

# Lecture 8-1

## Deep Neural Nets for Everyone

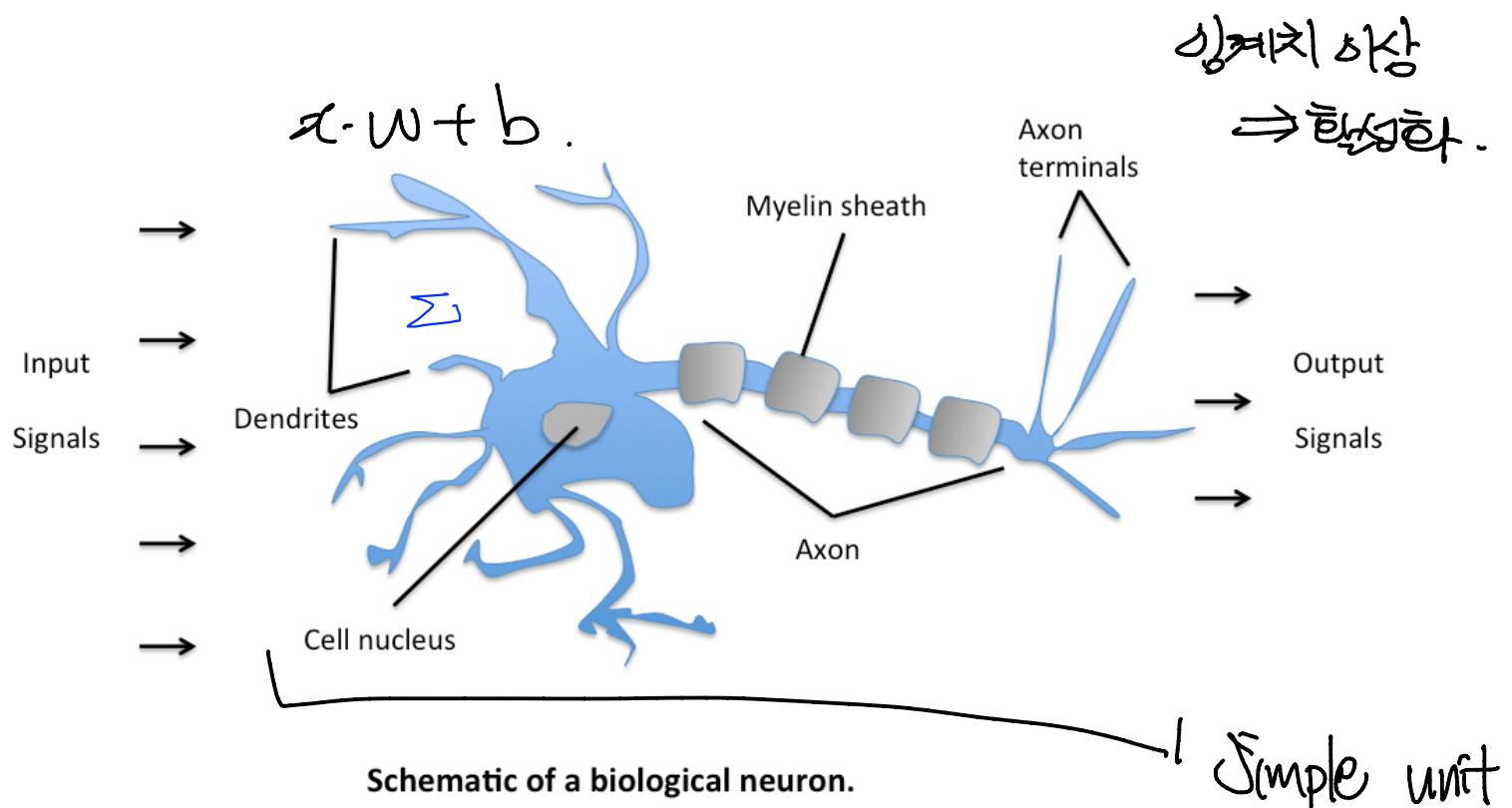
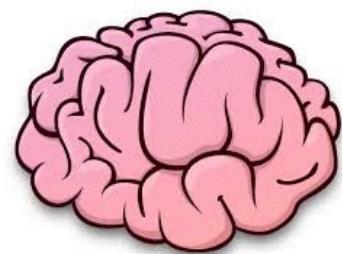
Sung Kim <[hunkim+mr@gmail.com](mailto:hunkim+mr@gmail.com)>

<http://www.contagious.com/blogs/news-and-views/14054117-deep-learning-deep-insight-deeper-resonance>

