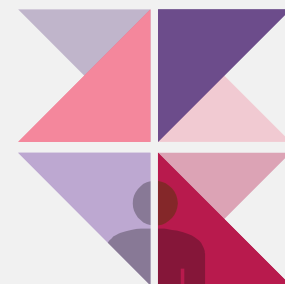
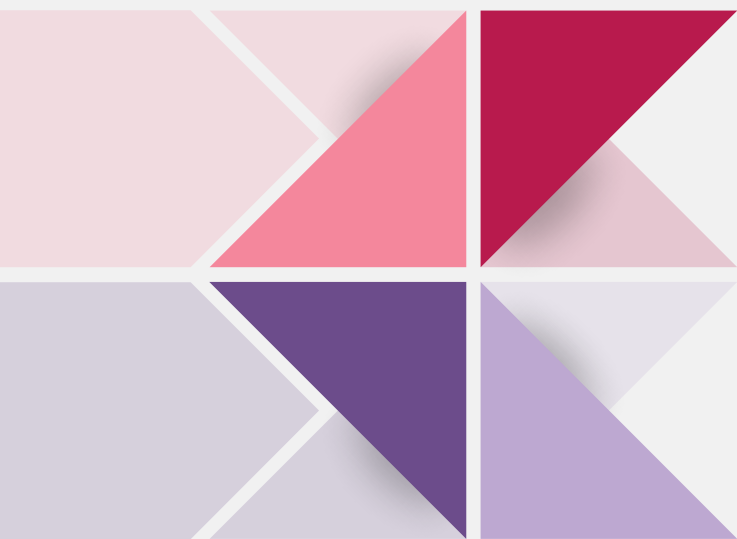




