

Convolutional Neural Networks (CNN)

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$$y[m, n] = x[m, n] * h[m, n] = \sum_j \sum_i x[i, j] h[m - i, n - j]$$

Convolution in image processing

x

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

h

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

*

=

y

0	1	0	1
11	5	-10	-2
13	6	-19	-3
-1	0	-8	-11

2D convolution example

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

*

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

=

0	1	0	1
11	5	-10	-2
13	6	-19	-3
-1	0	-8	-11

$$(4)(1)+(2)(0)+(9)(-1)+(3)(1)+(1)(0)+(5)(-1)+(8)(1)+(7)(0)+(1)(-1) = 4+0-9+3+0-5+8+0-1 = 0$$

x

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

*

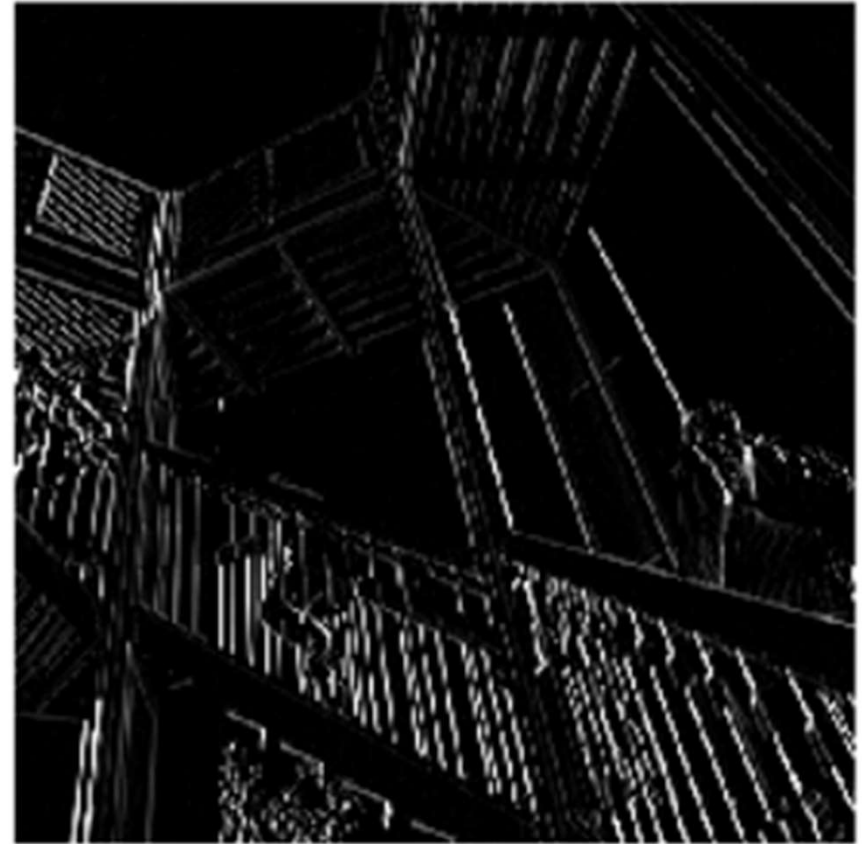
1	0	-1
1	0	-1
1	0	-1

=

0	1	0	1
11	5	-10	-2
13	6	-19	-3
-1	0	-8	-11

$$(2)(1)+(6)(0)+(2)(-1)+(1)(1)+(8)(0)+(1)(-1)+(5)(1)+(7)(0)+(8)(-1) = 2+0-2+1+0-1+5+0-8 = -3$$

