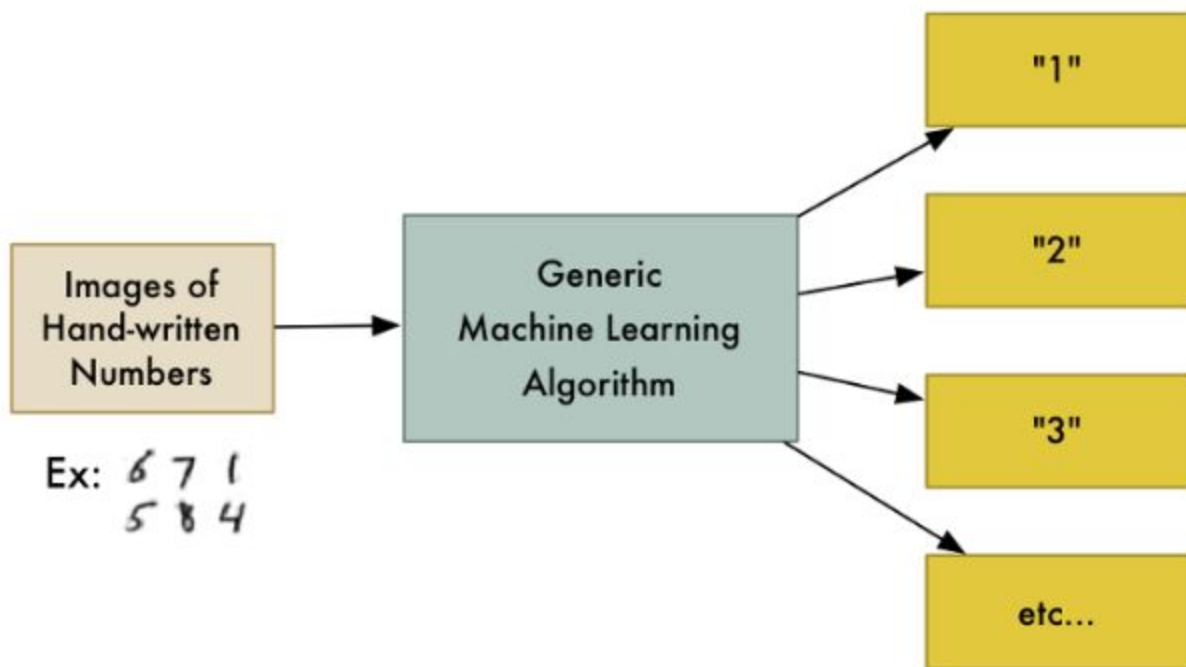


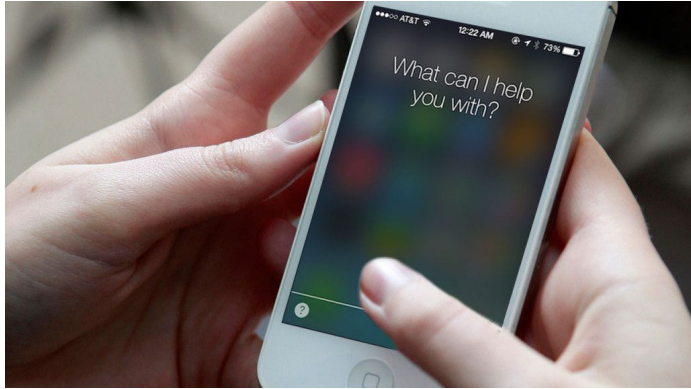
Introduksjon til maskinlæring

Av Bendik Kvamstad fra Epigram.AI

Hva er maskinlæring?

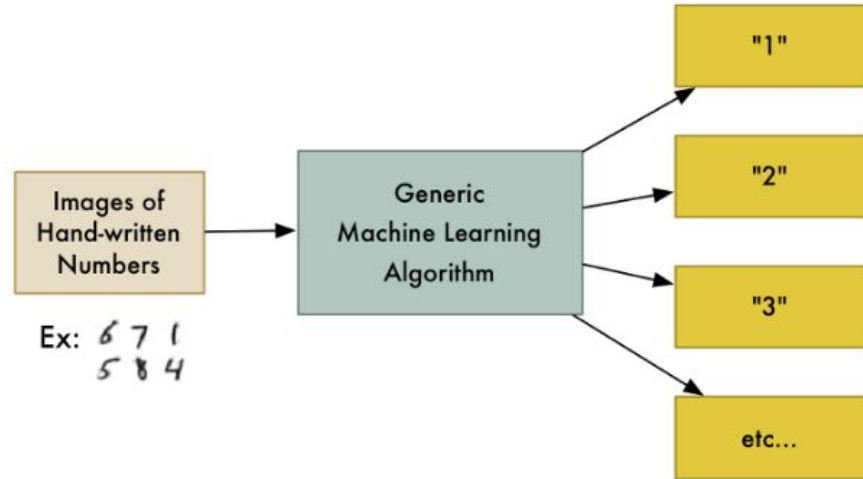


Used everywhere

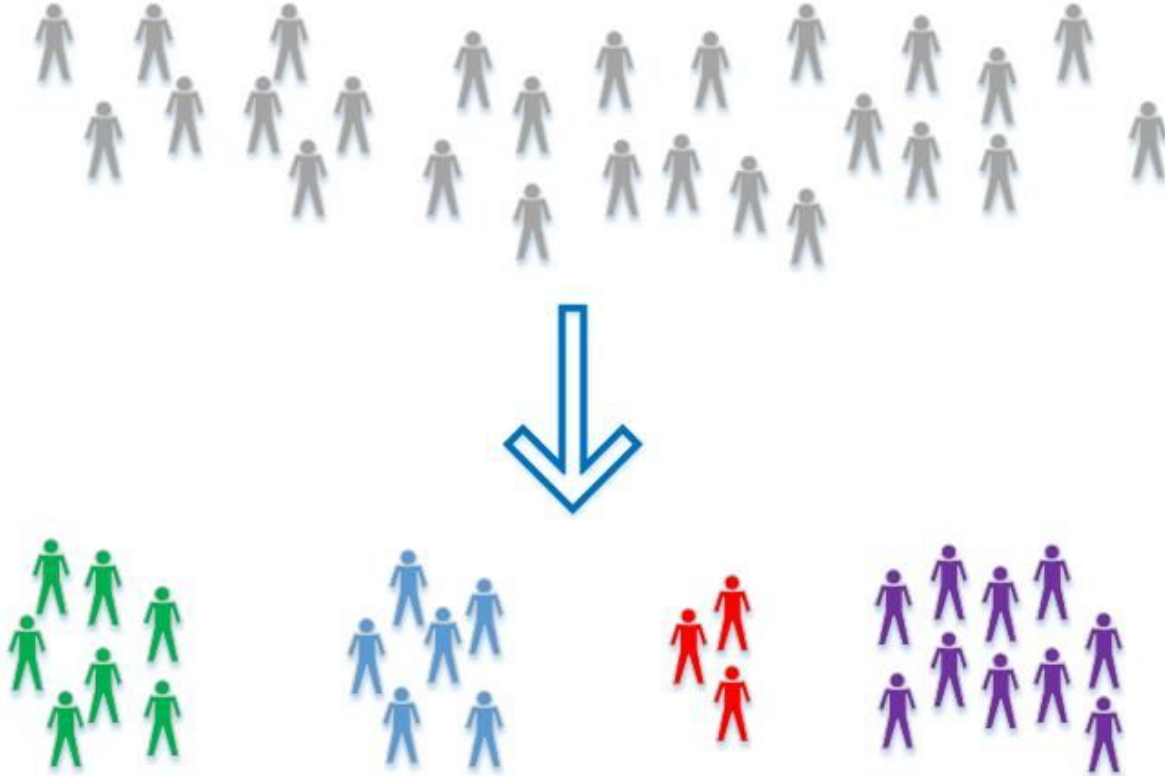


Supervised
vs
Unsupervised

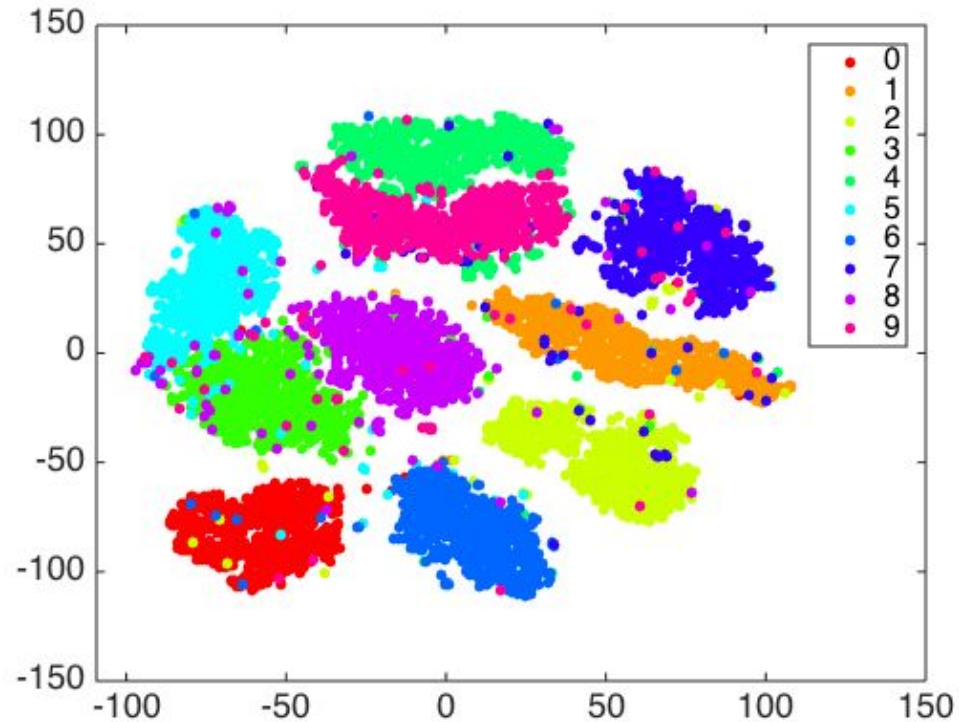
Supervised Learning



Unsupervised learning



Unsupervised learning



Unsupervised vs Supervised learning



Richard
@RichardSocher



Follow



Rather than spending a month figuring out an unsupervised machine learning problem, just label some data for a week and train a classifier.