# 深度學習

## Deep Learning





# 1

為什麼深度學習會成為主流？

# 為什麼深度學習會成為主流?

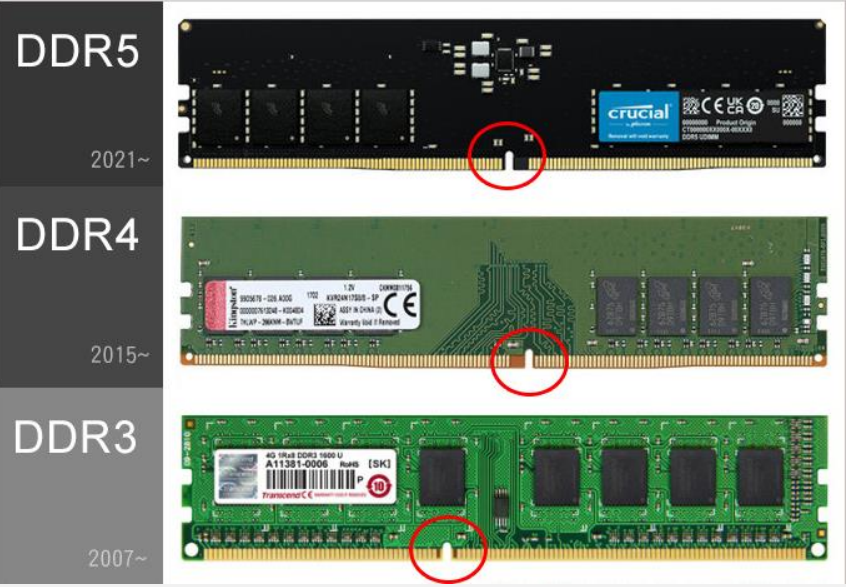
## 1. 硬體的進步

### CPU



資料來源

### RAM



資料來源

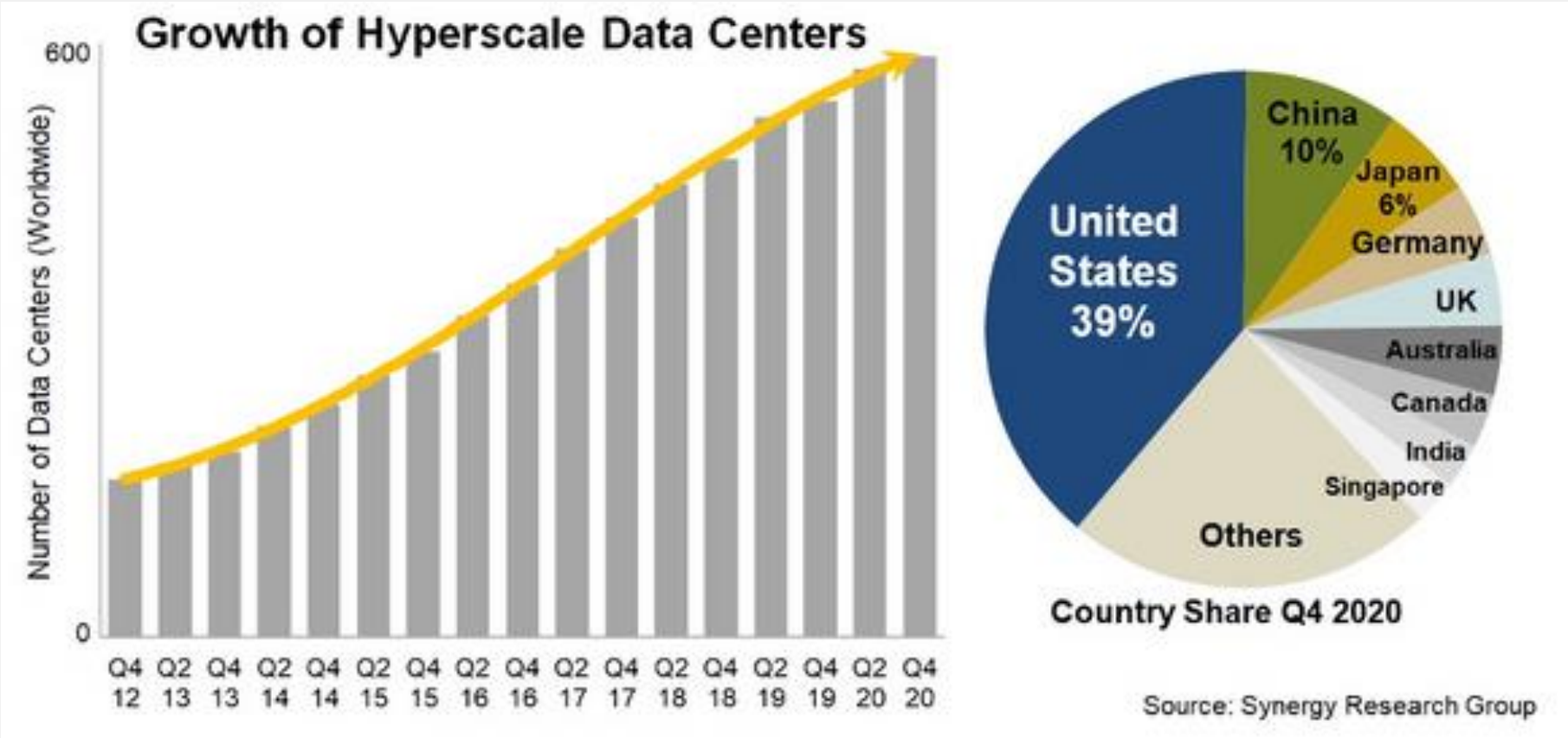
### GPU



資料來源

# 為什麼深度學習會成為主流？

## 2. 資料的成長

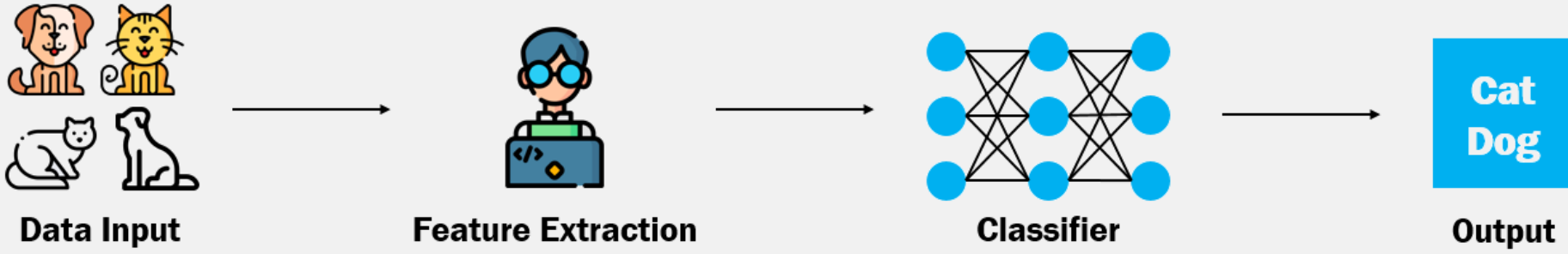


資料來源

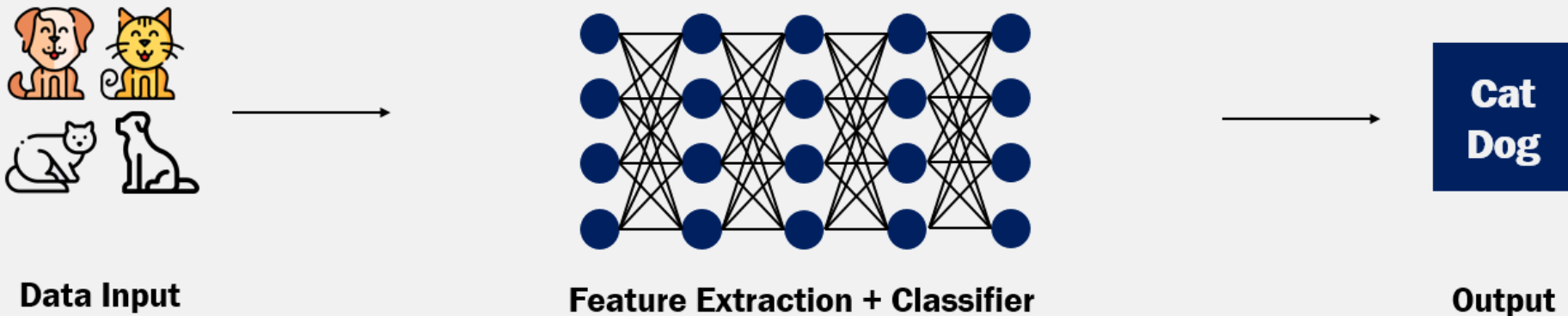
# 為什麼深度學習會成為主流?

## 3. 技術的變化

### Machine Learning



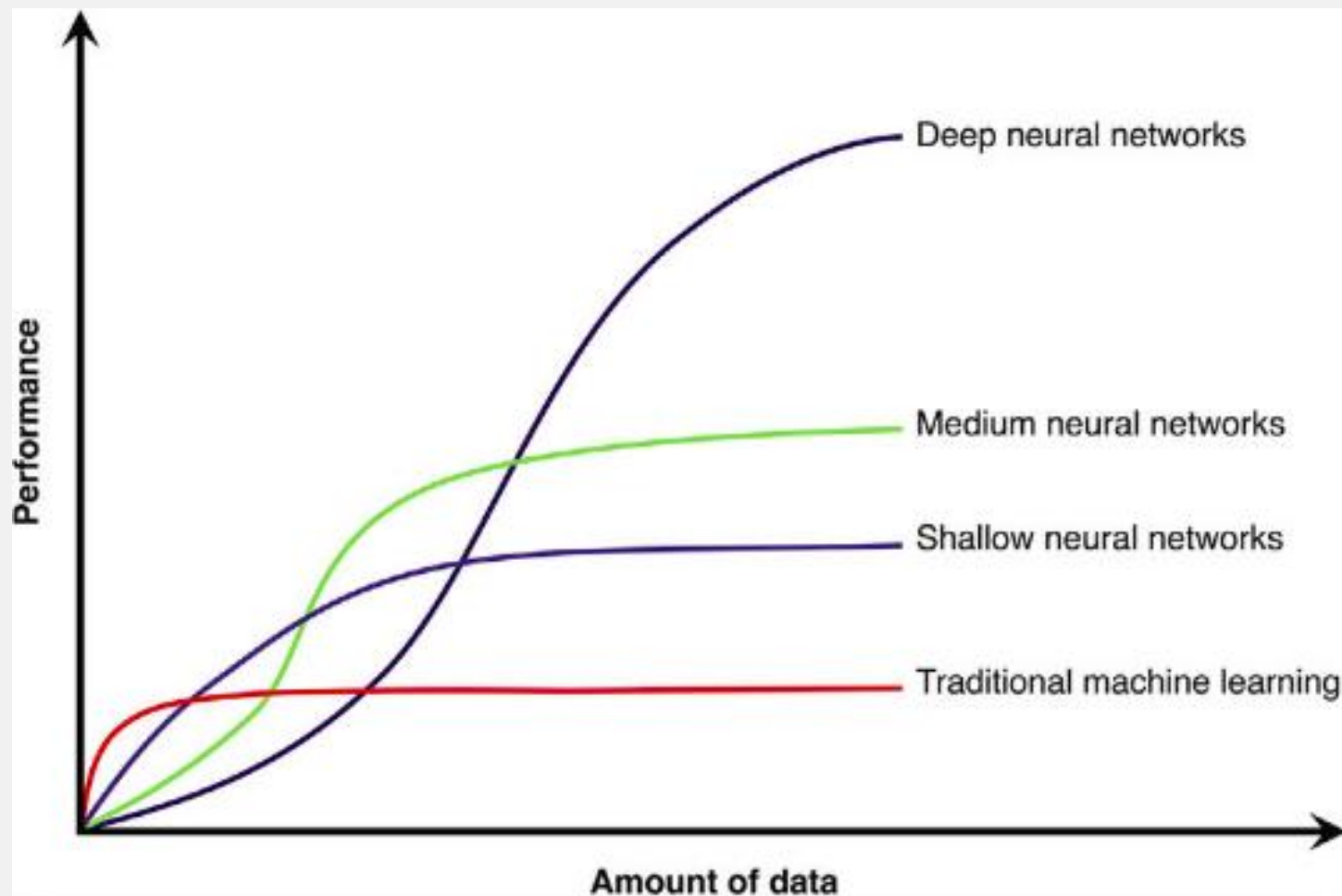
### Deep Learning

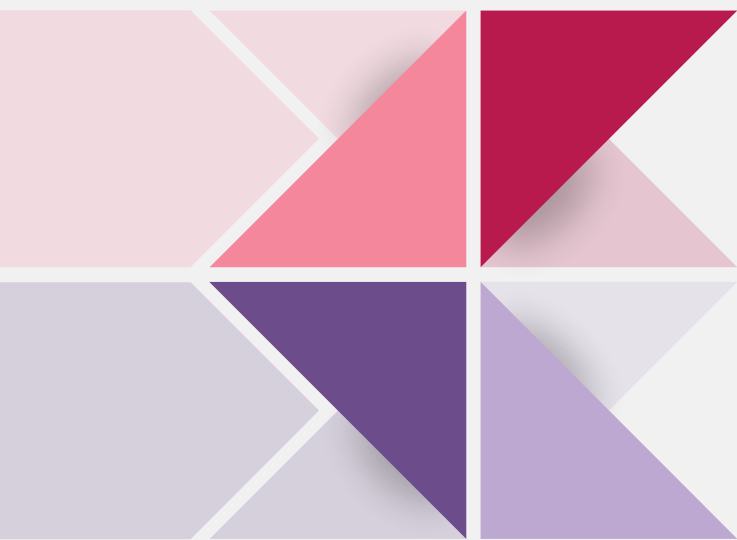


# 為什麼深度學習會成為主流？

## 3. 技術的變化

資料量增加時，不同技術的效能比較  
(Machine vs Deep Learning)