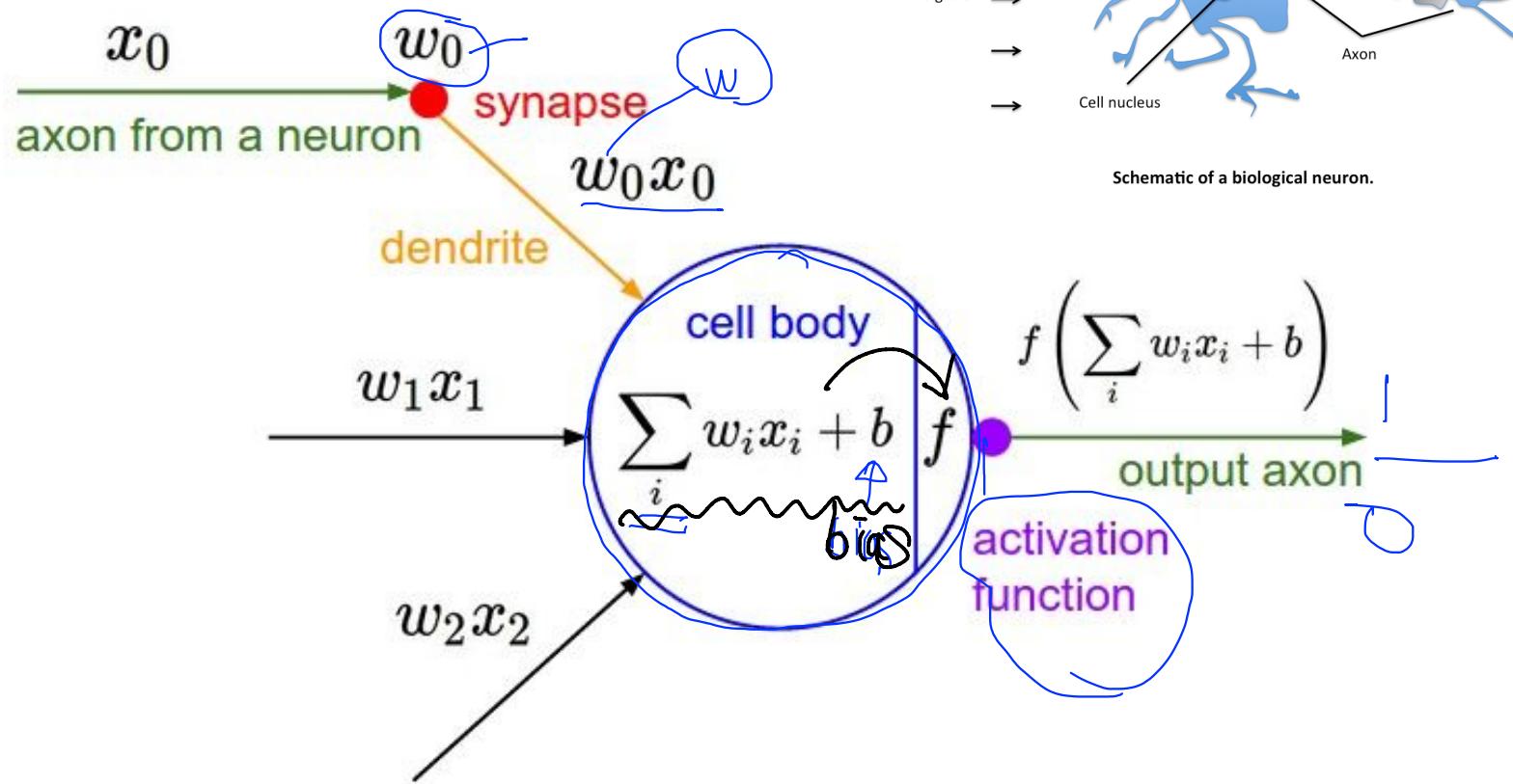
# Ultimate dream: thinking machine



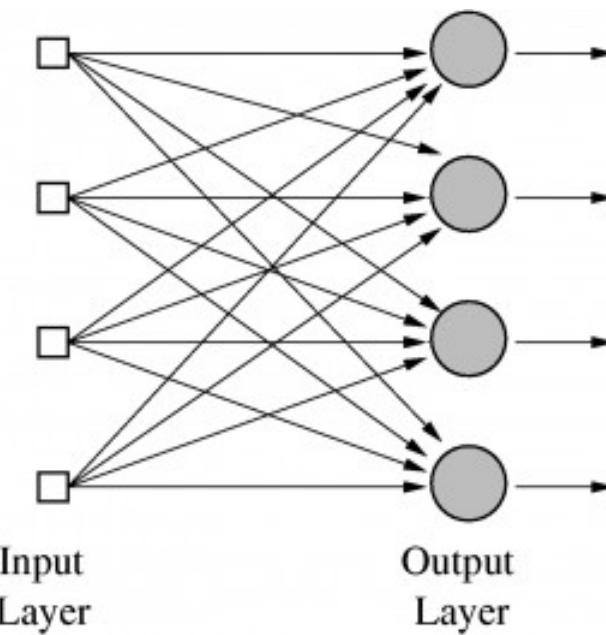
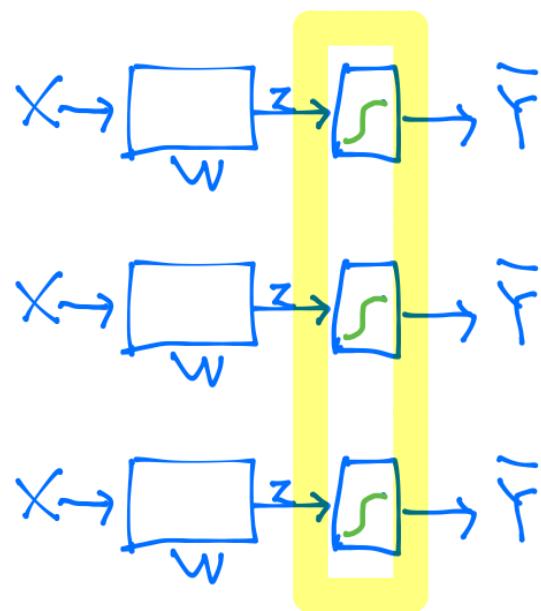
# Ultimate dream: thinking machine



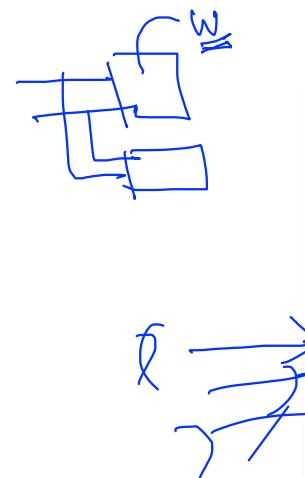
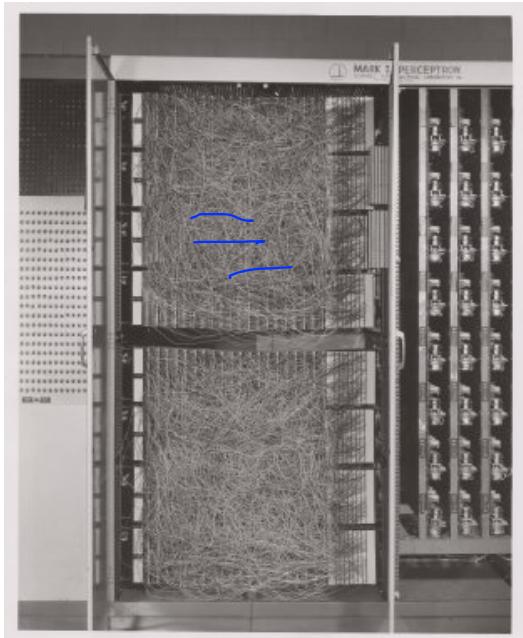
# Activation Functions