RETWEETS

114

LIKES

289



5:47 PM - 10 Mar 2017



12



114



289

Machine learning - State of the art

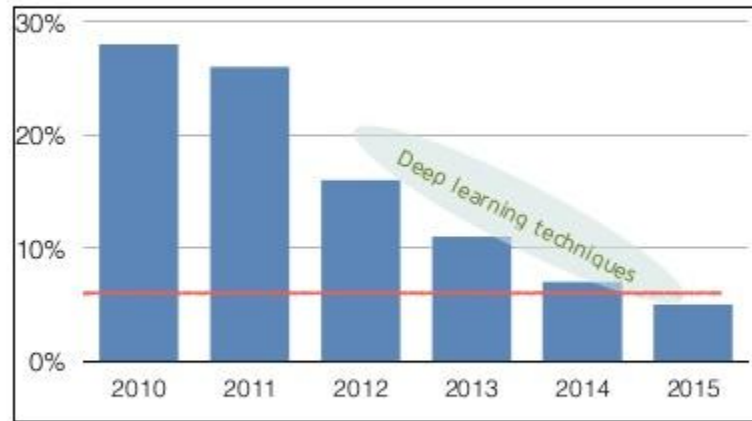
Imagenet



Image recognition

Imagenet ILSVRC Challenge

Error rate¹

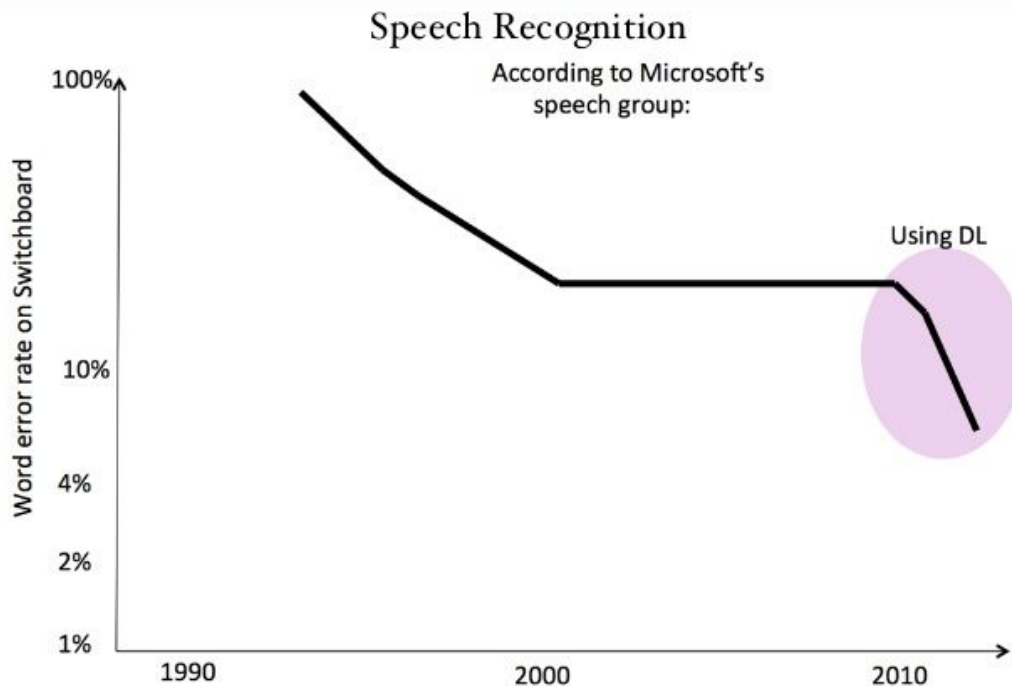


human
performance

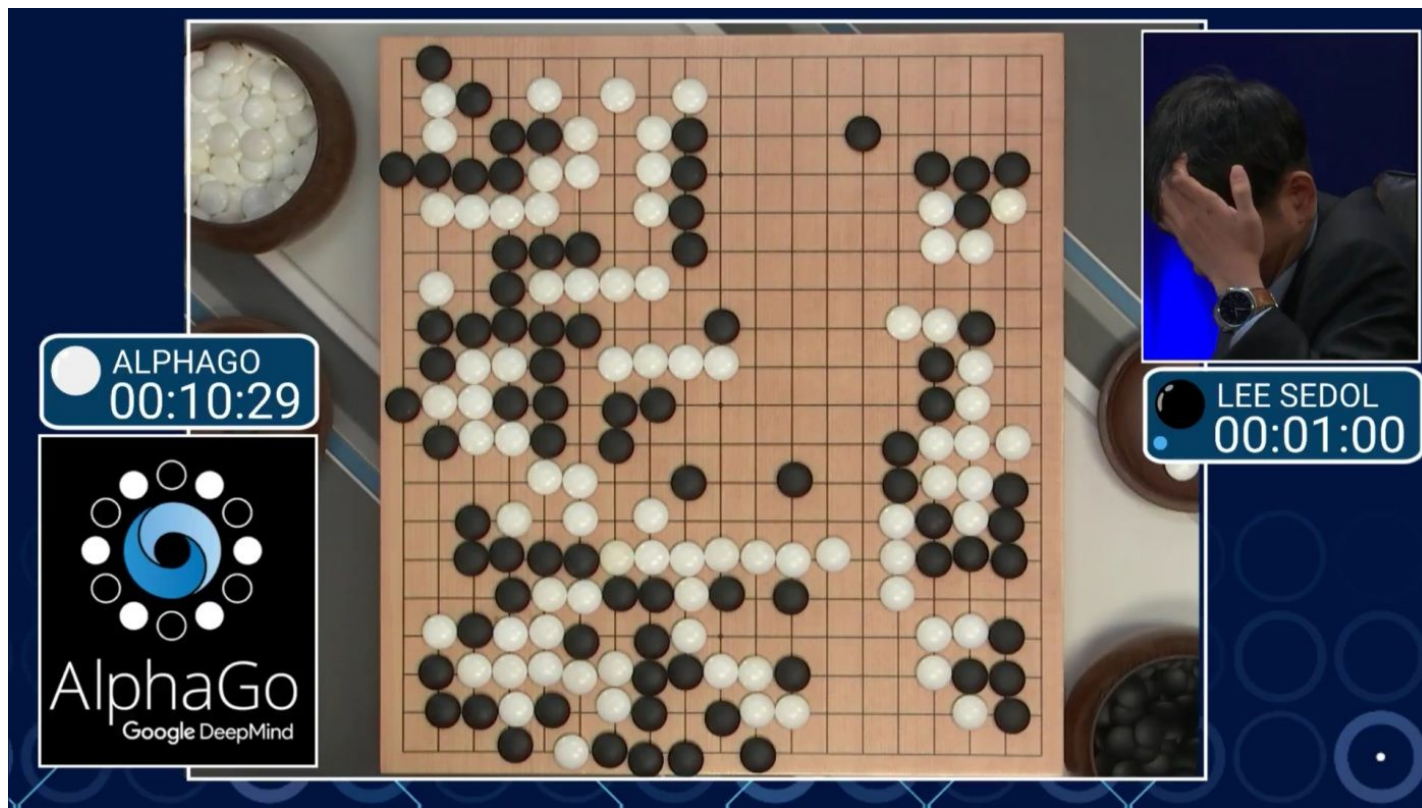
¹ Imagenet top-5 error rate
Source: Imagenet

Speech recognition

DL: Impact

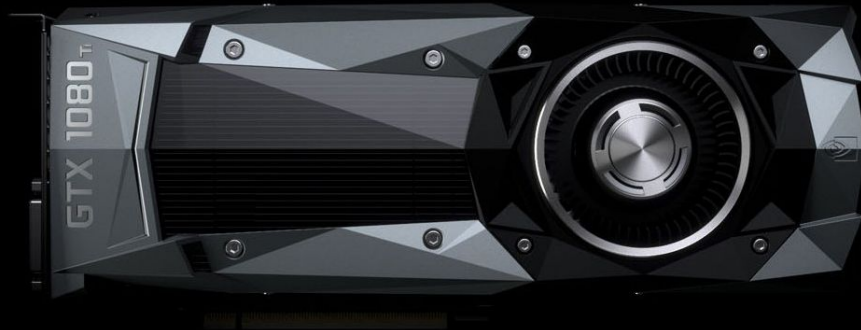


AlphaGO



Why now? - GPUs

Geforce GTX 1080 Ti



What is deep learning?

