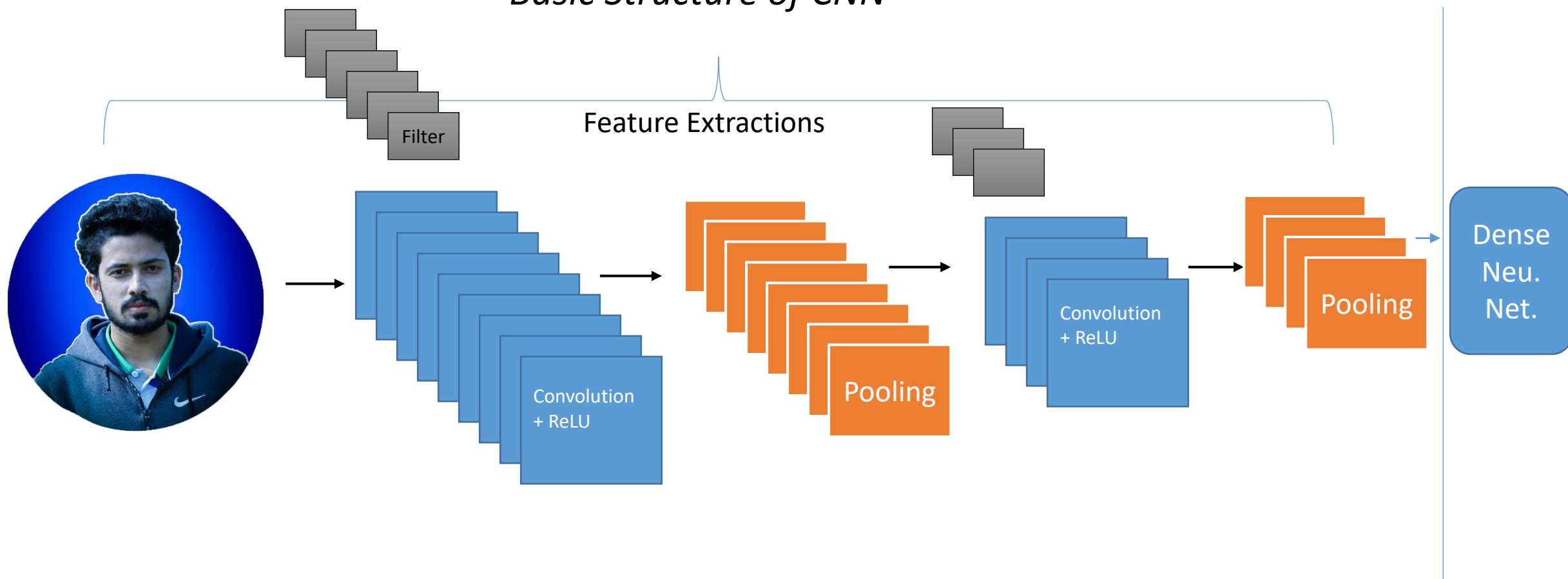


Convolutional Neural Network (CNN)

Basic Structure of CNN



Convolutional Neural Network (CNN)

- Images recognition
- Images classifications
- Objects detections
- Decoding facial recognition
- Understanding climate
- Driverless cars
- Human genome mapping
- Predicting earthquakes
- Natural disasters

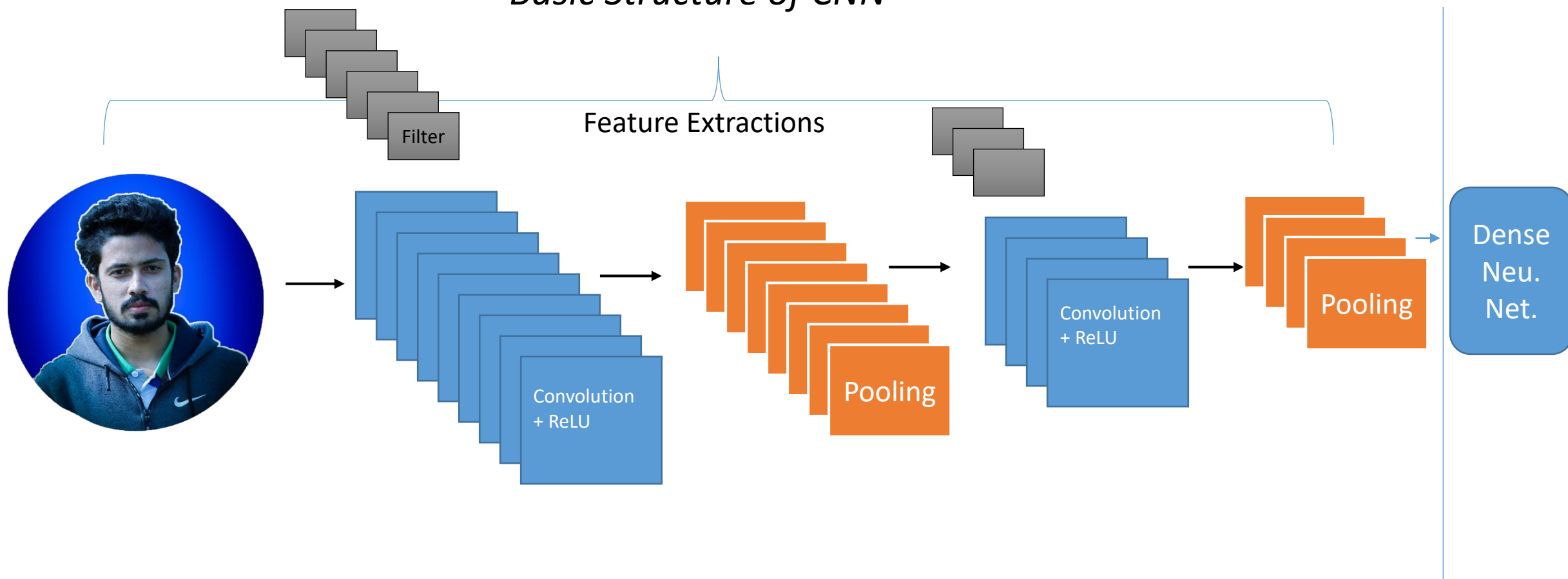
Convolutional Neural Network (CNN)

How many layers does CNN have?

There are **three types** of layers in a convolutional neural network: **Convolutional layer**, **Pooling layer**, and **Fully connected layer**. Each of these **layers has** different parameters that can be optimized and performs a different task on the input data.

Convolutional Neural Network (CNN)

Basic Structure of CNN



Images: Grayscale



Channel: 1
Type: Less Complex

302* 320 Grayscale image

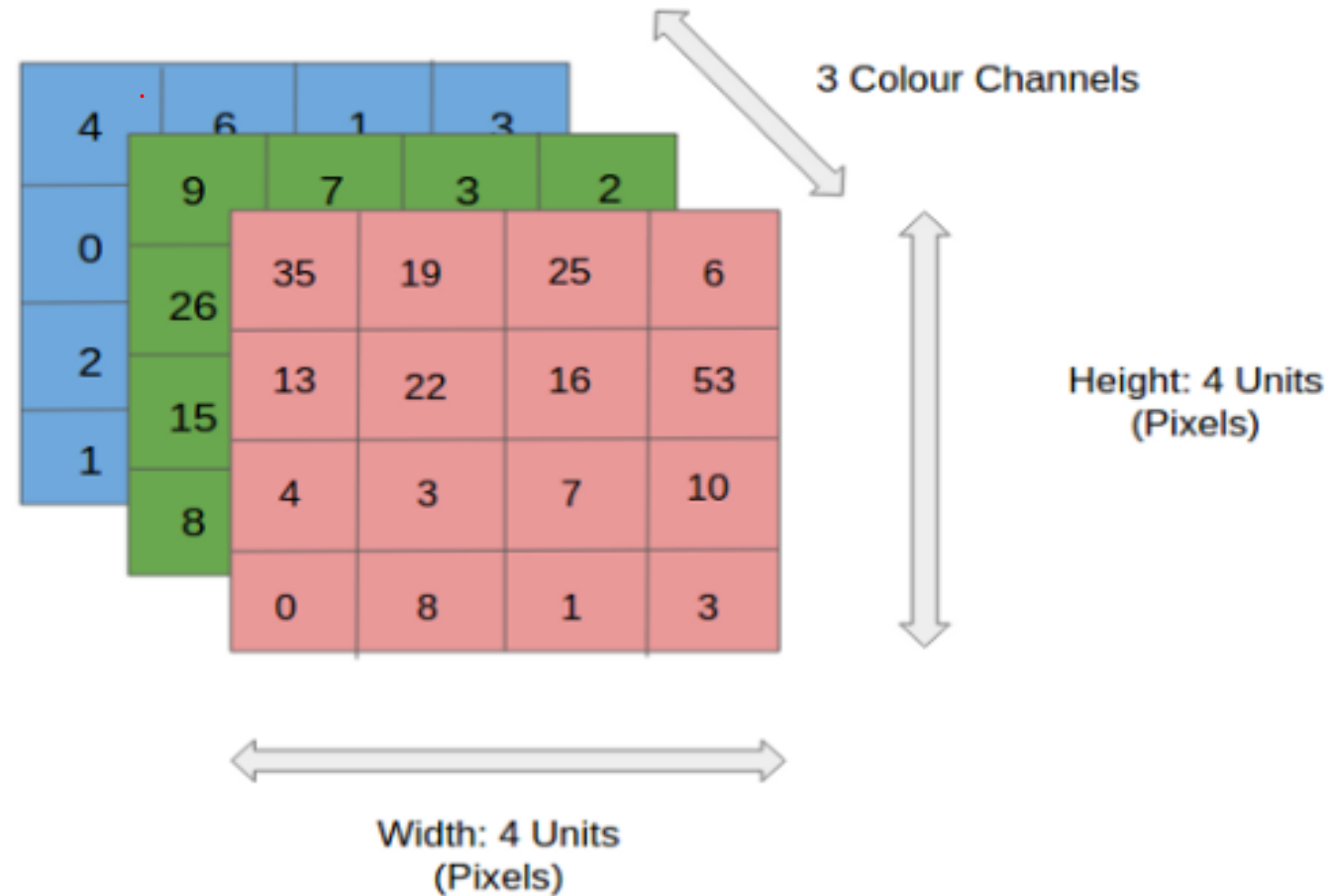
Images: RGB



Channel: 3
Type: Complex

3840* 2160 RGB image

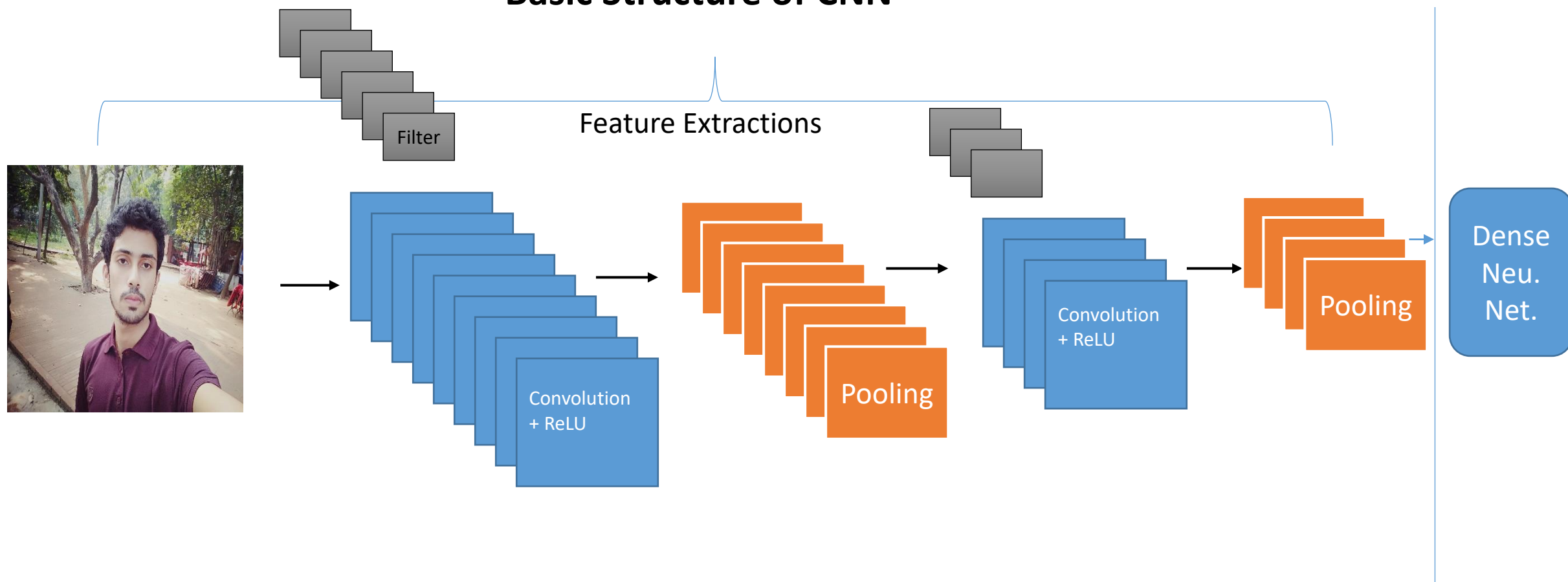
Convolutional Neural Network (CNN)



4*4*3 RGB image

Convolutional Neural Network (CNN)

Basic Structure of CNN



Convolutional Neural Network (CNN)

Convolution Layer — The Kernel

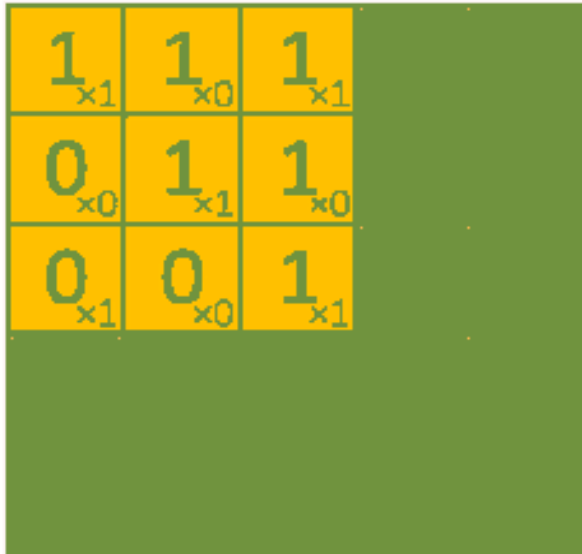


Image 5*5



Feature Map 3*3

Convolved
Feature



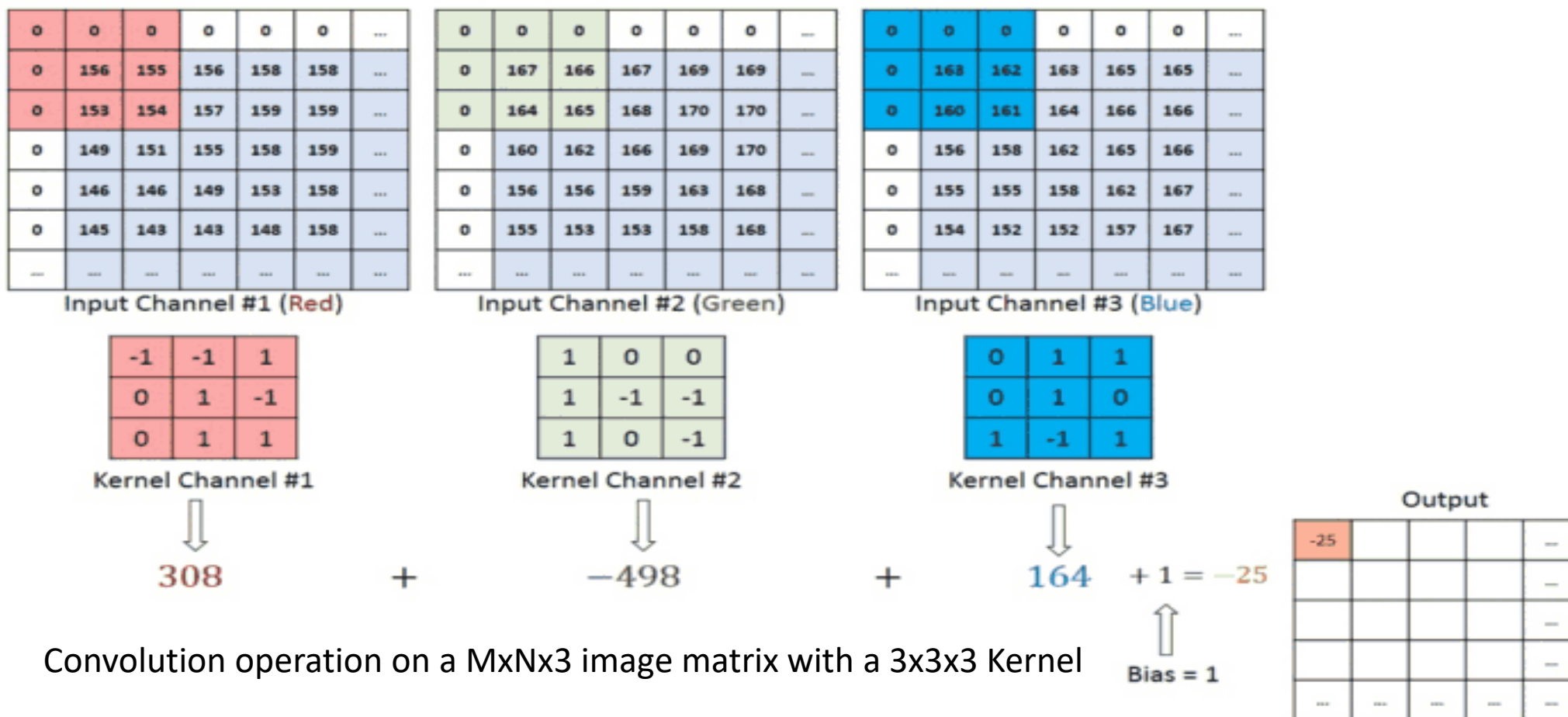
Filter 1

Multiplication: $1*1 + 1*0 + 1*1 + 0*0 + 1*1 + 1*0 + 0*1 + 0*0 + 1*1 = 4$

Map size = $(N - F + 1) * (N - F + 1)$
 $= (5 - 3 + 1) * (5 - 3 + 1)$
 $= 3*3$ Matrix

Convolutional Neural Network (CNN)

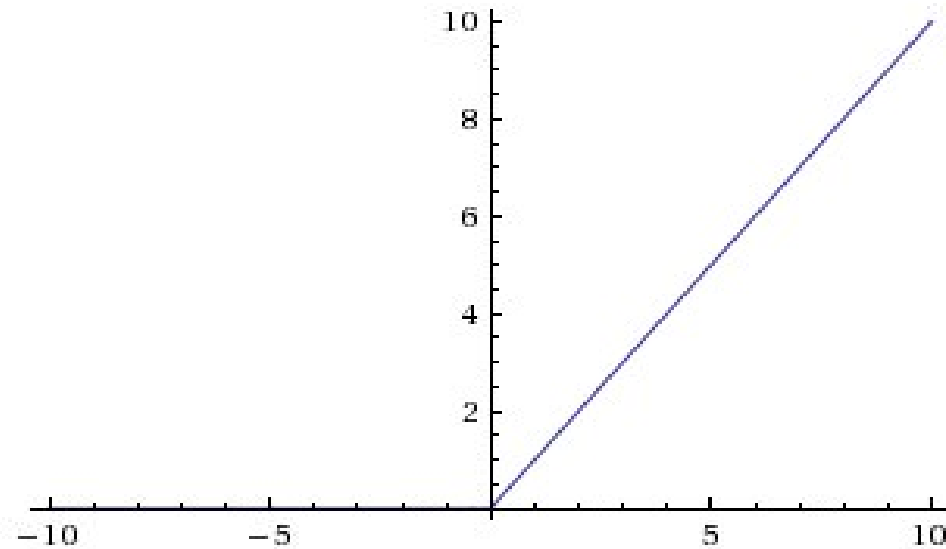
Convolution Layer — The Kernel



Convolution operation on a MxNx3 image matrix with a 3x3x3 Kernel

Convolutional Neural Network (CNN)

Activation function: **Rectified Linear Units (ReLU)**



Convolutional Neural Network (CNN)

Activation function: **Rectified Linear Units (ReLU)**

Filter 1 Feature Map

9	3	5	-8
-6	2	-3	1
1	3	4	1
3	-4	5	1



9	3	5	0
0	2	0	1
1	3	4	1
3	0	5	1

Convolutional Neural Network (CNN)

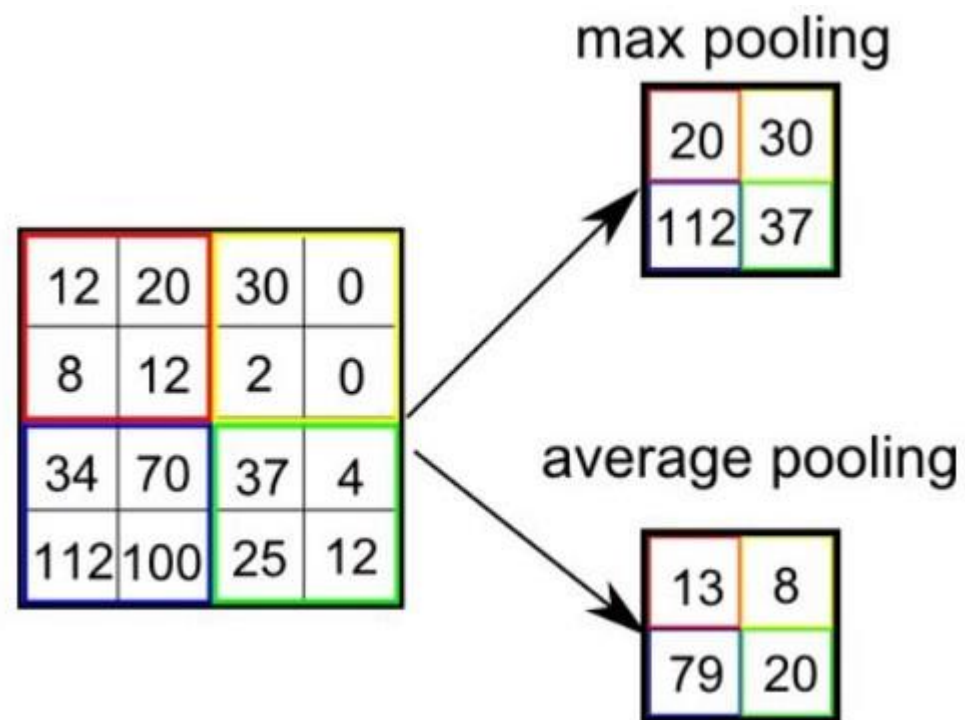
Pooling Layer

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

Convolutional Neural Network (CNN)

Pooling Layer



Convolutional Neural Network (CNN)

Padding

- What is padding in CNN?

Padding is a term relevant to convolutional neural networks as it refers to the amount of pixels added to an image when it is being processed by the kernel of a **CNN**. For example, if the **padding** in a **CNN** is set to zero, then every pixel value that is added will be of value zero.

Convolutional Neural Network (CNN)

Padding

- Why does CNN use padding?

Padding is simply a process of adding layers of zeros to our input images so as to avoid the problems mentioned above. This prevents shrinking as, if p = number of layers of zeros added to the border of the image, then our $(n \times n)$ image becomes $(n + 2p) \times (n + 2p)$ image after **padding**.

35	19	25	6
13	22	16	53
4	3	7	10
9	8	1	3

$4 * 4$

After Padding
 $P = 1$



0	0	0	0	0	0
0	35	19	25	6	0
0	13	22	16	53	0
0	4	3	7	10	0
0	9	8	1	3	0
0	0	0	0	0	0

$6 * 6$

$$\begin{aligned} \text{Input size} &= n + 2p - f + 1 \\ &= 4 + 2*1 - 3 + 1 = (4*4) \end{aligned}$$

Convolutional Neural Network (CNN)

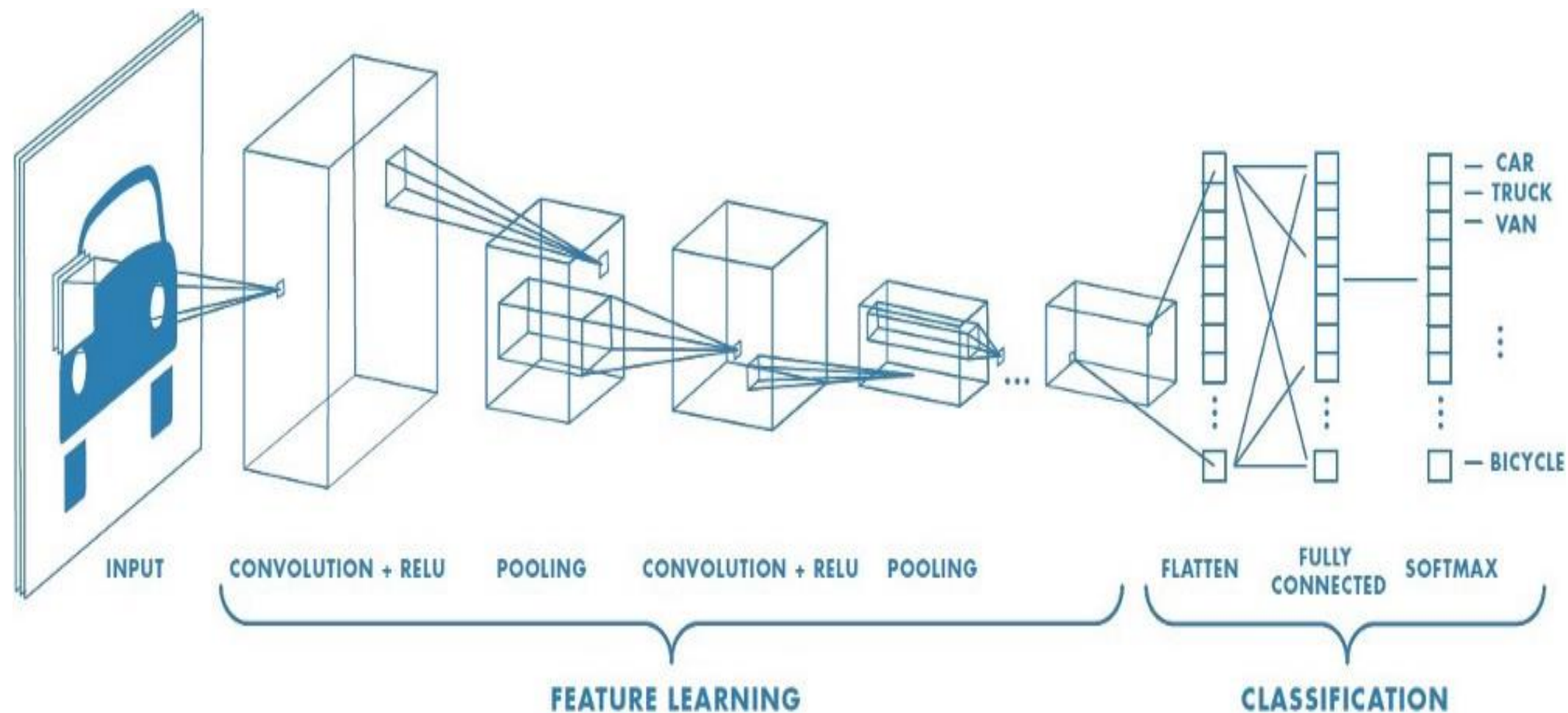
Padding

Types of Padding:

- **Valid Padding** : It implies no padding at all. The input image is left in its valid/unaltered shape. So, $[(n \times n) \text{ image}] * [(f \times f) \text{ filter}] \rightarrow [(n - f + 1) \times (n - f + 1) \text{ image}]$
- **Same Padding** : In this case, we add 'p' padding layers such that the output image has the same dimensions as the input image.
So, $[(n + 2p) \times (n + 2p) \text{ image}] * [(f \times f) \text{ filter}] \rightarrow [(n \times n) \text{ image}]$

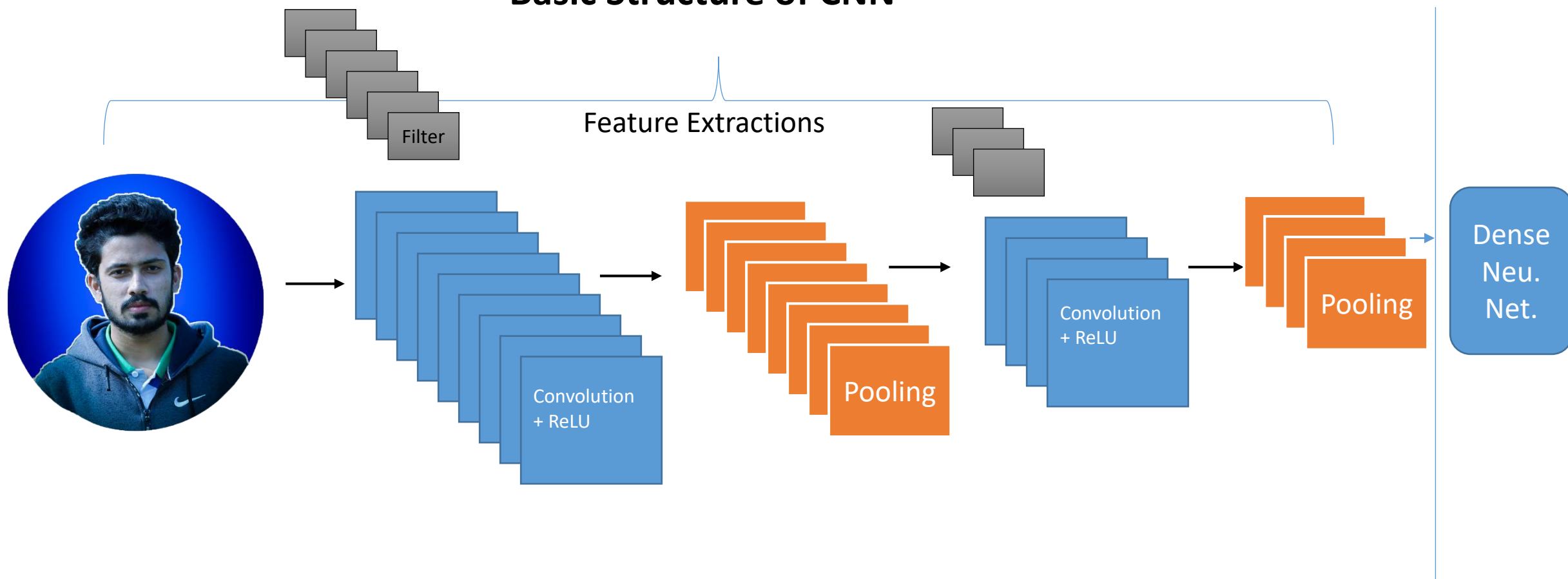
$$\text{Output size} = n + 2p - f + 1$$

Convolutional Neural Network (CNN)



Convolutional Neural Network (CNN)

Basic Structure of CNN



Data Augmentation in Deep Learning

How do I get more data, if I don't have “more data”?



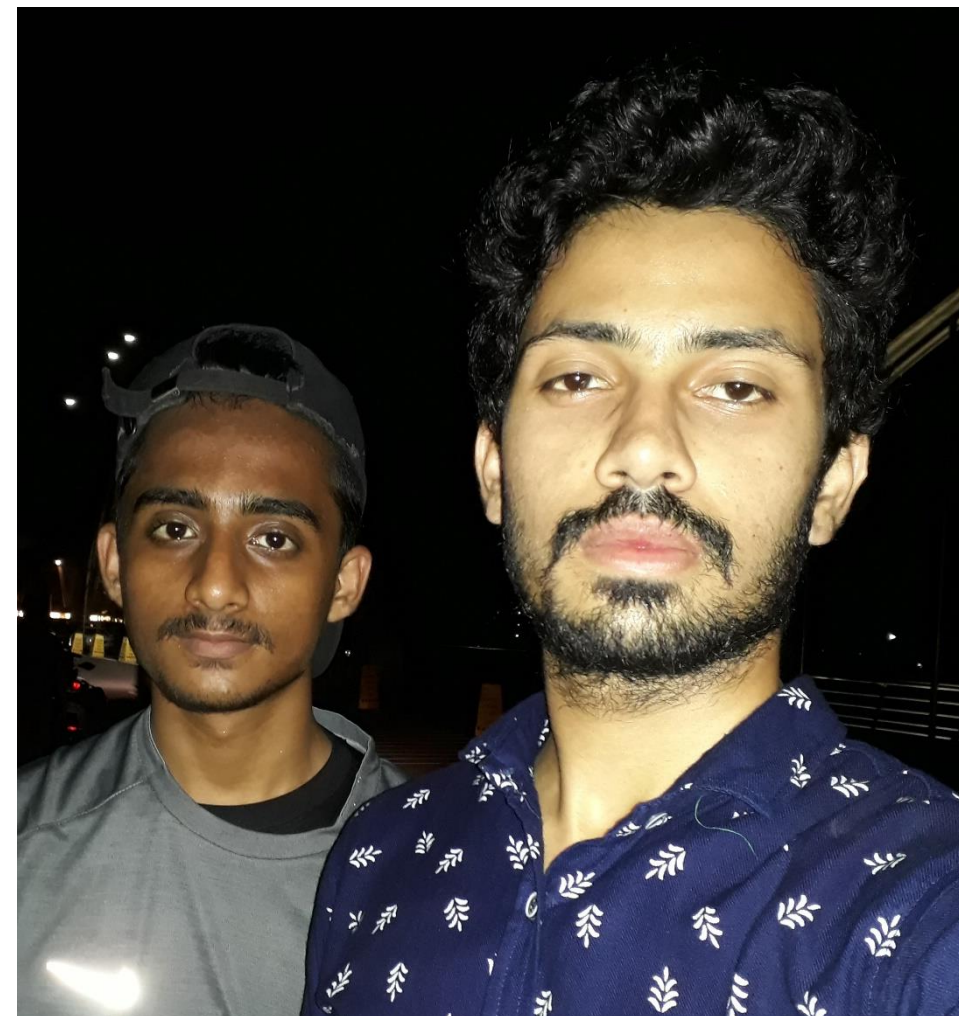
Data Augmentation in Deep Learning

What is Data Augmentation?



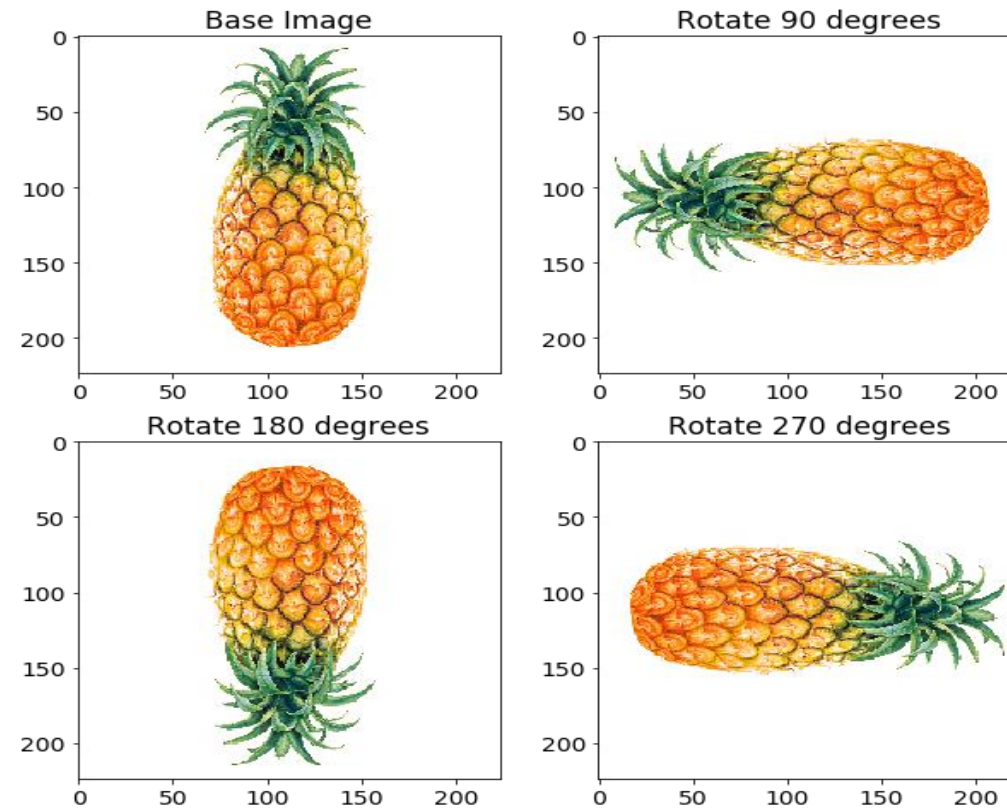
Convolutional Neural Network (CNN)

1. Zoom in/out



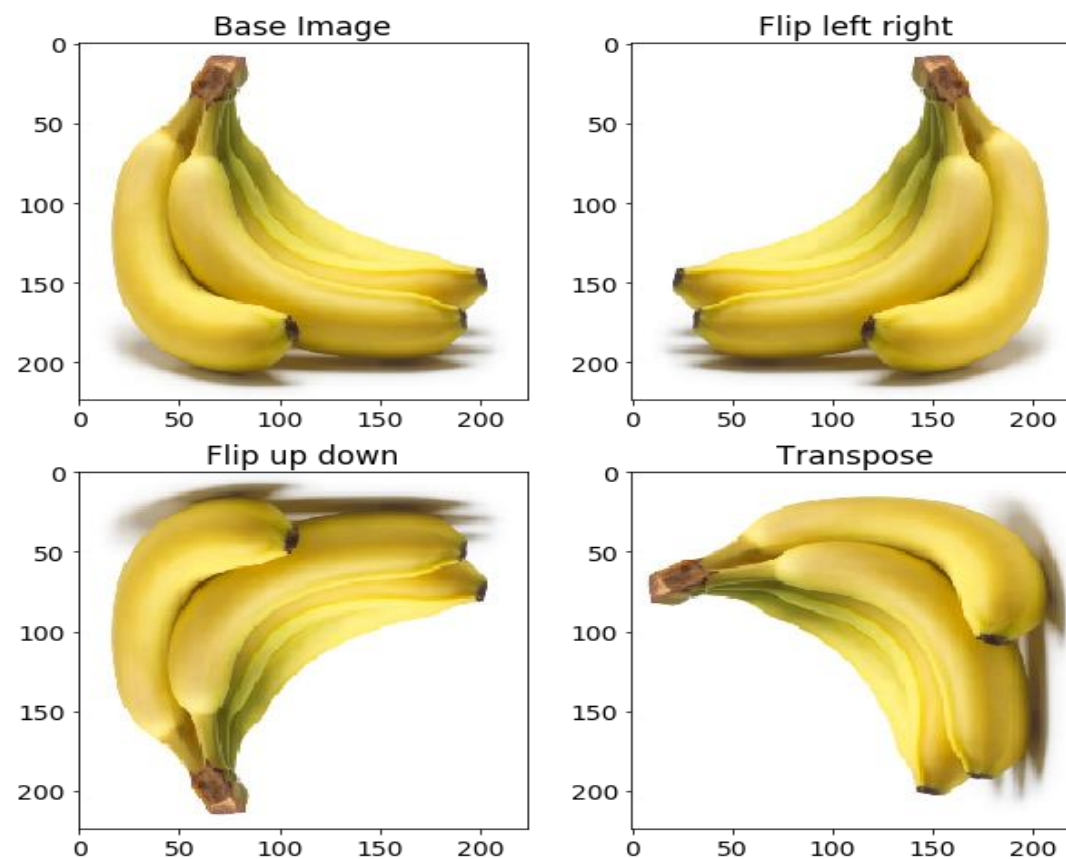
Data Augmentation in Deep Learning

2. Rotation



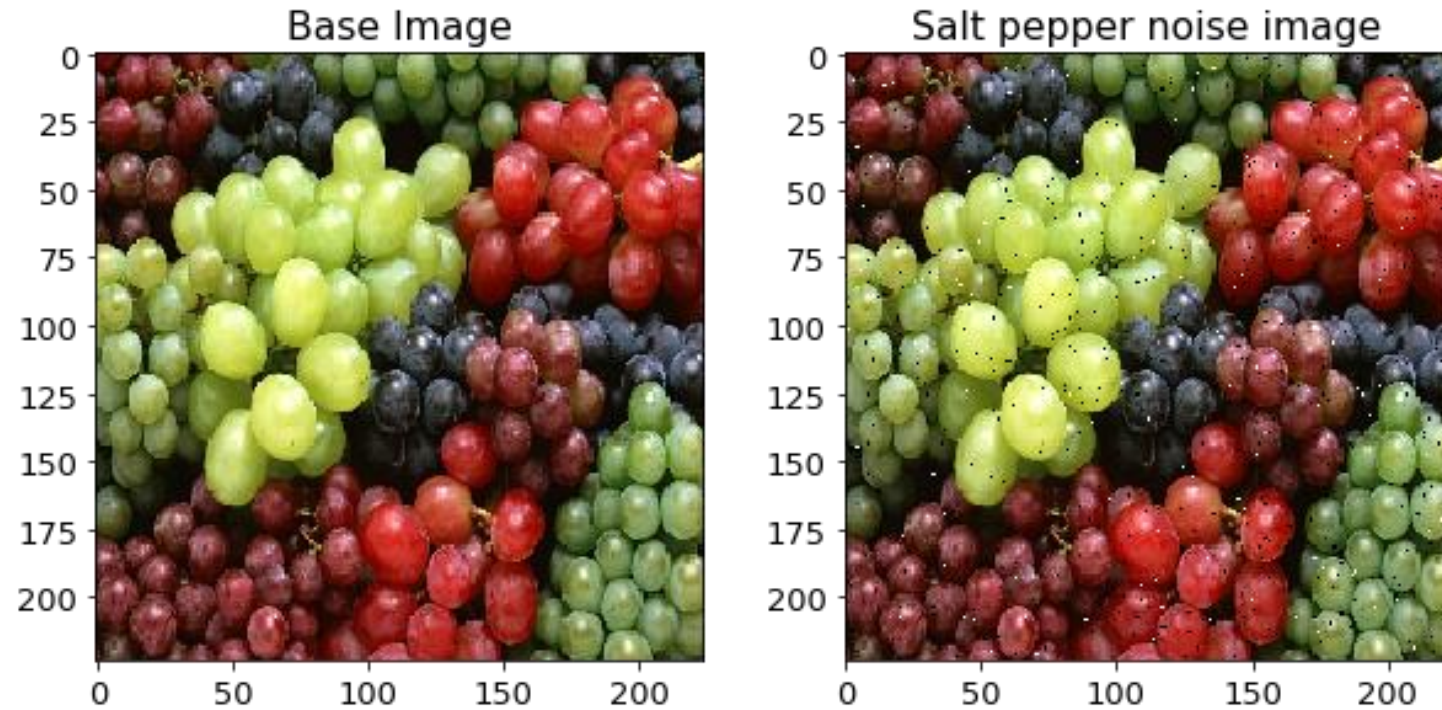
Data Augmentation in Deep Learning

3. Flipping



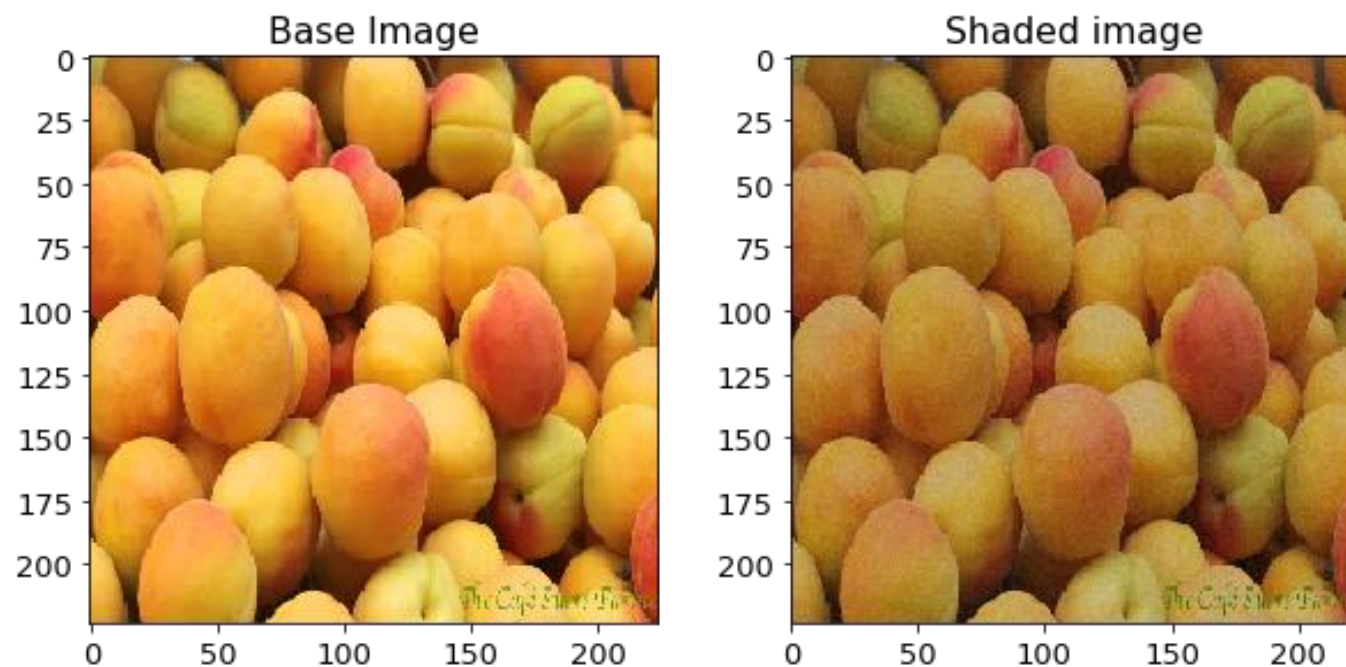
Data Augmentation in Deep Learning

4. Adding Noise



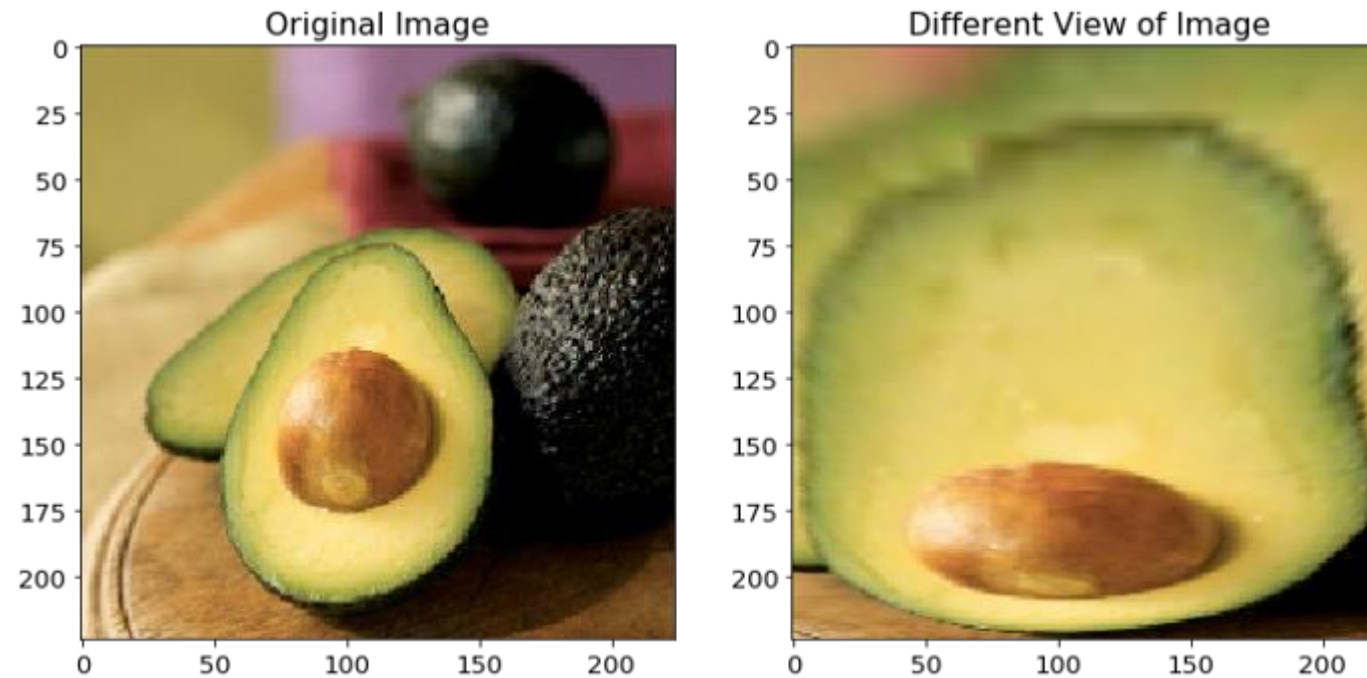
Data Augmentation in Deep Learning

5. Lighting Condition



Data Augmentation in Deep Learning

6. Perspective transform



Watch: <https://youtu.be/p8e7dGY-Oko>

