

Pip install keras

Pip install Numpy

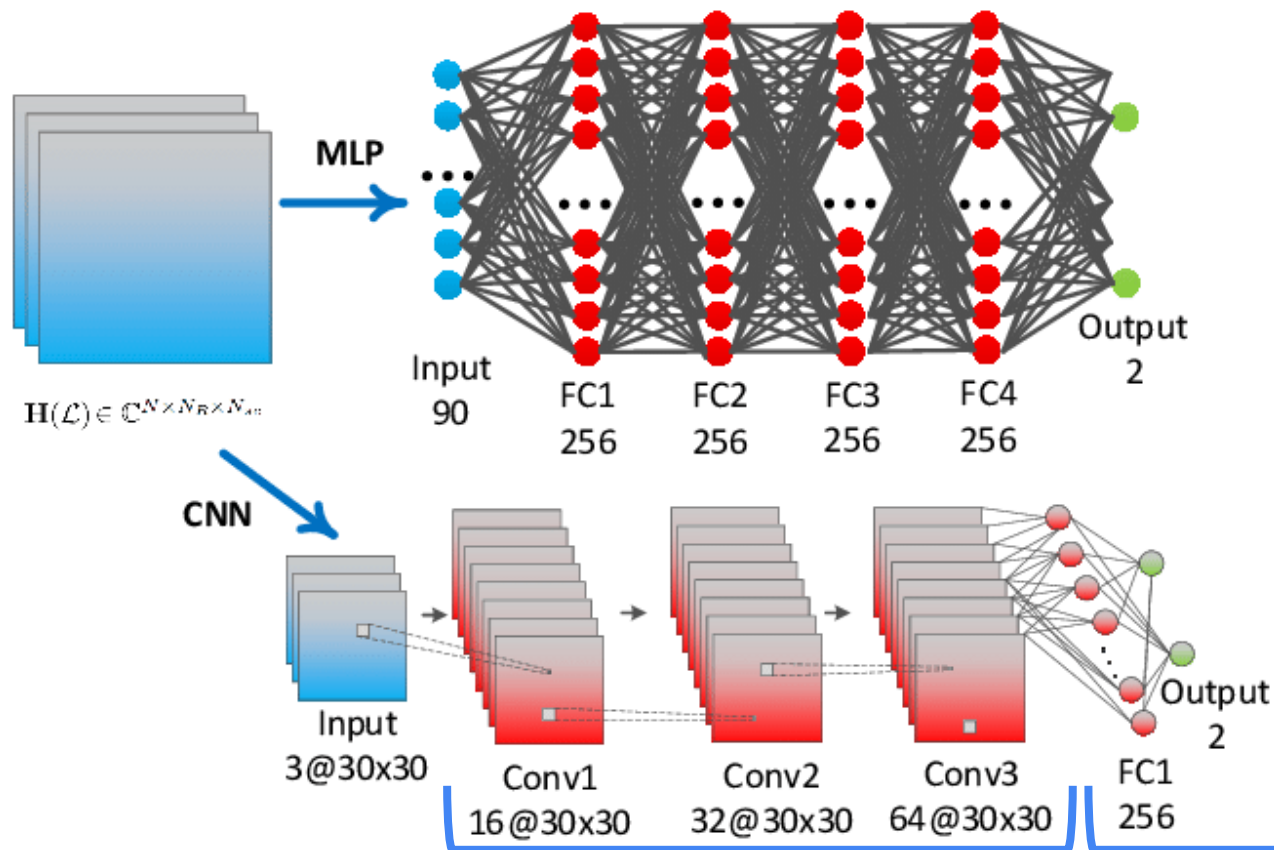
Pip install Matplotlib

Pip install opencv-python

# Convolutional Neural Network

## 1. MLP vs CNN

### (0) Overview



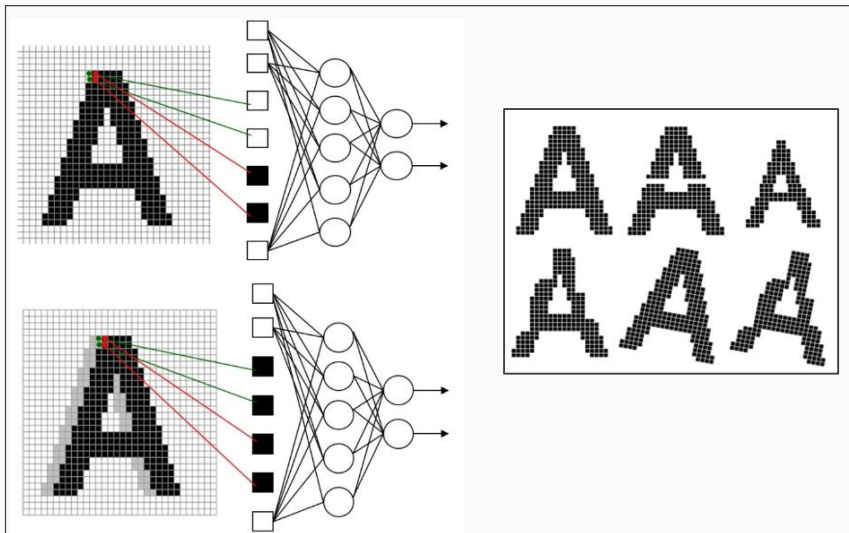
1. Feature extraction

2. Classification

# Convolutional Neural Network

## 1. MLP vs CNN

### (1) 기존 Multi-Layered Neural Network의 문제점

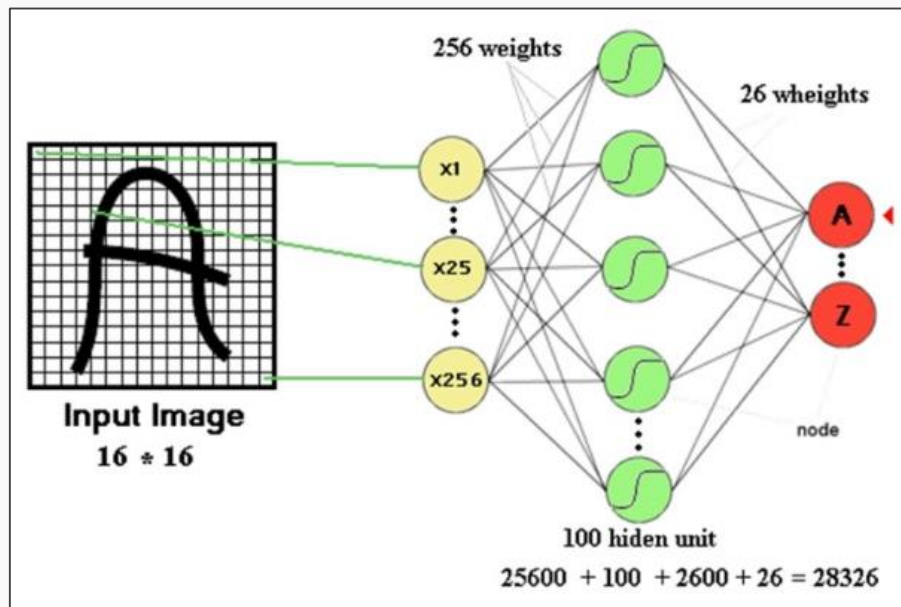


1. Did not consider spatial, temporal relationship.  
➔ Need many training data to deal with many variation.

# Convolutional Neural Network

## 1. MLP vs CNN

### (1) 기존 Multi-Layered Neural Network의 문제점



## 2. Number of free parameters

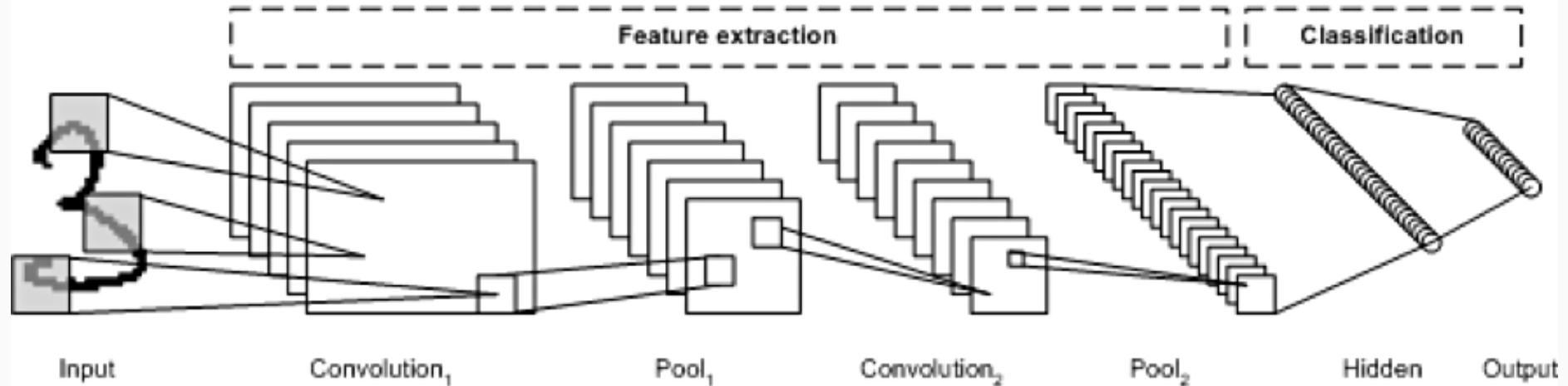
# Convolutional Neural Network

## 1. MLP vs CNN

### (2) Why CNN?

#### 1. Feature Extraction (Convolution + Pooling)

→ Translation invariant



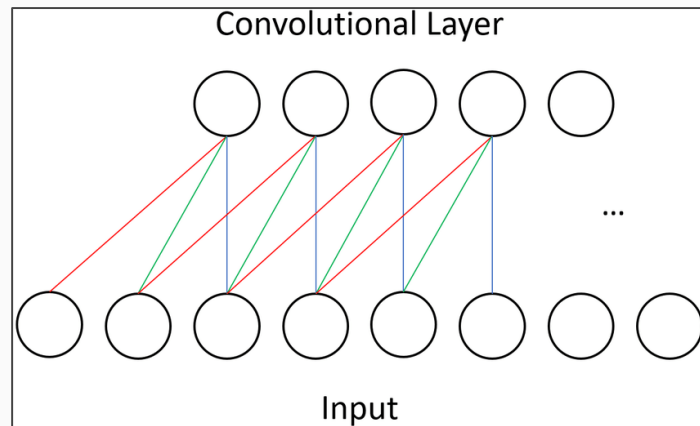
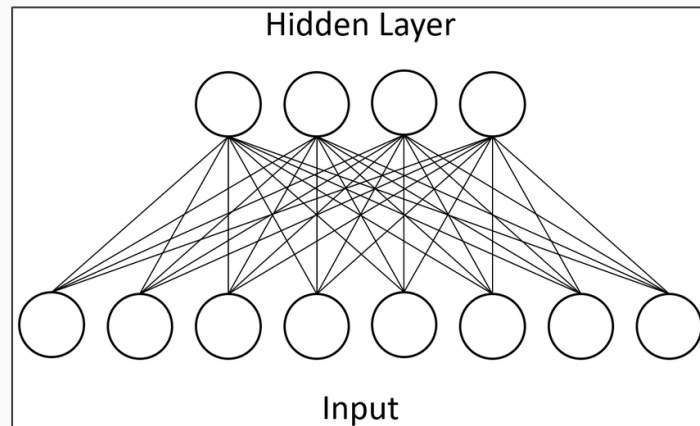