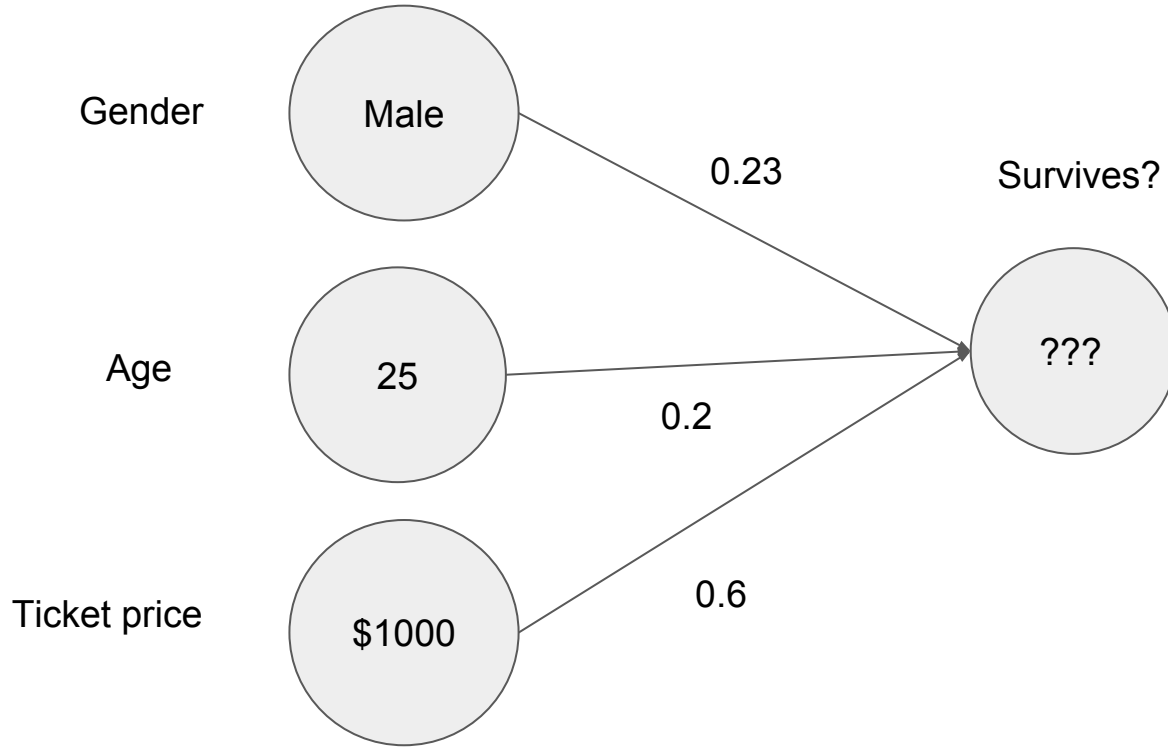
Titanic: Machine Learning from Disaster



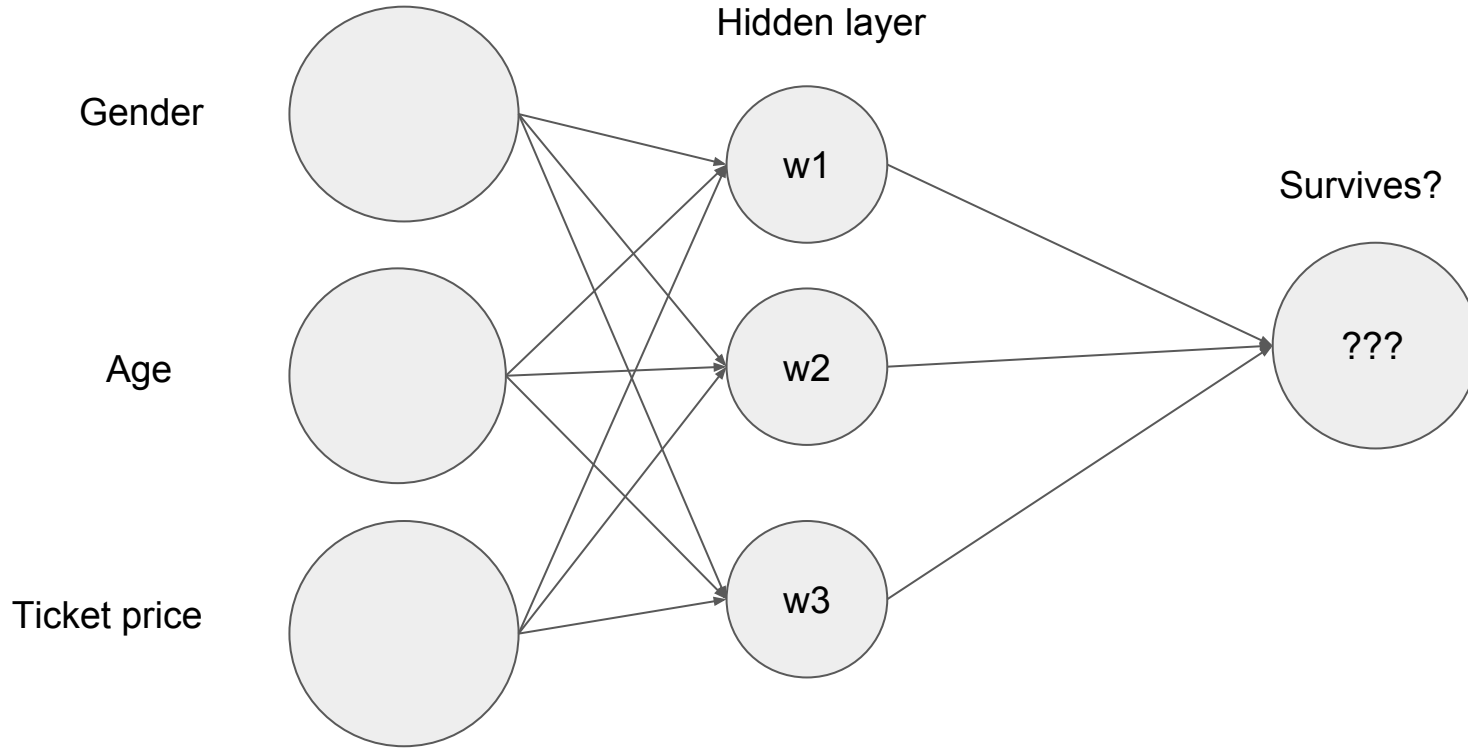
Titanic passenger information

Gender	Age	Ticket price	Survived
Male	55	\$1500	Yes
Female	75	\$50	No
Male	30	\$15	No
Female	25	\$12	Yes