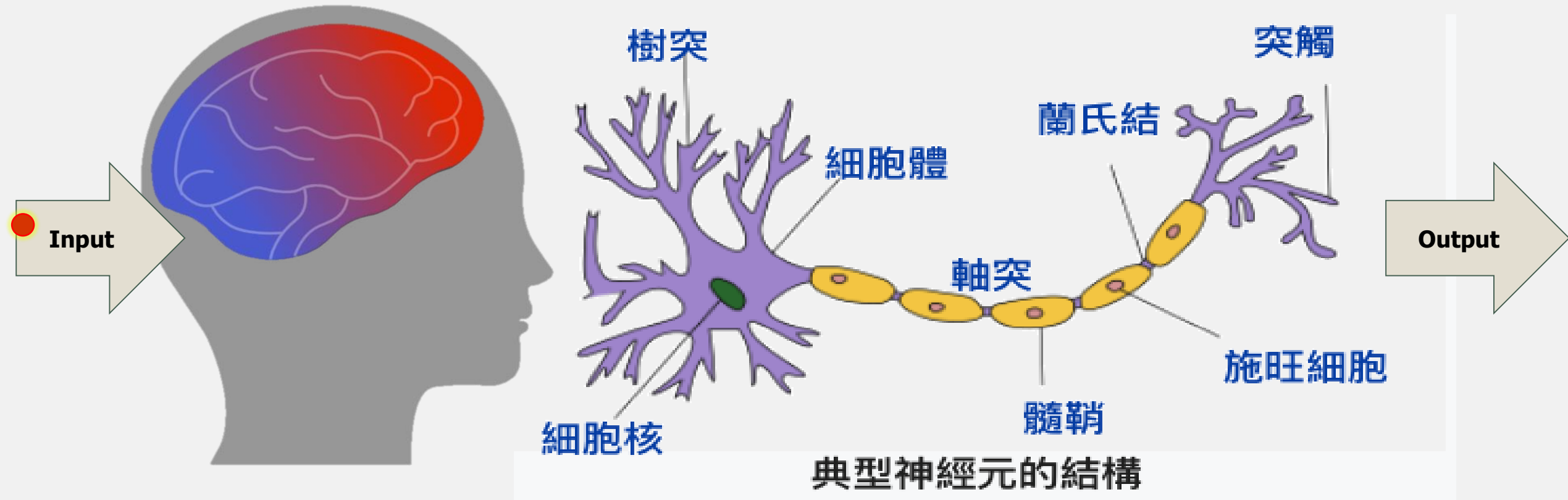




# 2

深度學習是什麼技術？

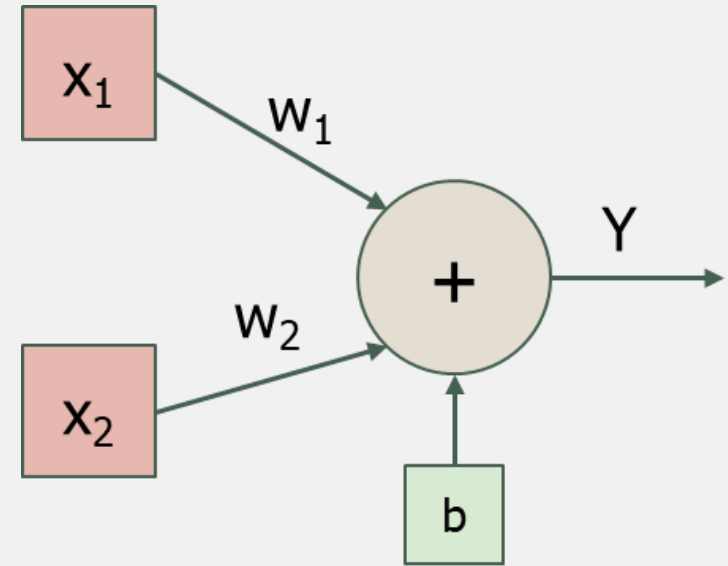
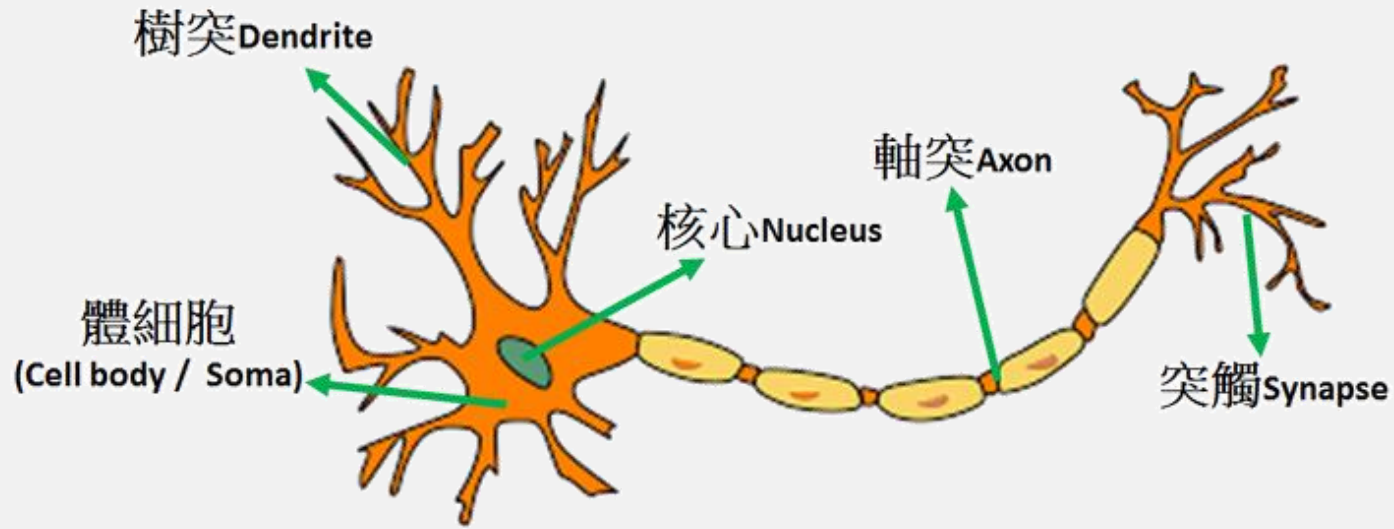
# 深度學習是什麼技術？



