

# ML/DL Study W04

- Convolutional Neural Network
- Layer : Conv, Pool, Fully connected
- Ensemble
- Data Augmentation

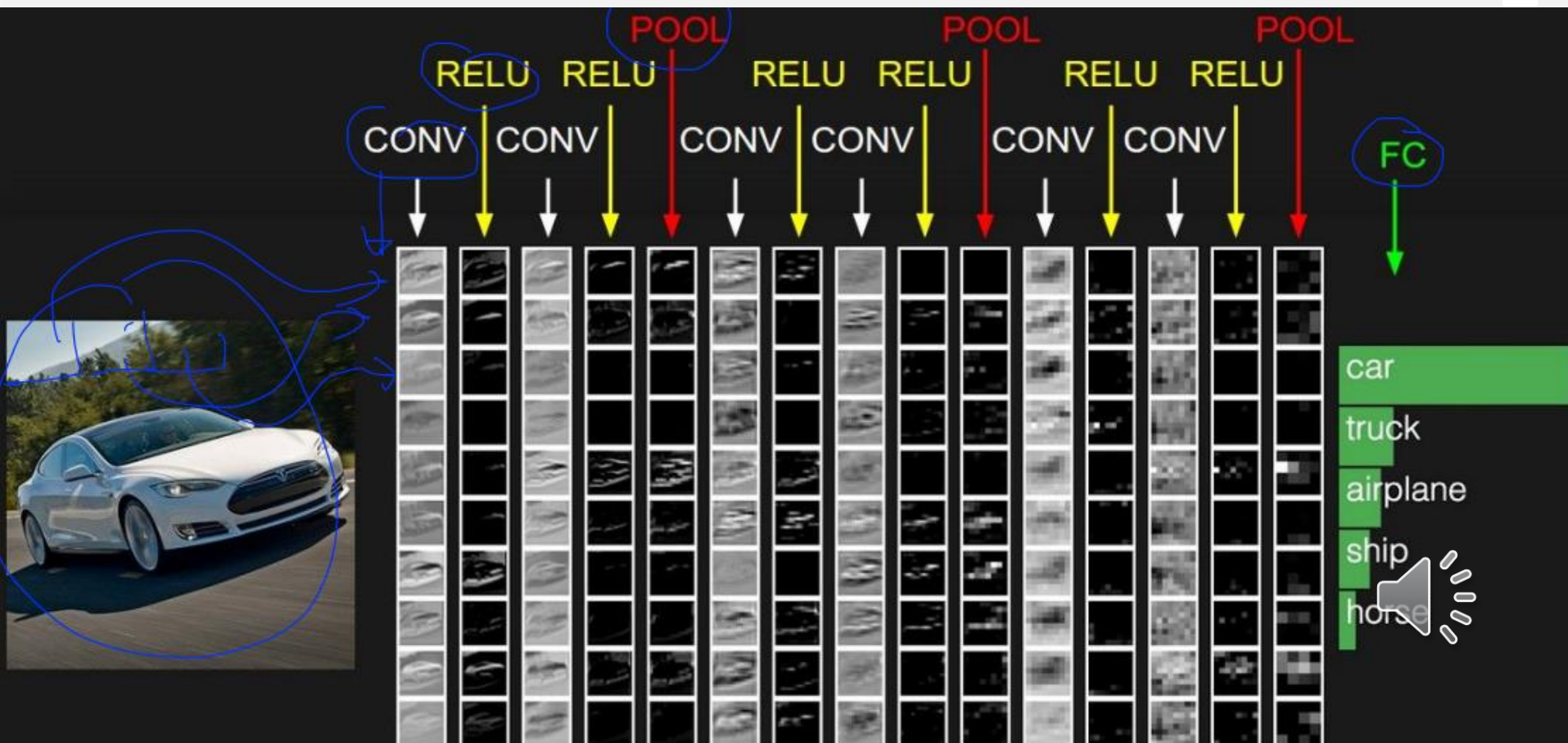


```
lookup.KeyValue  
f.constant(['em  
=tf.constant([0  
ce = tf.lookup.StaticV  
init,  
num_oov_buckets=5)  
  
lookup.StaticVocabular  
initializer  
num_oov_buckets,  
lookup_key_dtype=None  
name=None,  
experimental_is_spon
```