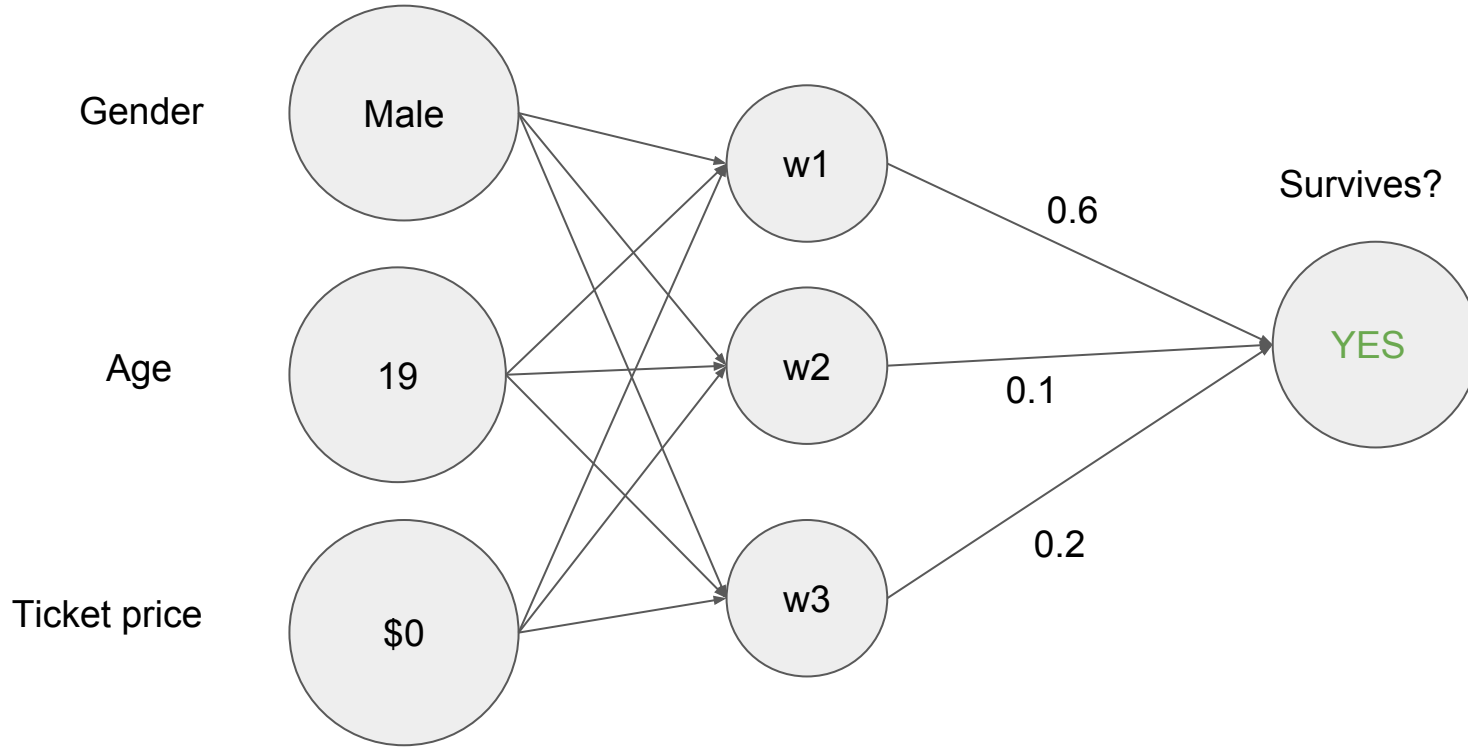
Titanic survival



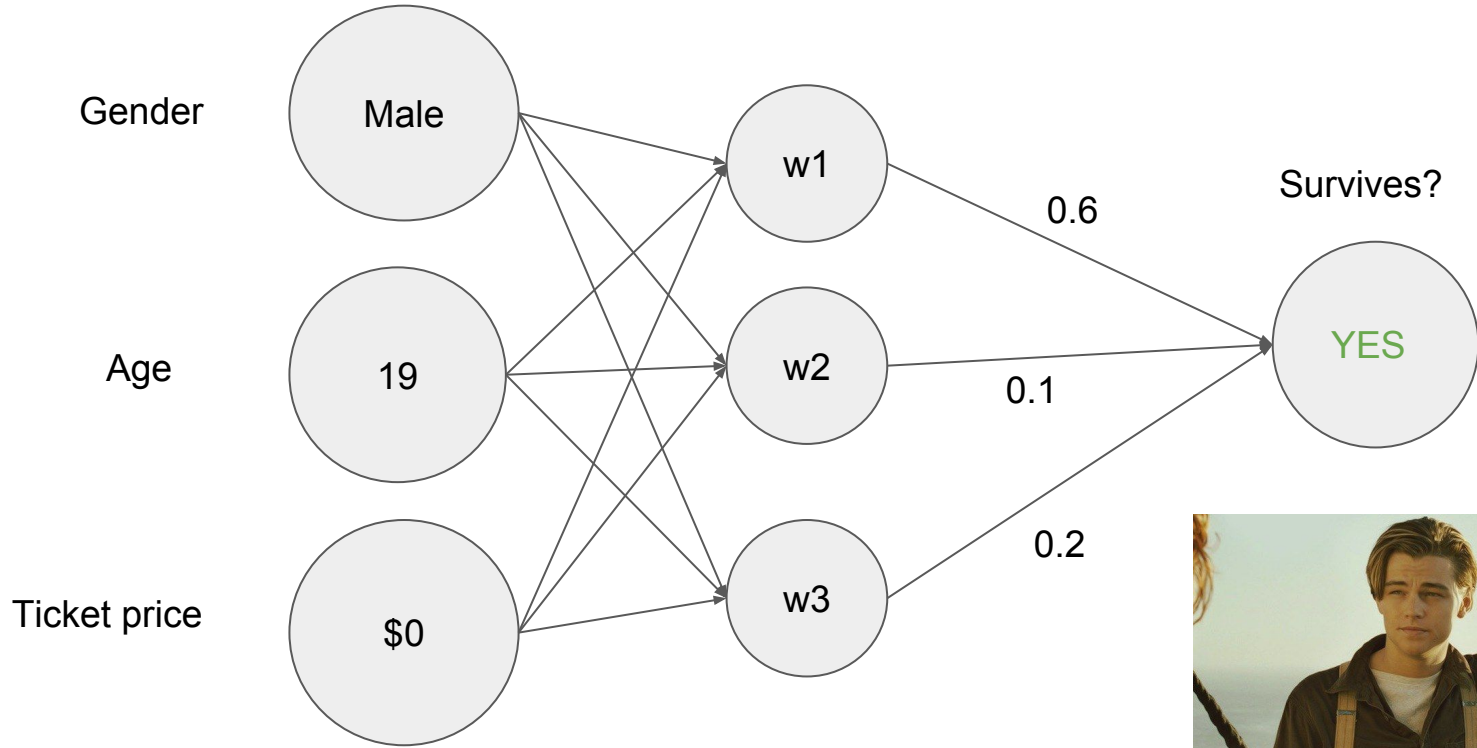
Neural network



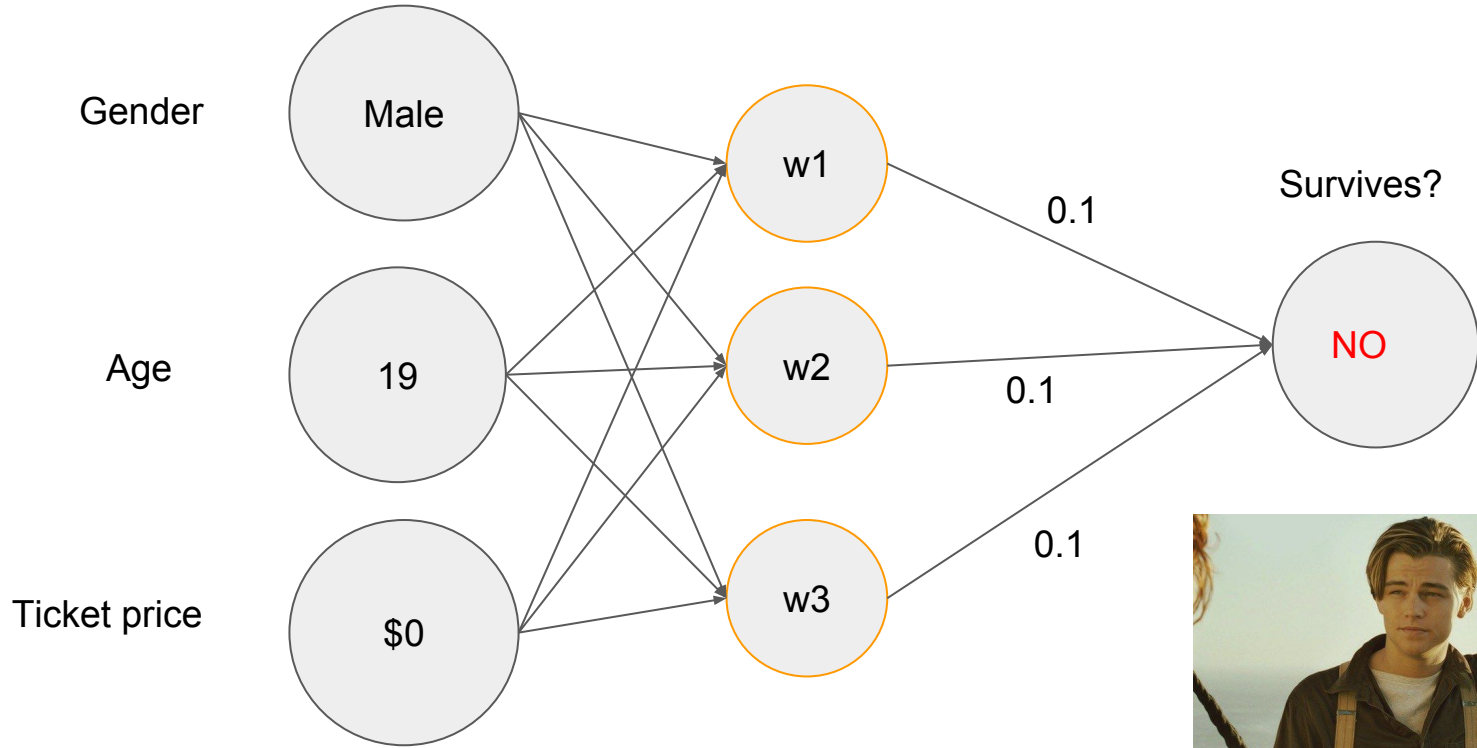
Titanic survival



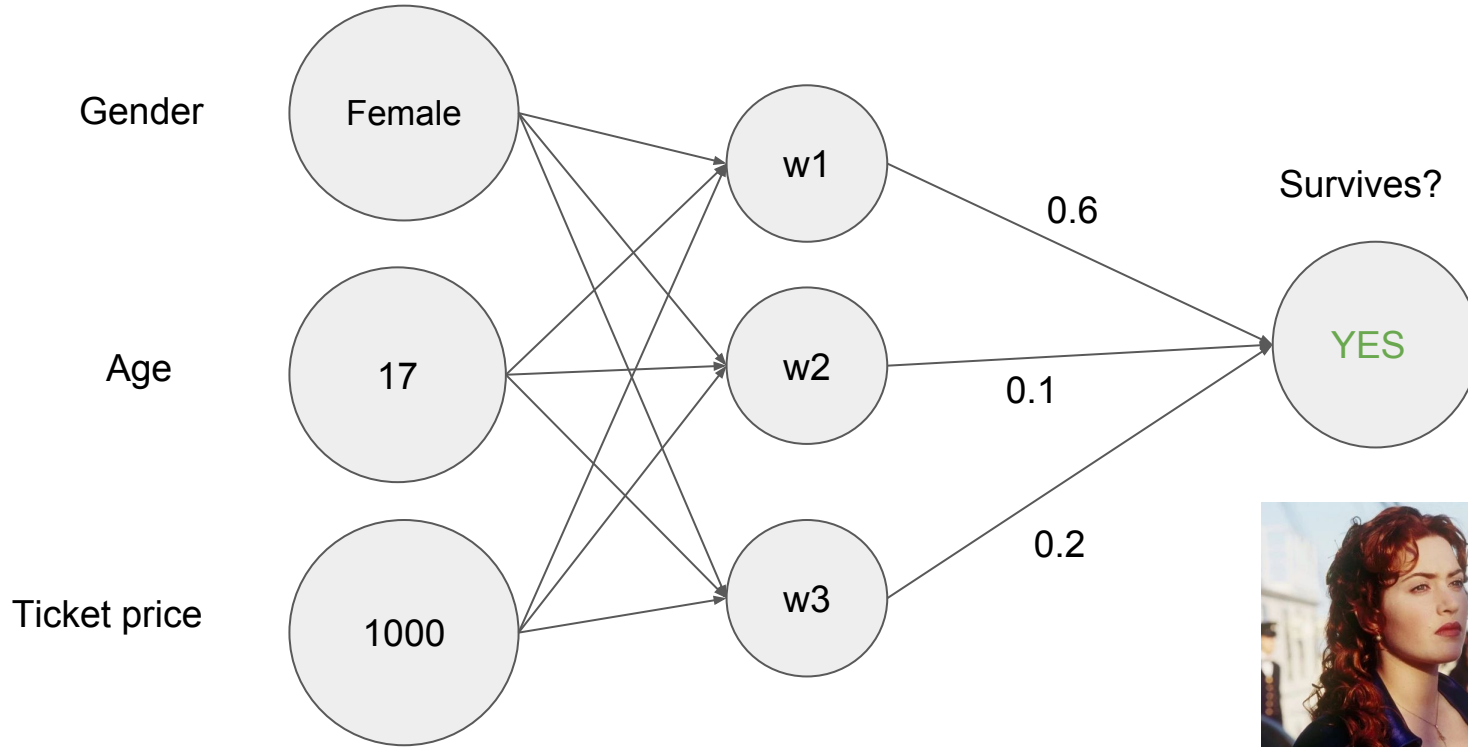
Titanic survival