資料來源

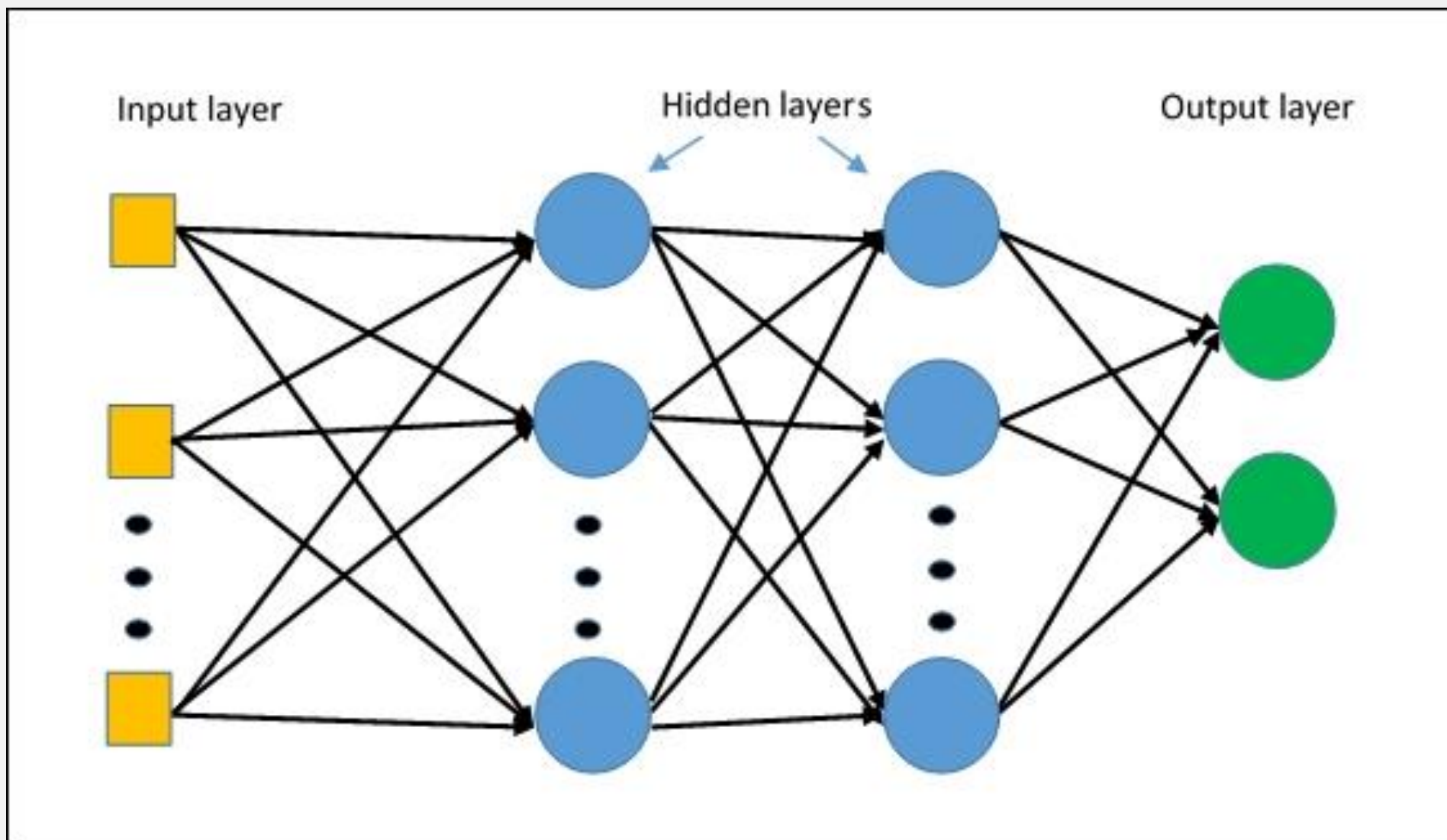


# 深度學習是什麼技術？



- Neurons:
  - Have  $K$  inputs (*dendrites*).
  - Have 1 output (*axon*).
  - If the sum of the input signals surpasses a *threshold*, sends an *action potential* to the axon.
- Synapses
  - Transmit electrical signals between neurons.

# 深度學習是什麼技術？



# 深度學習是什麼技術？

LeCun、Bengio、Hinton, Deep Learning, Nature, 2015

- <https://www.cs.toronto.edu/~hinton/absps/NatureDeepReview.pdf>
- Yann LeCun, 紐約大學、**Facebook**人工智慧
- Yoshua Bengio, 蒙特婁大學
- Geoffrey Hinton, 多倫多大學、**Google Brain**

'Godfathers of AI' honored with **2019 Turing Award**

REVIEW

doi:10.1038/nature14539

Deep learning

Yann LeCun<sup>1,2</sup>, Yoshua Bengio<sup>3</sup> & Geoffrey Hinton<sup>4,5</sup>