# Logistic regression units



# Hardware implementations



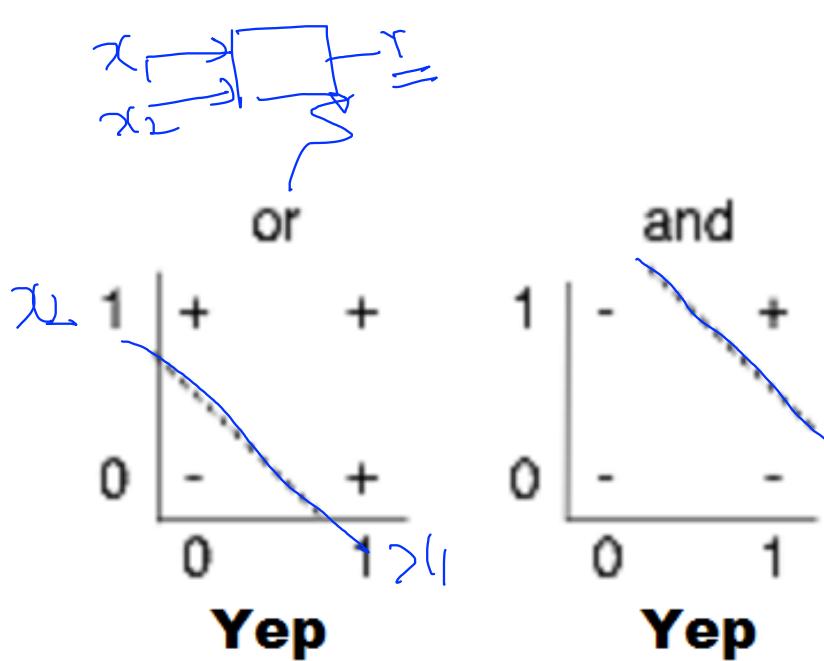
Frank Rosenblatt, ~1957: Perceptron

Widrow and Hoff, ~1960: Adaline/Madaline

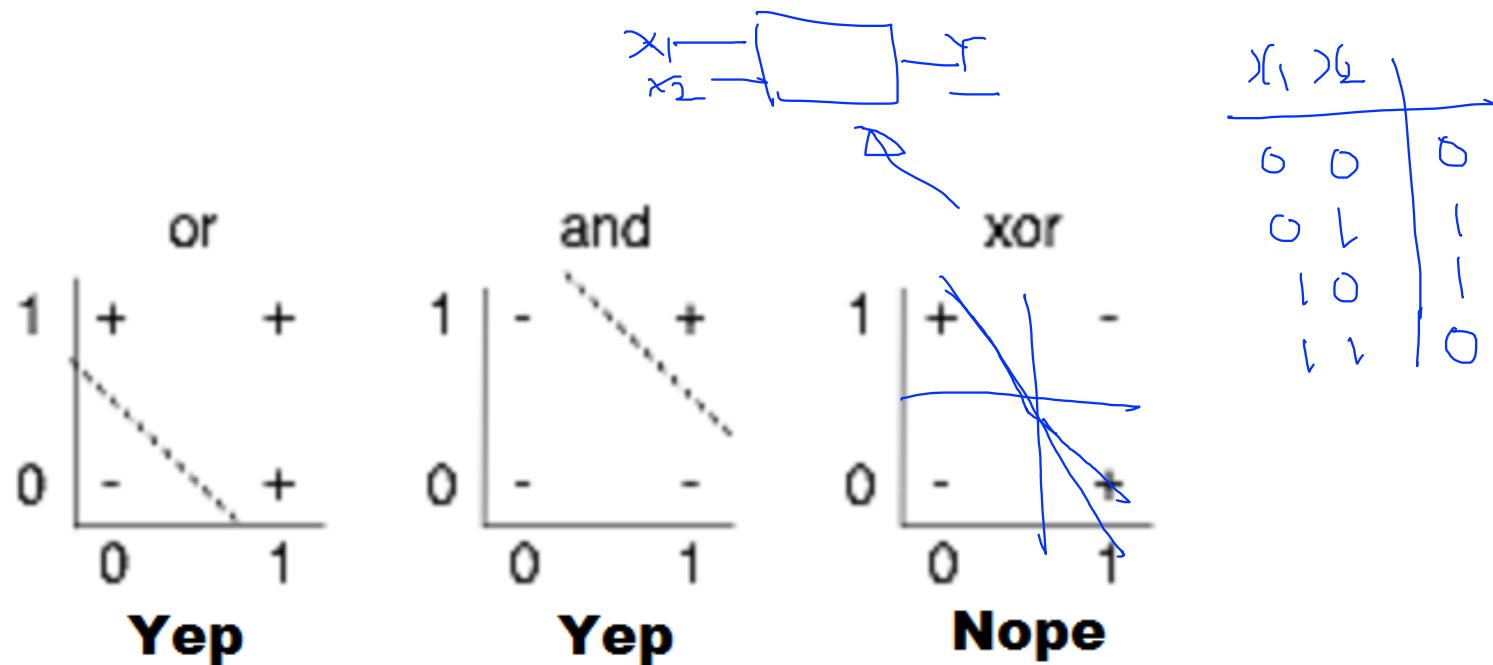
# False Promises

“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~~ 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” The New York Times July 08, 1958

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

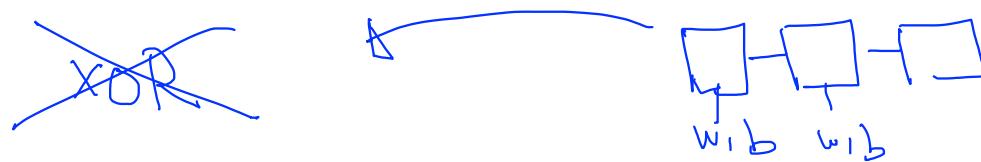
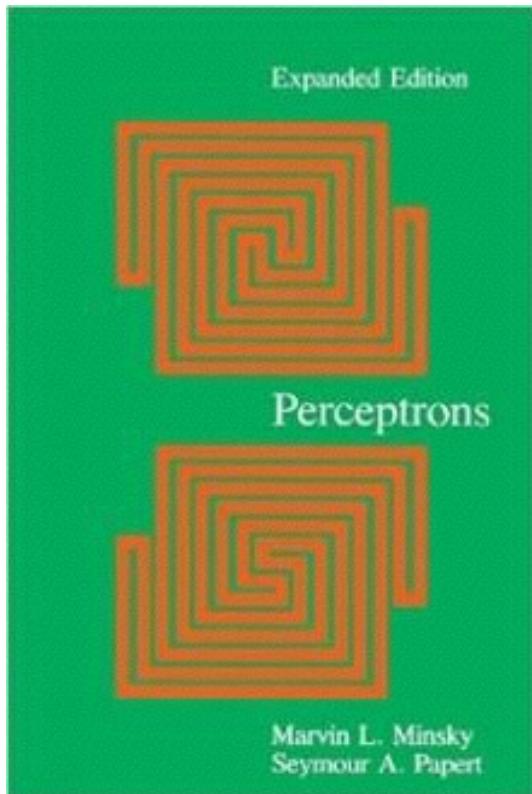