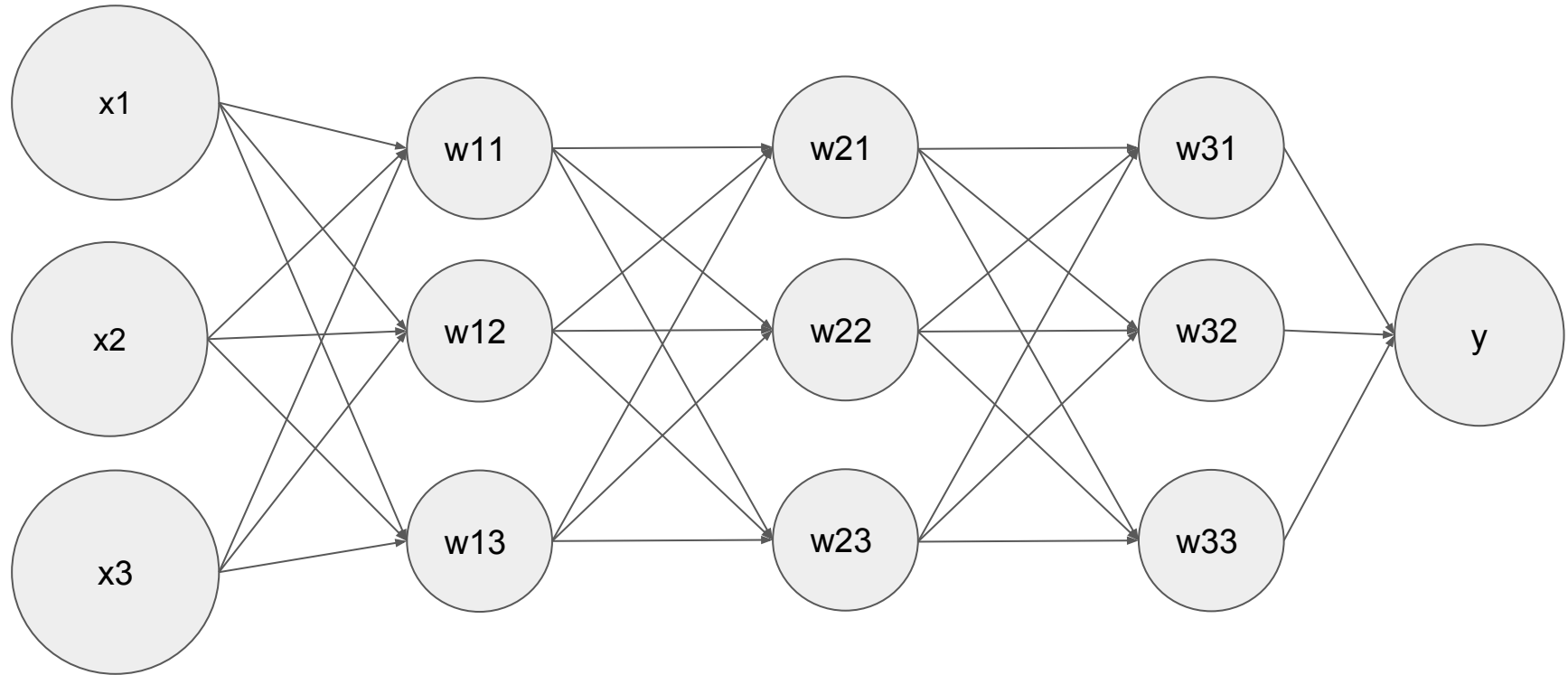
Titanic survival



Titanic survival

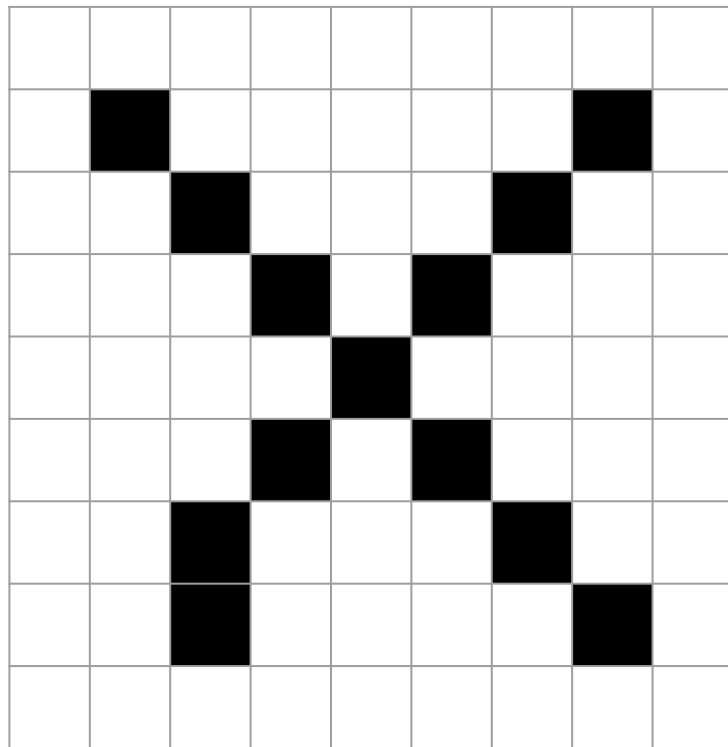
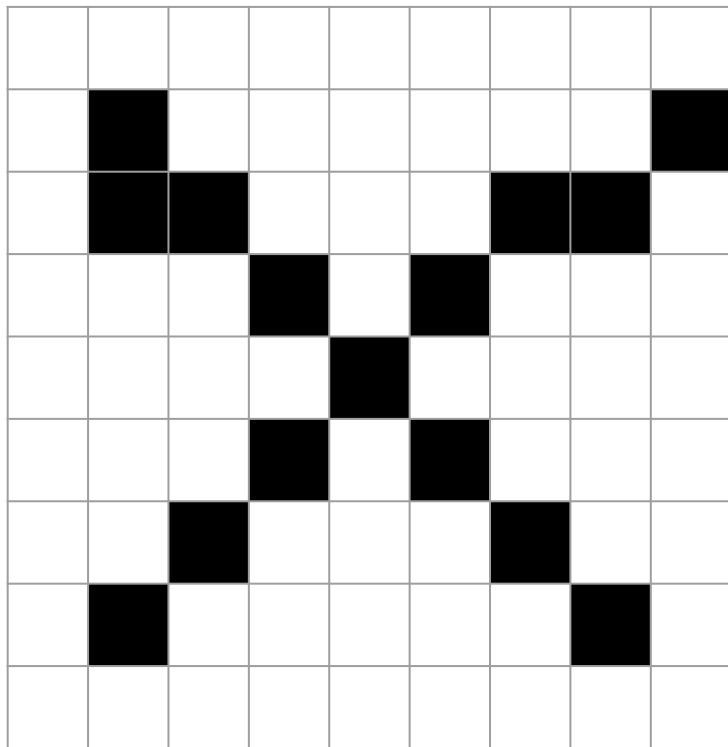


Deep neural network

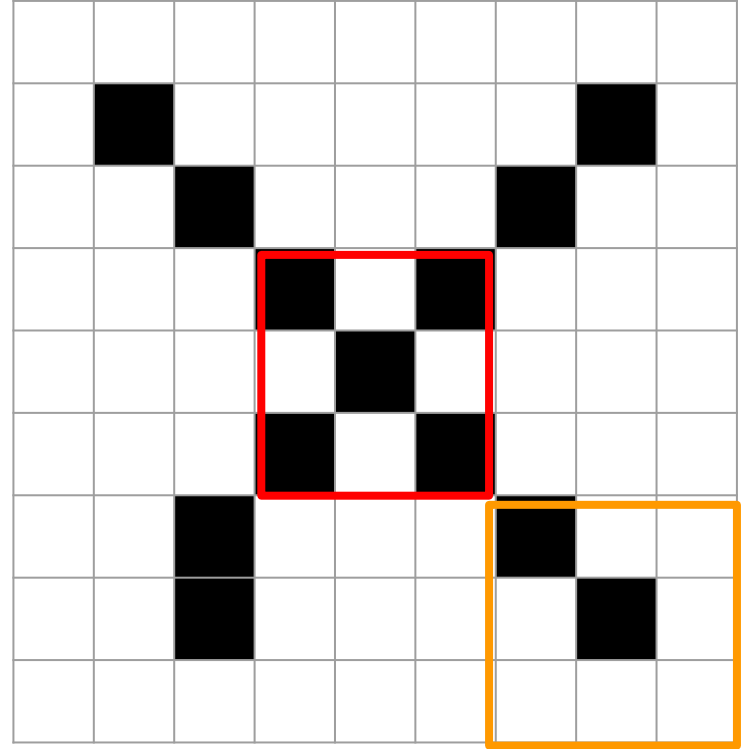
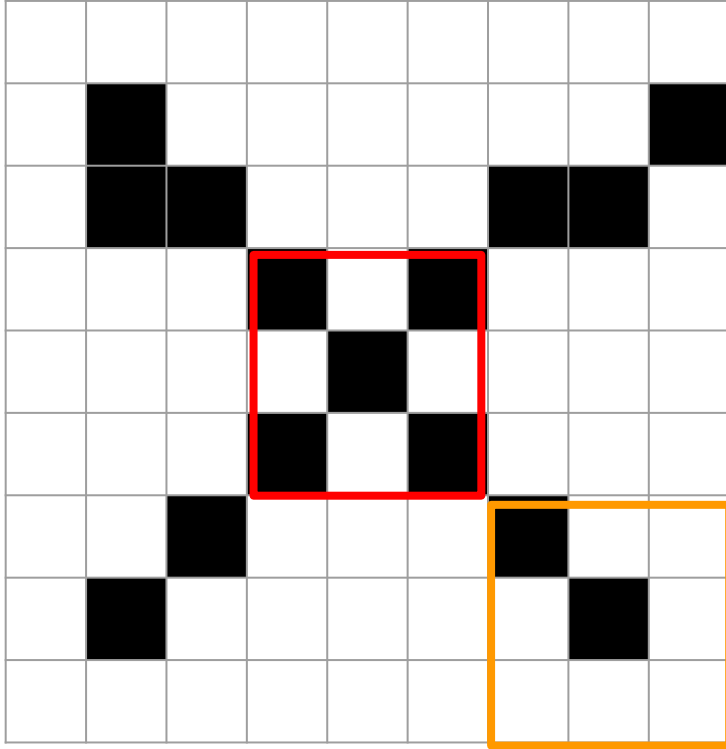


Images?





