

# 心理與神經資訊學

## (Psychoinformatics & Neuroinformatics)

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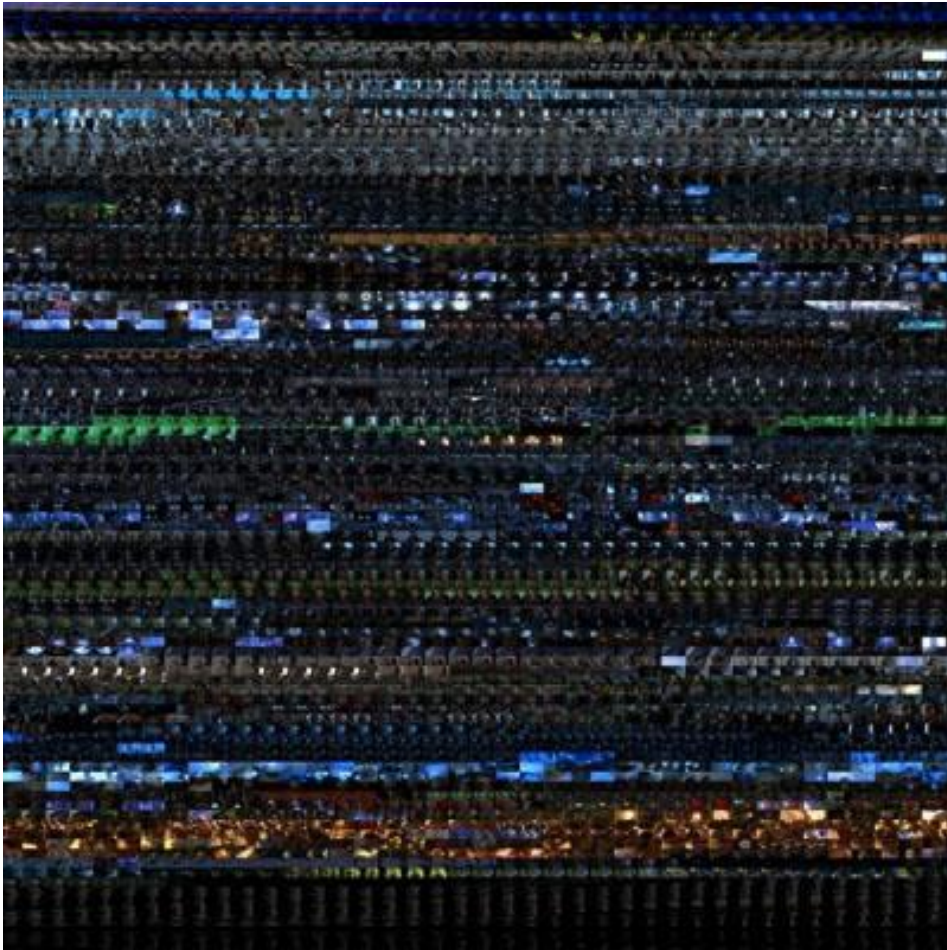
時間: 一789





# 視覺化幫助洞察資料(1/2)

不同類別影片的主色調相異



# 視覺化幫助洞察資料(2/2)

不同年代的男女外貌有何不同？



*The Class of 1988 (left panel)*



*The Class of 1988 (right panel)*



*The Class of 1967 (left panel)*



*The Class of 1967 (right panel)*



# CNN的應用(1/2)

判斷誰可能犯罪(classification)



(a) Three samples in criminal ID photo set  $S_c$ .



(b) Three samples in non-criminal ID photo set  $S_n$

Figure 1. Sample ID photos in our data set.

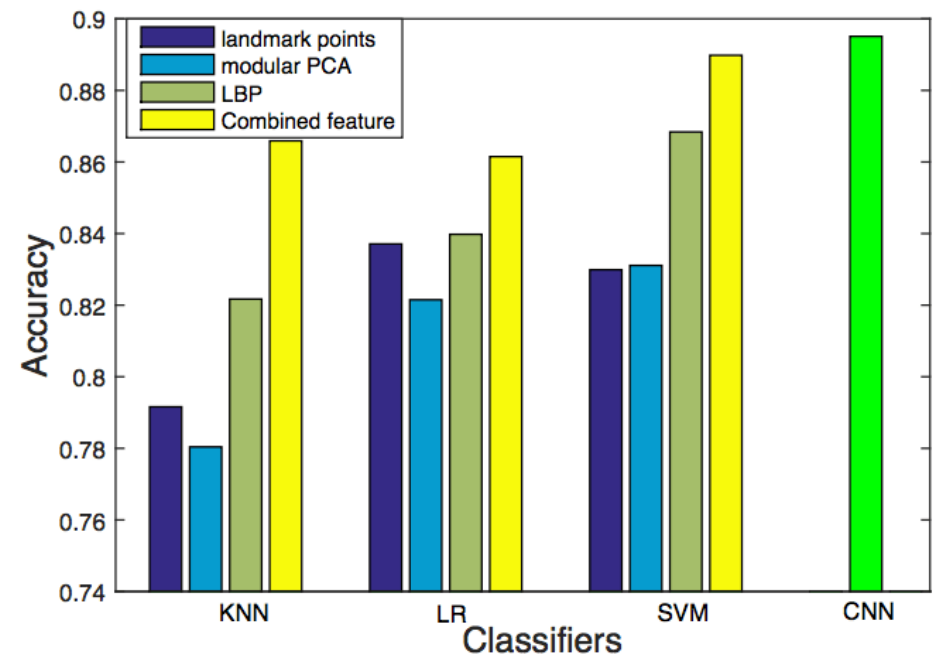


Figure 2. Accuracy of all four classifiers in all thirteen cases.

# CNN的應用(2/2)

判斷誰比較美(regression)



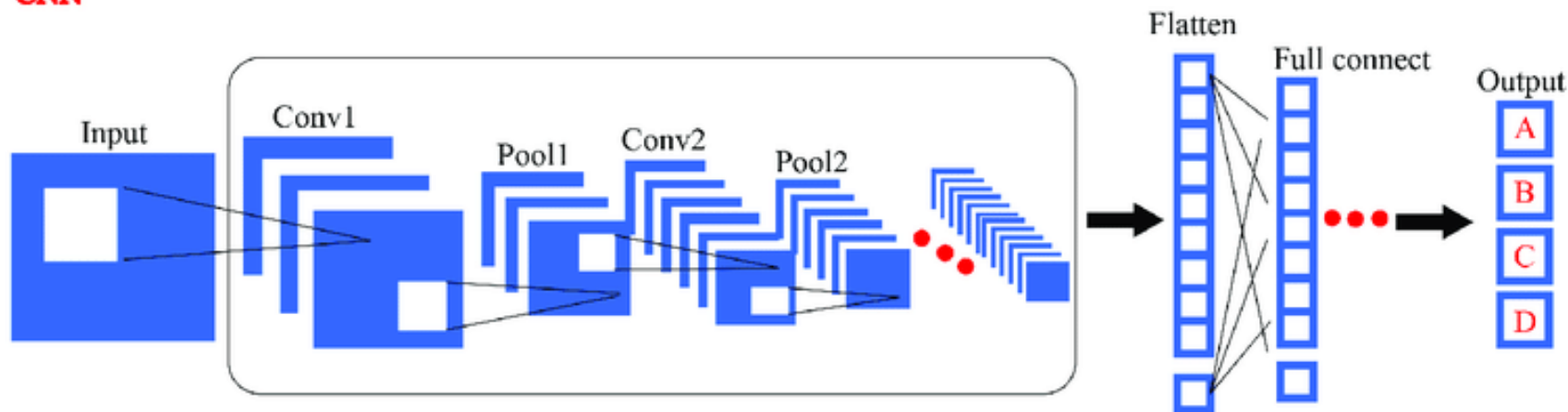
TABLE VI. CORRELATION COEFFICIENTS IN SINGLE NETWORK

<i>Exp.</i>	1	2	3	4	5	Average
PC	0.8509	0.8050	0.8112	0.7817	0.8446	0.8187

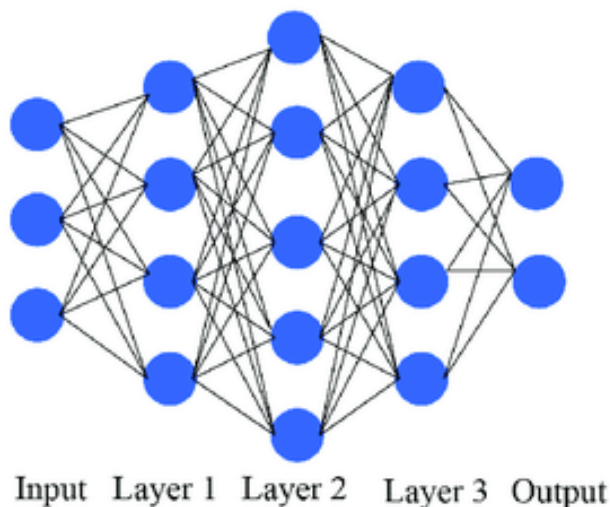
# 三種基本網路架構：今天主角是CNN

CNN通常處理影像資料;RNN通常處理語言資料

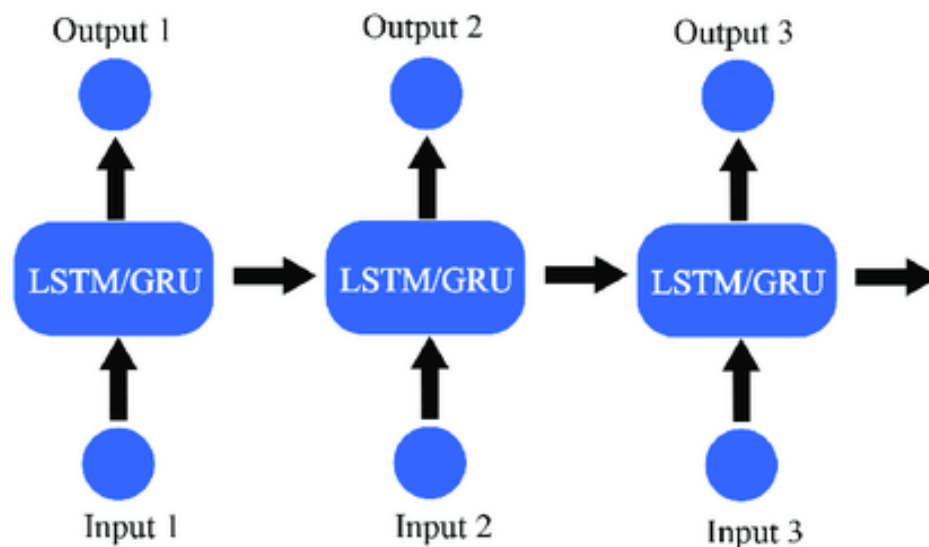
**CNN**



**DNN**



**RNN**



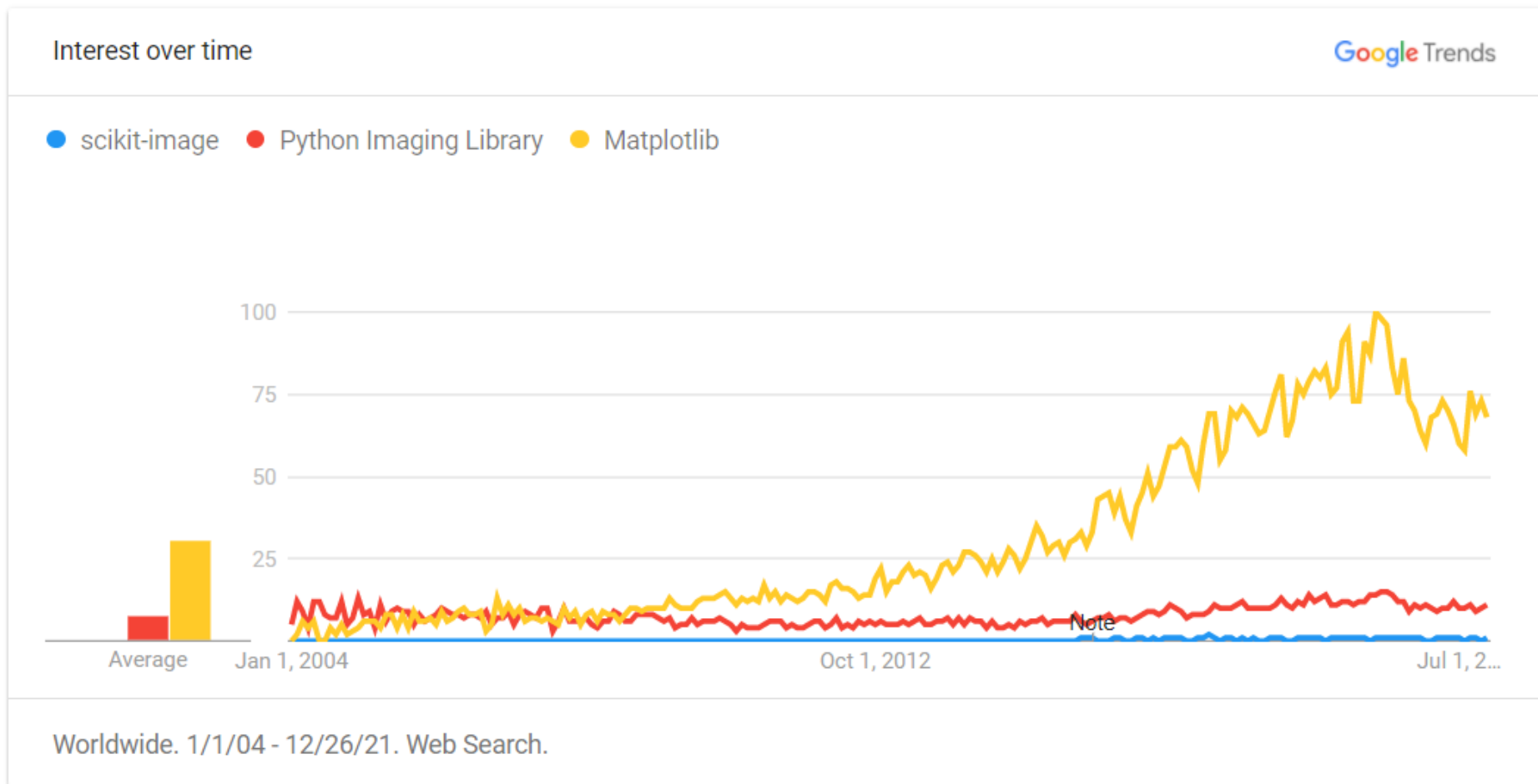
# 基本影像處理

## (Imaging Processing)



# 影像處理的套件

有不同的選擇



簡單處理用matplotlib;複雜情況用PIL/Pillow

# Matplotlib簡介

Matplotlib其實是模仿Matlab的繪圖指令



Fork me on GitHub

[home](#) | [examples](#) | [gallery](#) | [pyplot](#) | [docs](#) »

[modules](#) | [index](#)

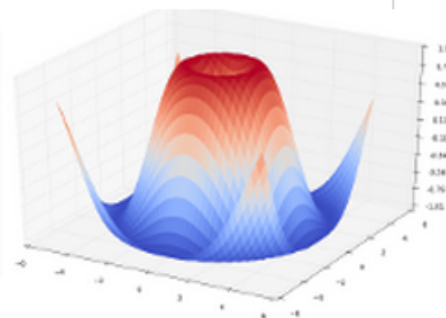
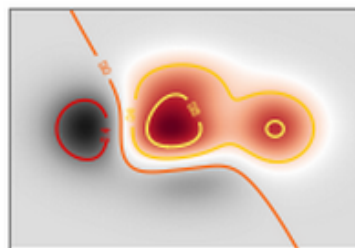
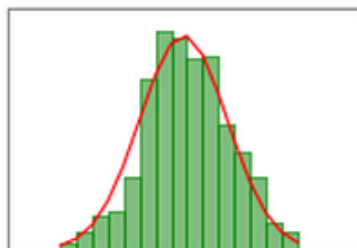
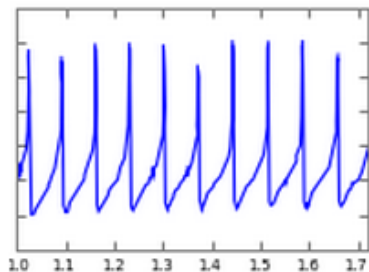
## Introduction

matplotlib is a python 2D plotting library which produces publication quality figures in a variety of hardcopy formats and interactive environments across platforms. matplotlib can be used in python scripts, the python and [ipython](#) shell (ala MATLAB<sup>®</sup>\* or Mathematica<sup>®</sup>†), web application servers, and six graphical user interface toolkits.

Quick search

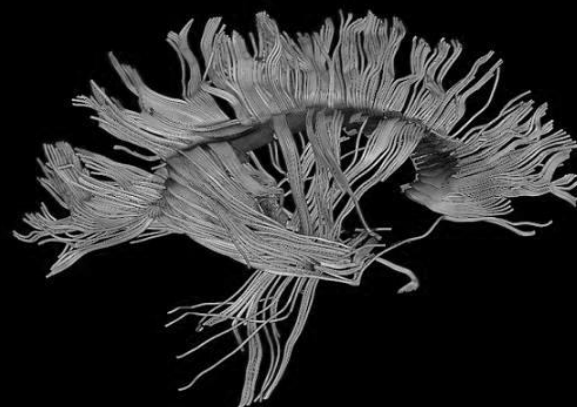
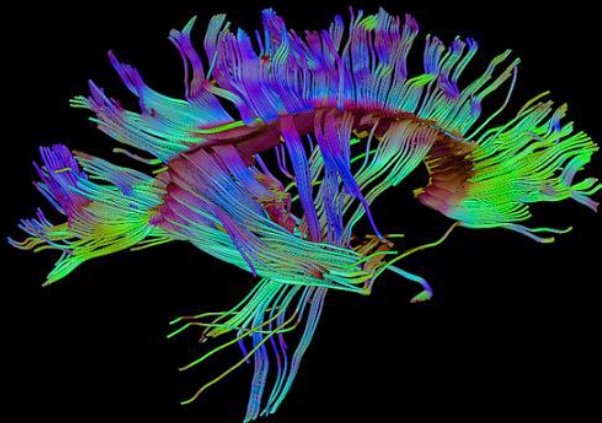
Go

Enter search terms or a module, class or function name.



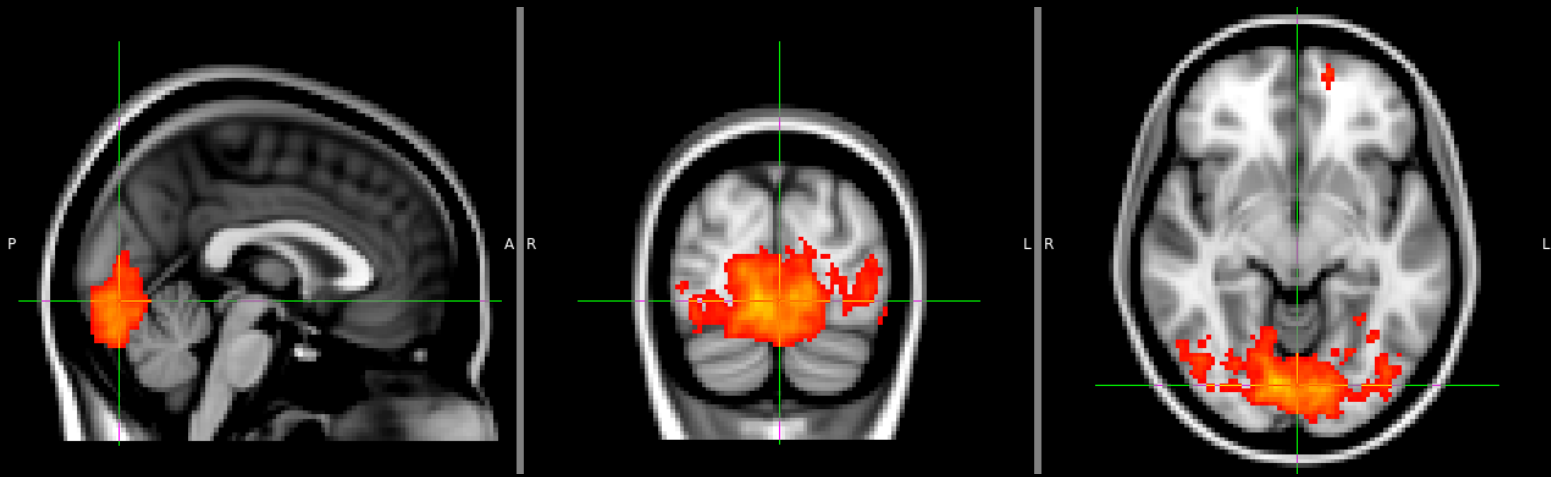
# Matplotlib的基本影像處理(1/3)

```
import matplotlib.pyplot as plt
import numpy as np
plt.close('all'); img=plt.imread('DTI.jpg')
print(img.shape,type(img),img.dtype)
plt.imshow(img); plt.figure()
img2=np.mean(img,2); print(img2.shape)
plt.imshow(img2,cmap=plt.cm.gray)
```



# Matplotlib的基本影像處理(2/3)

```
import numpy as np,matplotlib.pyplot as plt
img=[]
img.append(np.float64(plt.imread('MRI1.jpg')))
img.append(np.float64(plt.imread('MRI2.jpg')))
img.append(img[1]-img[0]) #contrast
for i in range(3):
    plt.subplot(1,3,i+1); plt.axis('off')
    plt.imshow(img[i],cmap=plt.cm.gray)
```



# Matplotlib的基本影像處理(3/3)

```
import numpy as np, matplotlib.pyplot as plt
plt.close('all'); img=[]
img.append(plt.imread('face.jpg')) # for FFA
img.append(plt.imread('house.jpg')) # for PPA
k=np.arange(1,10,2)/10.0
for i in range(5):
    plt.subplot(1,5,i+1);plt.axis('off')
    hybrid=k[i]*img[0]+(1-k[i])*img[1]
    plt.imshow(hybrid/255.0)
```



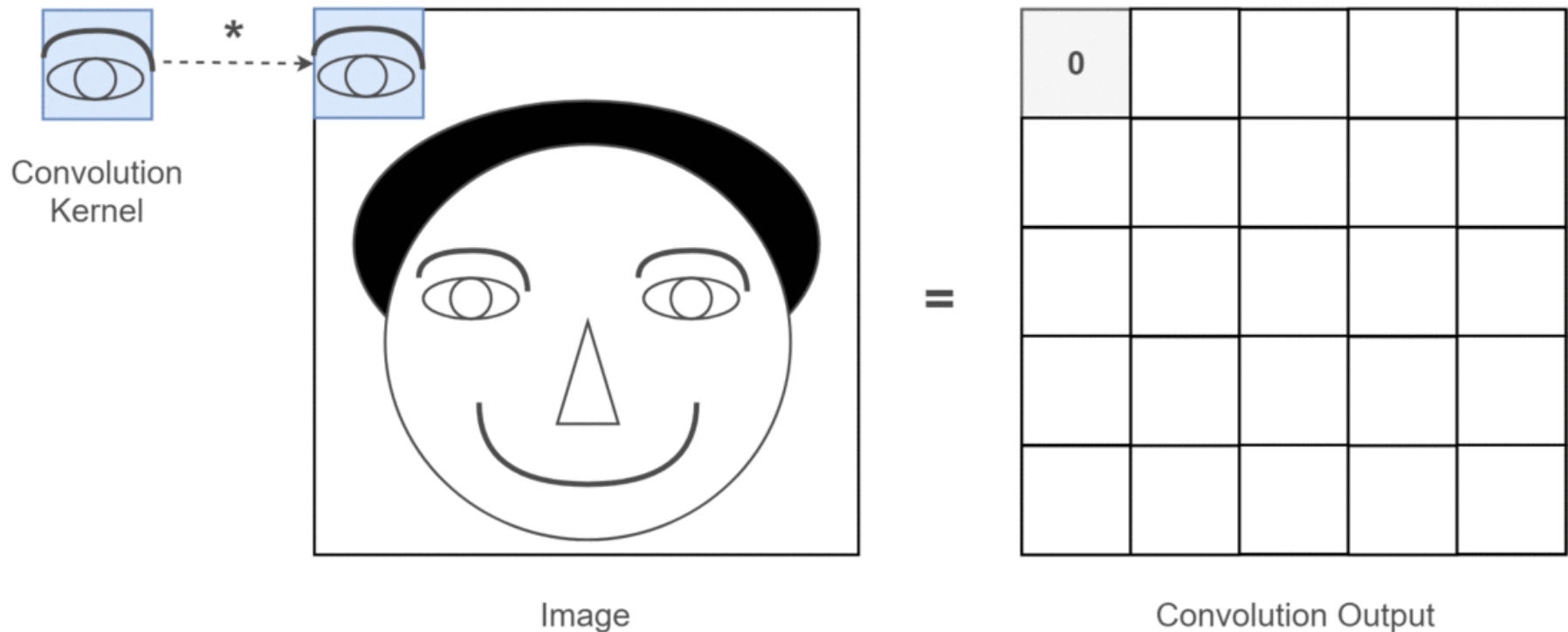


# 卷積 = 在空間滑動偵測

因為相同的特徵有可能在不同的位置出現

$X_{11}$	$X_{12}$	$X_{13}$
$X_{21}$	$X_{22}$	$X_{23}$
$X_{31}$	$X_{32}$	$X_{33}$

$W_{11}$	$W_{12}$
$W_{21}$	$W_{22}$

# Padding & Stride

Input與Output的維度關係一定要會算

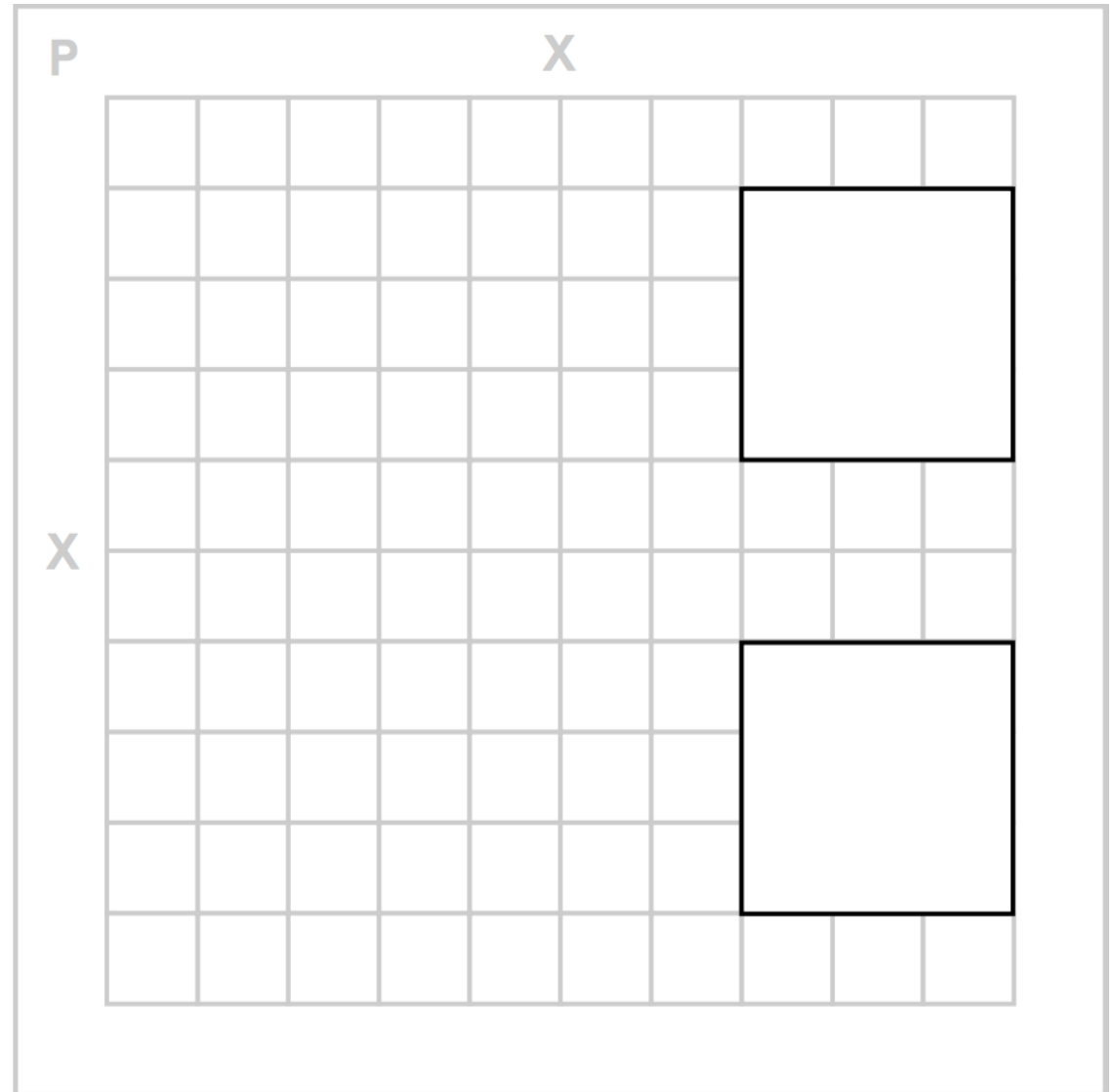
$$1 + \frac{X - F + 2P}{S}$$

X = image size

F = filter size

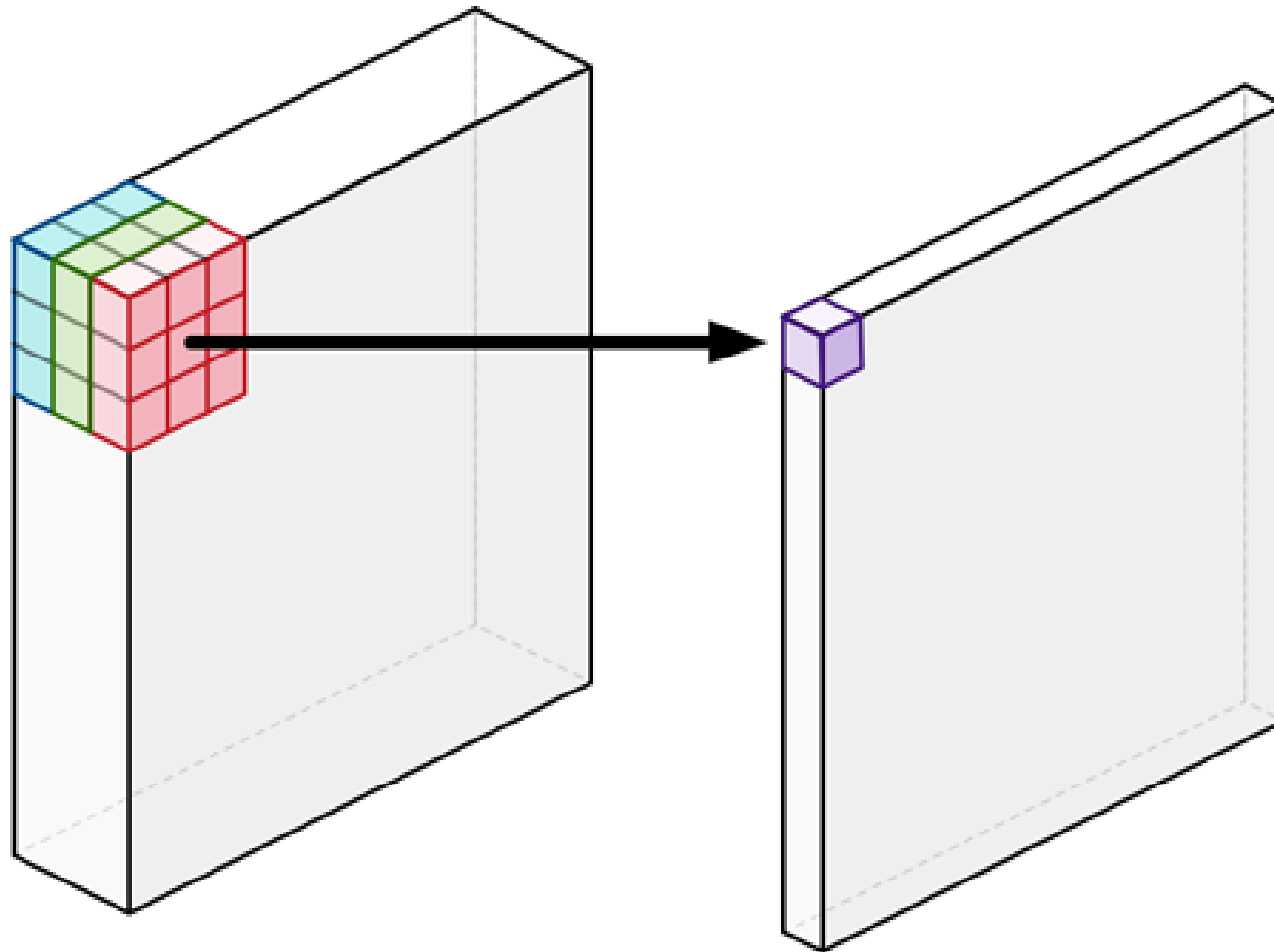
P = padding

S = stride



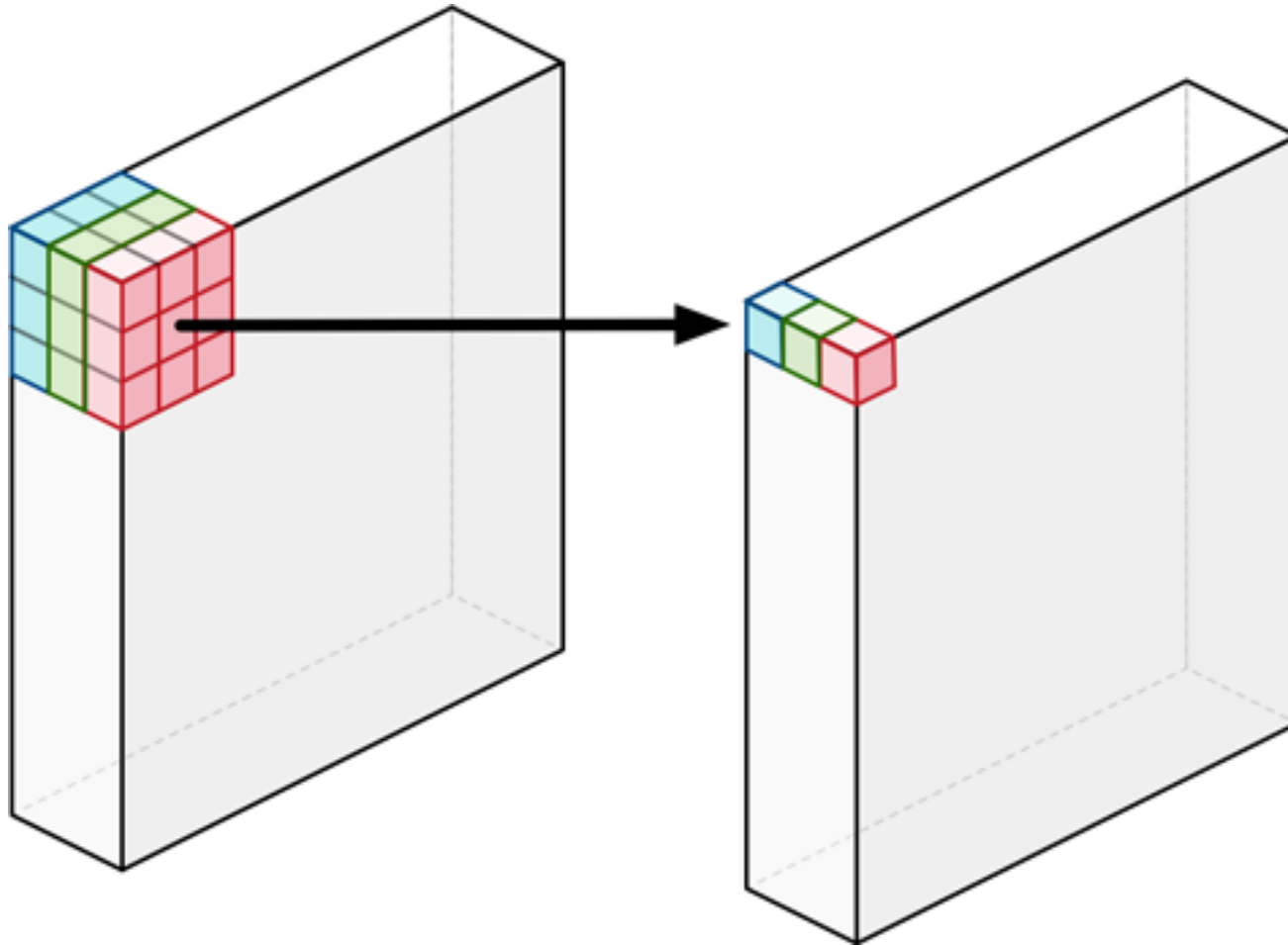
# 3D Spatial Convolution

和2D一樣就是template matching



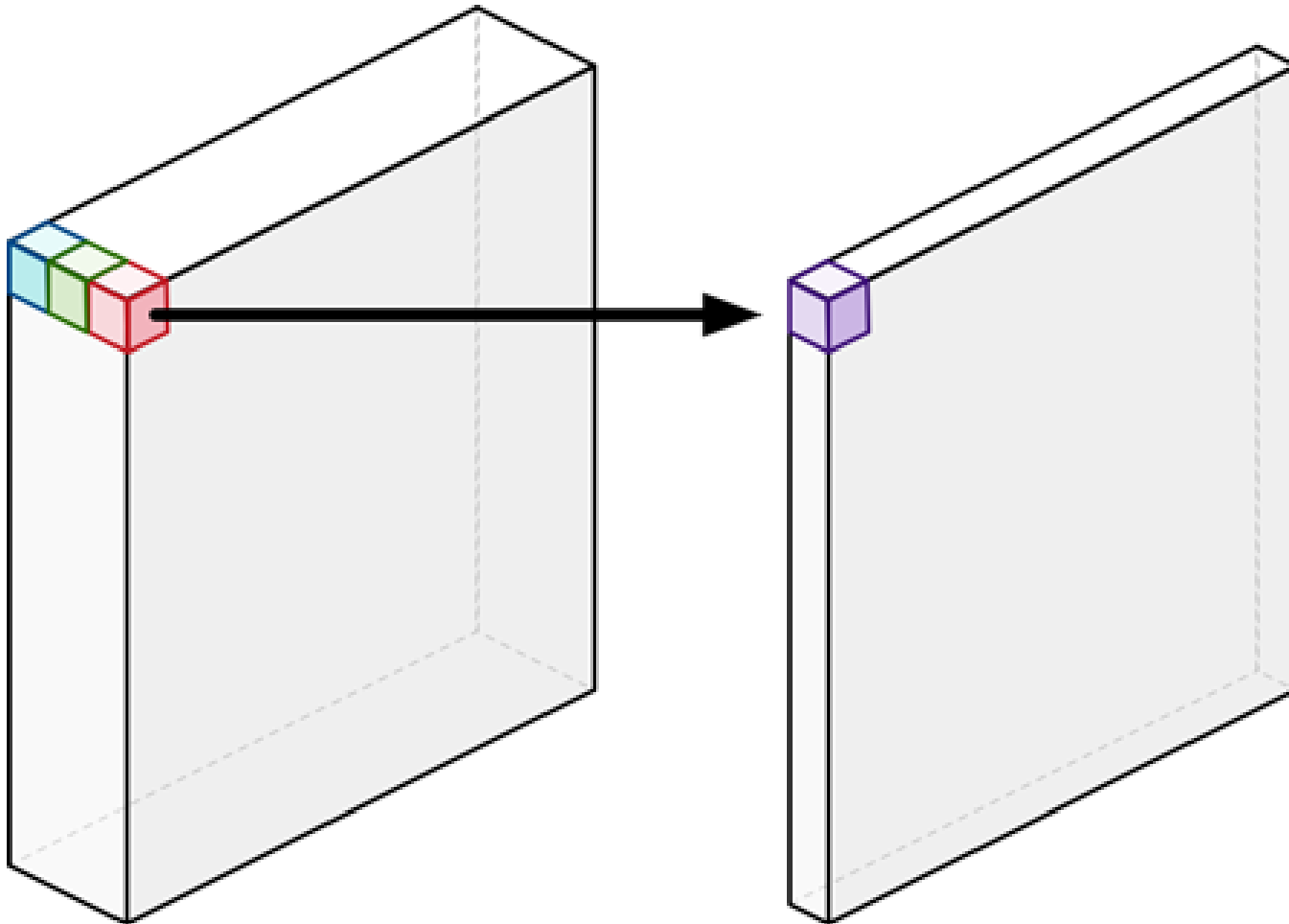
# Depthwise Separable Conv.

各層的規律性分開找計算複雜度較低(如 $2^{27} \rightarrow 3 \times 2^9$ )



# Pointwise Convolution

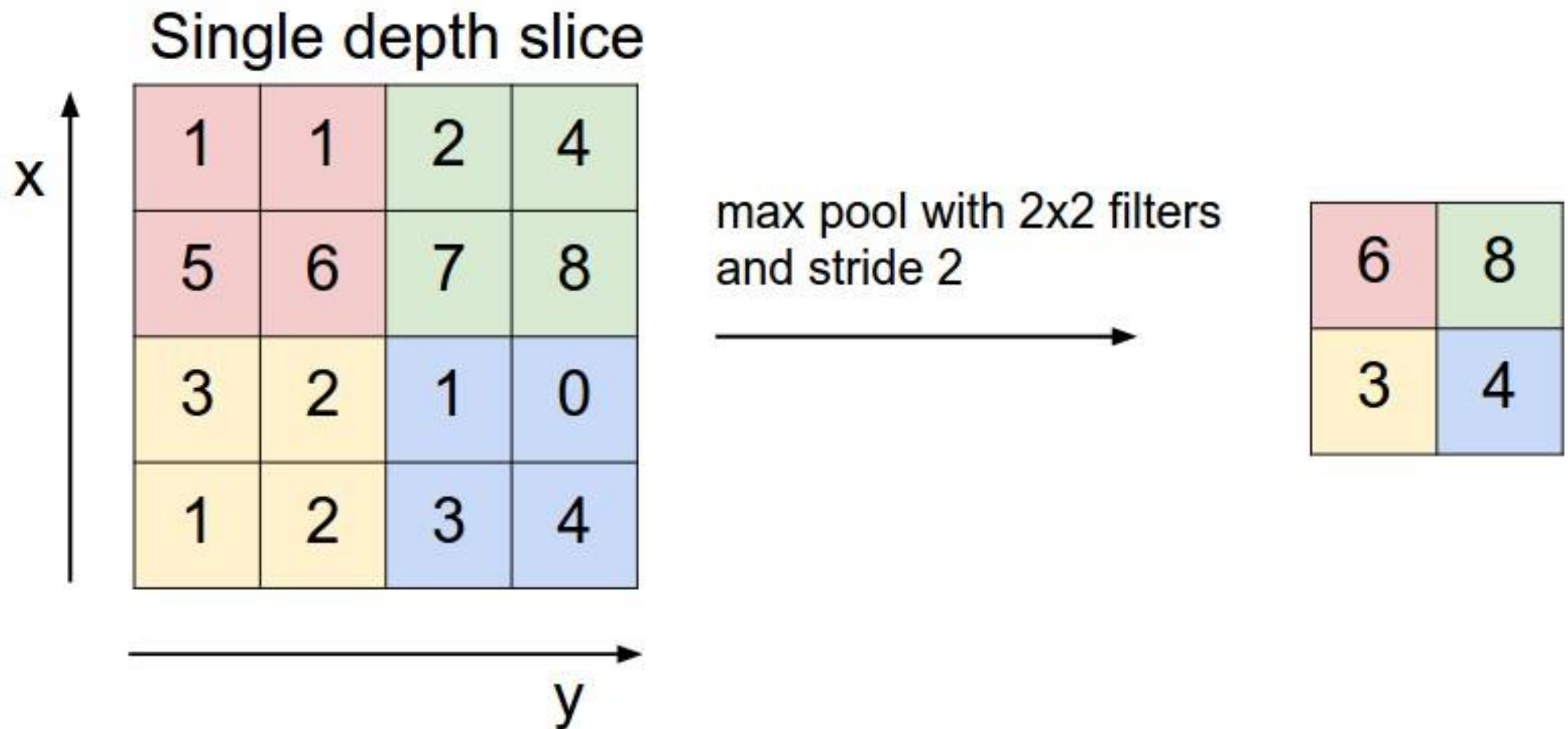
就是去把不同層做加權平均





# (Max) Pooling

就是downsampling



# 基本電腦視覺

## (Computer Vision)

# 電腦視覺處理的問題(1/2)

從What到What-Where

**Classification**



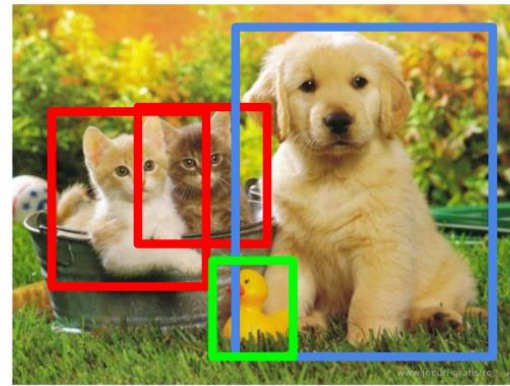
CAT

**Classification  
+ Localization**



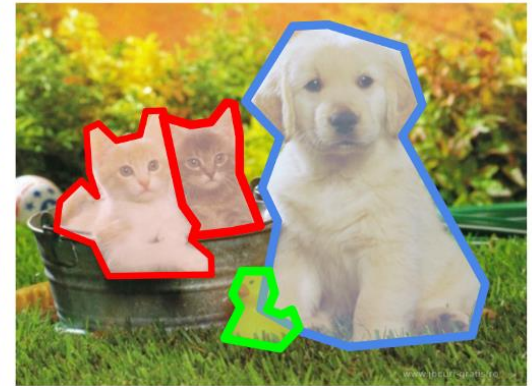
CAT

**Object Detection**



CAT, DOG, DUCK

**Instance  
Segmentation**



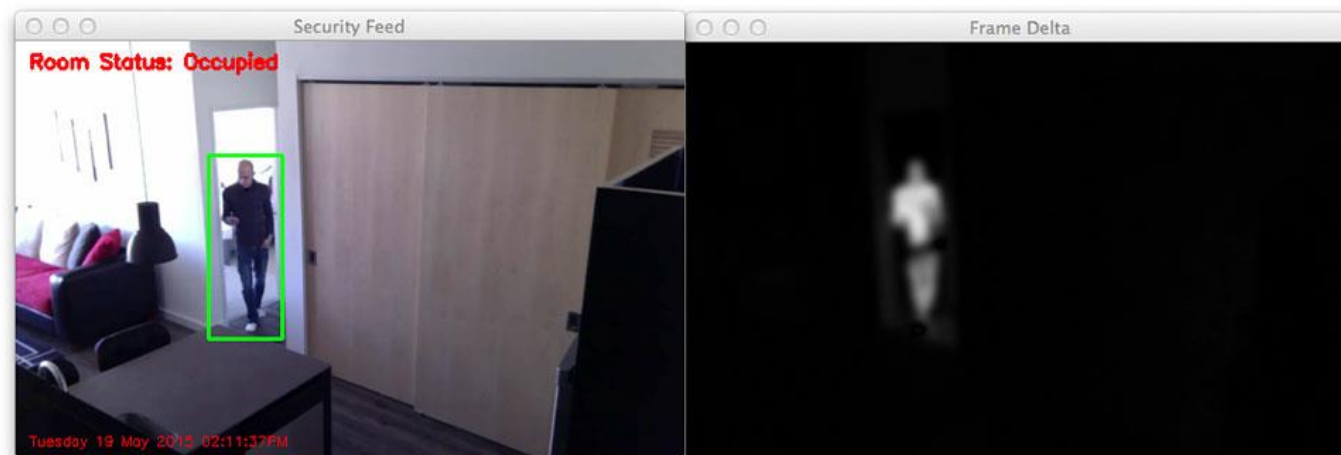
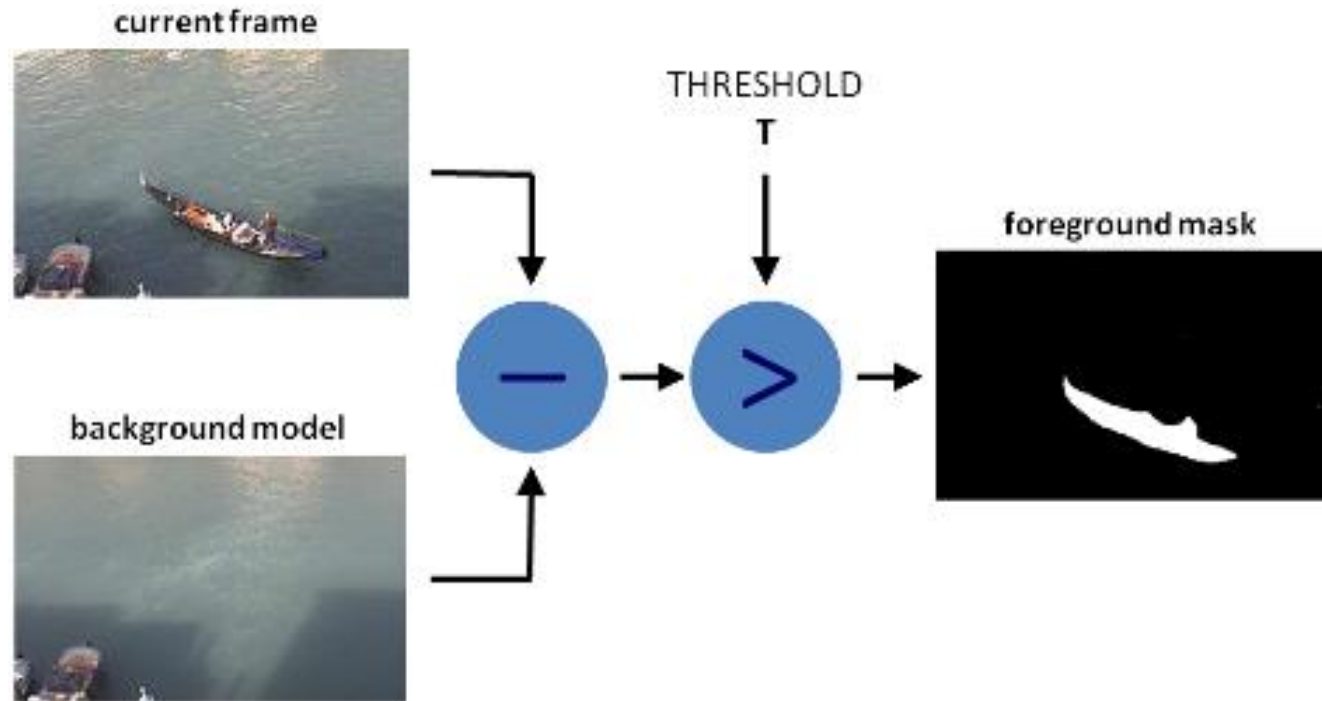
CAT, DOG, DUCK

Single object

Multiple objects

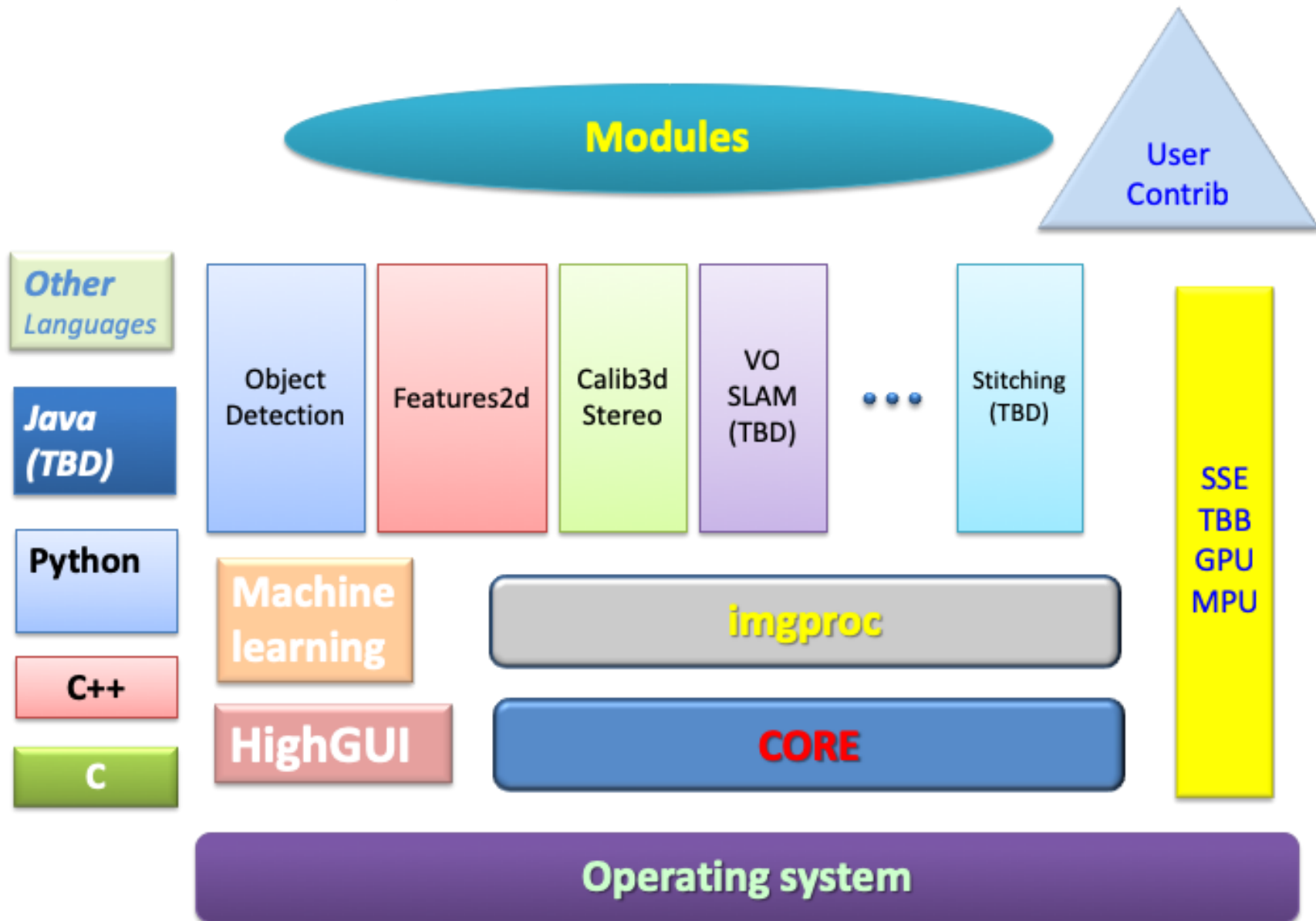
# 電腦視覺處理的問題(2/2)

從images到videos



# OpenCV (1/2)

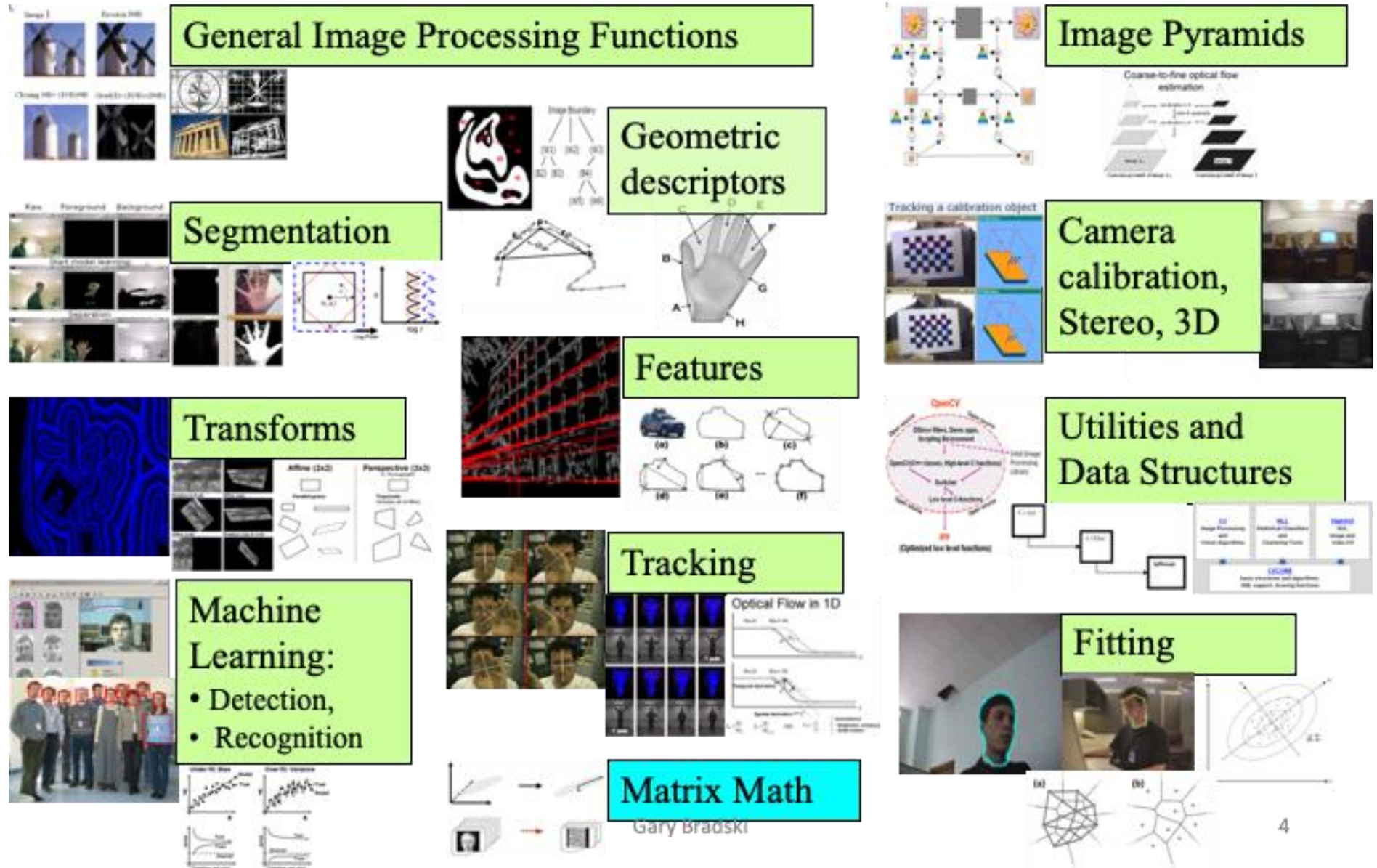
有影像處理能力&不同語言的APIs





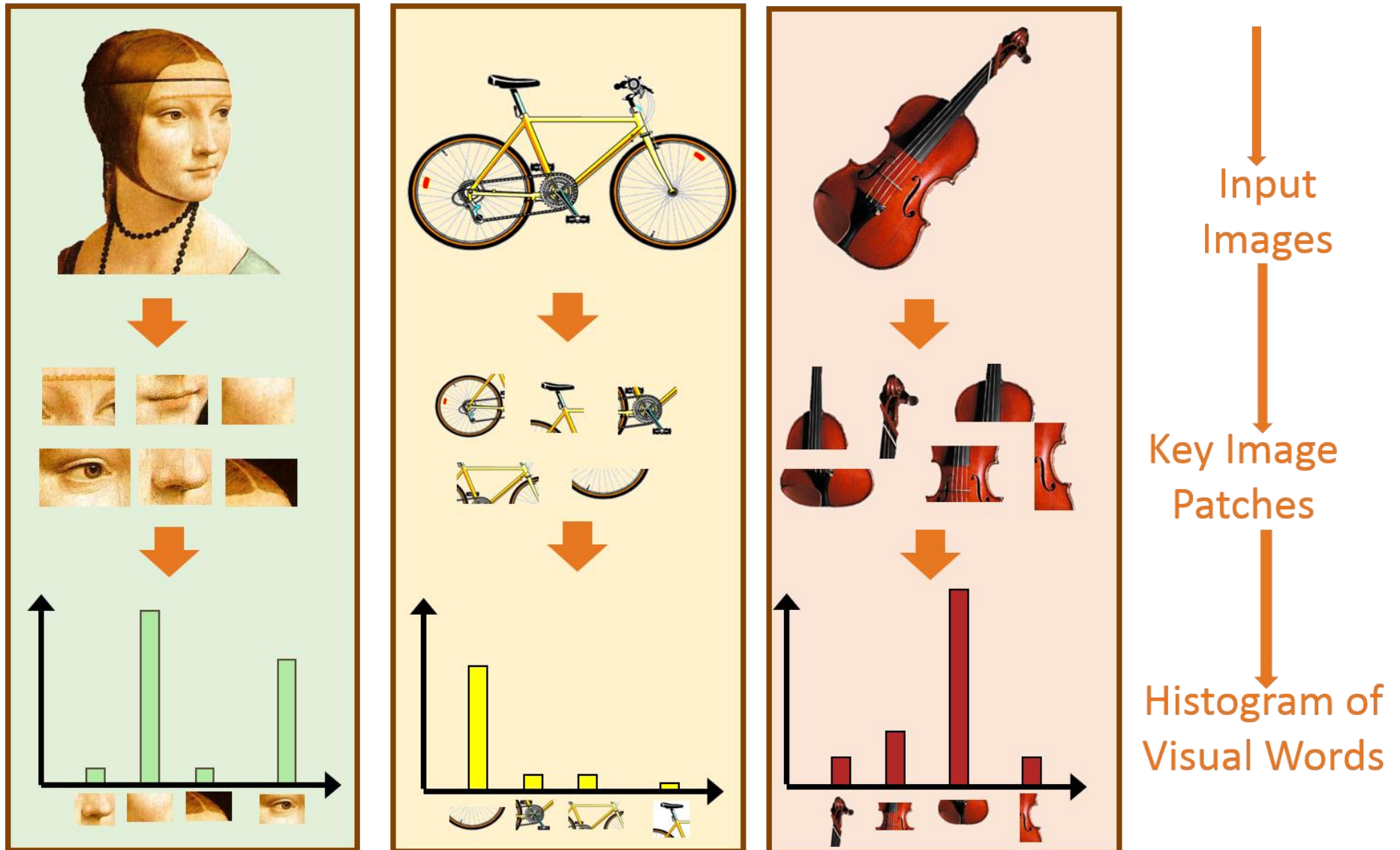
# OpenCV (2/2)

有超過2,500種演算法



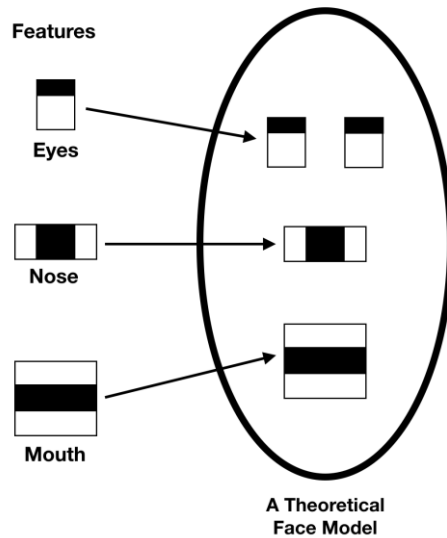
# 物體辨識: Visual Bag of Words

不考慮順序，只考慮物體特徵有無出現

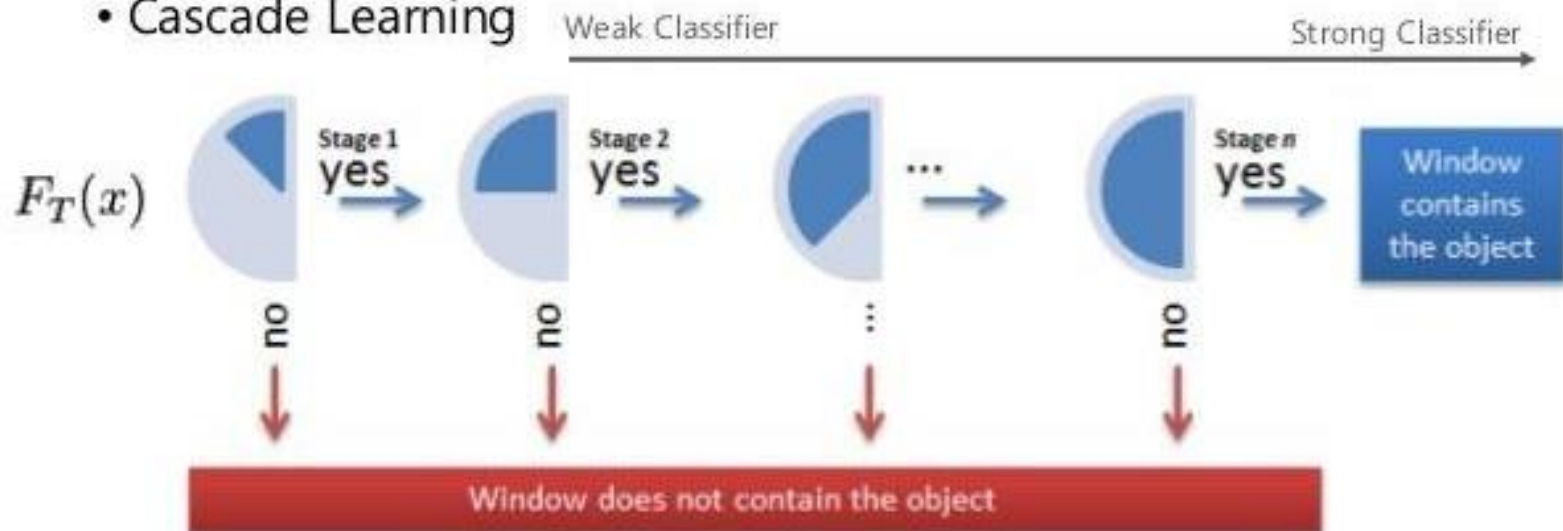


# 人臉辨識: Haar Cascades

AdaBoost on basic edge/line features



## • Cascade Learning

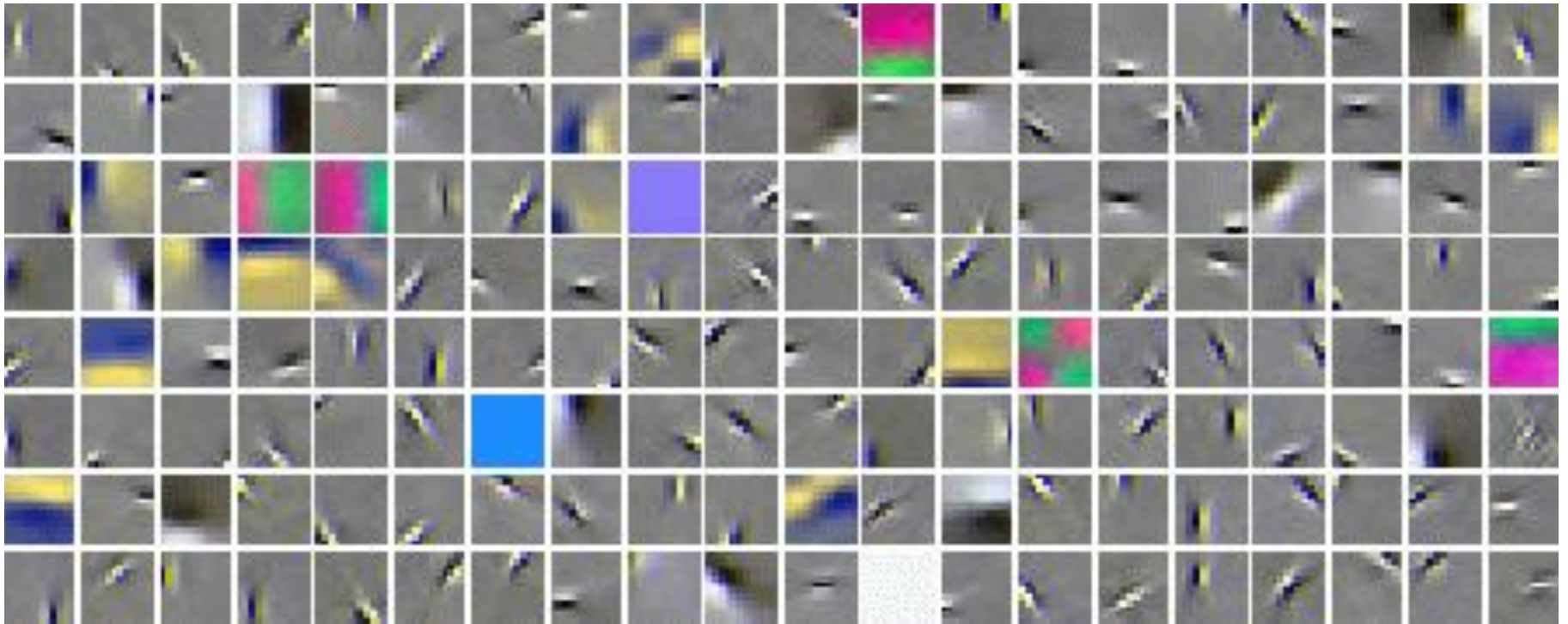
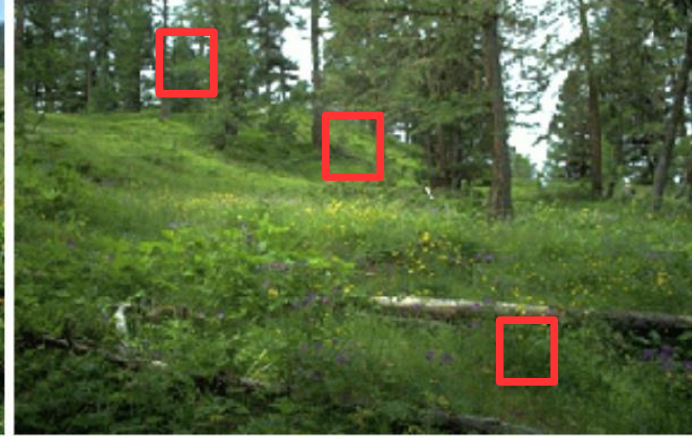
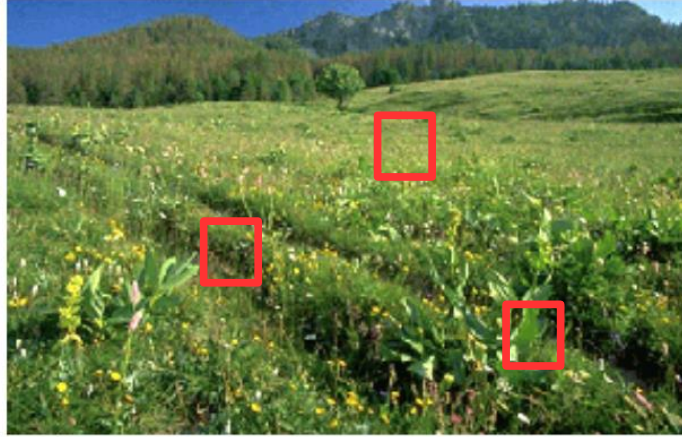
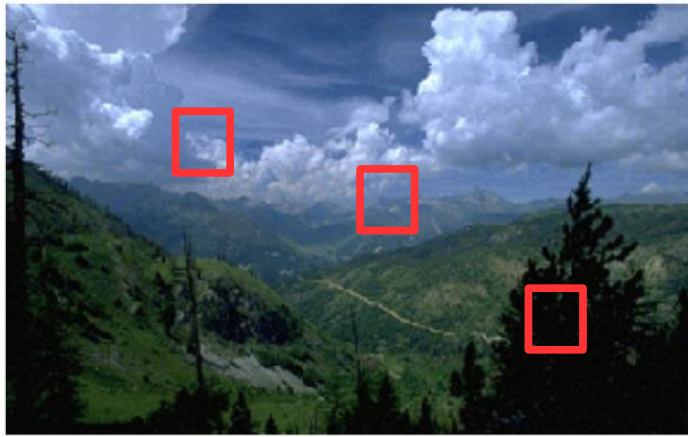


# 卷積神經網路

## (Convolutional Neural Networks)



# Shared Patterns of Patches

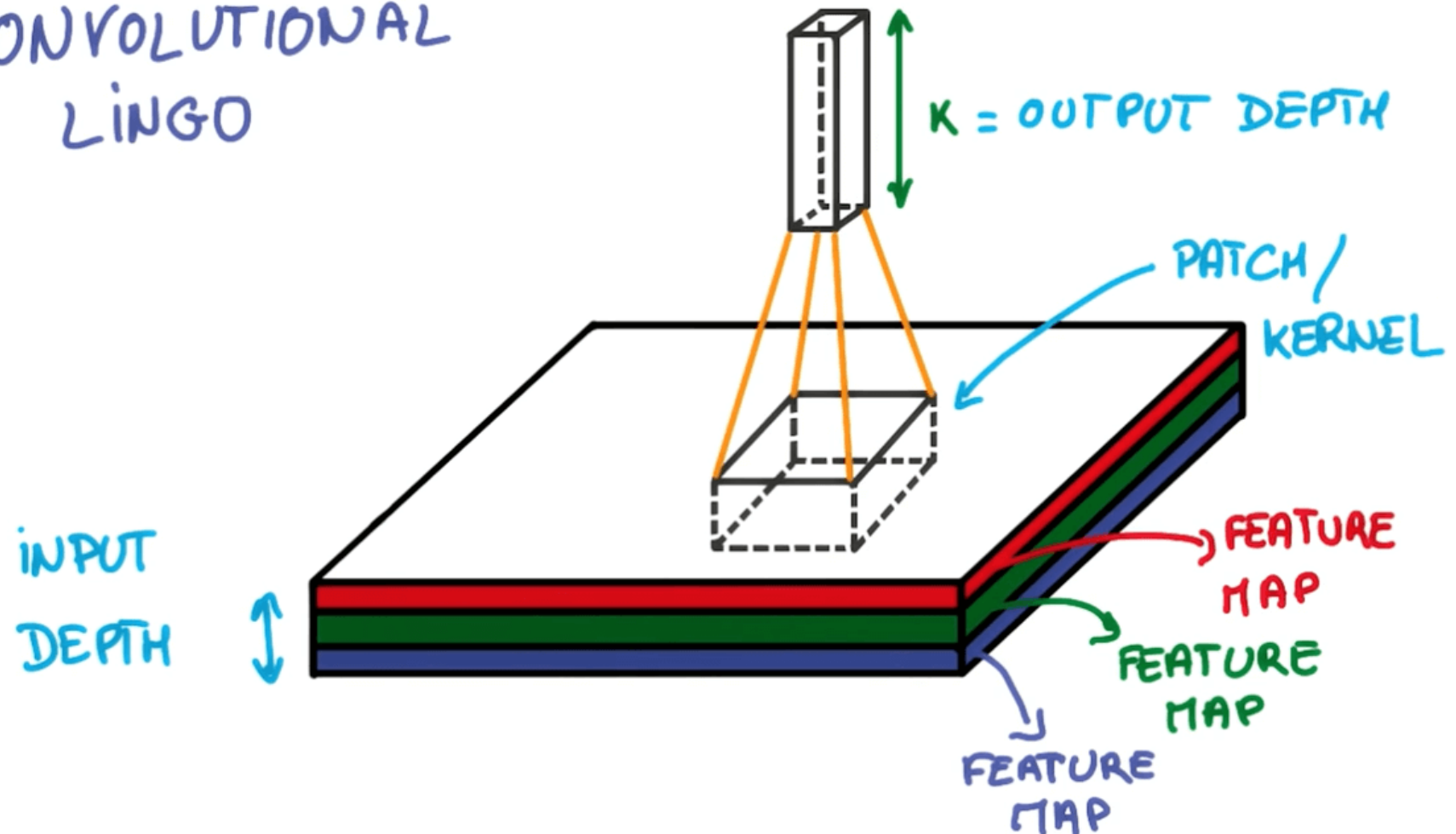




# CNN Terms

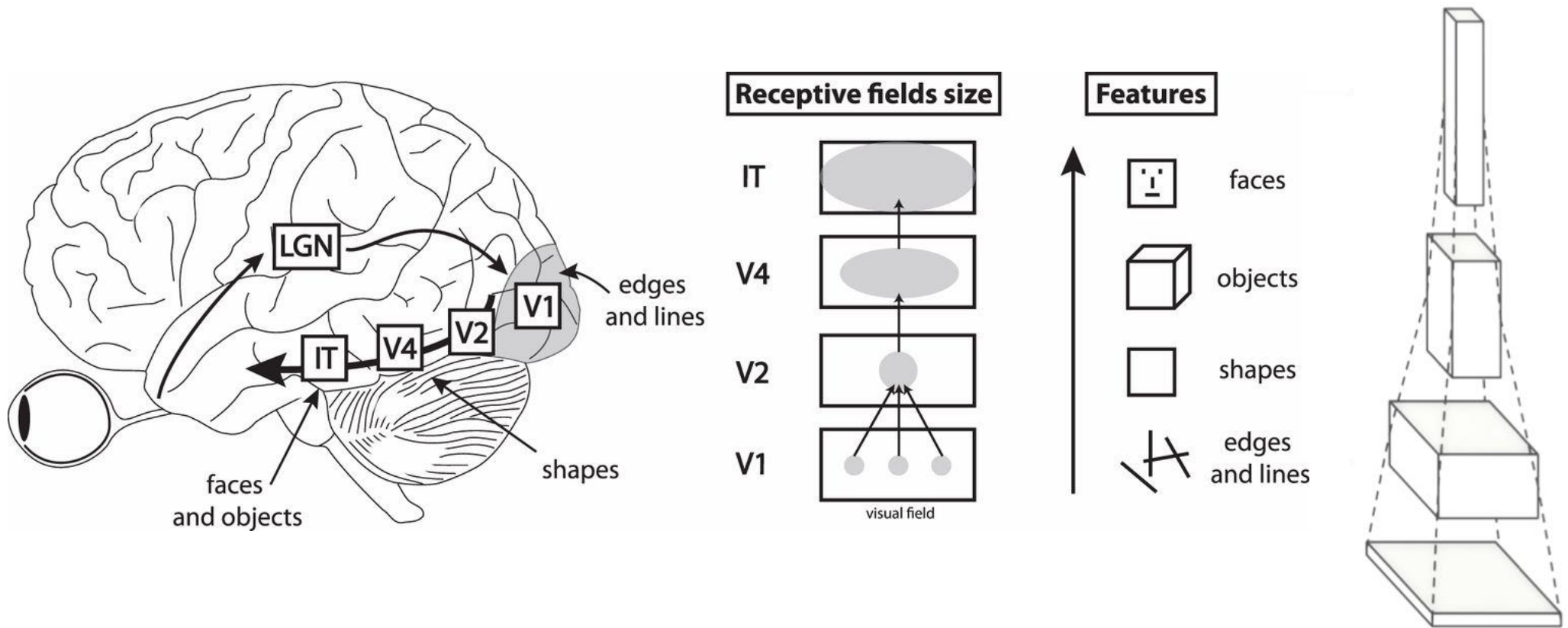
Kernel是template，也是shared network weights

CONVOLUTIONAL  
LINGO



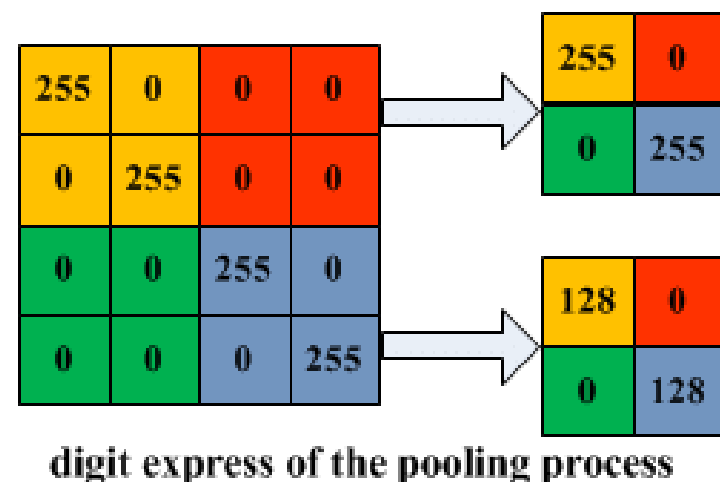
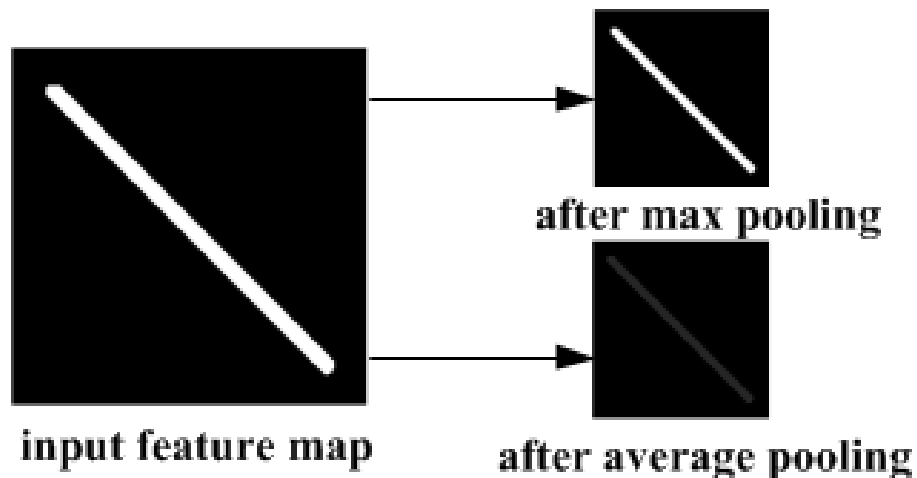
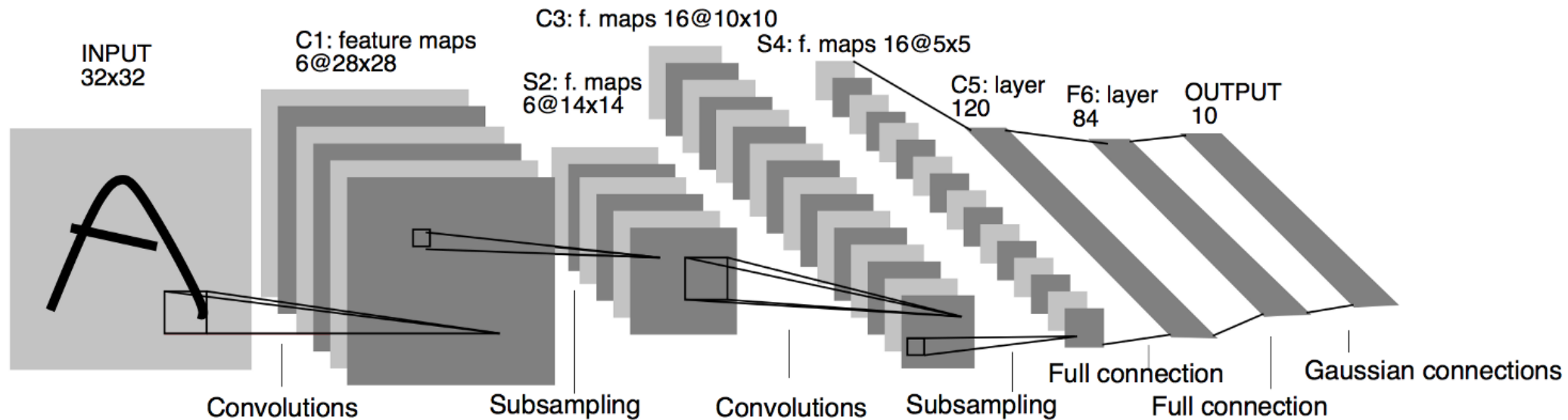
# CNN的金字塔結構

是在仿ventral visual pathway in the brain



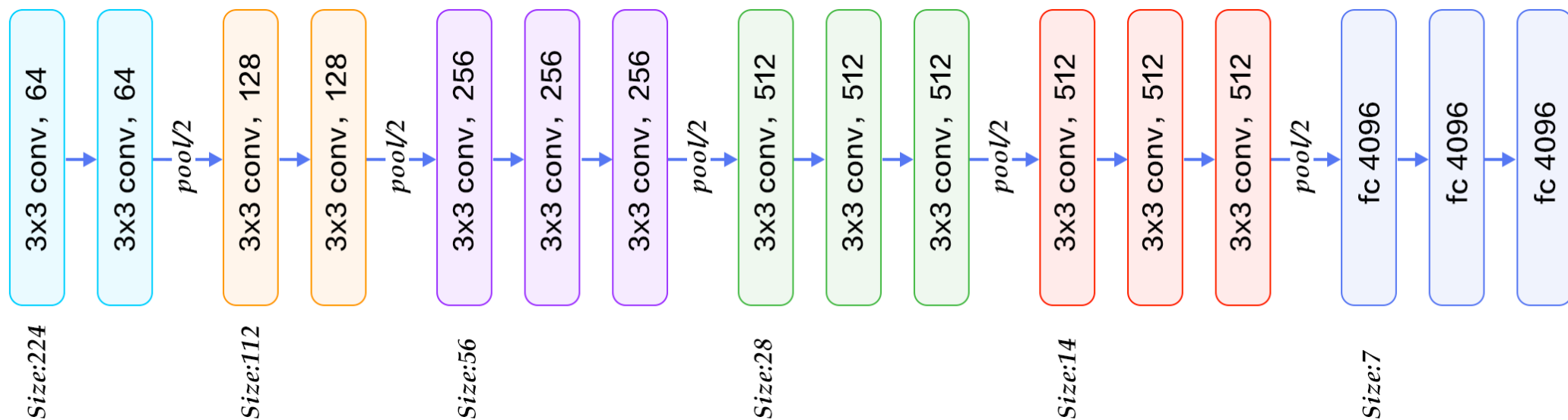
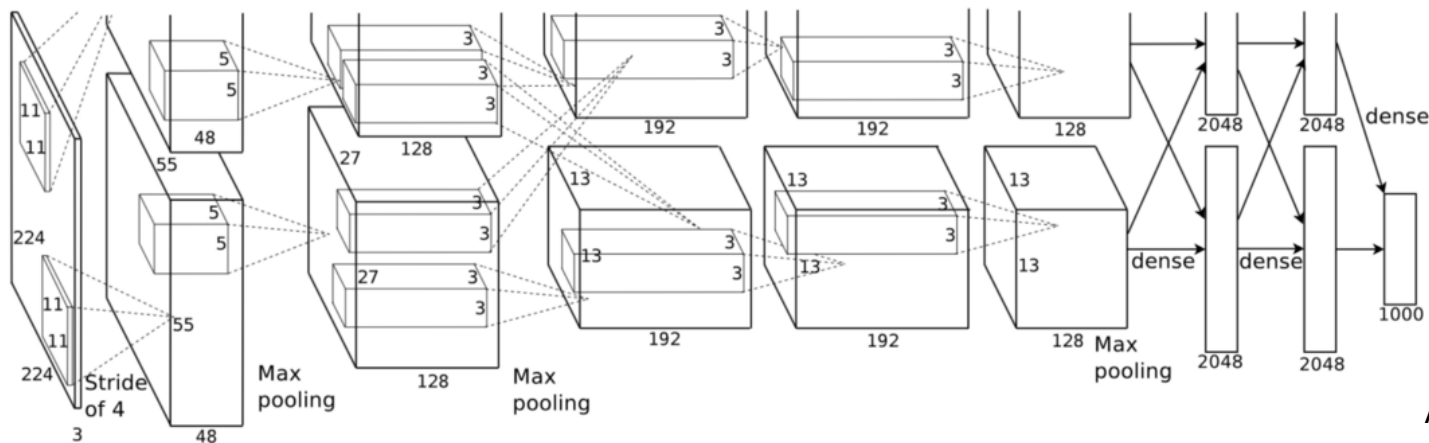
# CNN的基本結構

卷積的  $O=1+(I-F) \Rightarrow F=I-O+1=32-28+1=5$



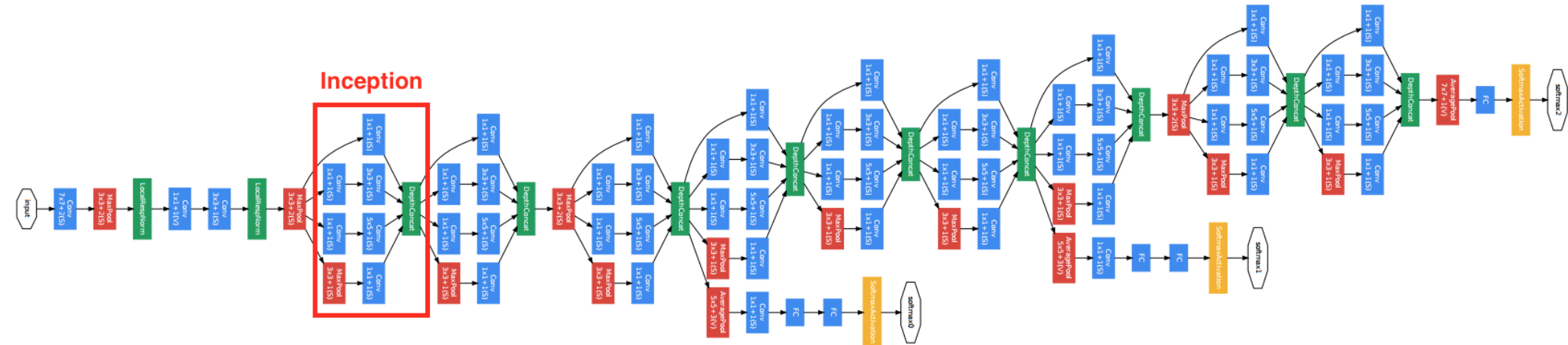
# CNN架構的演進(1/3)

更深/廣→跳接

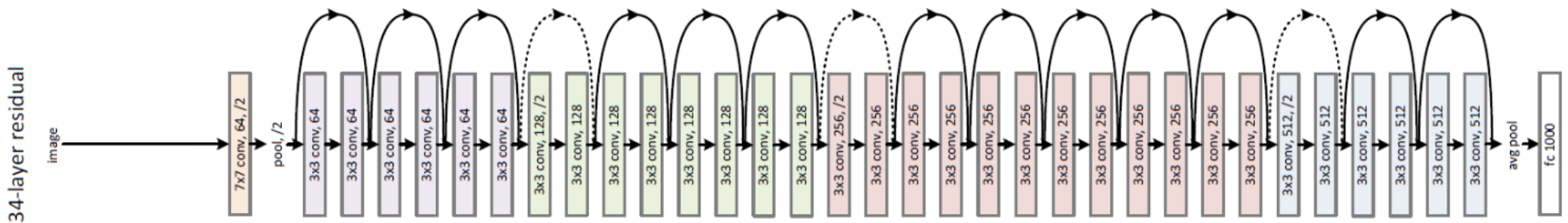


# CNN架構的演進(2/3)

更深/廣→跳接



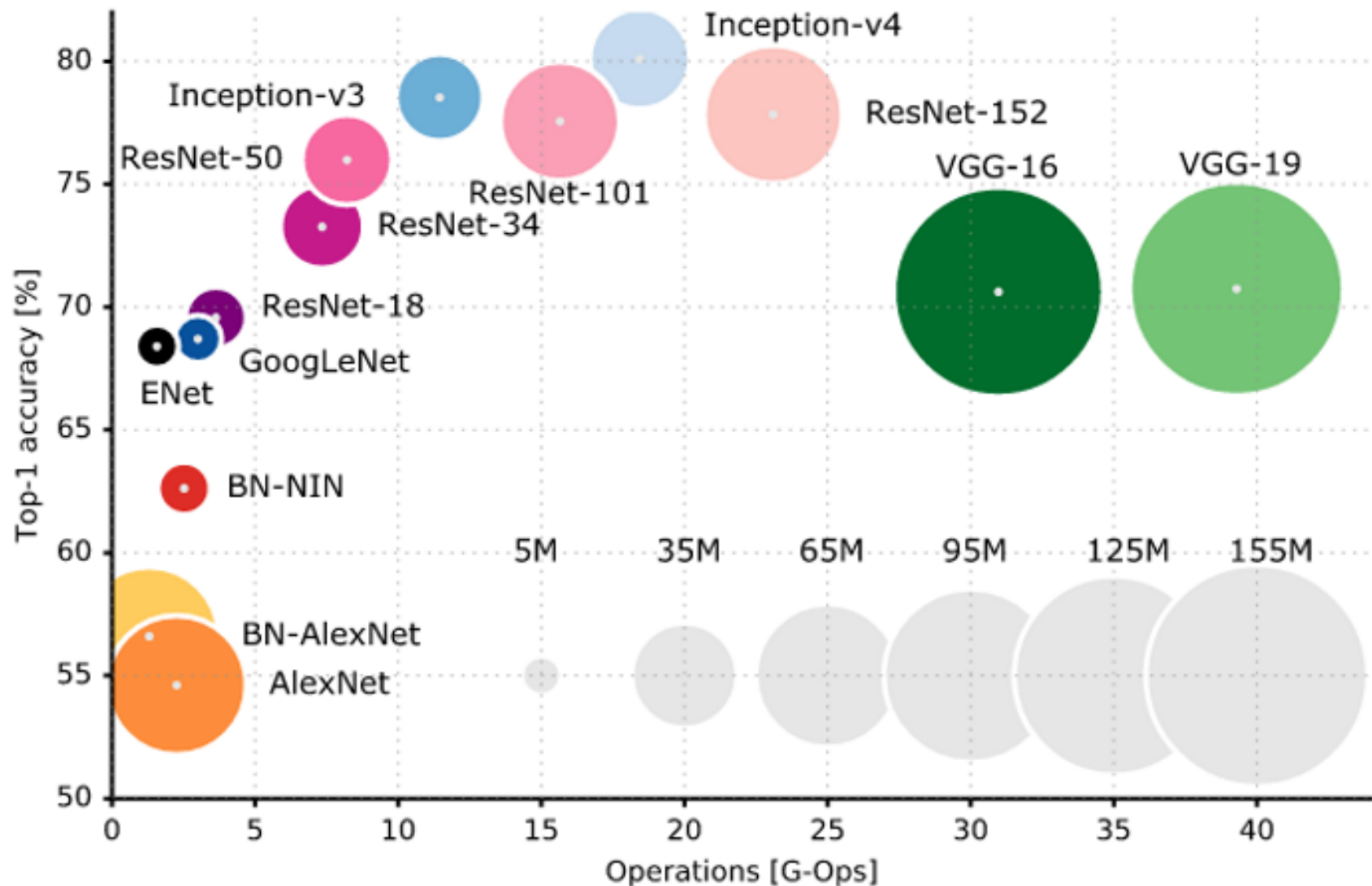
GoogLeNet (2014)



ResNet (2015)

# CNN架構的演進(3/3)

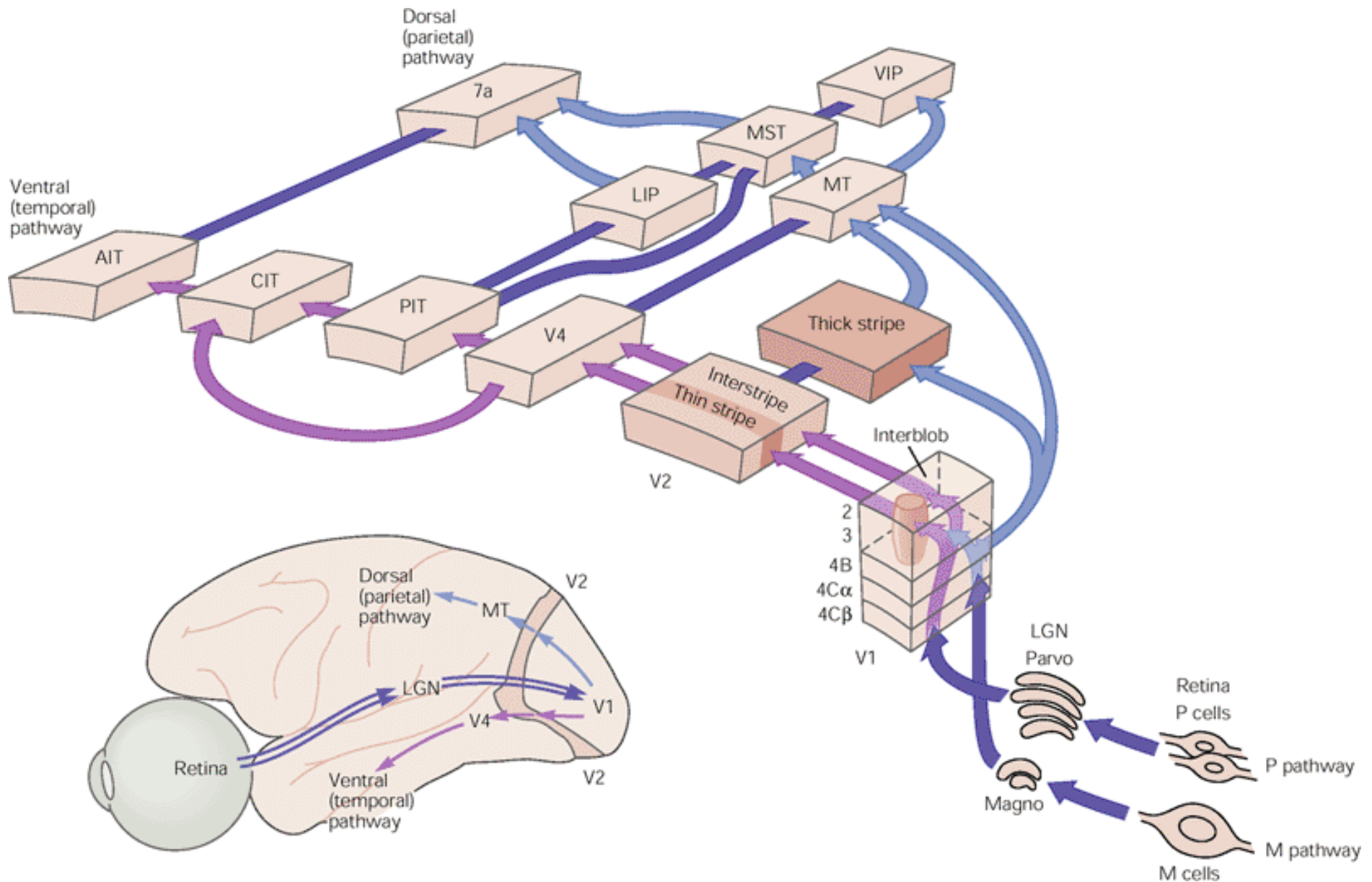
最複雜的模型  $\neq$  表現最好的模型





# CNN只模仿了What Pathway

但還有Where Pathway

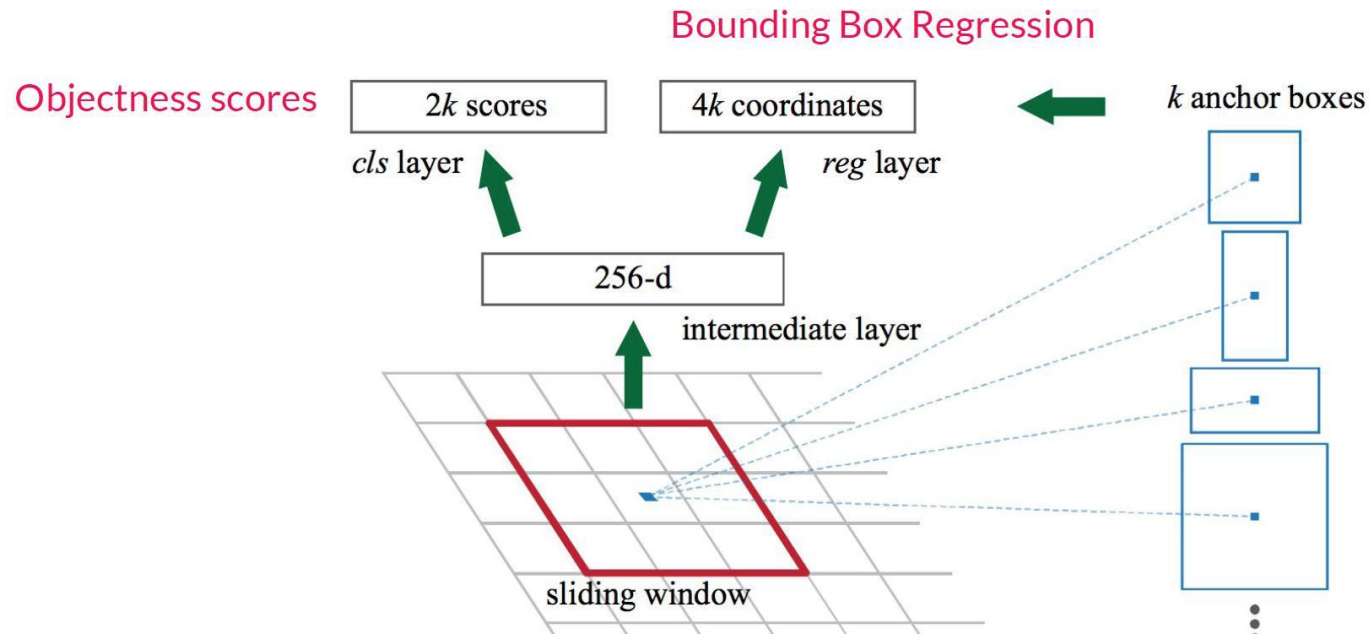


# 只模仿What Pathway的不足

無法分解問題來各個擊破



# Region-based CNN (R-CNN)



## R-CNN: *Regions with CNN features*

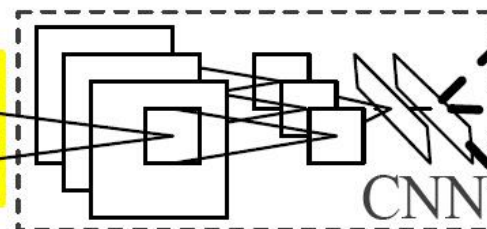


1. Input image

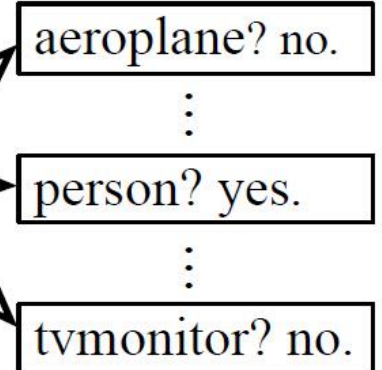


2. Extract region proposals ( $\sim 2k$ )

warped region



3. Compute CNN features



4. Classify regions



# R-CNN的徒子徒孫

## 族繁不及備載

### R-CNN

#### RCNN (ECCV2014)

- selective search,  
根据颜色, 边缘,  
1. 纹理等等快速的找  
到的可能存在的目  
标候选框

1.1 475张, VOC2007上的检测结果从DPM HSC的34.3%直接提升到了66%(mAP)

1.2 Proposal归一化到227\*227, CNN只对一个图片ROI图片的提特征, 分类还是SVM, 最终有对分类好的proposal的回归

1.3 问题在于每一个图像块进来都要用CNN算一下特征, 其实整张图算一次就好了

#### Fast RCNN (ICCV2015)

- 加入SPPnet,  
end to end 训  
练, 使用了回  
归

1.1 3S每张, Map70%, 仍然网络外部给Proposal

1.2 ROI pooling: 类似于SPP, 但只有一种7\*7网格, 下采样得到49\*512维度的特征(只有全连接层才对Size有要求)

1.3 损失函数使用了多任务损失函数(multi-task loss), 将边框回归直接加入到CNN网络中训练

1.4 SPP 对任意输入的Feature Map 做了金字塔Pooling: 对Map 划成4\*4, 2\*2, 1\*1三种网格, 然后做pooling: 得到固定的FC输入: (16+4+1) \* channels维度

#### Faster RCNN (NIPS2015)

- 使用网络直接  
产生召回率高的  
Proposals:  
RPN网络

1.1 5FPS, mAP73.2%

1.2 加入了9种 anchors (3种尺度, 3种比例), 总共输出20000~proposals

1.3 输入的特征proposal接入到ROI Pooling

#### YOLO (CVPR2016)

1. 变为回归  
问题来做

1.1 45FPS, mAP57.9%

1.2 整张图划为7\*7网格, 每一个格子预测两个目标, 输出的结果有置信度+坐标位置

1.3 并没有使用Region proposal, 7\*7比较粗燥, 小目标不好

#### SSD (ECCV2015)

- YOLO+  
1. Proposal  
+多尺度

1.1 58FPS, mAP73.9%

1.2 整张图8\*8网格+anchors+FCN

1.3 不同层的feature map 3\*3滑窗感受野不同, 作为不同尺度的检测

GAME OVER