# (Simple) XOR problem: linearly separable?



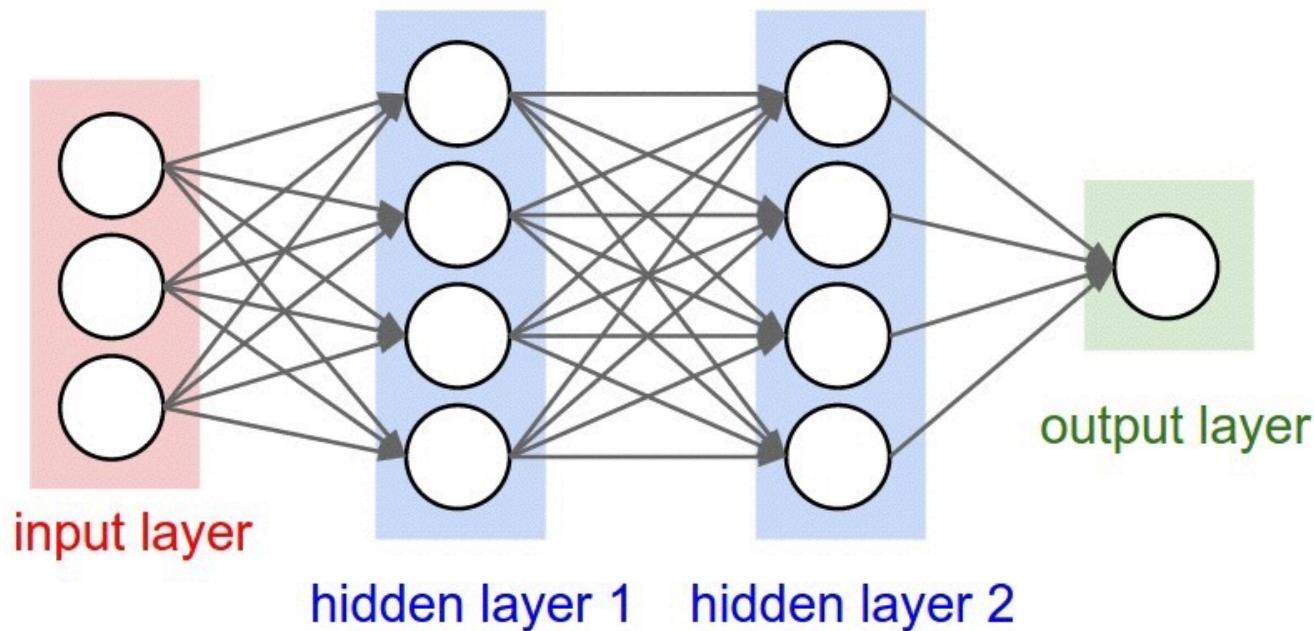
# Perceptrons (1969)

## 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

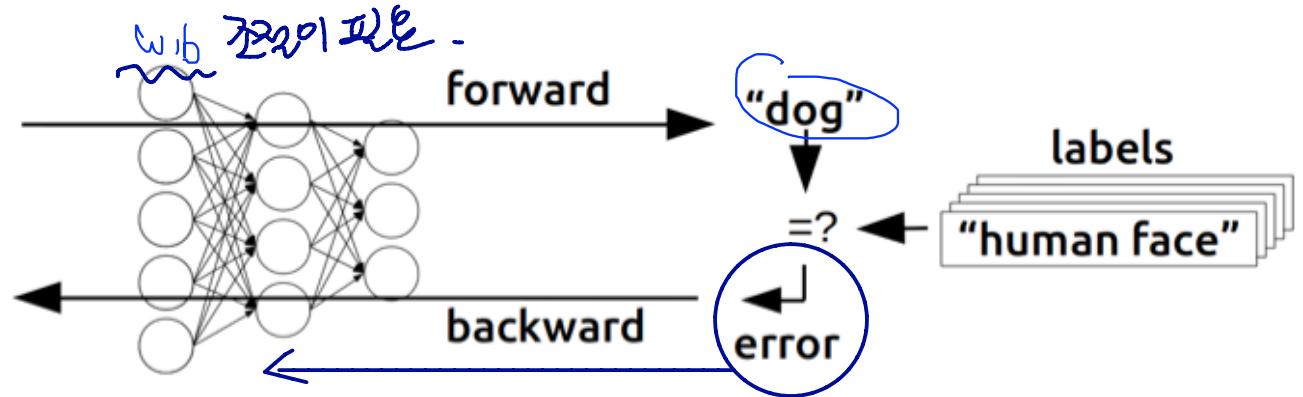
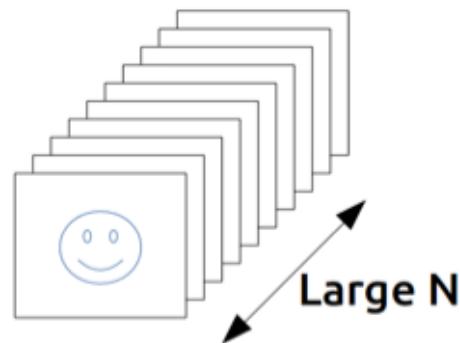
<http://cs231n.github.io/convolutional-networks/>

# Backpropagation 오류역전파 알고리즘

(1974, 1982 by Paul Werbos, 1986 by Hinton)