Convolutional neural network (CNN)



1	-1	-1
-1	1	-1
-1	-1	1

-1	-1	-1	-1	-1	-1	-1	-1	-1
-1	1	-1	-1	-1	-1	-1	1	-1
-1	-1	1	-1	-1	-1	1	-1	-1
-1	-1	-1	1	-1	1	-1	-1	-1
-1	-1	-1	-1	1	-1	-1	-1	-1
-1	-1	-1	1	-1	1	-1	-1	-1
-1	-1	1	-1	-1	-1	1	-1	-1
-1	1	-1	-1	-1	-1	-1	1	-1
-1	-1	-1	-1	-1	-1	-1	-1	-1

A 5x5 grid is shown. A 2x2 area in the top-left corner is highlighted with a thick orange border. An arrow points from the left edge of this orange box to the number 1.

-1	-1	-1	-1	-1	-1	-1	-1	-1
-1	1	-1	-1	-1	-1	-1	1	-1
-1	-1	1	-1	-1	-1	1	-1	-1
-1	-1	-1	1	-1	1	-1	-1	-1
-1	-1	-1	-1	1	-1	-1	-1	-1
-1	-1	-1	1	-1	1	-1	-1	-1
-1	-1	1	-1	-1	-1	1	-1	-1
-1	1	-1	-1	-1	-1	-1	1	-1
-1	-1	-1	-1	-1	-1	-1	-1	-1

1	-1	-1
-1	1	-1
-1	-1	1

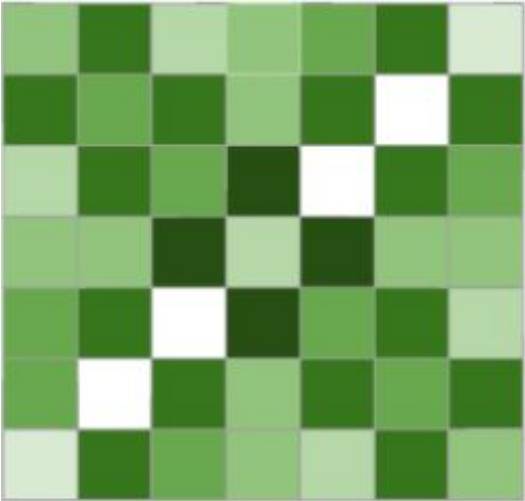
.7	-.1	.1	.3	.5	-.1	.3
-.1	1	-.1	.3	-.1	.1	-.1
.1	-.1	1	-.3	.1	-.1	.5
.3	.3	-.3	.5	-.3	.3	.3
.5	-.1	.1	-.3	1	-.1	.1
-.1	.1	-.1	-.3	-.1	1	.1
.3	-.1	.5	.3	.1	-.1	.7

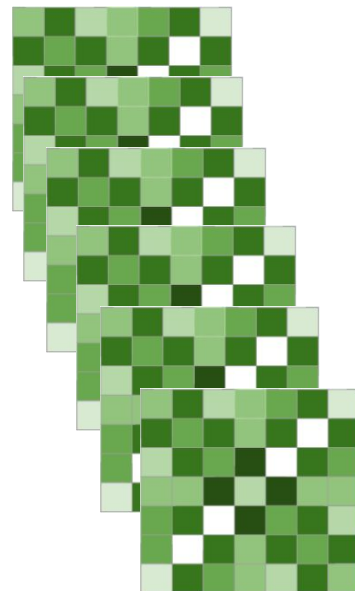
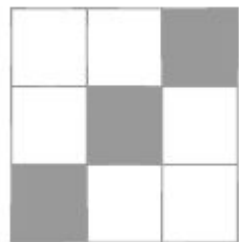
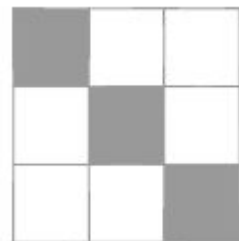
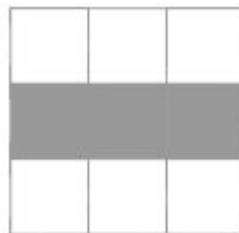
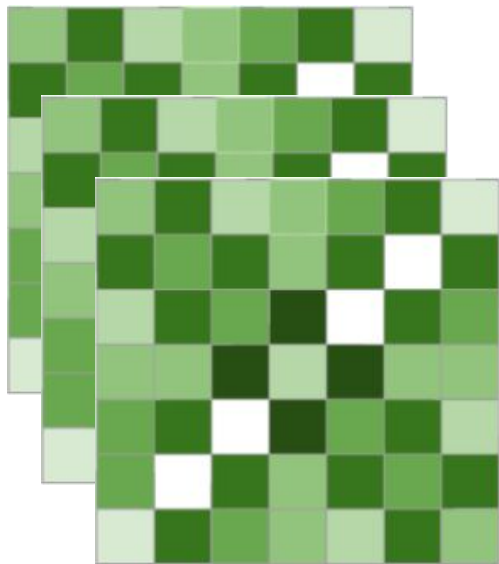
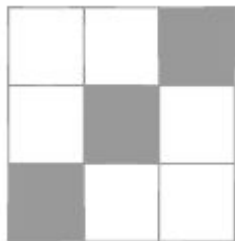
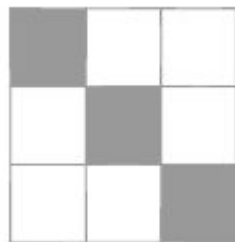
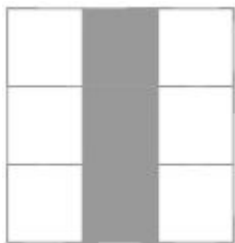
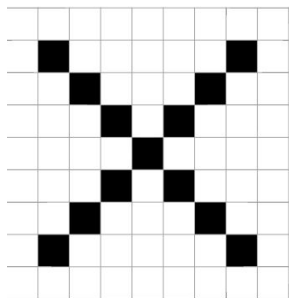
-1	-1	-1	-1	-1	-1	-1	-1	-1
-1	1	-1	-1	-1	-1	-1	1	-1
-1	-1	1	-1	-1	-1	1	-1	-1
-1	-1	-1	1	-1	1	-1	-1	-1
-1	-1	-1	-1	1	-1	-1	-1	-1
-1	-1	-1	1	-1	1	-1	-1	-1
-1	-1	1	-1	-1	-1	1	-1	-1
-1	1	-1	-1	-1	-1	-1	1	-1
-1	-1	-1	-1	-1	-1	-1	-1	-1

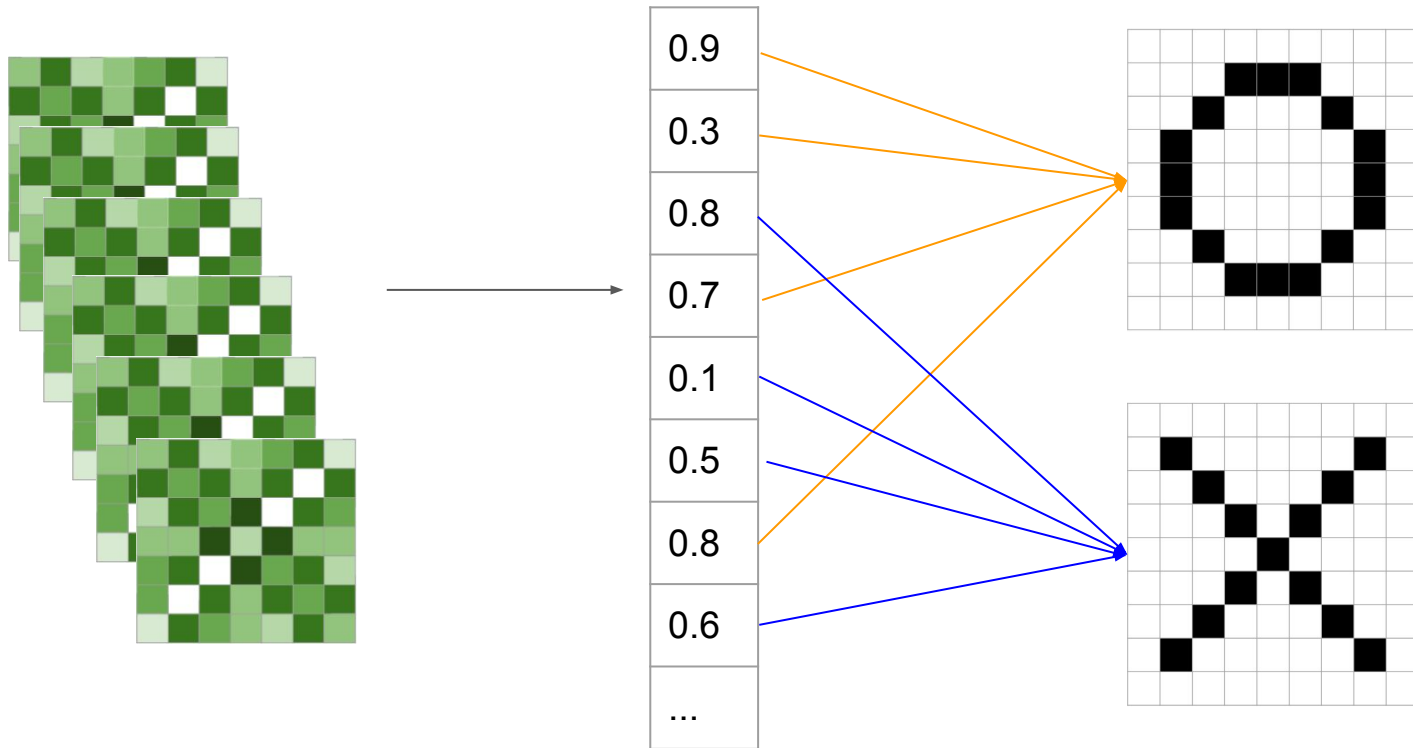
1	-1	-1
-1	1	-1
-1	-1	1

-1	-1	1
-1	1	-1
1	-1	-1

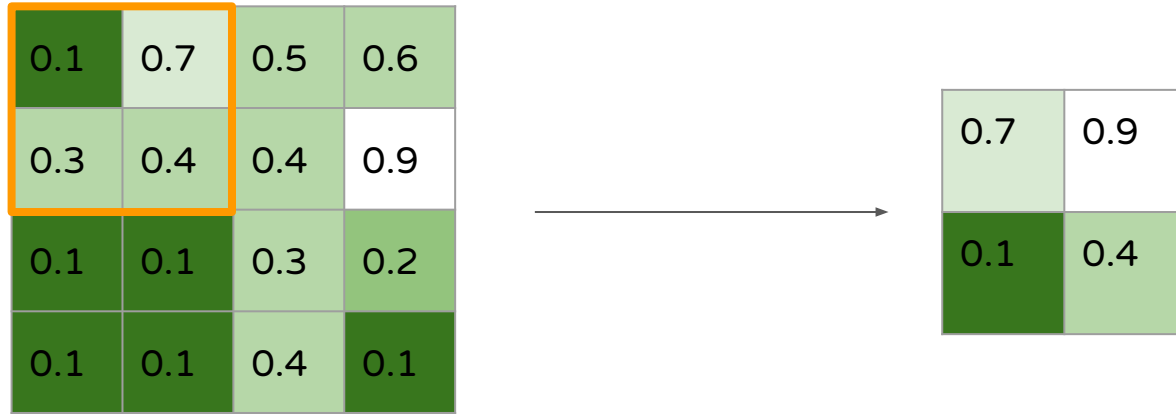
.7	-.1	.1	.3	.5	-.1	.3
-.1	1	-.1	.3	-.1	.1	-.1
.1	-.1	1	-.3	.1	-.1	.5
.3	.3	-.3	.5	-.3	.3	.3
.5	-.1	.1	-.3	1	-.1	.1
-.1	.1	-.1	-.3	-.1	1	.1
.3	-.1	.5	.3	.1	-.1	.7



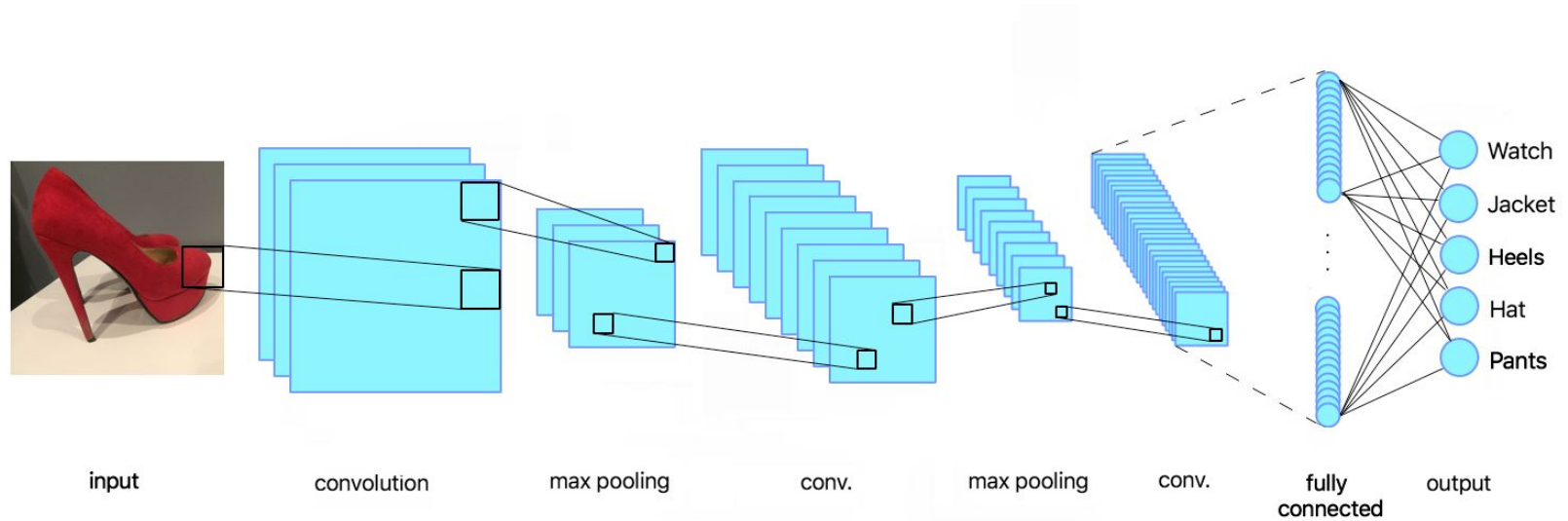


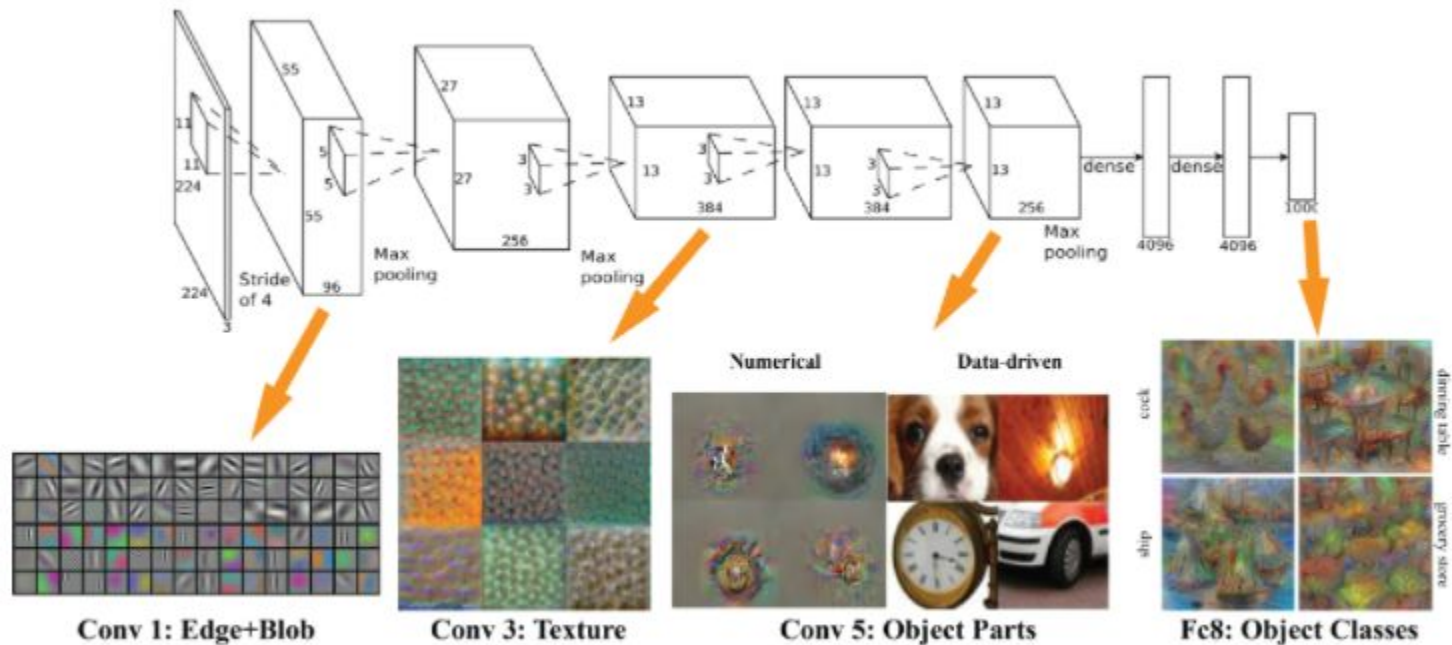


Max pooling



Deep learning cnn model



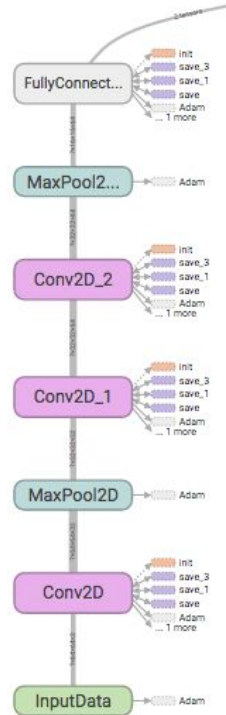


Cats vs Dogs

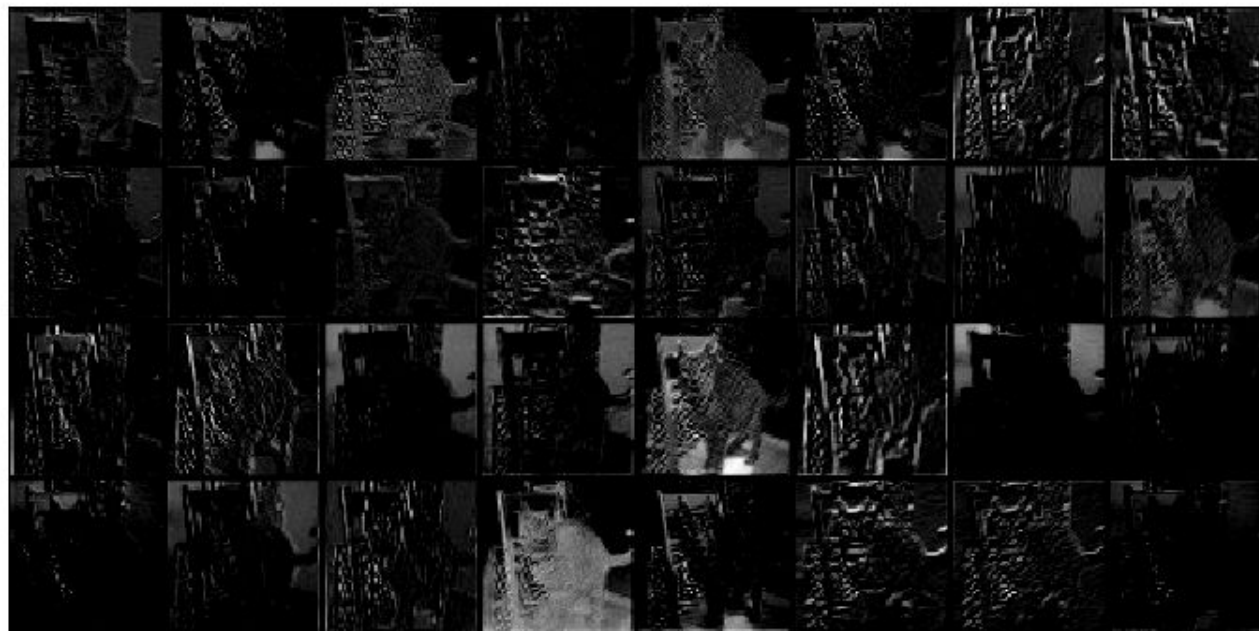


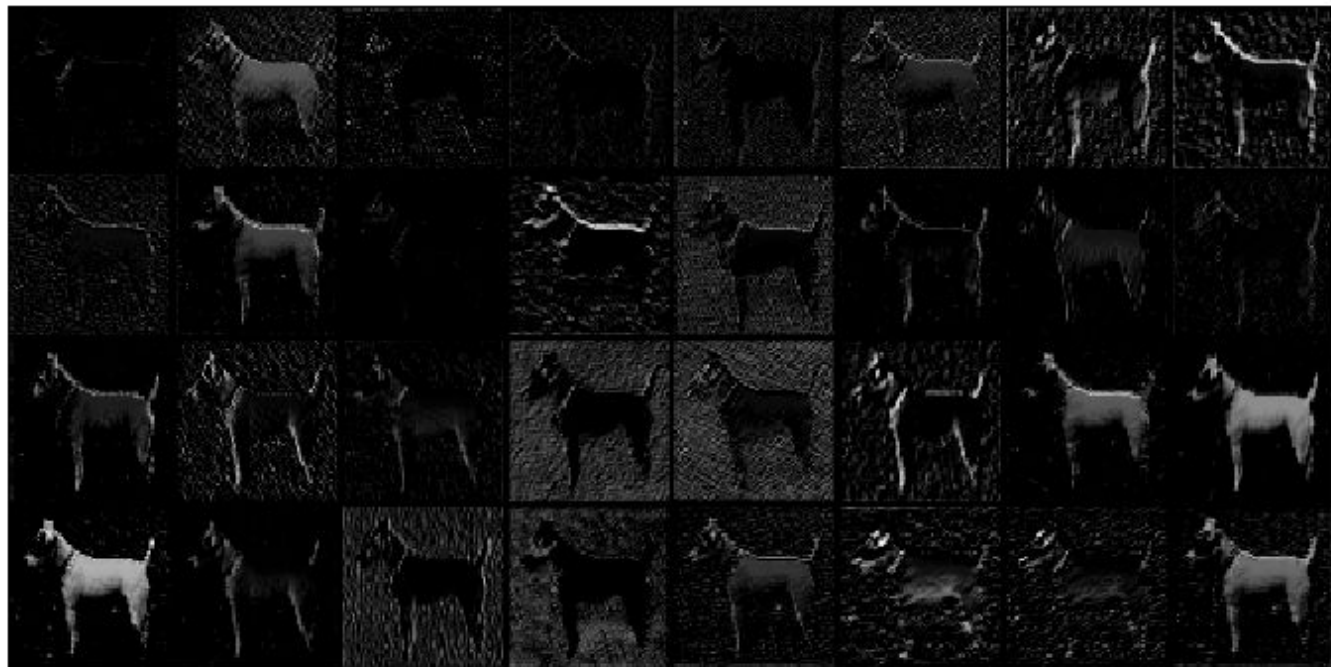


Cats vs Dogs - Model

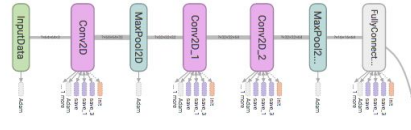


Tensorflow demo

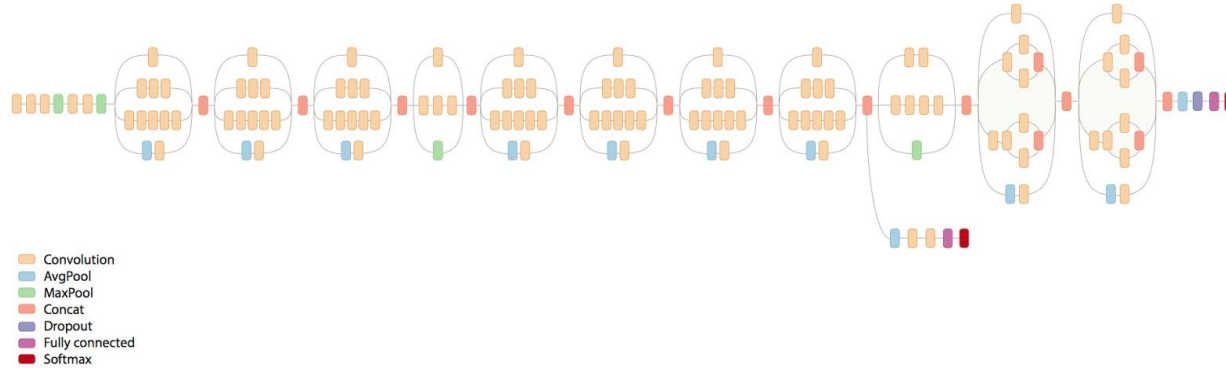




Our model

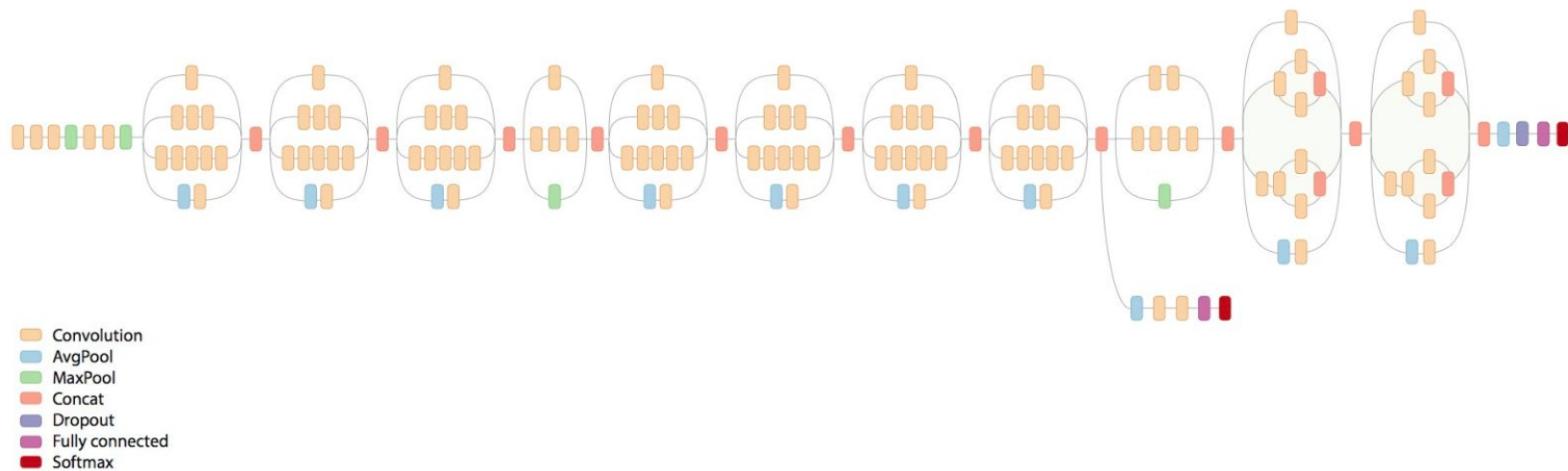


State-of-the-art



Transfer learning

Inception V3



JPEG



Inception Features
(abstract illustration)



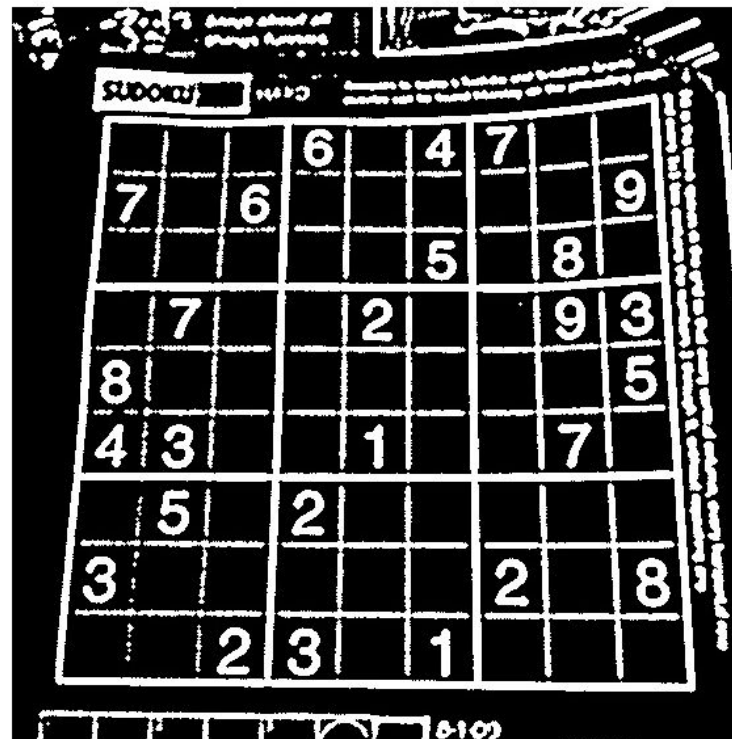
Inception demo

Tips og Triks

OpenCV



An image with a sudoku puzzle



Learning resources

- Machine Learning is Fun! (<https://medium.com/@ageitgey/machine-learning-is-fun-80ea3ec3c471#.s71r3kpe5>)
- Andrew Ng - Machine learning (<https://www.coursera.org/learn/machine-learning>)
- Tensorflow.com
- Kaggle.com (Titanic example)
- <https://gym.openai.com/>

Spørsmål?

Kontakt: bendik@epigram.ai