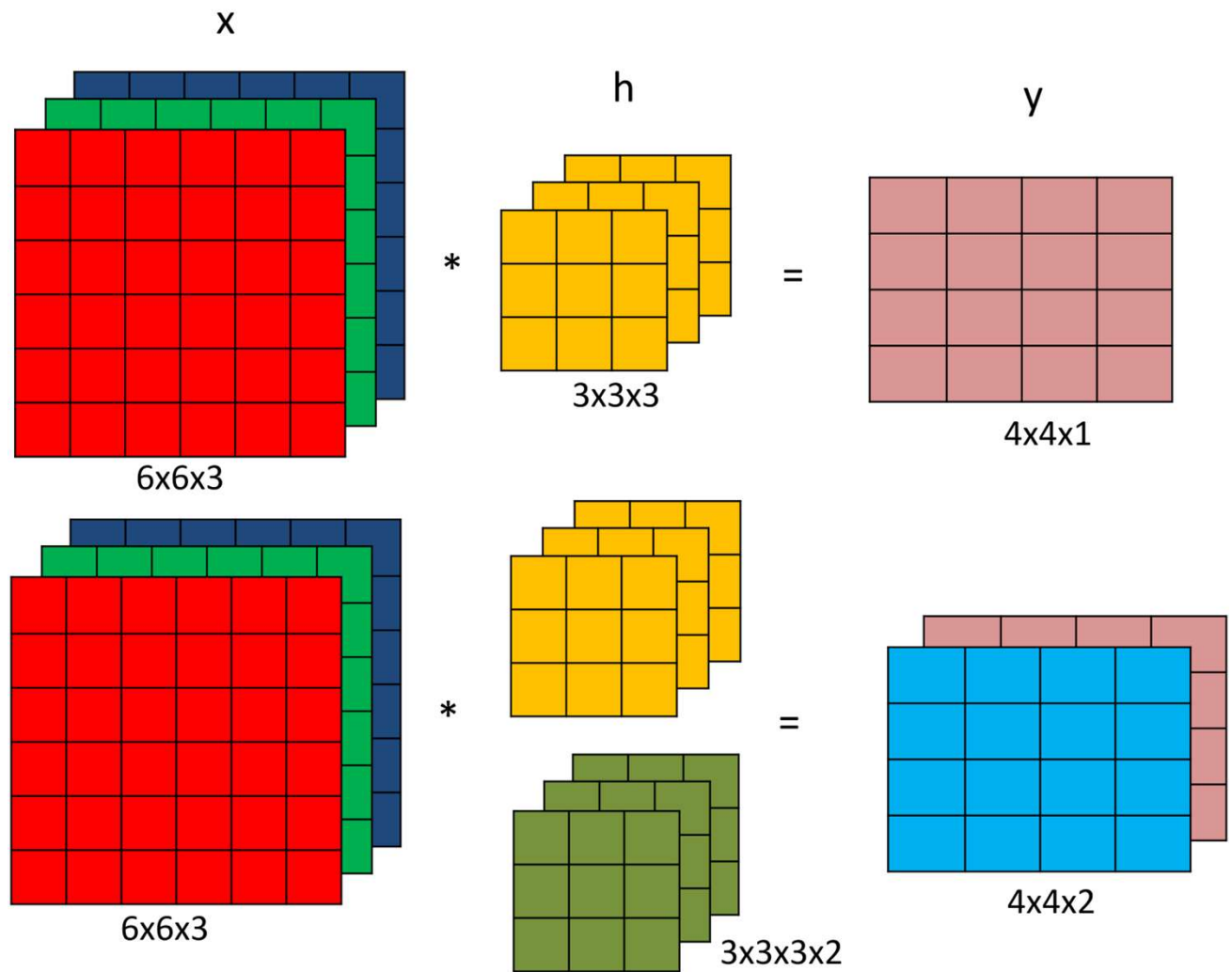
2D convolution example