# 卷積類神經網路

## ImageNet (ILSVRC)

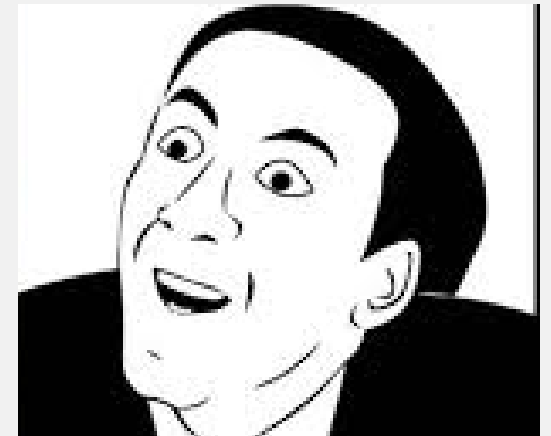
- 李飛飛 等人
- 1000 個類別 以及 1.2M 張影像
- ~2017



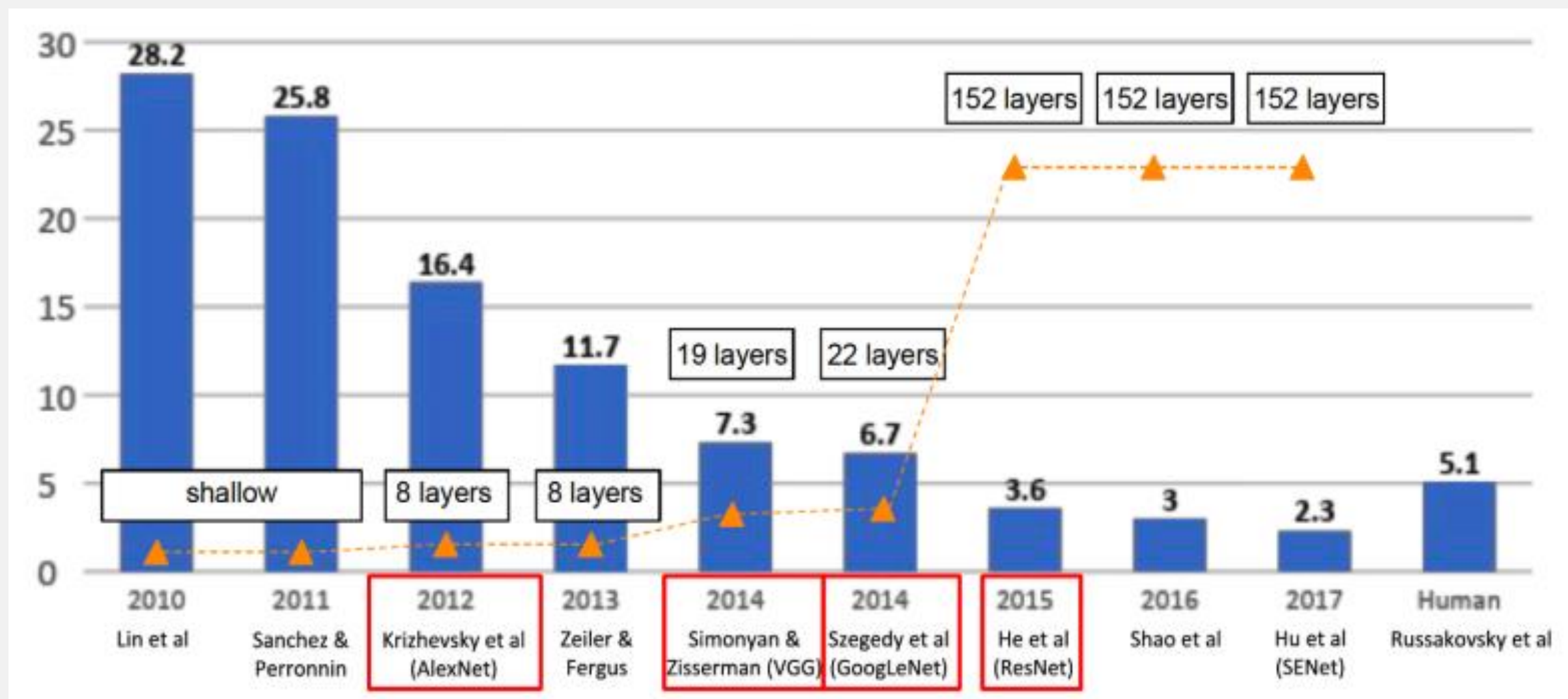
EntleBucher  
恩特布山犬

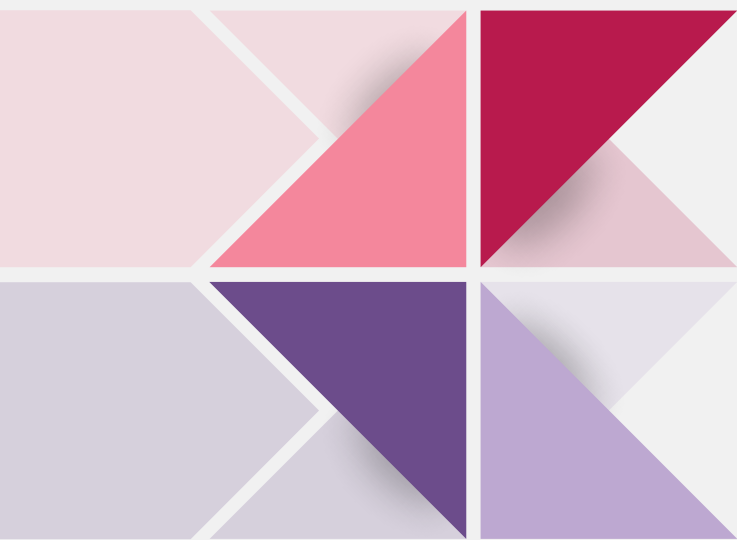


Appenzeller  
阿彭策爾山犬



# 卷積類神經網路





# 3

## 卷積類神經網路

# 卷積類神經網路

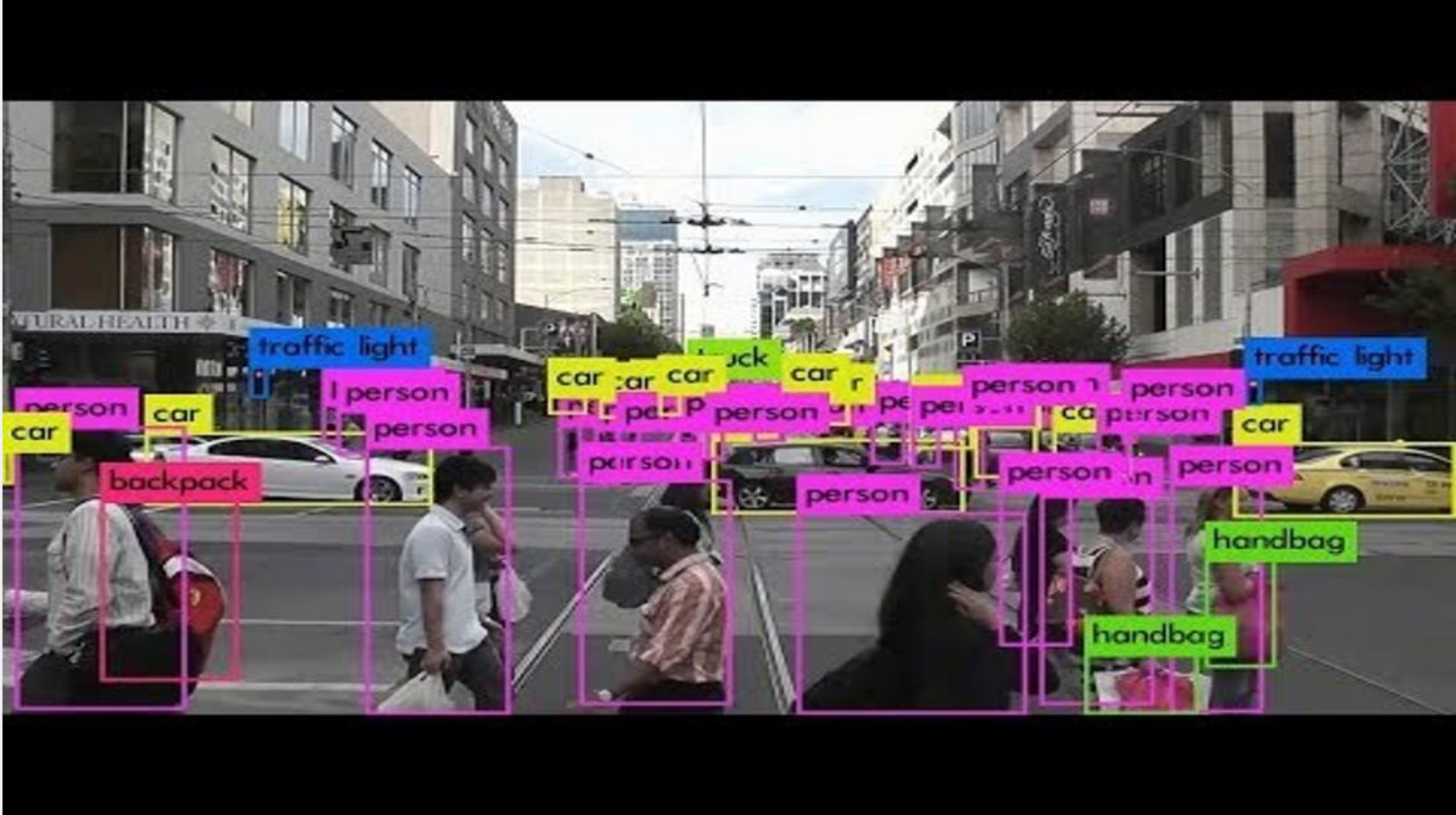
## 數字辨識



資料來源

# 卷積類神經網路

## 道路即時偵測



資料來源



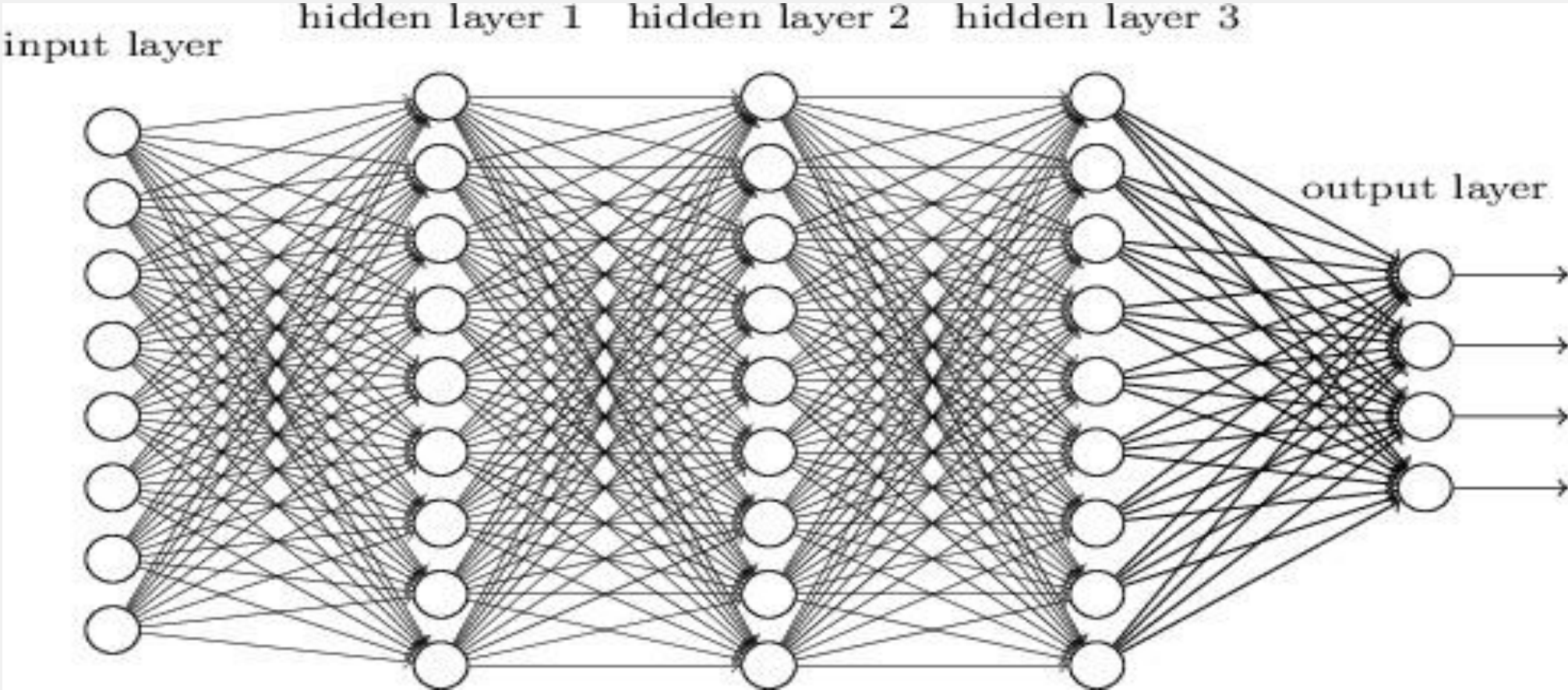
# 卷積類神經網路

## 大腦腫瘤切割

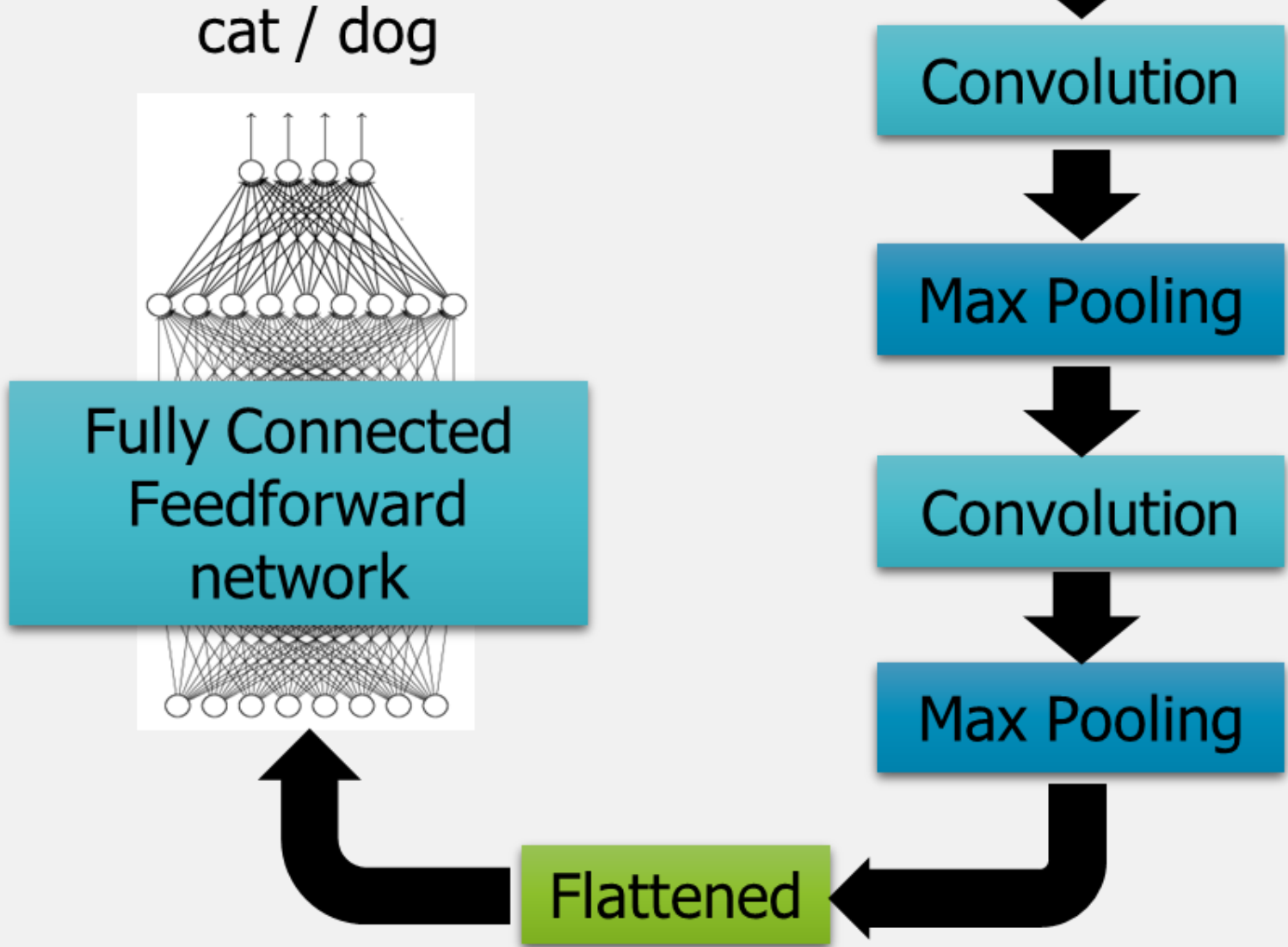


[資料來源](#)

# 卷積類神經網路



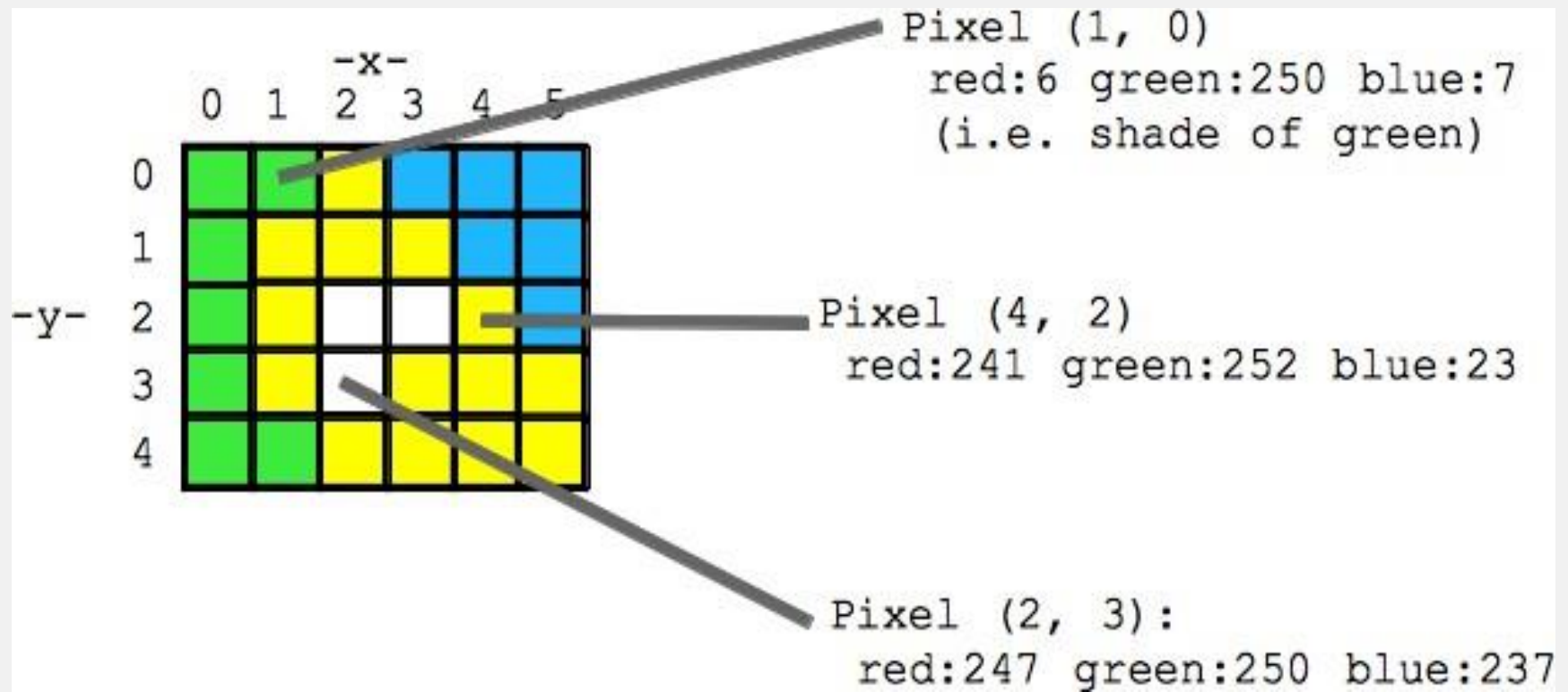
# 卷積類神經網路



# 卷積類神經網路

Each image contain many pixels and each pixels compose red, green, blue (RGB)

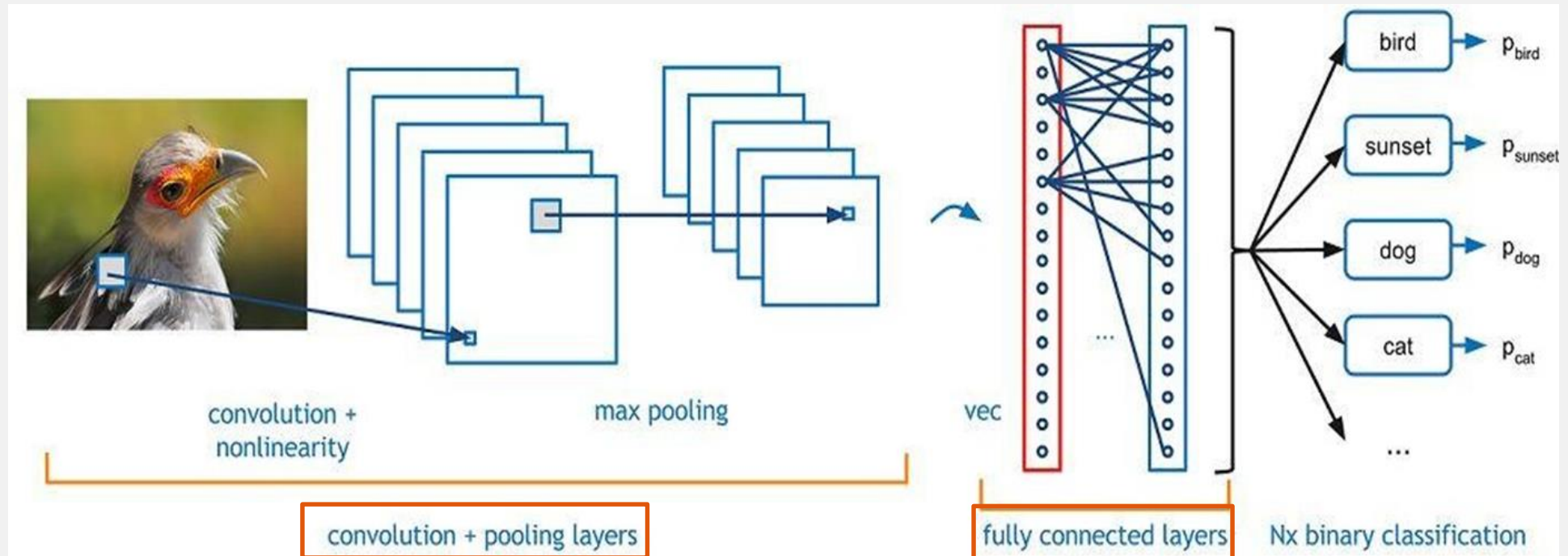
Each channel have brightness levels between 0~255



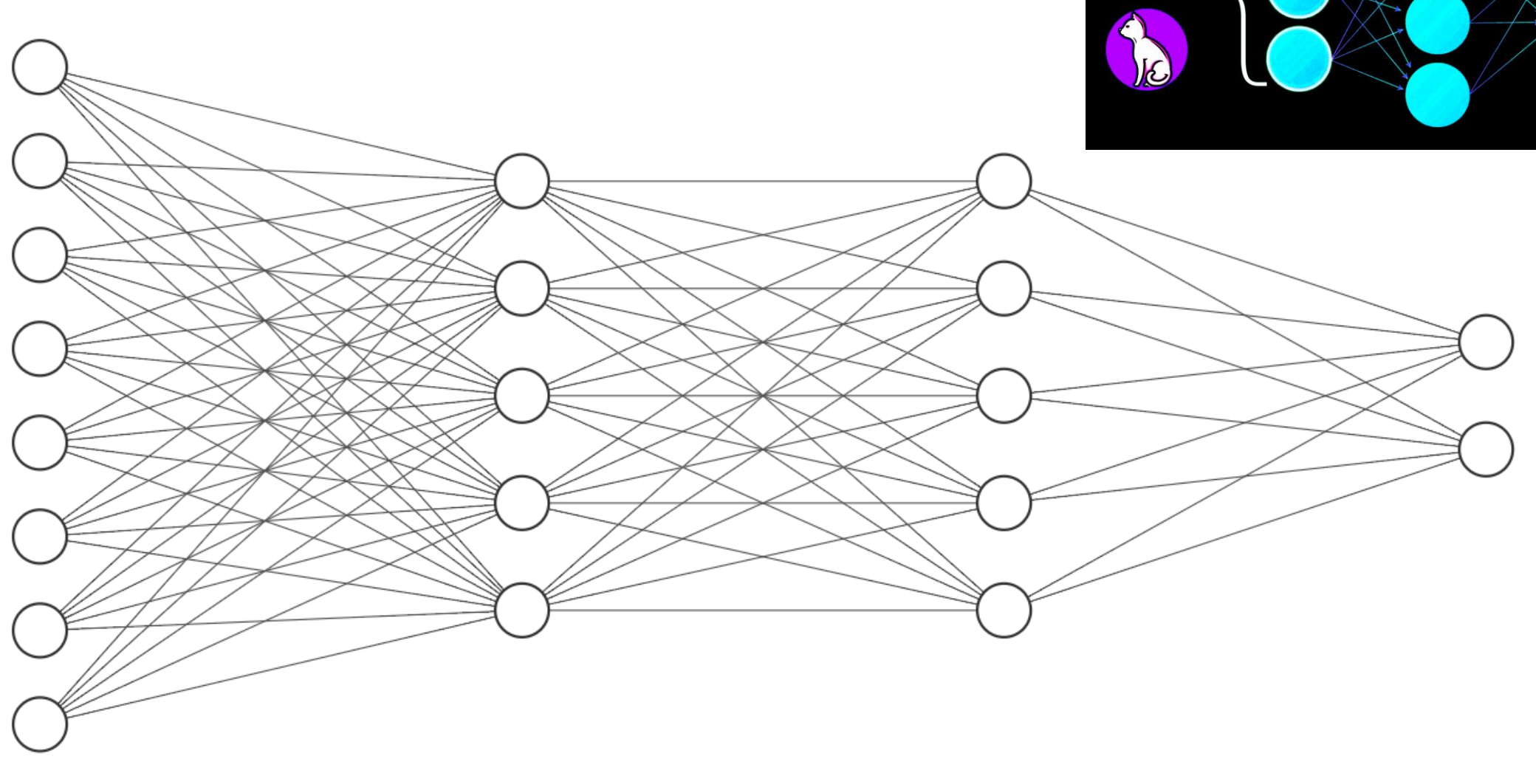
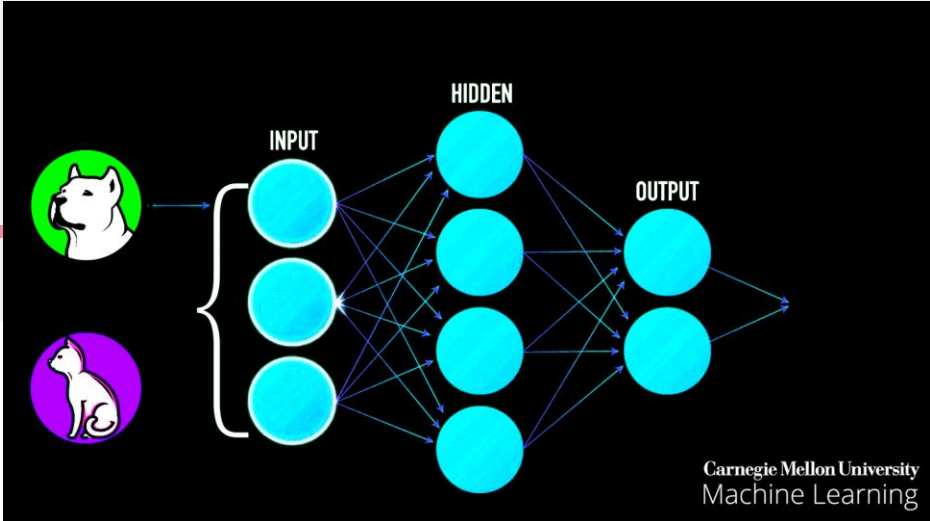
# 卷積類神經網路