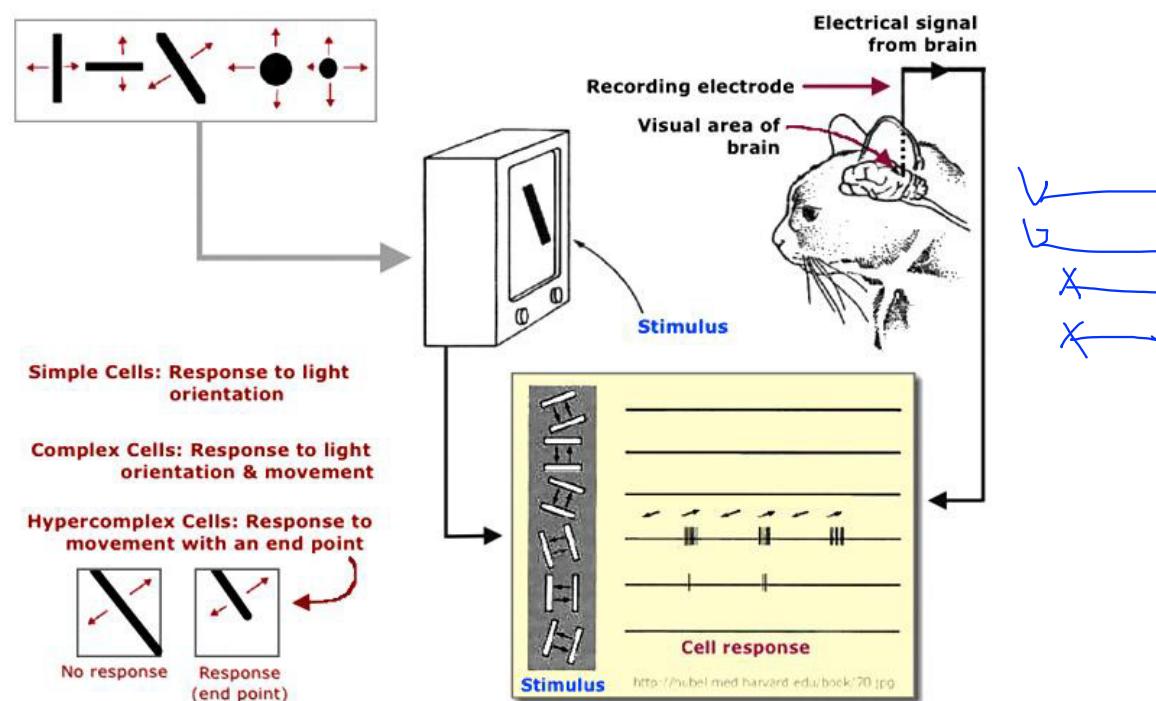


Training



<https://devblogs.nvidia.com/parallelforall/inference-next-step-gpu-accelerated-deep-learning/>

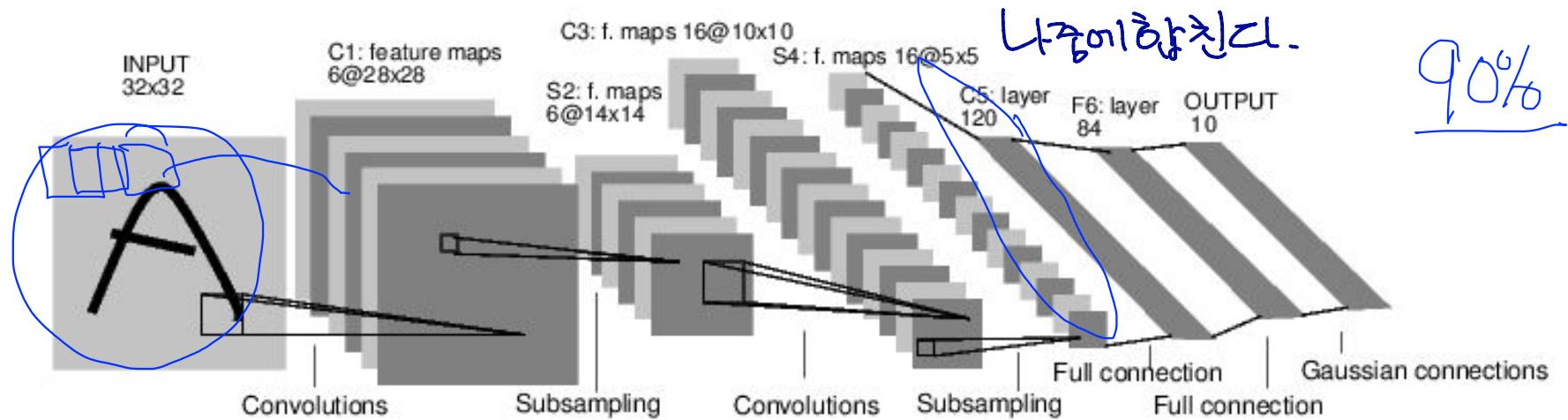
# Convolutional Neural Networks



Hubel & Wiesel, 1959

알파고도

# Convolutional Neural Networks



나중에 학습된다.  
90%

"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]

NavLab 1984 - 1994



“Alvinn: An autonomous land vehicle in a neural network”

# Terminator 2 (1991)



**JOHN**: Can you learn? So you can be... you know. More human. Not such a dork all the time.

**TERMINATOR**: My CPU is a **neural-net** processor... a learning computer. But **Skynet** presets the switch to "read-only" when we are sent out alone.

...

We'll learn how to **set** the neural net

**TERMINATOR** Basically. (starting the engine, backing out) The **Skynet** funding bill is passed. The system goes on-line August 4th, 1997. Human decisions are removed from strategic defense. **Skynet** begins to learn, at a geometric rate. It becomes **self-aware** at 2:14 a.m. eastern time, August 29. In a panic, they try to pull the plug.

**SARAH**: And **Skynet** fights back.

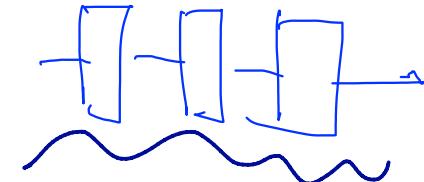
**TERMINATOR**: Yes. It launches its ICBMs against their targets in Russia.