# Convolutional Neural Network

## 1. MLP vs CNN

### (2) Why CNN?

#### 1. Number of free parameters

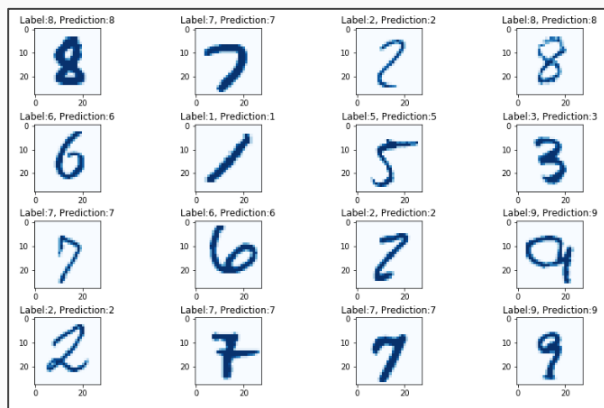
- Locality (Local Connectivity) → Sparse matrix
- Shared Weights



# Convolutional Neural Network

## 1. MLP vs CNN

### (2) Why CNN? (실습)

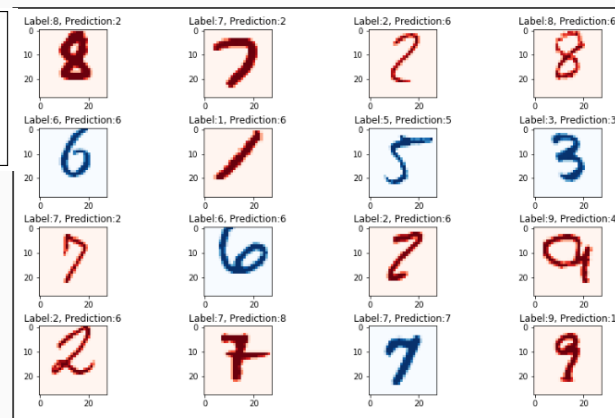


MLP

Correct prediction data

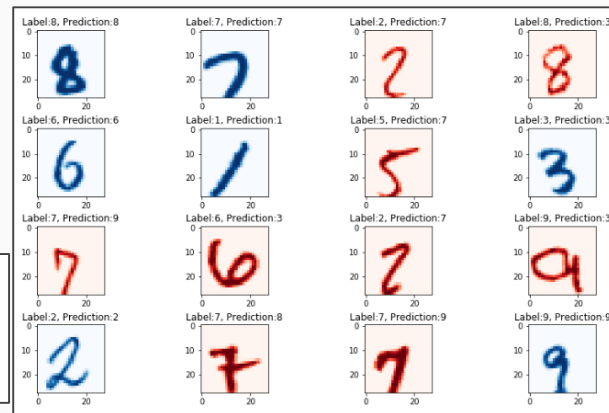
$$T = \begin{bmatrix} 1 & 0 & t_x \\ 0 & 1 & t_y \end{bmatrix}$$

Translation



Rotation

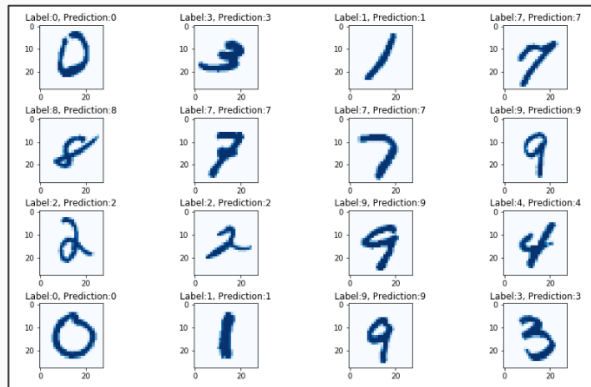
$$R = \begin{bmatrix} \cos\theta & -\sin\theta \\ \sin\theta & \cos\theta \end{bmatrix}$$



# Convolutional Neural Network

## 1. MLP vs CNN

### (2) Why CNN? (실습)

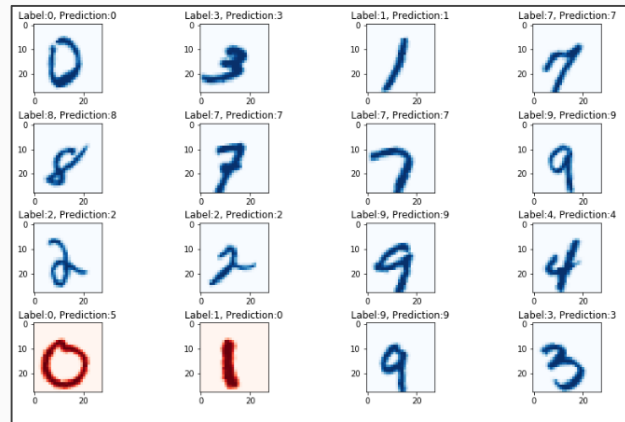
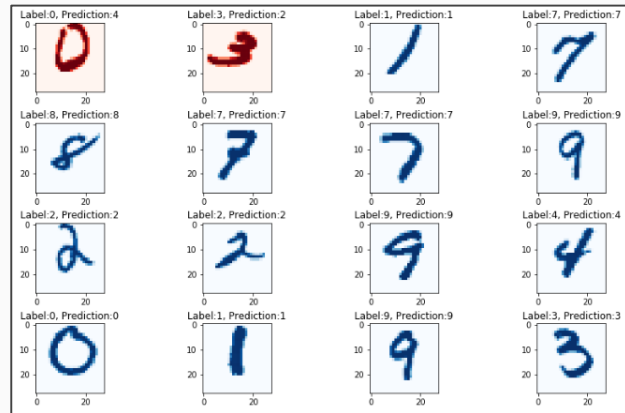


CNN

Correct prediction data

$$T = \begin{bmatrix} 1 & 0 & t_x \\ 0 & 1 & t_y \end{bmatrix}$$

Translation

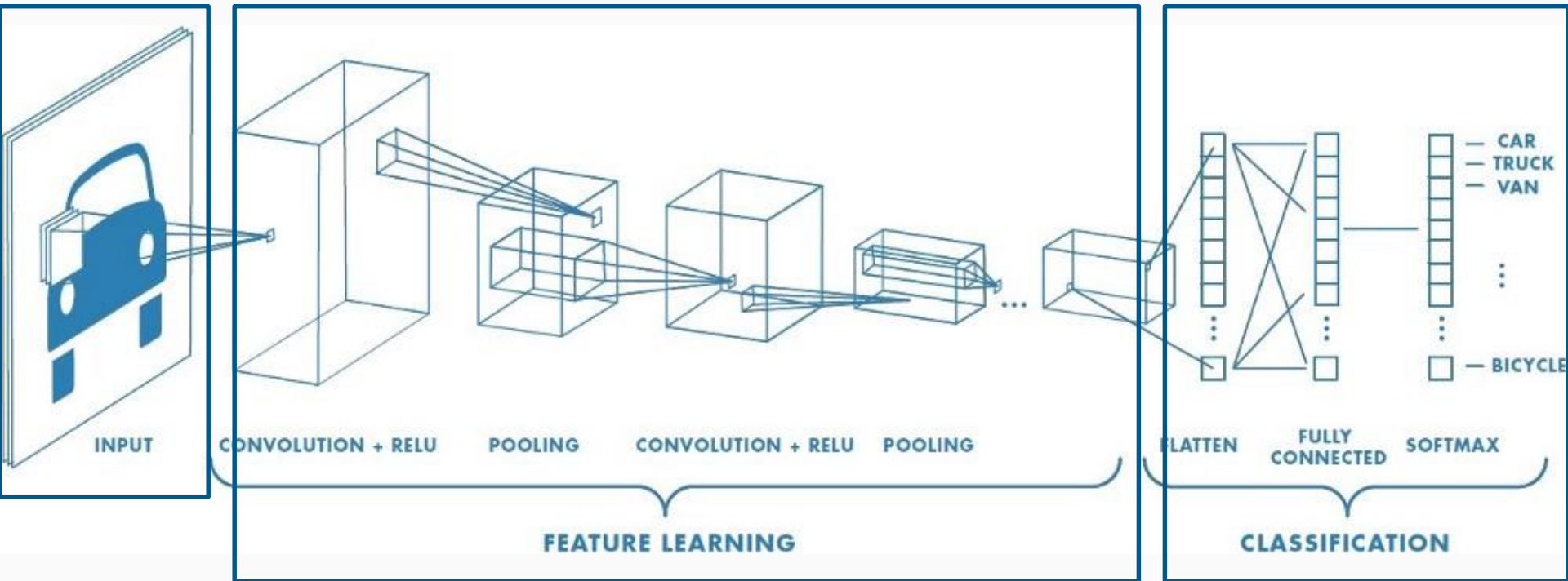


Rotation

$$R = \begin{bmatrix} \cos\theta & -\sin\theta \\ \sin\theta & \cos\theta \end{bmatrix}$$

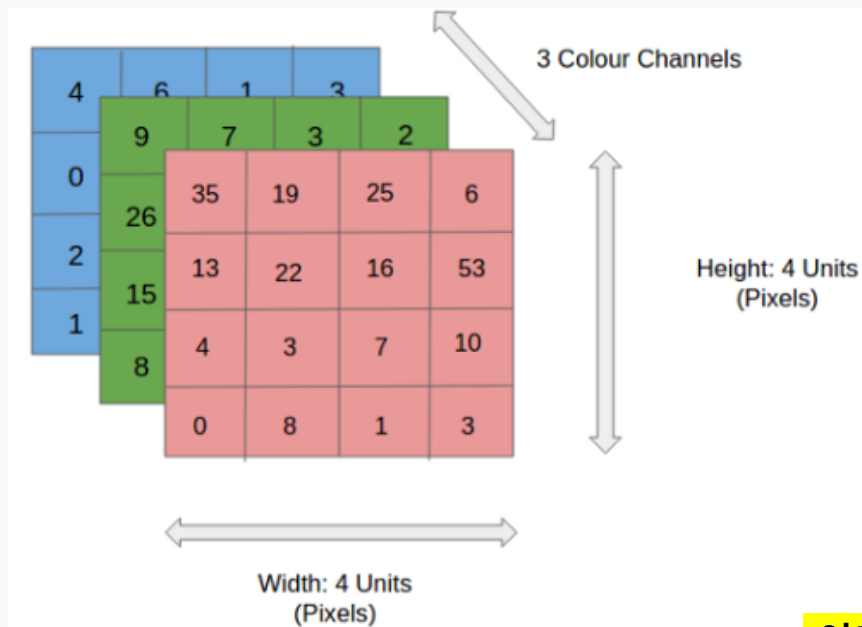


## 0. Overview of CNN Structure



# Convolutional Neural Network – 주요 용어 설명

## 0. Input Image



- The role of the ConvNet is to
- **reduce the images** into a form which is easier to process,
  - **without losing features** which are critical for getting a good prediction

(이미지 개수, 이미지 Height, 이미지 Width, 이미지 Channel)

# Convolutional Neural Network – 주요 용어 설명

## 1. Feature Extraction - Convolution Layer – The Kernel

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

Image

4		

Convolved  
Feature

Input :  $5 \times 5 \times 1$

Kernel :  $3 \times 3 \times 1 \times 1$

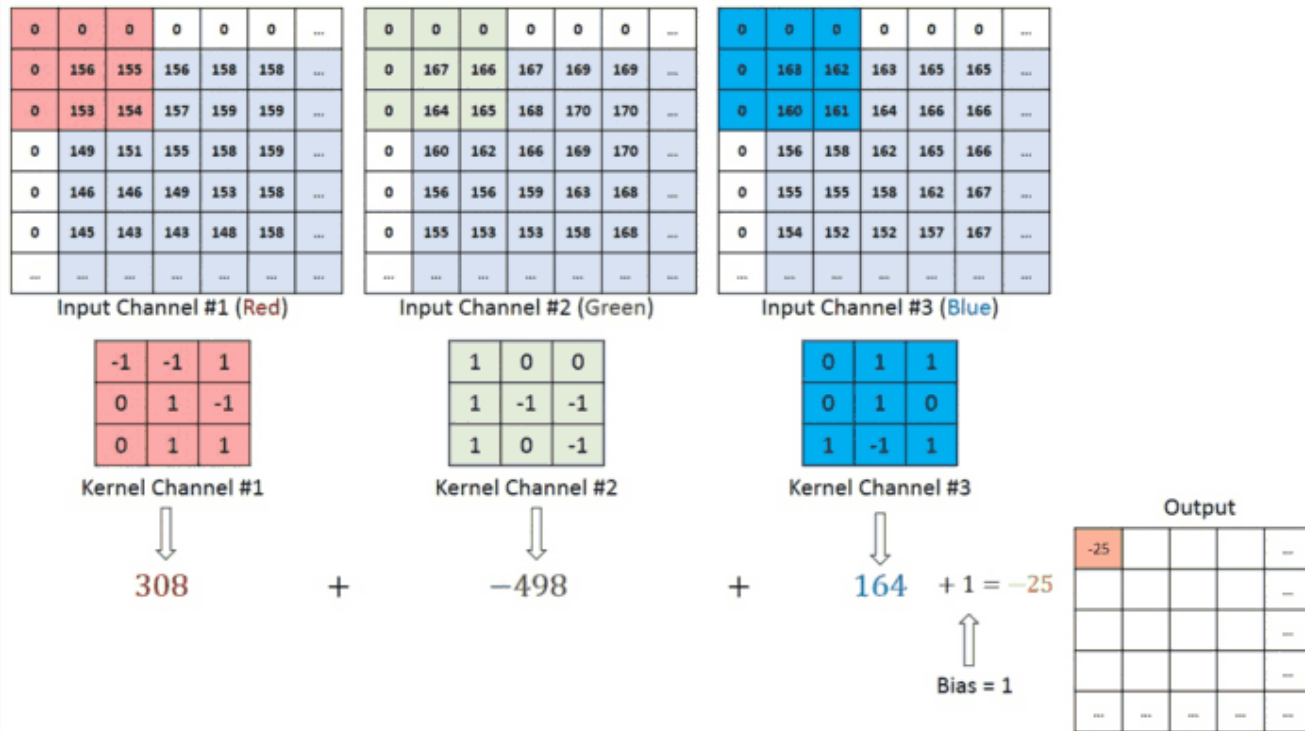
Strides : (1,1)