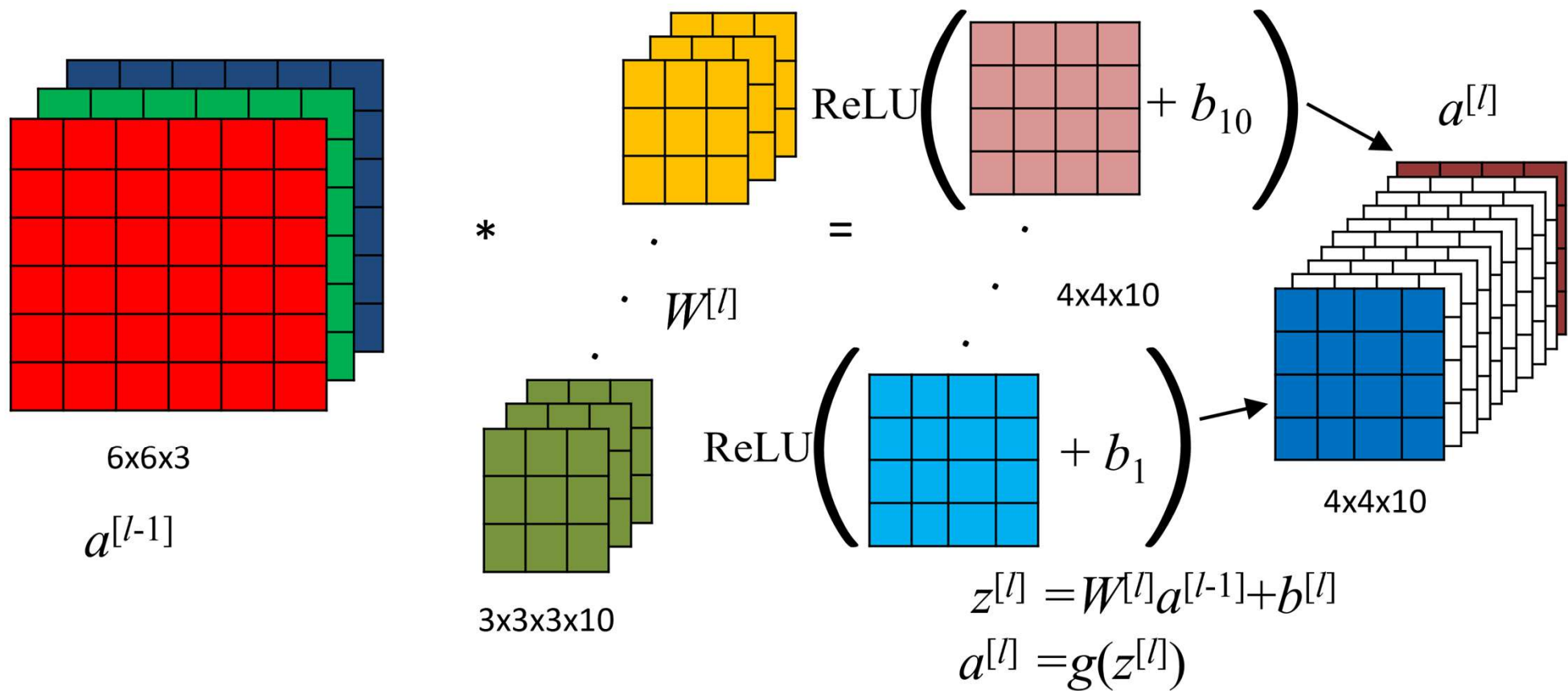


edge detection with convolution

see [convolution.ipynb](#)