**SARAH**: Why attack Russia?

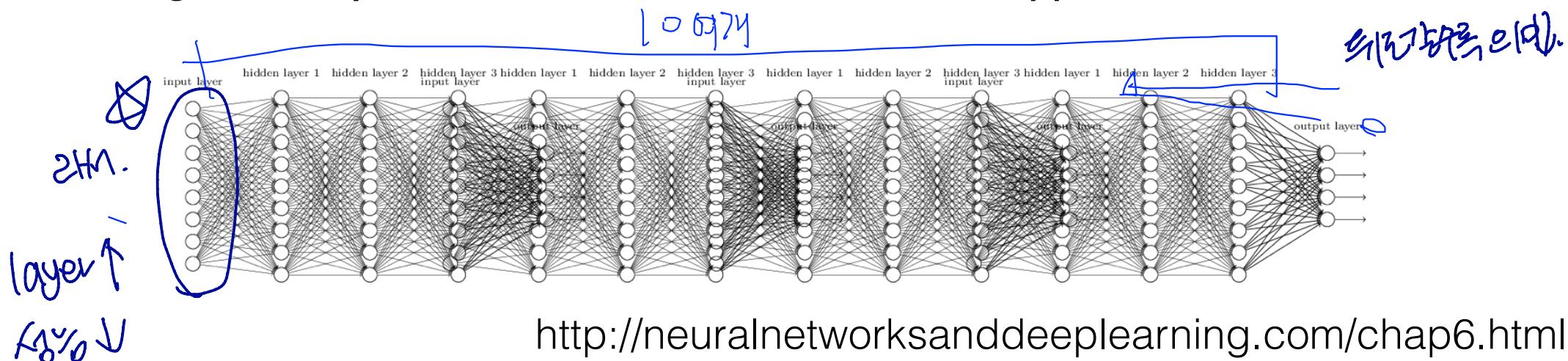
**TERMINATOR**: Because **Skynet** knows the Russian counter-strike will remove its enemies here.

layer van  
act. fun.

# 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



Next  
To be continued...



# CIFAR

- Canadian Institute for Advanced Research (CIFAR)
- CIFAR encourages basic research without direct application, was what motivated **Hinton** to move to Canada in 1987, and funded his work afterward.



**CIFAR**

CANADIAN INSTITUTE  
for ADVANCED RESEARCH

<http://www.andreykurenkov.com/writing/a-brief-history-of-neural-nets-and-deep-learning-part-4/>

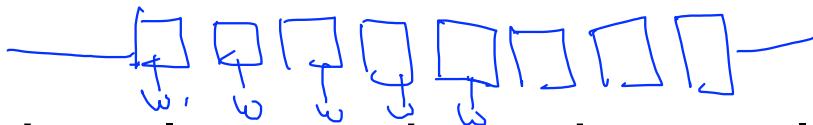
# “Everyone else was doing something different”

- “It was the worst possible time,” says Bengio, a professor at the Université de Montréal and co-director of the CIFAR program since it was renewed last year. “Everyone else was doing something different. Somehow, Geoff convinced them.”
- “We should give (CIFAR) a lot of credit for making that gamble.”
- CIFAR “had a huge impact in forming a community around deep learning,” adds LeCun

- In 2006, Hinton, Simon Osindero, and Yee-Whye Teh published, “A fast learning algorithm for deep belief nets”
- Yoshua Bengio et al. in 2007 with “Greedy Layer-Wise Training of Deep Networks”

# Breakthrough

in 2006 and 2007 by Hinton and Bengio



초기값을 잘 초기화하는가

- 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.
- Rebranding to Deep Nets, Deep Learning

# IMAGENET Large Scale Visual Recognition Challenge

Steel drum

The Image Classification Challenge:

1,000 object classes

1,431,167 images

What's picture?



Output:  
Scale  
T-shirt  
Steel drum  
Drumstick  
Mud turtle



Output:  
Scale  
T-shirt  
Giant panda  
Drumstick  
Mud turtle

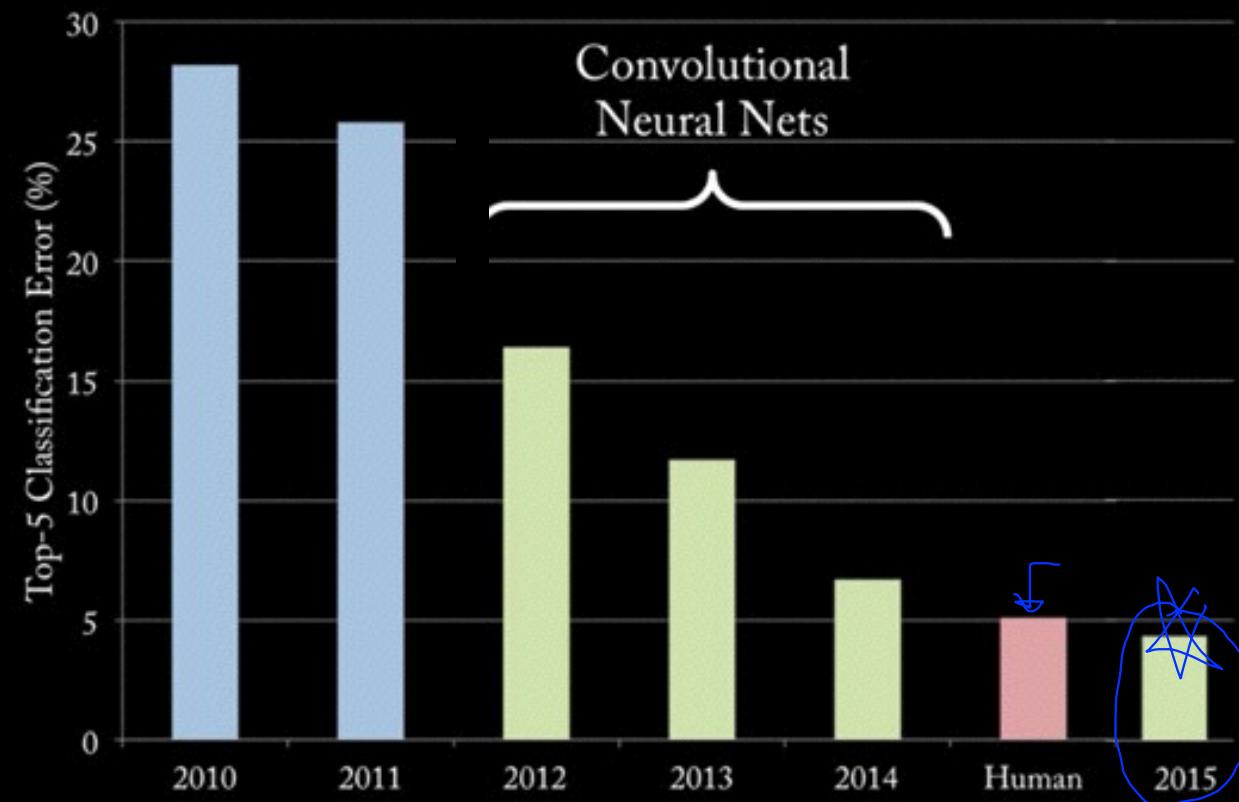


Russakovsky et al. arXiv, 2014

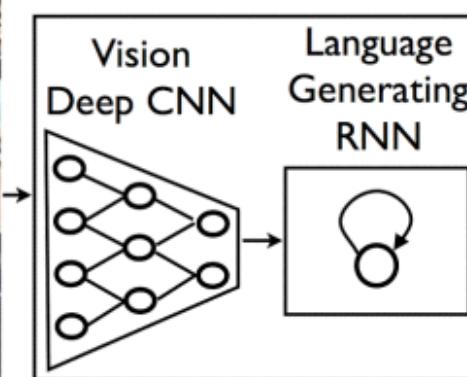
# ImageNet Classification (2010 -



# ImageNet Classification (2010 – 2015)



# Neural networks that can explain photos



**A group of people  
shopping at an  
outdoor market.**

**There are many  
vegetables at the  
fruit stand.**

# Deep API Learning\*

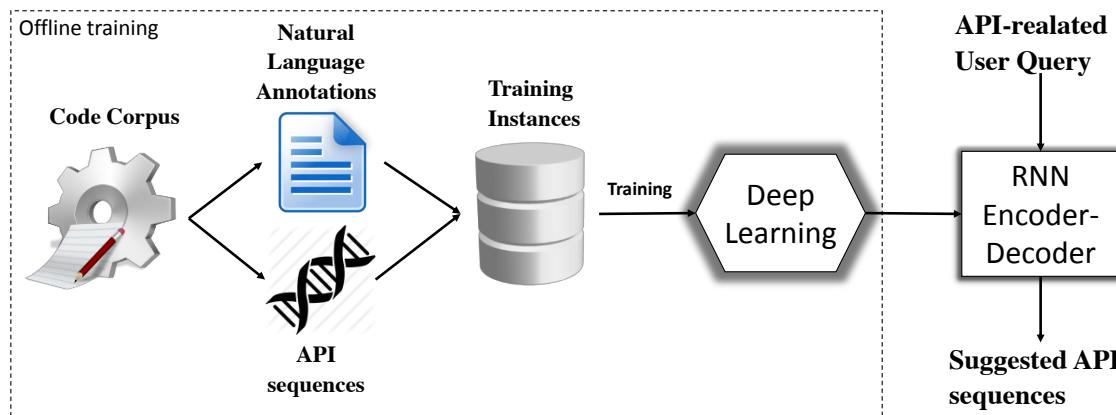
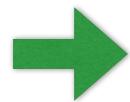


Figure 3: The Overall Workflow of DEEPAPI

copy a file and save it to  
-your destination path ↗

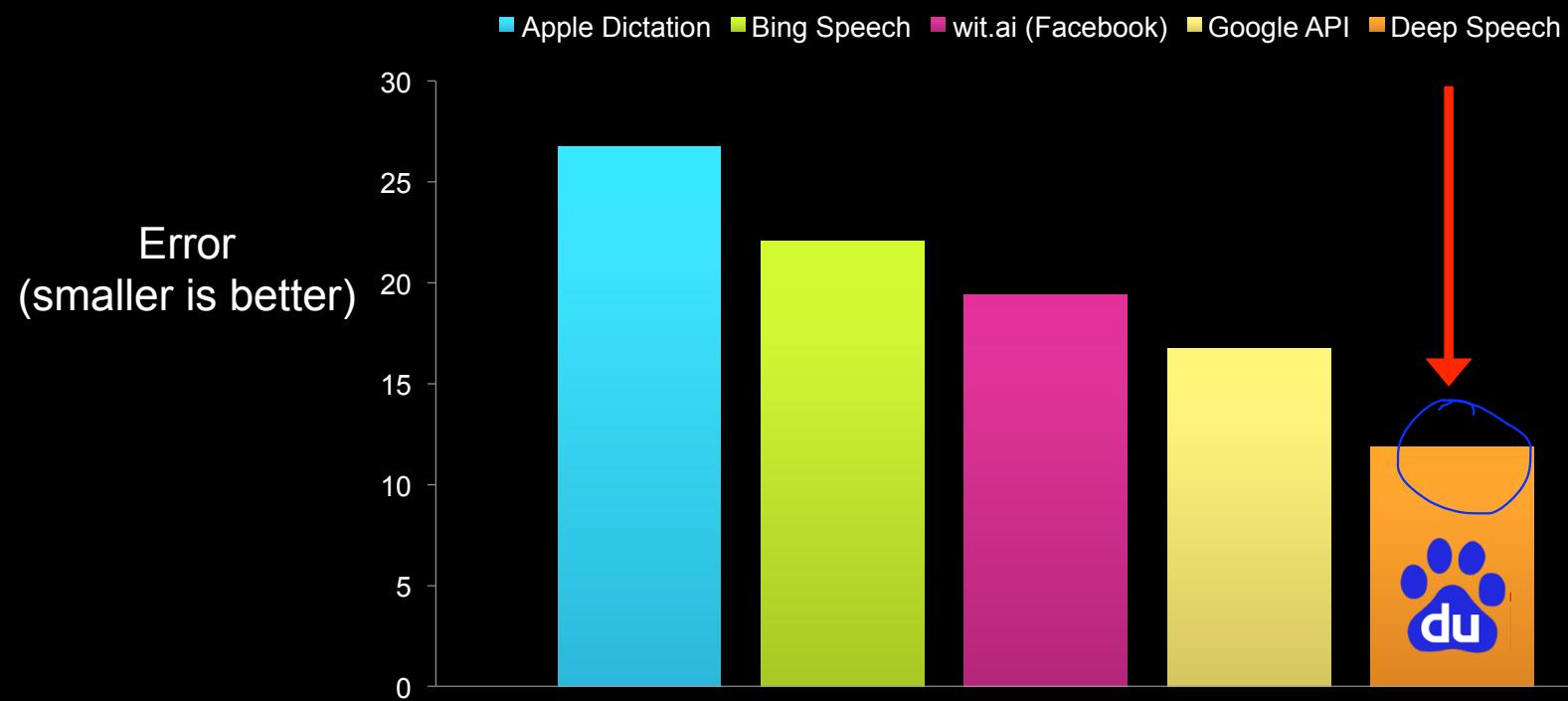


FileInputStream.new FileOutputStream.new FileInputStream.getChannel FileInputStream.getChannel FileInputStream.size FileInputStream.transferTo FileInputStream.close FileOutputStream.close FileInputStream.getChannel FileInputStream.close FileInputStream.close

NLP

\*GU et al. at HKUST with MSRA

# Speech recognition errors



Google DeepMind's Deep Q-learning playing Atari Breakout



<https://youtu.be/V1eYniJ0Rnk>



# 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?

- *I am not a researcher, not a computer scientist!*
- Do you have data?
- Do you sell something?
- Are doing any business?



English (auto-generated)  
Click for settings

## Random Search vs. Grid Search

Random Search for Hyper-Parameter Optimization  
Bergstra and Bengio, 2012

Fei-Fei Li & Andrej Karpathy & Justin Johnson      Lecture 5 - 90      20 Jan 2016

different taxes and you end up with a better spot than here where you've

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1:11:05 / 1:18:37

## CS231n Winter 2016: Lecture 5: Neural Networks Part 2



Andrej Karpathy

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ISSTA

Published by Andreas Zeller [?] · 45 mins ·

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Stevão Andrade



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3

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Sungjin Kim's birthday is today

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A screenshot of a Google search results page. The search bar at the top contains the query "sung kim". Below the search bar are several navigation links: All (highlighted with a blue bracket and arrow), Images, News, Videos, Maps, More ▾, and Search tools. To the right of these are user profile icons for "Sung" and other account options. The main content area shows search results. At the top of the results is a snippet for "Sung Kim's CSE Homepage" from "www.cse.ust.hk/~hunkim/". Below this is another snippet for "Sung's Publications" from "www.cse.ust.hk/~hunkim/Publications.html". Further down is a snippet for "Sung Kim - Wikipedia, the free encyclopedia" from "https://en.wikipedia.org/wiki/Sung\_Kim".

About 113,000,000 results (0.66 seconds)

### Sung Kim's CSE Homepage

[www.cse.ust.hk/~hunkim/](http://www.cse.ust.hk/~hunkim/) ▾

Sung is an associate professor at the Hong Kong University of Science and Technology.

He was a post-doc at the Program Analysis Group at MIT. He received ...

Publications - Research - Software - Teaching

### Sung's Publications

[www.cse.ust.hk/~hunkim/Publications.html](http://www.cse.ust.hk/~hunkim/Publications.html) ▾

Sung's Publications. 2015. Jaechang Nam and Sunghun Kim, "Heterogeneous Defect Prediction", In Proceedings of the 10th European Software Engineering ...

### Sung Kim - Wikipedia, the free encyclopedia

[https://en.wikipedia.org/wiki/Sung\\_Kim](https://en.wikipedia.org/wiki/Sung_Kim) ▾

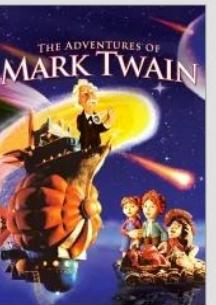
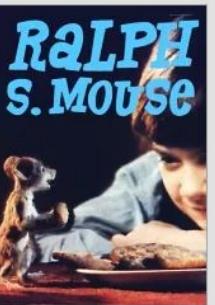
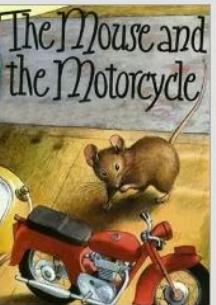
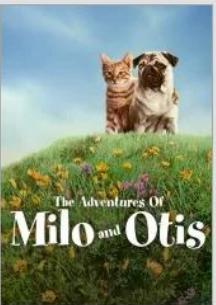
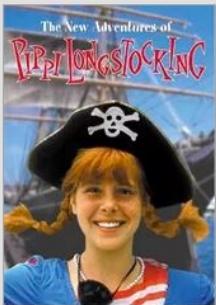
Sung Y. Kim (born 1960) is a Korean-born U.S. diplomat and the current United States Special Representative for North Korea Policy. He previously served as ...

Early life and education - Professional career - Ambassador to South Korea



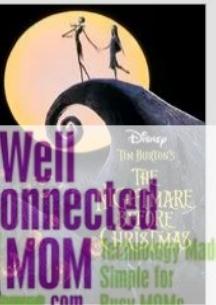
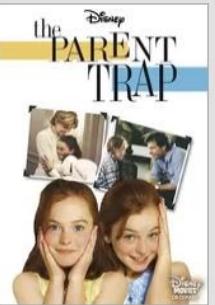
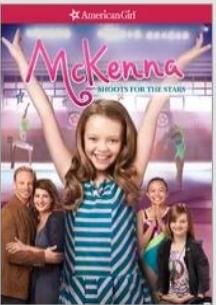
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Based on your interest in...



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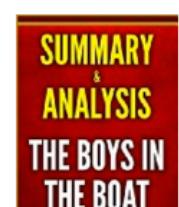
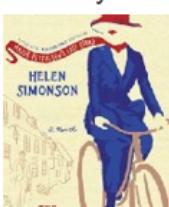
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  - Not too late to be a world expert
  - Not too complicated (mathematically)
- Practitioner      *90%↑ Accuracy.*
  - Accurate enough to be used in practice
  - many ready-to-use tools such as TensorFlow
  - Many easy/simple programming languages such as Python
- After all, it is fun!

Next  
Neural Nets Basic with  
XOR!

