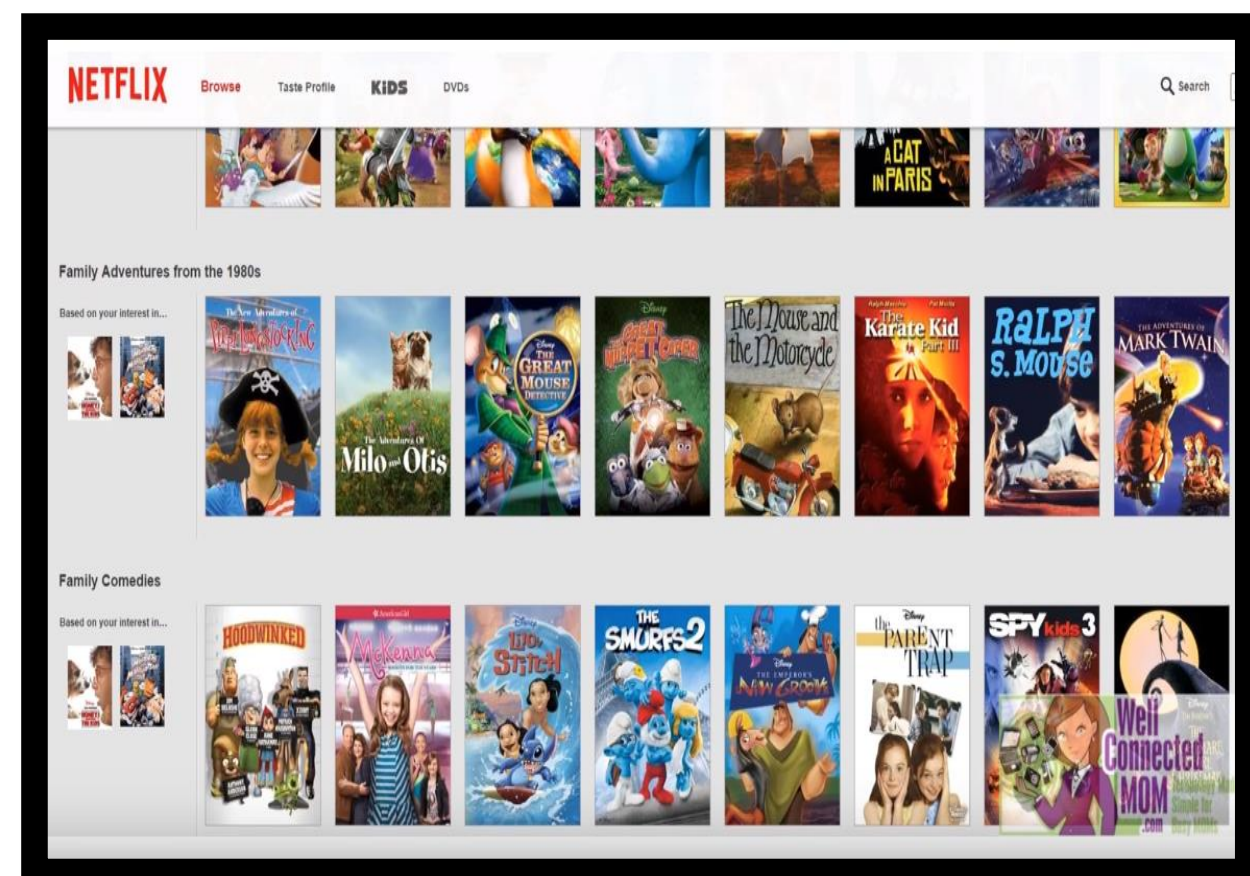
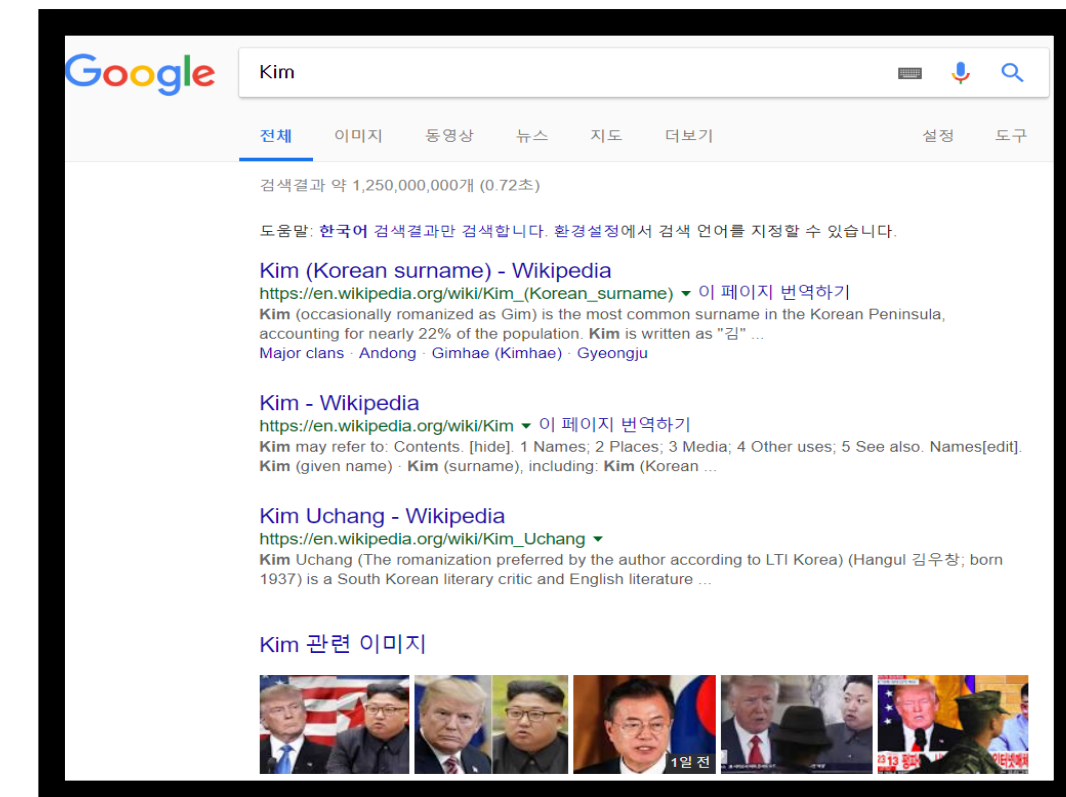
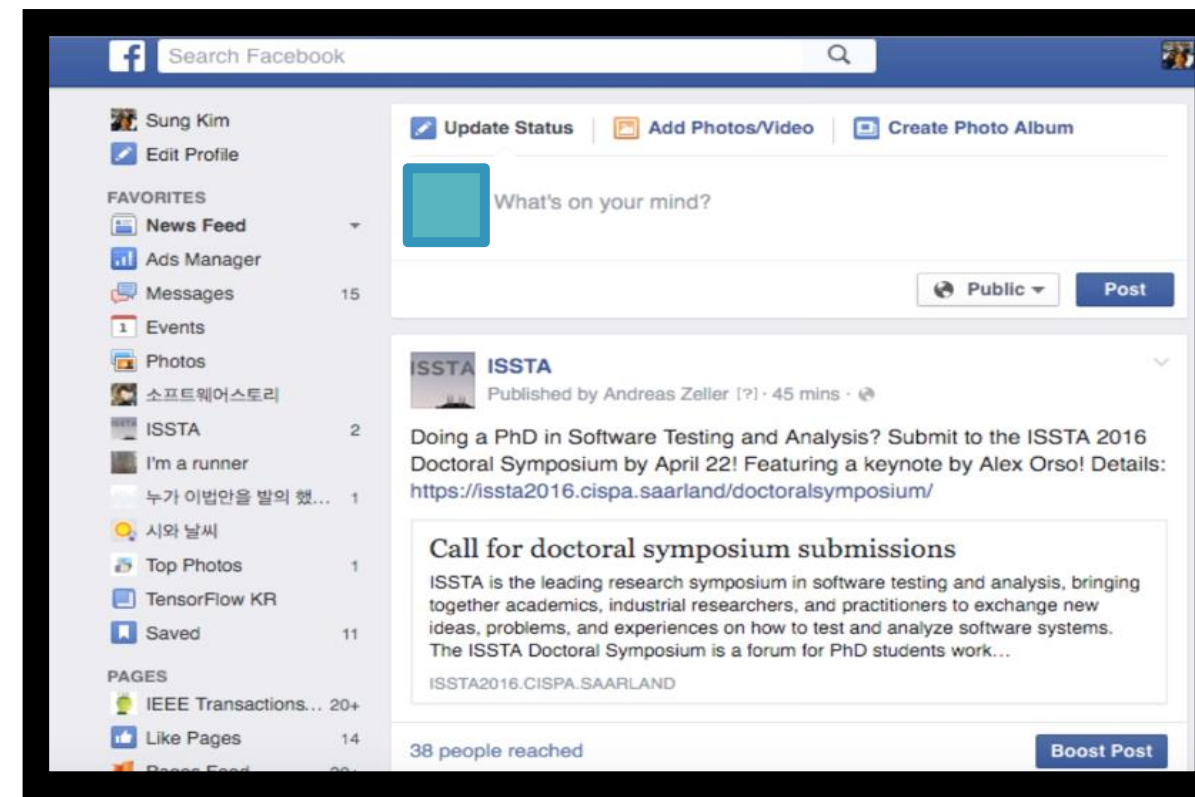
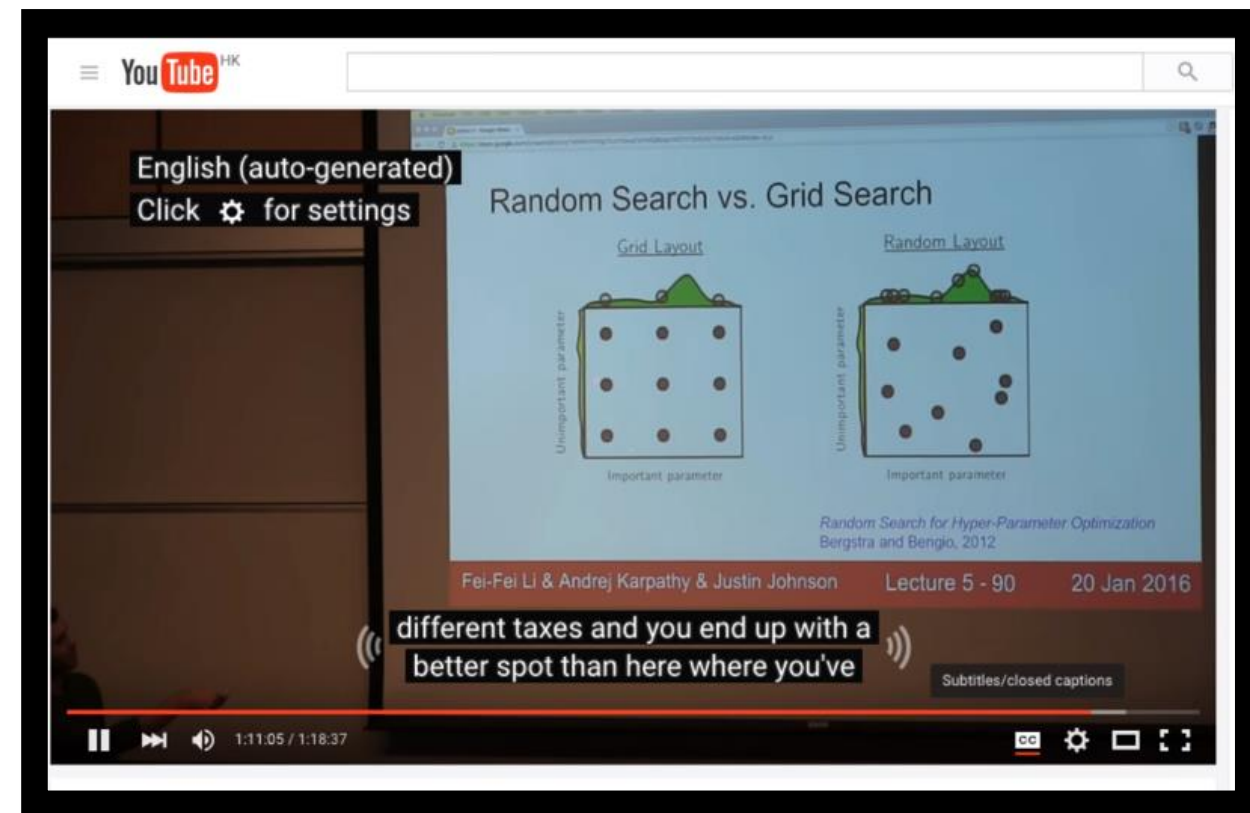
# AlphaGo



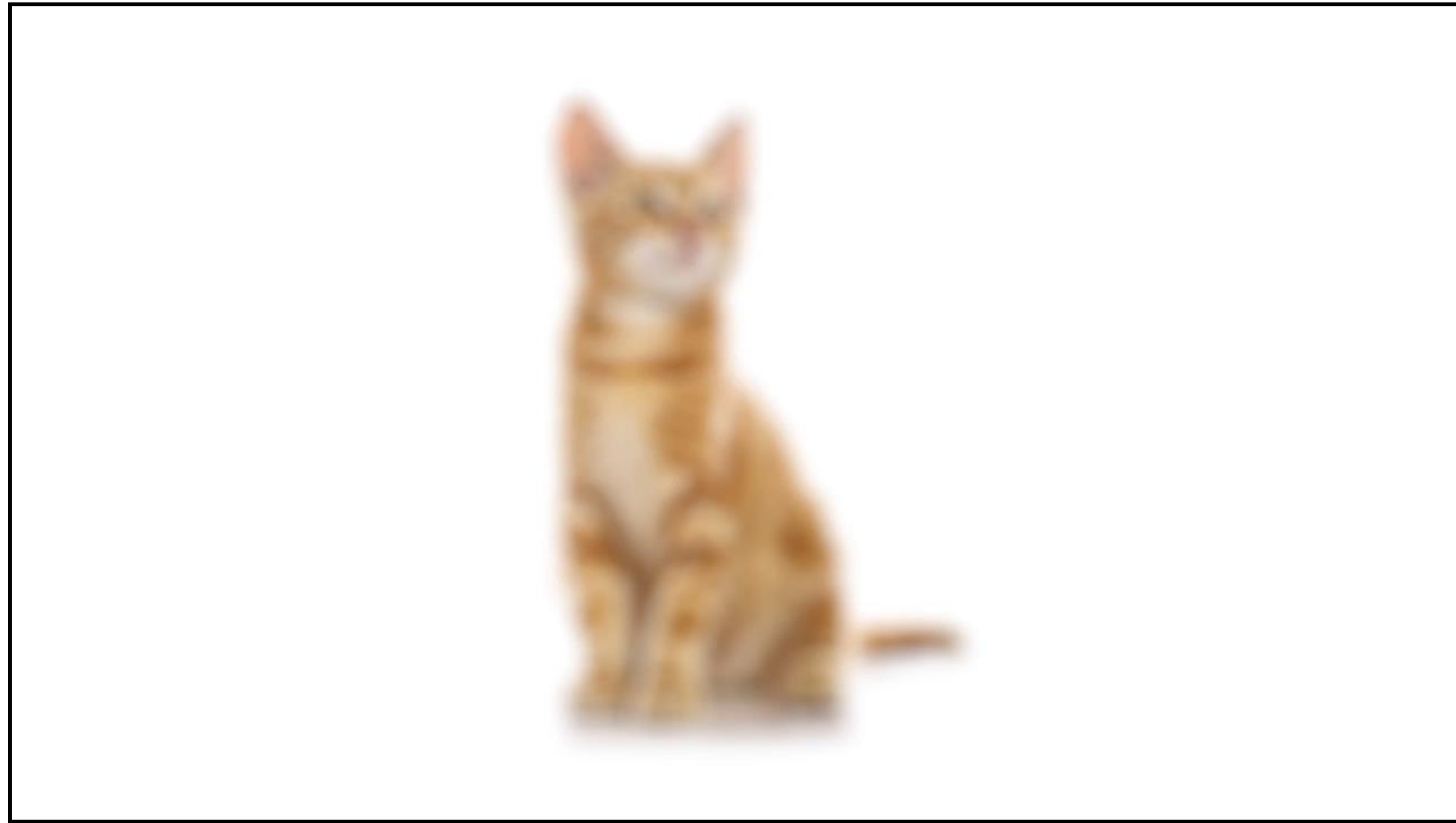
# Geoffrey Hinton's summary of findings up to today

- Our labeled datasets were thousands of times too small
- Our computers were millions of times too slow.
- We initialized the weights in a stupid way.
- We used the wrong type of non-linearity.

# Why should I care?

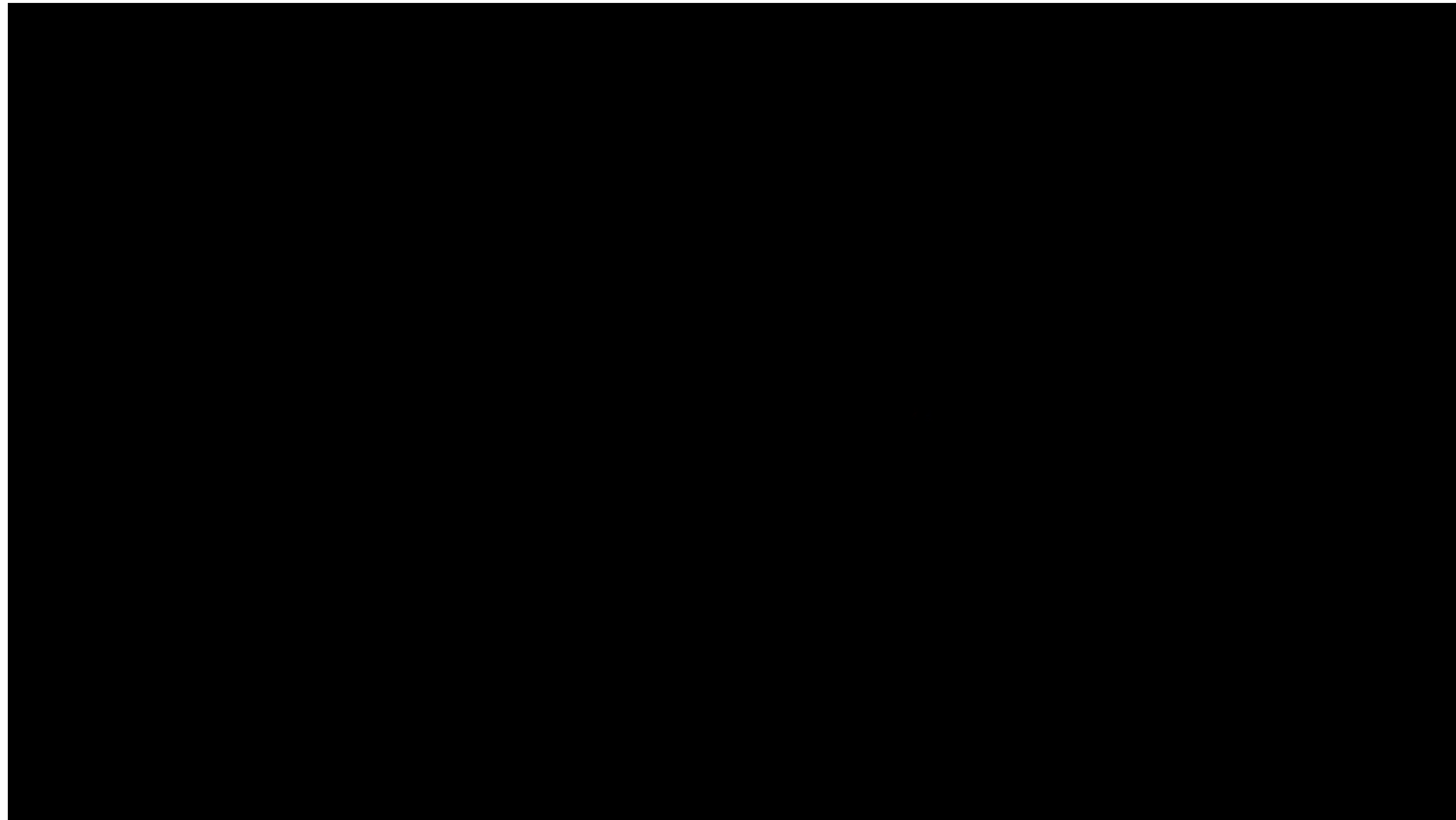


# Why should I care?



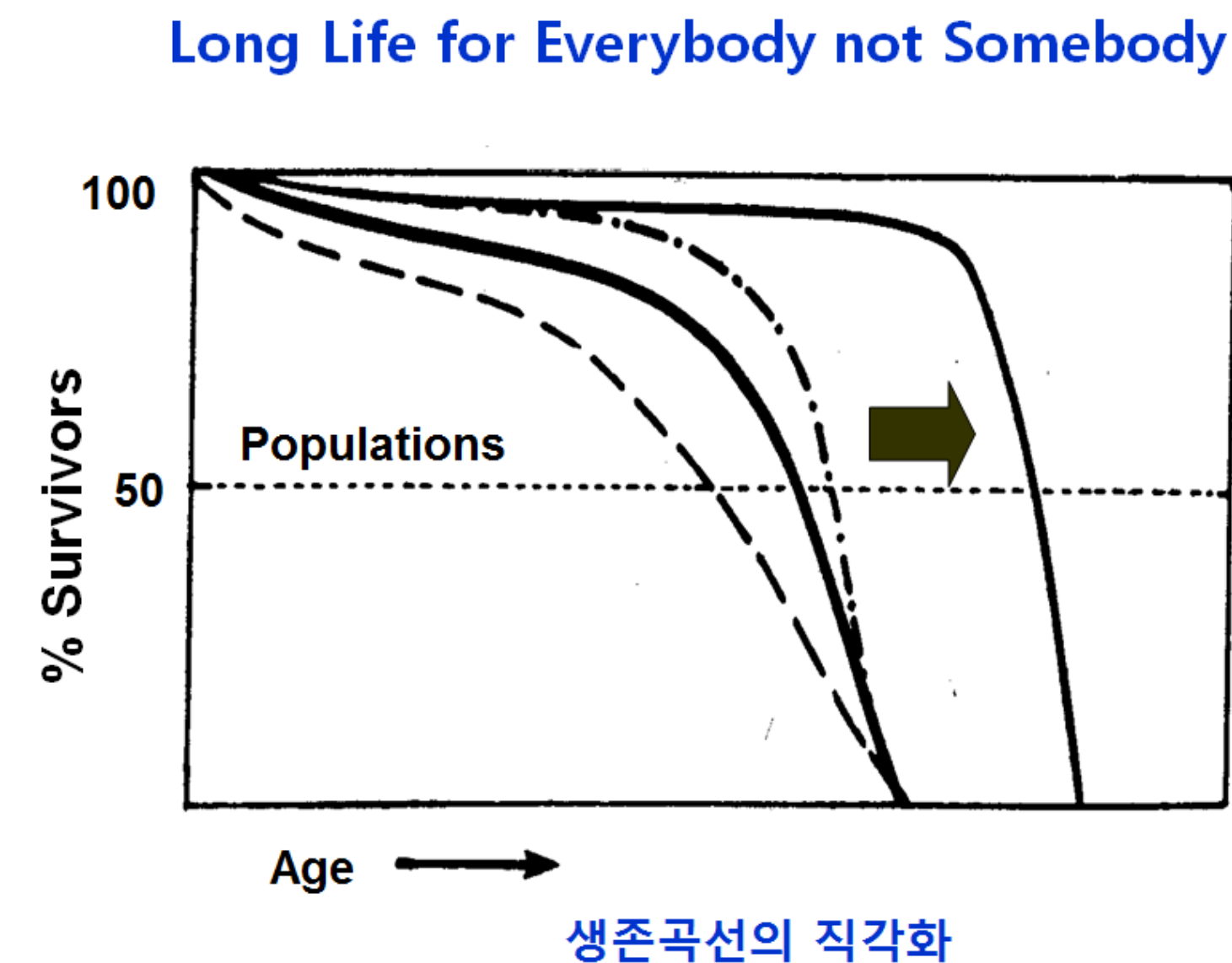
# Why should I care?

## A.I. Duet



# Why should I care?

- **IBM Watson** : 미국 주요 병원에서 암 진단 및 치료법 조언, 국내 주요 대학병원에도 도입
  - 2013년 투입 전 : 60만 건 진단서, 200만 쪽 전문서적, 150만 명의 환자 기록을 학습
  - 정확도 비교 : 폐암 진단에서 **Watson 90%** , 의사 **50 %**