3D convolution

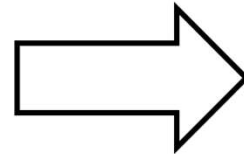




convolution layer in NN

max pooling layer

3	1	2	1
4	8	1	1
2	6	3	1
5	1	1	3

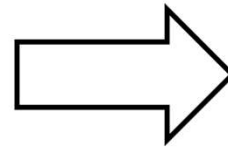


8	2
6	3

Max pooling
($f = 2$, $s = 2$)

average pooling layer

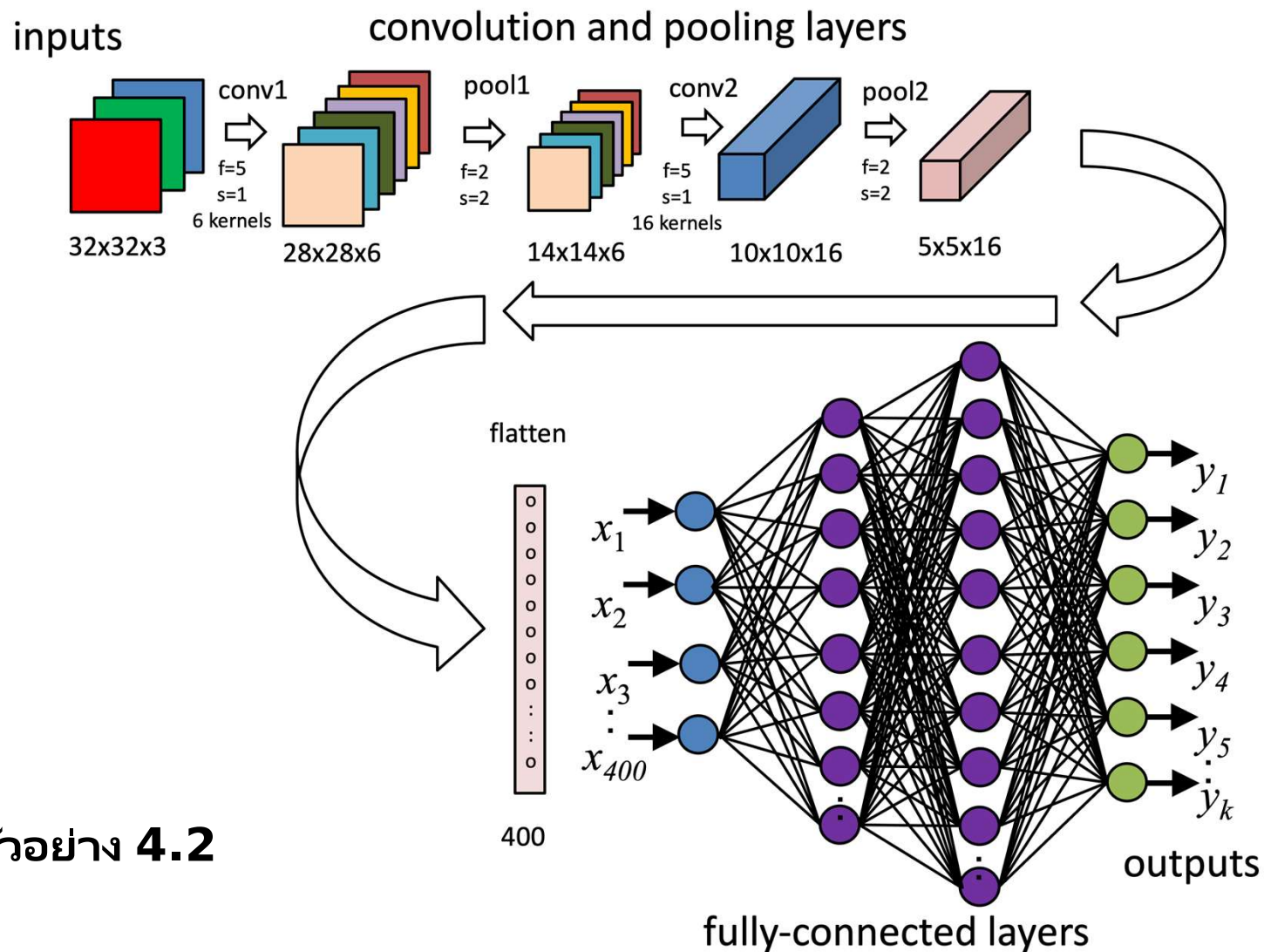
3	1	2	1
4	8	1	1
2	6	3	1
5	1	1	3



4	1.25
3.5	2

Average pooling
($f = 2$, $s = 2$)