## Convolution Neural Network (CNN)

- 卷積層 (Convolution layer)
- 池化層 (Max-pooling layer)
- 全連通層 (Fully connected layer)



# 卷積類神經網路



**Dog**

**Cat**

# 卷積類神經網路

## 卷積層概念

Kernel = 3\*3 , Padding = No, **Stride = 1**

Kernel

1	0	1
0	1	0
1	0	1

1 <sub>x1</sub>	1 <sub>x0</sub>	1 <sub>x1</sub>	0	0
0 <sub>x0</sub>	1 <sub>x1</sub>	1 <sub>x0</sub>	1	0
0 <sub>x1</sub>	0 <sub>x0</sub>	1 <sub>x1</sub>	1	1
0	0	1	1	0
0	1	1	0	0

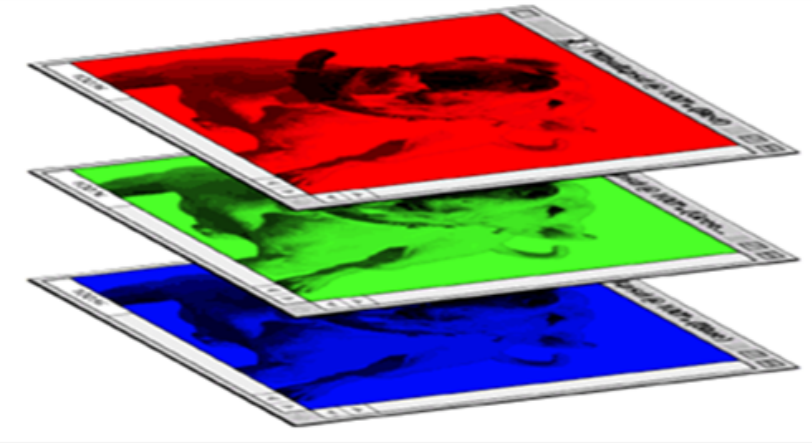
Image

4		

Convolved  
Feature

# 卷積類神經網路

Color image



1	0	0	0	0	1
1	0	0	0	0	1
0	1	0	0	0	1
0	0	1	0	1	0
1	0	0	1	0	0
0	1	0	0	1	0
0	0	1	0	1	0



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

Filter 1



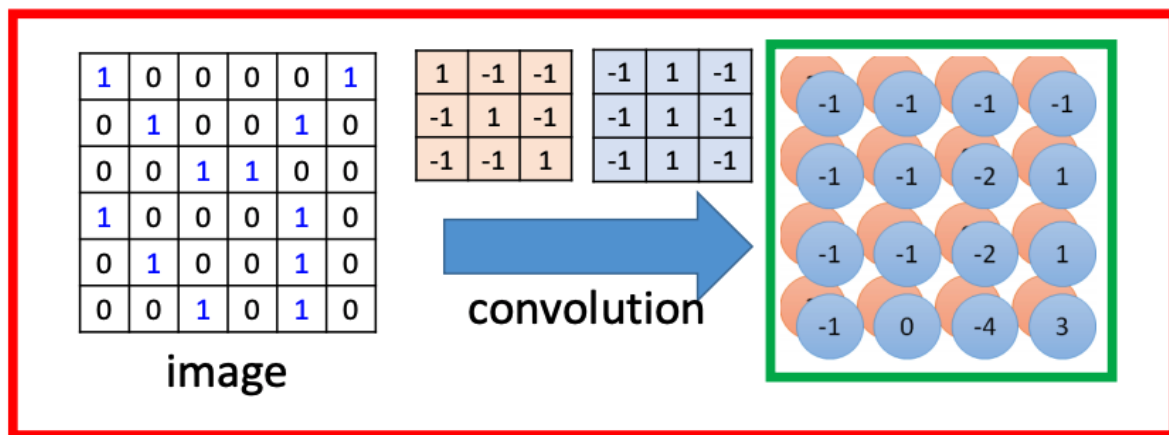
1	1	1
-1	1	-1
-1	1	-1
-1	1	-1

Filter 2

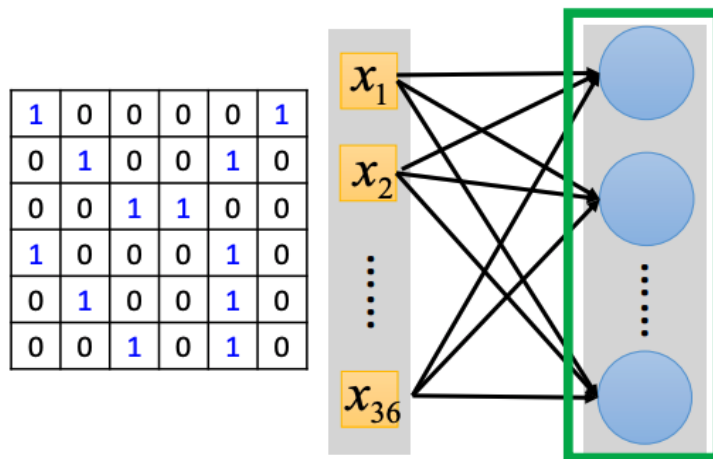


# 卷積類神經網路

## 卷積與全連通參數量差異



Fully-connected



filter (neuron) count

$$(3 \times 3 + 1) \times 3 = 30$$

w x h      bias

$$(36 + 1) \times 3 = 111$$

previous pixel count + bias

# 卷積類神經網路

## 池化層概念