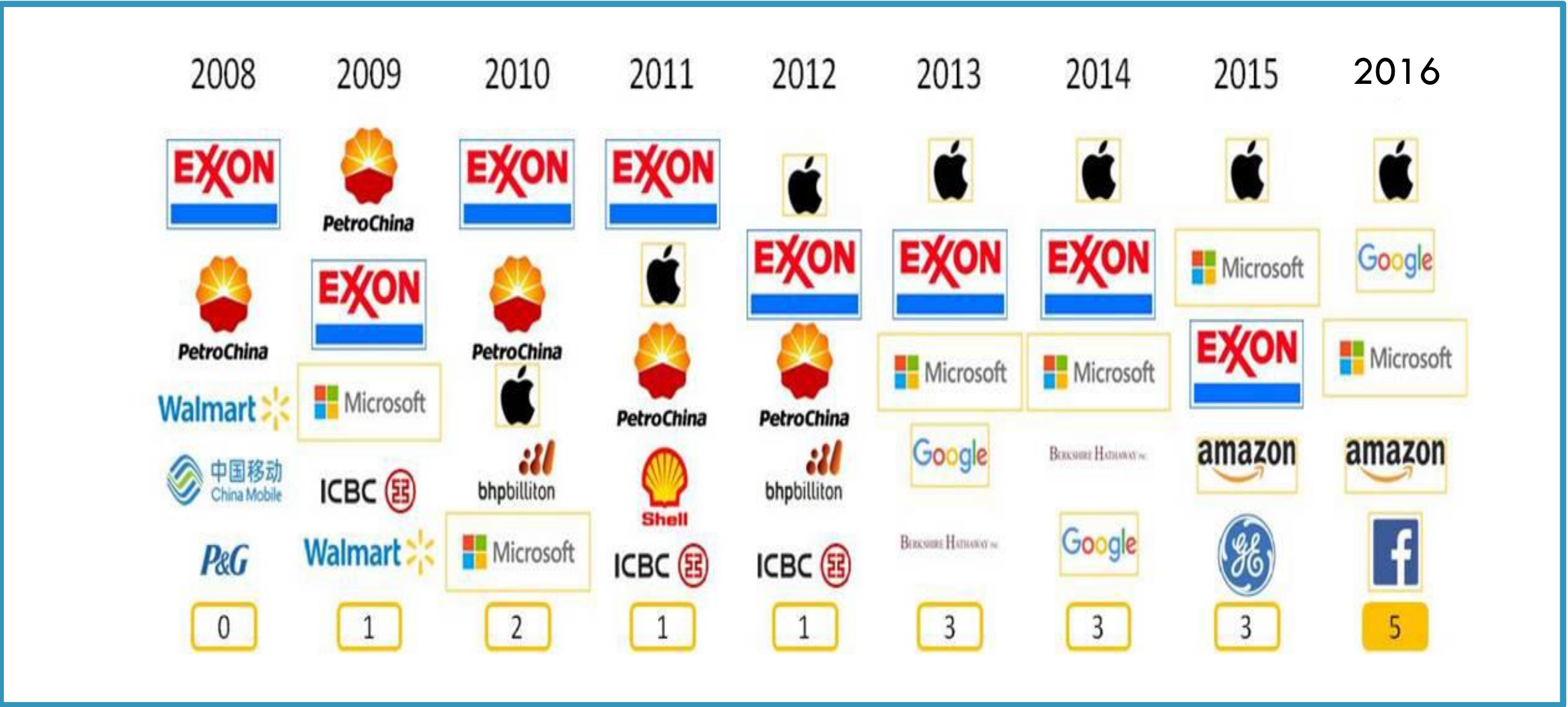
# Why should I care?

- 컴퓨터가 스스로 사고 팔고를 결정 – **Algorithm Trading**
  - 주식 거래의 **70%이상을 SW알고리즘으로 수행 (미국)**
- 자율 **SW agent** : 새로운 경제 체제를 지탱하는 근본으로 기능할 것
  - 프로그램 경제 (**programmable economy**)



# Why should I care?

SW & A.I. 세계 경제를 움직인다.



**Hotel Industry Market Value**

- Air B&B \$25.5B (2015.6), \$10B (2014.3)
- Hilton \$24.0B (2015.6, 627,000 Rooms)
- Marriott \$21B (2015)
- Hyatt \$8.3B (2015.6)

**Uber Market Value \$50B (2015.5)**

= ?

•한계 비용 제로 사회 – Jeremy Rifkin

# Why should I care?



# Why should I care?

## 10년 전에 존재하지 않았던 현재의 유망 직업



미래부, '10년 후 대한민국 미래 일자리의 길을 찾다' 보고서 중에서...

# Why Now?

- Students / Researchers
  - **Not too late** to be a world expert.
  - **Not too complicated** (mathematically).
- Practitioner
  - **Accurate enough** to be used in practice
  - Many ready-to-use tools **such as TensorFlow**
  - Many easy/simple programming languages **such as Python**
- **After all, it is fun!**