CNN model example



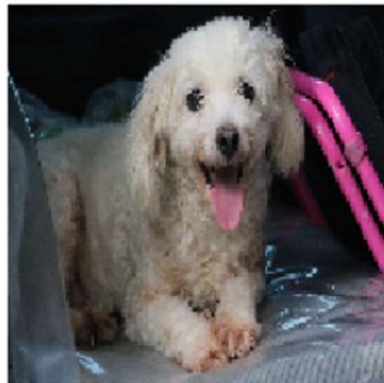
see ตัวอย่าง 4.2

cat/dog classification

[1.]
jackie.jpg is a dog



[1.]
maam.jpeg is a dog



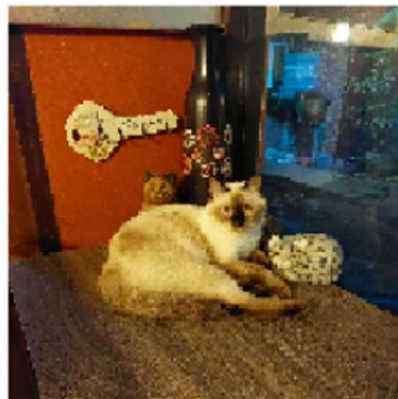
[0.]
dollar_scale.jpg is a cat



[1.]
fongbeer1.jpeg is a dog



[1.]
bingzoo.jpg is a dog



[0.]
ninja_bingz.jpg is a cat



DNN/CNN comparision (SVHN)

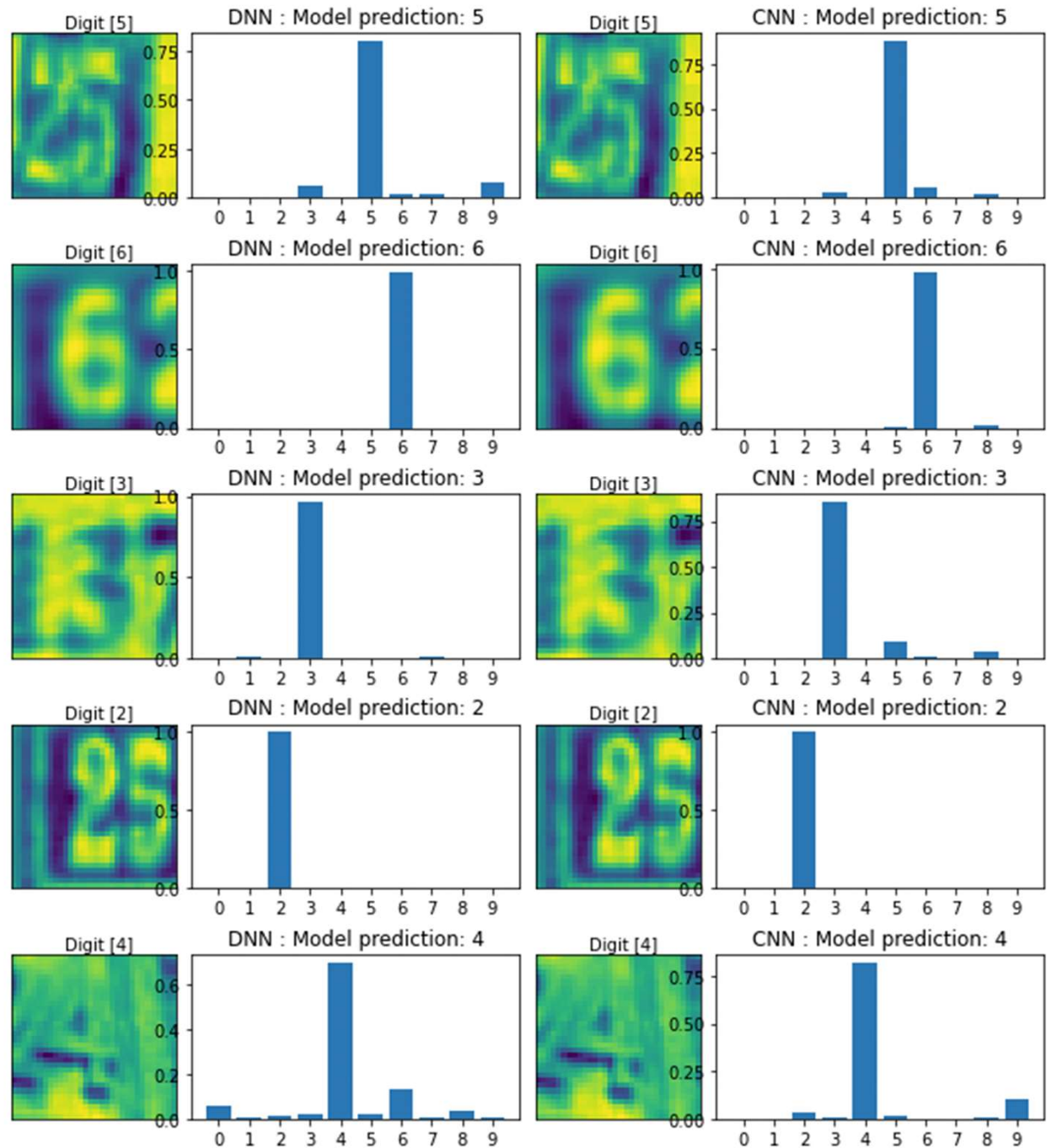


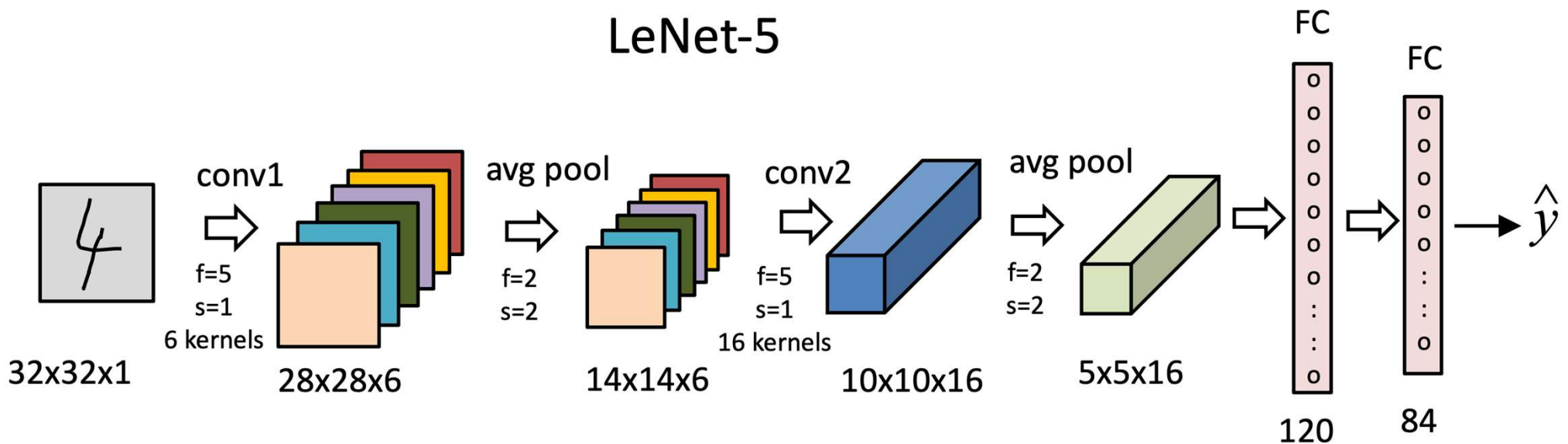
image augmentation



CNN case study

LeNet-5
AlexNet
VGG-16
ResNets
Inception model

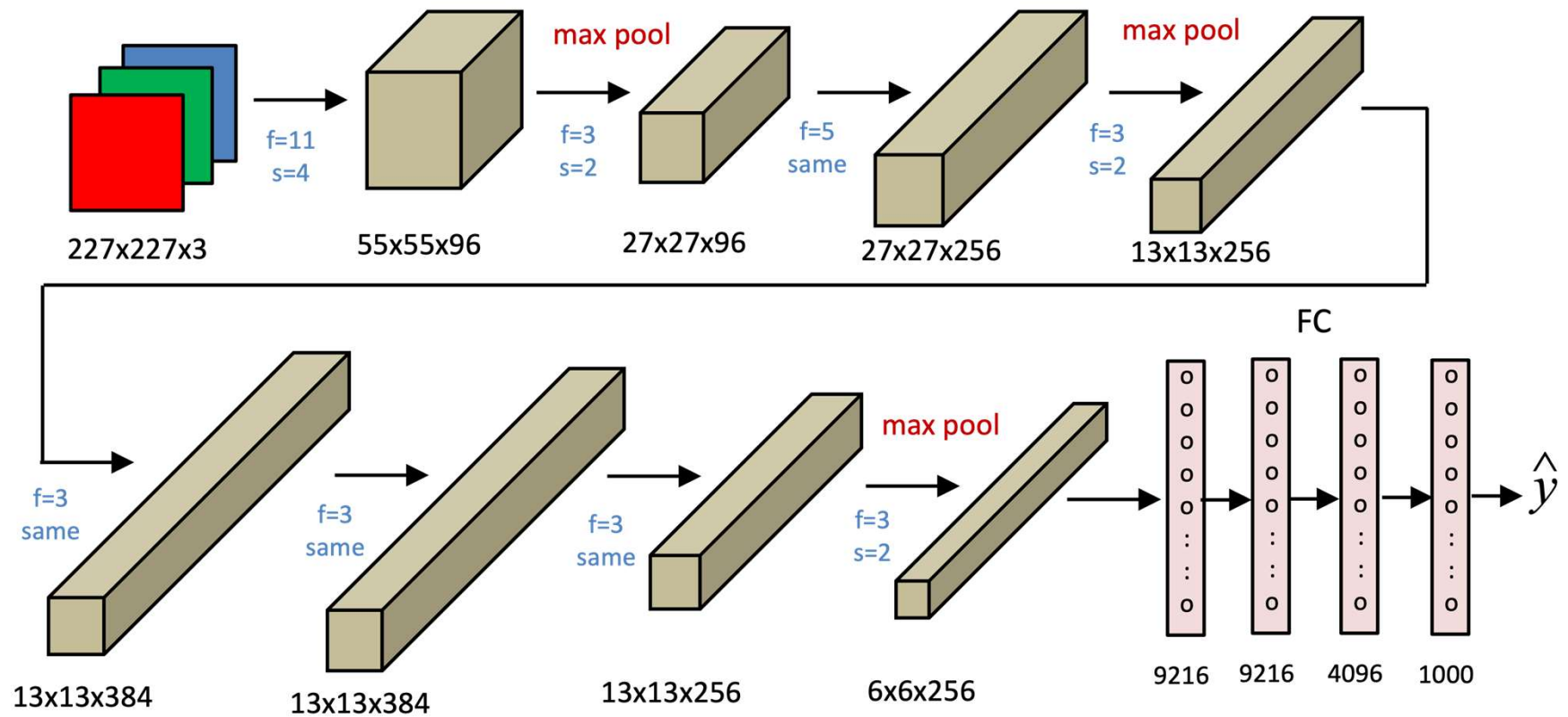
LeNet-5



LeCun, Y.; Boser, B.; Denker, J. S.; Henderson, D.; Howard, R. E.; Hubbard, W. & Jackel, L. D. (1989). Backpropagation applied to handwritten zip code recognition. *Neural Computation*, 1(4):541-551.

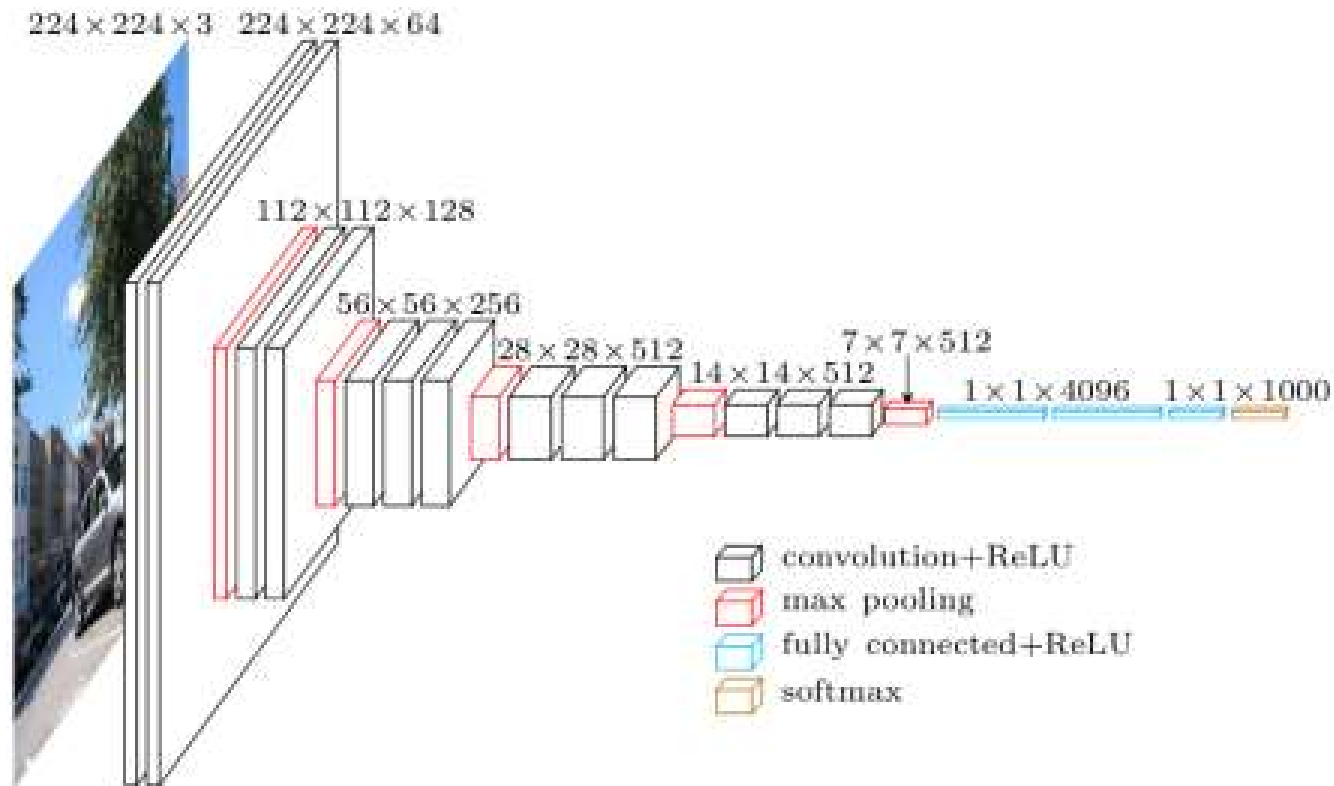
AlexNet

AlexNet



Krizhevsky, Alex; