

$$I \otimes F = \begin{bmatrix} & & & & & \\ & & & & & \\ & & & & & \\ & & & & & \\ & & & & & \\ & & & & & \end{bmatrix} \begin{bmatrix} & & & & & \\ & & & & & \\ & & & & & \\ & & & & & \\ & & & & & \\ & & & & & \end{bmatrix}$$

~~$I \otimes F =$~~

$$n_1 = f_1 \cdot i_1 + f_2 \cdot i_2 + f_3 \cdot i_3 ; n_2 = f_1 \cdot i_2 + f_2 \cdot i_3 + f_3 \cdot i_4$$

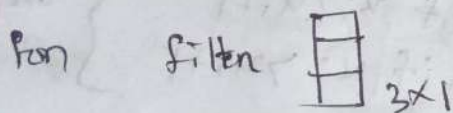
$$; n_3 = f_1 \cdot i_3 + f_2 \cdot i_4 + f_3 \cdot i_5$$

$$; n_4 = f_1 \cdot i_4 + f_2 \cdot i_5 + f_3 \cdot i_6$$

$$I \otimes F = \begin{bmatrix} n_1 & n_2 & n_3 & n_4 \\ & & & \\ & & & \\ & & & \\ & & & \\ & & & \end{bmatrix}$$

Stride \rightarrow Shifting step (2, 2, ...)

padding \rightarrow increasing dimension (p.c)

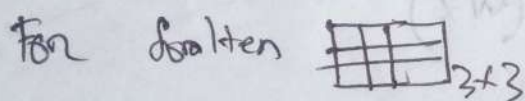


$$I \otimes F =$$

$$n/c = \frac{\text{img. d} - f.d}{\text{stride}} + 1$$

6

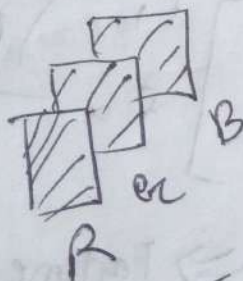
3



$$I \otimes F =$$

4

3



Tensor \rightarrow (3, 5, 4)

\downarrow channel

\downarrow row

\downarrow column

$$I = \begin{bmatrix} 1 & 2 & 3 & 2 & 0 & 5 \\ & & & & & \\ & & & & & \\ & & & & & \end{bmatrix}$$

$$F = \begin{bmatrix} 1 & 1 & 1 \\ 3 & 3 & 3 \end{bmatrix}$$

$$R = \begin{bmatrix} 2 & 2.33 & 2 & 1 & 2 \end{bmatrix}$$

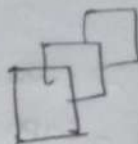
$(3, 5, 4) \rightarrow \text{Tensor}$



$(3, 4, 8) \rightarrow \text{Filter}$

3^* - fixed for considering tensor
 $x, y \rightarrow$ determined by owner

Tensor \otimes Filter \Rightarrow Response



$n \times \text{filter} = n \times \text{Response}$

~~(Always
 of same
 dimension
 as filter tensor)~~

So, Response shape $(\underbrace{\# \text{ of filter}}_{\text{number of filter}}, n, c)$

$(c, n_1, n_2) \rightarrow \text{Tensor}$

$(c, n_2, c_2) \rightarrow \text{Filter}$

$(ch, n_3, n_4) \rightarrow \text{Response}$

$ch = \text{Number of filter}$

Conv - 1

48, 11, 11

Stride = 4

Output $\Rightarrow 48, 55, 55$
 $48, 55, 55$

Maxpooling

Region(2) 3×3
 Strid 2

$$\frac{55-3}{2} + 1 = 27$$

Input layer
3, 227, 227

ImageNet paper
AlexNet paper

Conv-1

48, 11, 11

48, 11, 11

stride = 4

Output \Rightarrow 48, 55, 55 - GPU 1
48, 55, 55 - GPU 2

Max pooling

Region (z) 3x3

stride 2

$$\frac{55-3}{2} + 1 = 27$$

Output shape 48, 27, 27 - GPU 1
48, 27, 27 - GPU 2

Relu

Conv-2

128, 48, 55

128, 48, 55

stride = 1

Region (z) 5x5

$$\frac{27-5}{1} + 1$$

(= 23 with padding)

$$\frac{(27+2 \times 2) - 5}{1} + 1 = 27$$

P = 2

Relu

$$\frac{(27+2 \times 2 - 5)}{1} + 1 = 27$$

with padding 2

128, 27, 27

128, 27, 27

Conv-3Max pooling 2×3 , stride=2

$$\text{output} = \frac{27-3}{2} + 1 = 13$$

Output shape $128, 13, 13$ - $128, 13, 13$ ReluConv-33

(Merging both)

[384 filters]

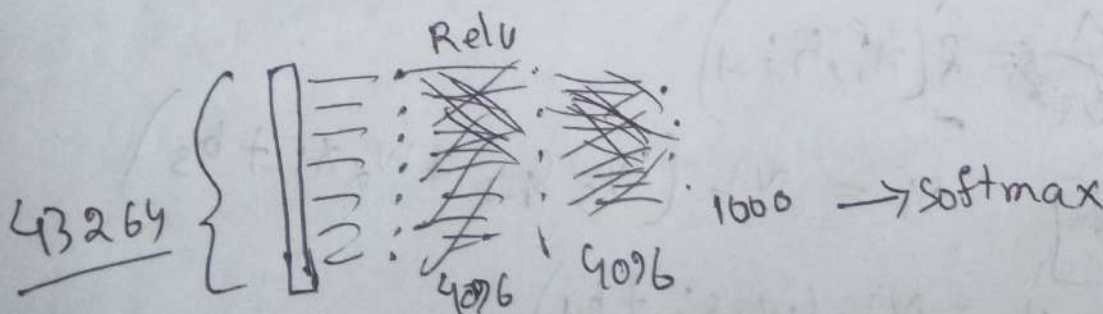
 $192, 256, 3, 3$ $192, 256, 3, 3$

padding=1, stride=1

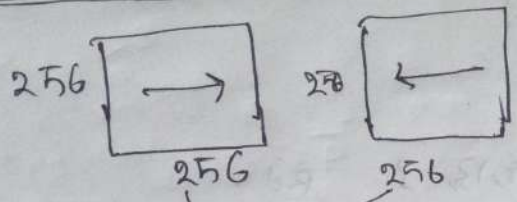
Output = $192, 13, 13$ $192, 13, 13$ Conv-44padding -1 | $192, 192, 3, 3$ $192, 192, 3, 3$ $192, 13, 13$ ReluOutput $192, 13, 13$ Conv-5 $128, 192, 3, 3$ $128, 192, 3, 3$

padding -1, stride -1

Relu

Output: $128, 13, 13$ 

Data Augmentation

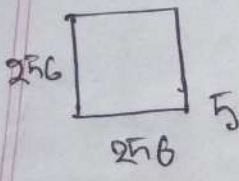


227 samples

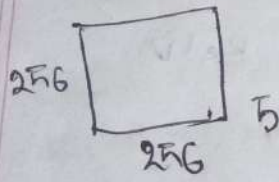
~~2x27x27~~

2x84 images (Both)

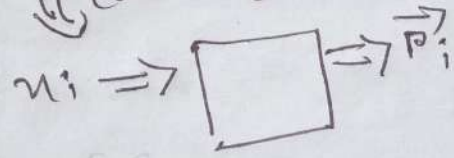
1682 images



Test time Augmentation (5 types)



= 16 $\frac{227 \times 227}{\text{each image}}$



$$\frac{1}{10} \sum_{i=1}^L P_i$$

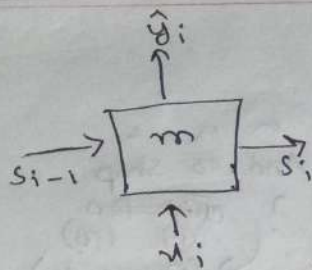
RNN (Recurrent Neural Network) [Background]

$$\hat{y}_i, s_i \Rightarrow \hat{f}(x_i, s_{i-1})$$

$$s_i = NL(w_s s_{i-1} + w_x x_i + b_s)$$

s_0 [Zero Vector]

$$y_i = NL(w_y s_i + b_y)$$



$$s_i = \text{NL}_1(w_s \cdot s_{i-1} + w_x x_i + b_s) \quad \left| \begin{array}{l} s_0 \rightarrow \text{is zero} \\ \text{vector} \end{array} \right.$$

$$\hat{y}_i = \text{NL}_2(w_y s_i + b_y)$$

$\hat{y}_0, \hat{y}_1, \hat{y}_2$

(x_1, x_2, x_3)
 (y_1, y_2, y_3)
 s_0 is zero vector

$$s_1 = \text{NL}_1(w_s s_0 + w_x x_1 + b_s)$$

$$\hat{y}_1 = \text{NL}_2(w_y s_1 + b_y)$$

$$s_2 = \text{NL}_1(w_s s_1 + w_x x_2 + b_s)$$

$$\hat{y}_2 = \text{NL}_2(w_y s_2 + b_y)$$

$$s_3 = \text{NL}_1(w_s s_2 + w_x x_3 + b_s)$$

$$\hat{y}_3 = \text{NL}_2(w_y s_3 + b_y)$$

$$L = \frac{1}{3} \left(\text{nll}(y_1, \hat{y}_1) + \text{nll}(y_2, \hat{y}_2) + \text{nll}(y_3, \hat{y}_3) \right)$$

nll = negative log likely hood.

NER \rightarrow Named Entity Recognition.

I am going to Australia

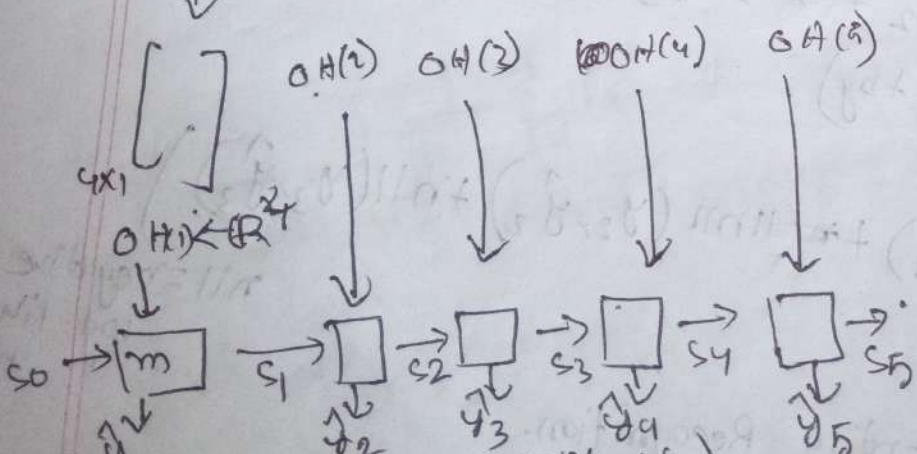
Person $\begin{cases} I \\ B \end{cases}$
 location $\begin{cases} I \\ B \end{cases}$
 Institution $\begin{cases} I \\ B \end{cases}$
 Other $\begin{cases} I \\ B \end{cases}$

1 2 3 4 5 6
 I am going to And to Shop
 (B) (B) (B) (B) (B) (B)
 (Depends)
 Meena Buzon
 (B) (B) (B)
 7 8 9 10 11 12
 There I will also be going
 to Melbourne and Sydney

vocabulary $\begin{cases} I - 1 \\ am - 2 \\ going - 3 \\ to - 4 \end{cases}$

Australia - 5
 There - 6
 will - 7
 also - 8
 be - 9
 Melbourne - 10
 and - 11
 Sydney - 12
 (unk) - 13

I am going to Australia



$$s_i = NL_1(w_{s,i-1} + w_{x,i} + b_s)$$

$$\hat{y}_i = NL_2(w_{y,i} + b_y)$$

NL \rightarrow Activation function