Padding : valid

**Conv2D(filters = 필터갯수,  
kernel\_size=(가로,세로),  
strides = (가로 이동수,세로 이동수),  
padding='same ' or padding="valid")**

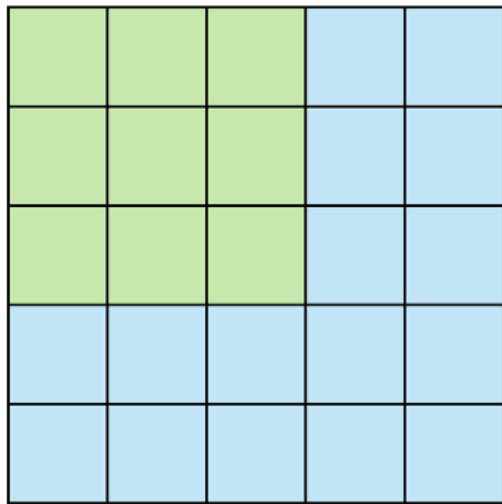
# Convolutional Neural Network – 주요 용어 설명

## 1. Feature Extraction - Convolution Layer – The Kernel

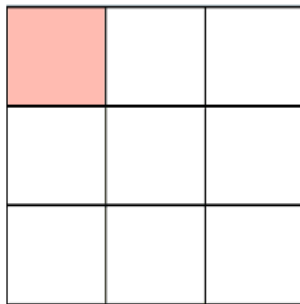


# Convolutional Neural Network – 주요 용어 설명

## 1. Feature Extraction - Convolution Layer – The Kernel - Stride



Stride 1

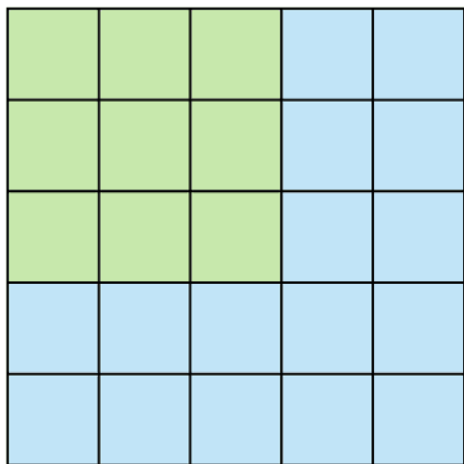


Feature Map

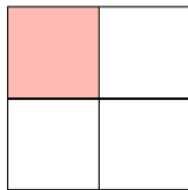
**Conv2D(filters = 필터갯수,  
kernel\_size=(가로,세로),  
strides = (가로 이동수,세로 이동수),  
padding='same ' or padding="valid")**

# Convolutional Neural Network – 주요 용어 설명

## 1. Feature Extraction - Convolution Layer – The Kernel - Stride



Stride 2

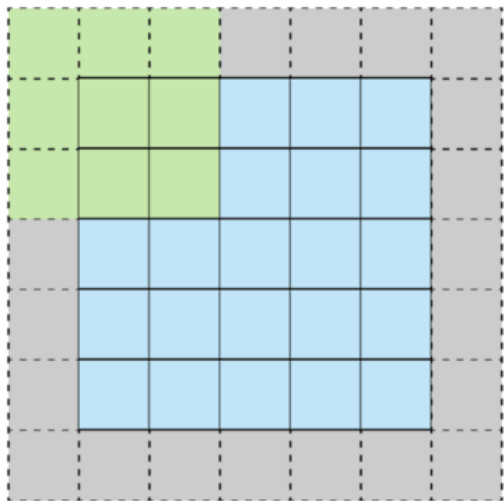


Feature Map

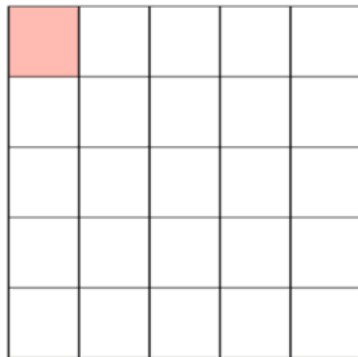
**Conv2D(filters = 필터갯수,  
kernel\_size=(가로,세로),  
strides = (가로 이동수,세로 이동수),  
padding='same ' or padding="valid")**

# Convolutional Neural Network – 주요 용어 설명

## 1. Feature Extraction - Convolution Layer – The Kernel - Padding



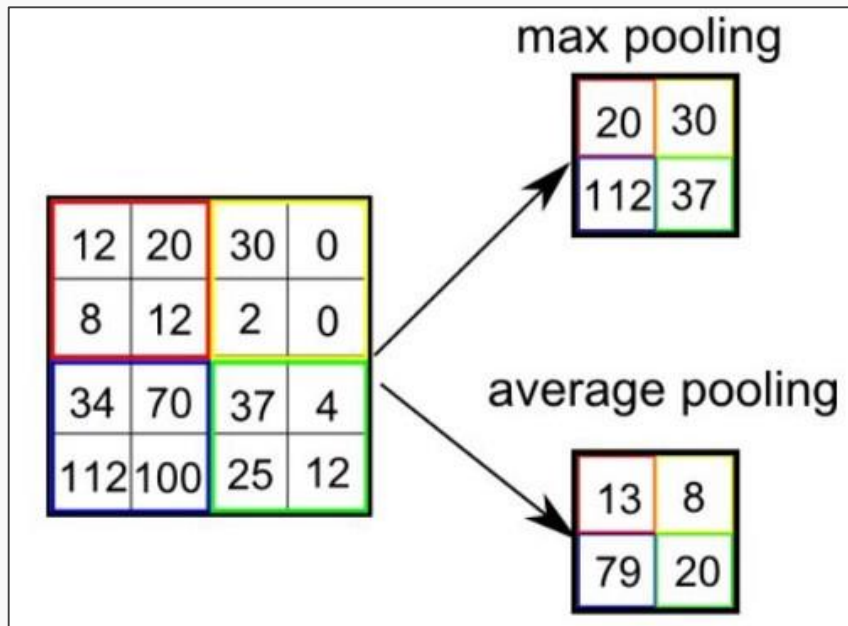
Stride 1 with Padding



Feature Map

**Conv2D(filters = 필터갯수,  
kernel\_size=(가로,세로),  
strides = (가로 이동수,세로 이동수),  
padding='same ' or padding="valid")**

## 1. Feature Extraction - Pooling Layer



- Decrease the computational power
- Extracting dominant features (rotational, positional invariant)
- Noise Suppressant

```
MaxPooling2D(pool_size=(2, 2),  
strides=None, padding='valid', data_format=None)
```



# Convolutional Neural Network – 주요 용어 설명

## 1. Feature Extraction - Pooling Layer

3.0	3.0	3.0
3.0	3.0	3.0
3.0	2.0	3.0

3	3	2	1	0
0	0	1	3	1
3	1	2	2	3
2	0	0	2	2
2	0	0	0	1

`MaxPooling2D(pool_size=(2, 2),  
strides=None, padding='valid', data_format=None)`

`AveragePooling2D(pool_size=(2, 2), strides=None,  
padding='valid', data_format=None)`

# Convolutional Neural Network – 주요 용어 설명

## 실습



0.0625	0.125	0.0625
0.125	0.25	0.125
0.0625	0.125	0.0625



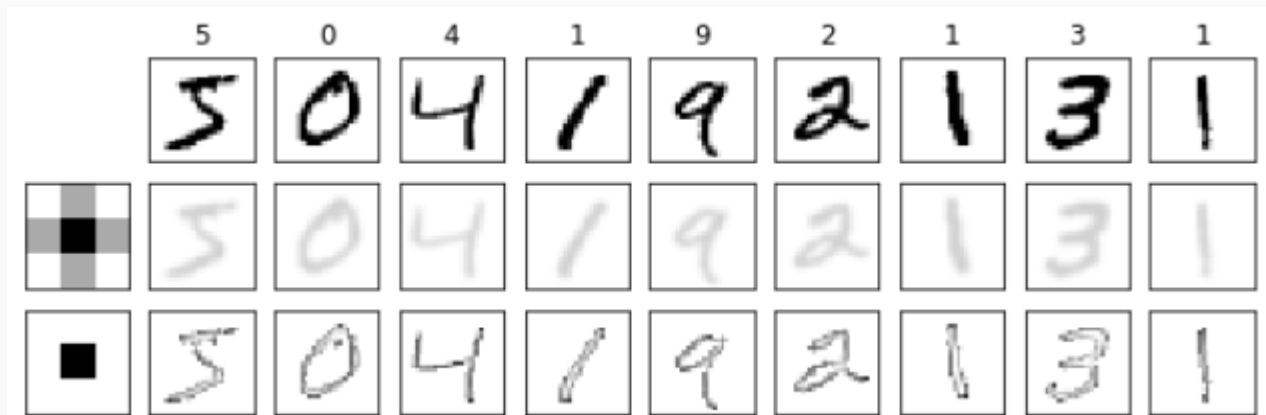
+1	0	-1
+2	0	-2
+1	0	-1



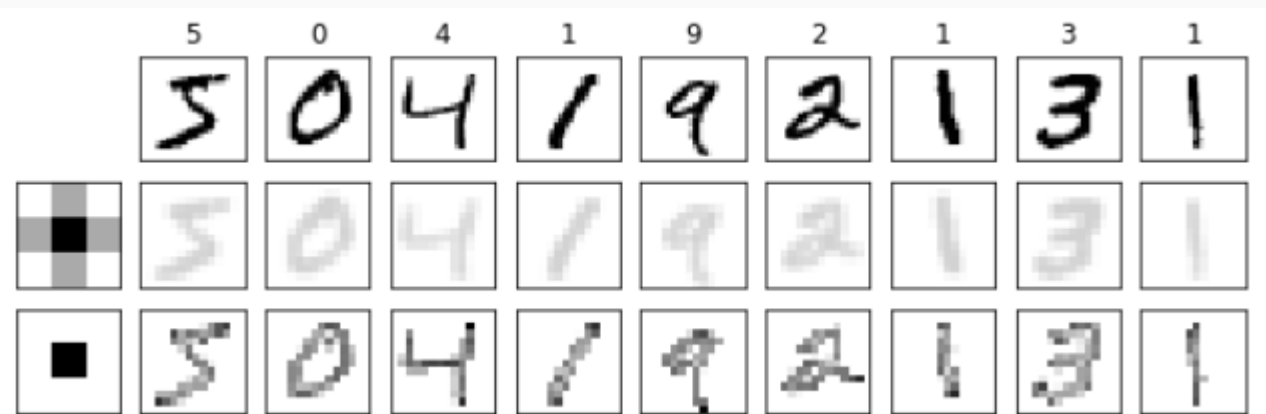
# Convolutional Neural Network – 주요 용어 설명

실습

Convolution



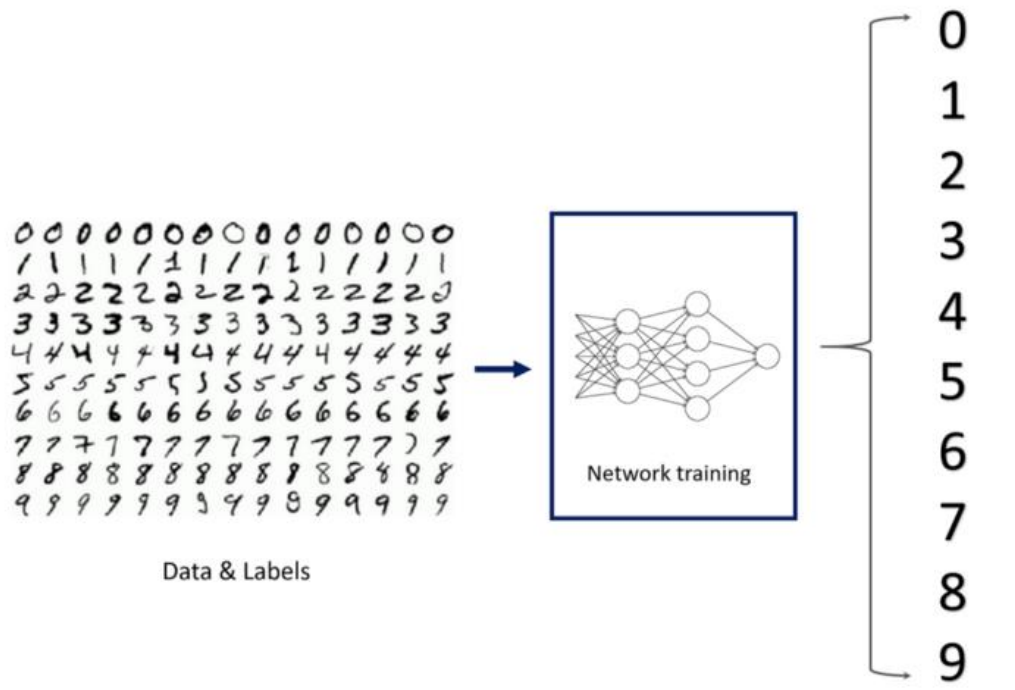
Pooling



Let's have intuition first!

<http://scs.ryerson.ca/~aharley/vis/conv/>

# Convolutional Neural Network – Mnist Dataset



size :  $28 * 28$

# of trainingset : 60000

# of test set : 10000

Keras, tensorflow →  
Default로 (N,H,W,C) 순서로.  
Y는 One hot-encoding

60000,28,28,1