# Convolutional Neural Network



# Convolutional Neural Network

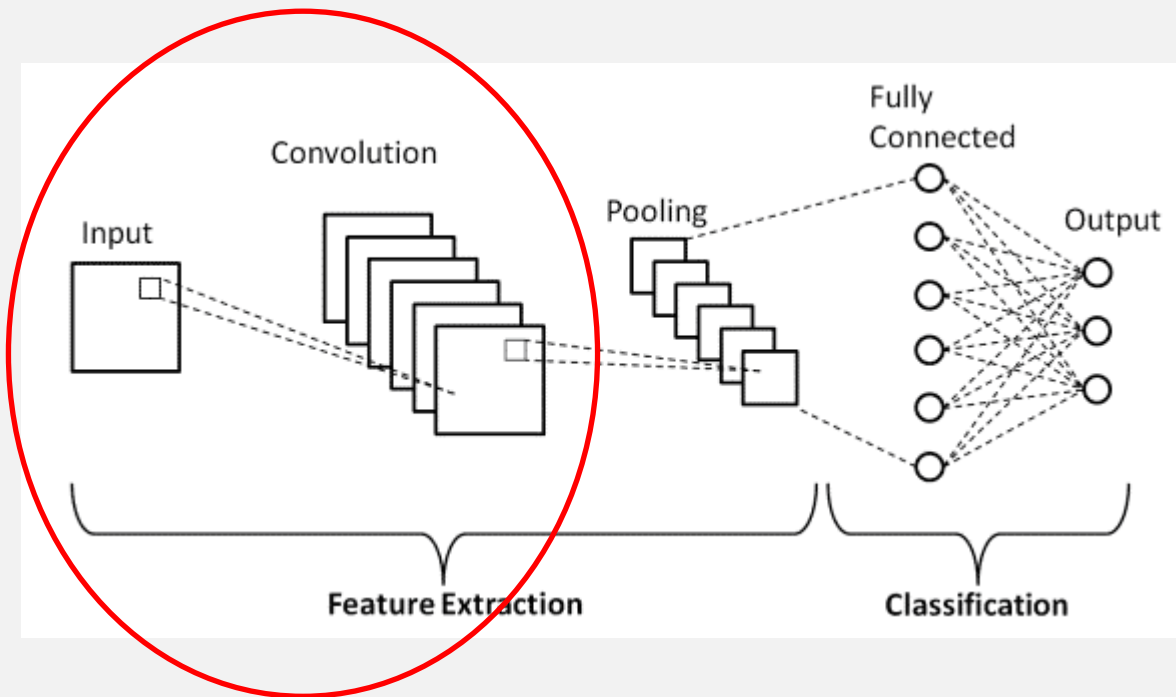


Layer : Conv, Pool, Fully connected



## Layer : Conv, Pool, Fully connected

Convolution Layer : 이미지 및 다차원 데이터의 특징을 감지하고 추출



- **Padding** : output data size를 조절할 수 있음, padding = valid or same
- **Stride** : filter가 input data를 이동하는 간격,  $(input - filter) // stride + 1$ 로 추측 가능



Padding = same

0	0	0	0	0	0	0	0
0	3	3	4	4	7	0	0
0	9	7	6	5	8	2	0
0	6	5	5	6	9	2	0
0	7	1	3	2	7	8	0
0	0	3	7	1	8	3	0
0	4	0	4	3	2	2	0
0	0	0	0	0	0	0	0

$6 \times 6 \rightarrow 8 \times 8$

\*

1	0	-1
1	0	-1
1	0	-1

$3 \times 3$

=

-10	-13	1			
-9	3	0			

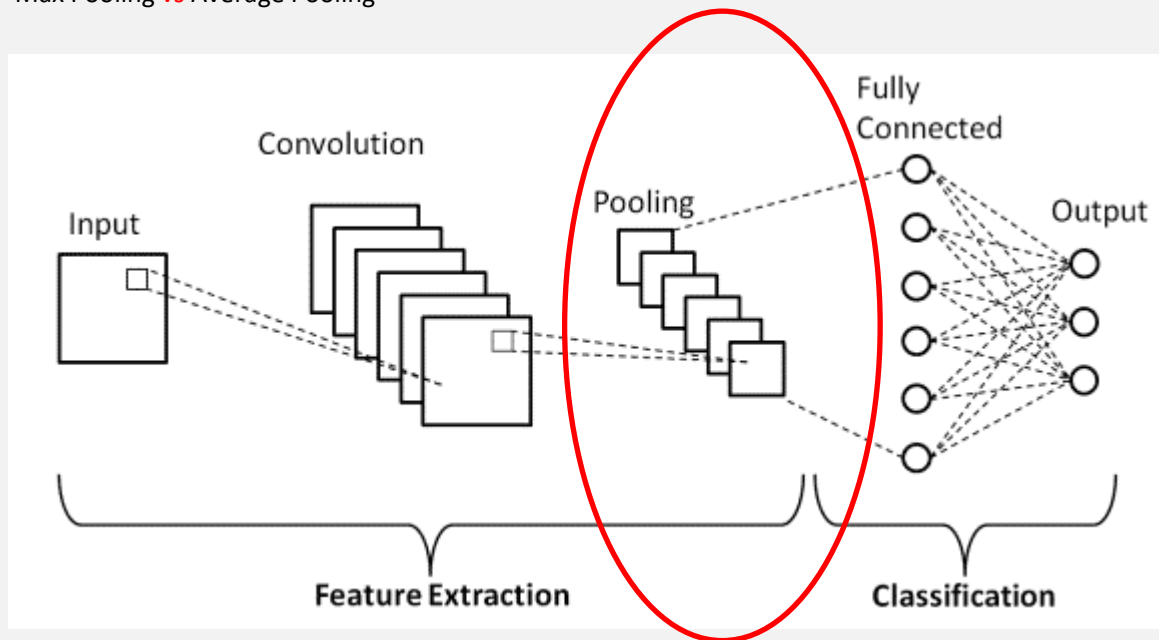
$6 \times 6$



## Layer : Conv, Pool, Fully connected

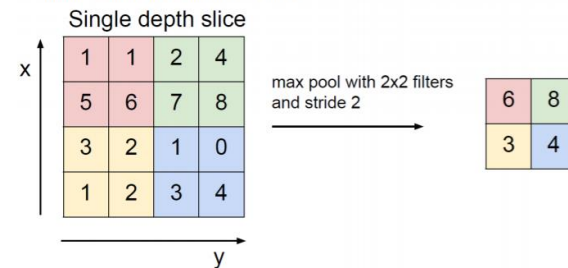
Pooling : 공간 차원(height, width) 줄이고 계산량을 감소시키면서 중요한 정보를 보존

Max Pooling vs Average Pooling

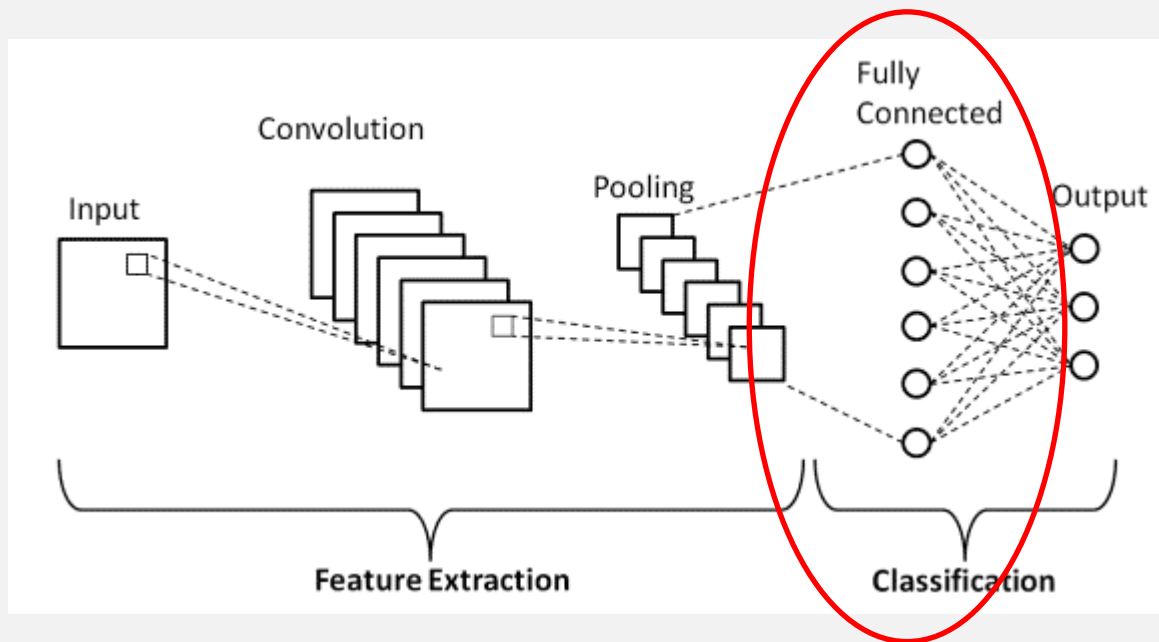


### Pooling

- Max Pooling or Average Pooling



## Layer : Conv, Pool, Fully connected



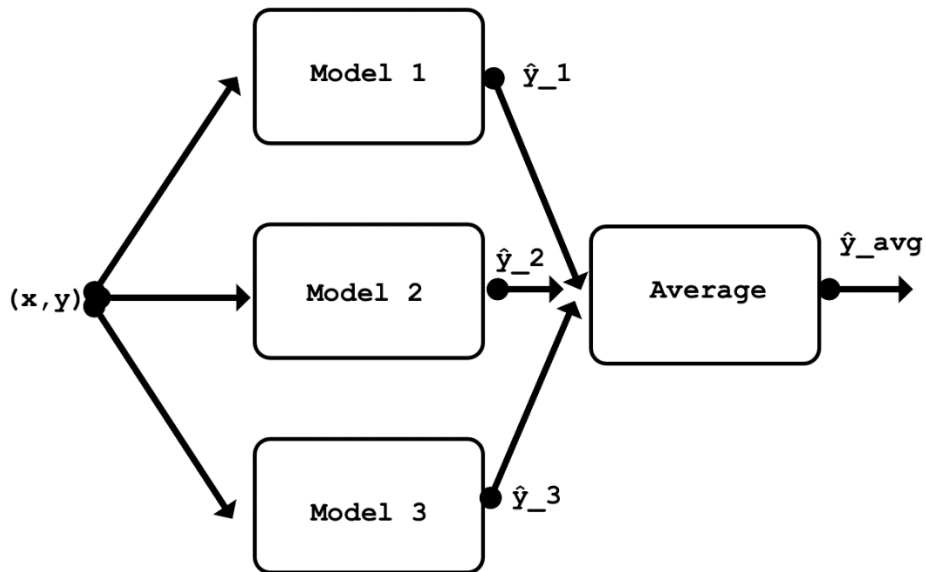


# Ensemble



## Ensemble

Ensemble : CNN model 여러 개를 조합하여 보다 정확한 model을 만드는 것



```
models = []  
num_models = 3  
for m in range(num_models):  
    models.append(MNISTModel())
```

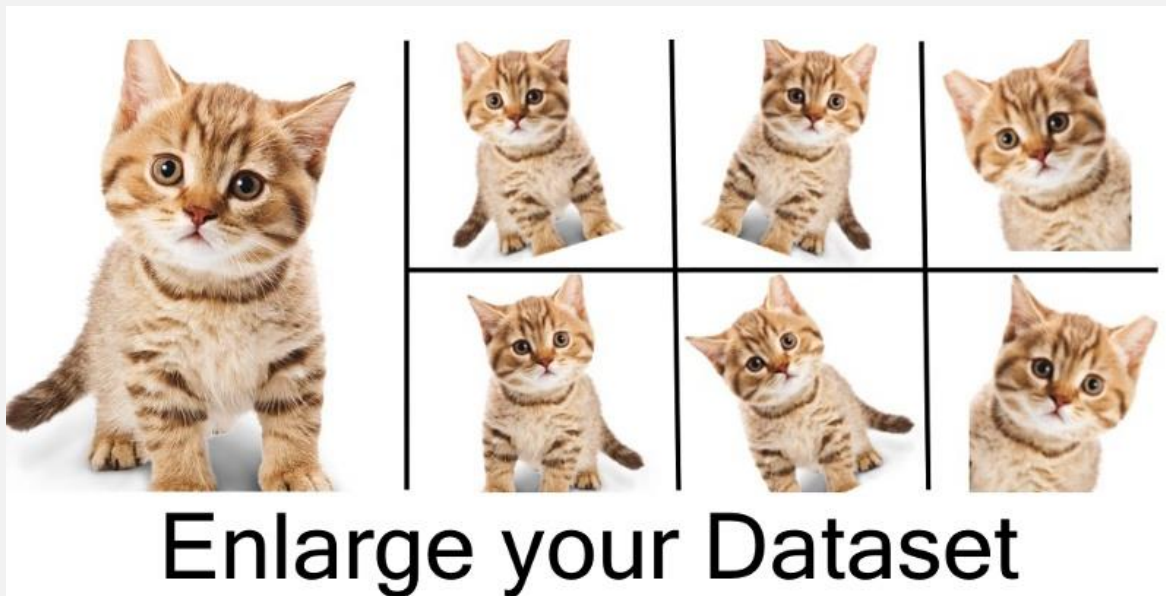


# Data Augmentation



## Data Augmentation

Data Augmentation : origin data set에서 새롭게 training data를 생성해서 model의 성능을 향상시킴



```
def data_augmentation(images, labels):
    aug_images = []; aug_labels = []

    for x, y in zip(images, labels):
        aug_images.append(x)
        aug_labels.append(y)

        bg_value = np.median(x)
        for _ in range(4):
            angle = np.random.randint(-15, 15, 1)
            rot_img = ndimage.rotate(x, angle, reshape=False, cval=bg_value)

            shift = np.random.randint(-2, 2, 2)
            shift_img = ndimage.shift(rot_img, shift, cval=bg_value)

            aug_images.append(shift_img)
            aug_labels.append(y)
    aug_images = np.array(aug_images)
    aug_labels = np.array(aug_labels)
    return aug_images, aug_labels
```

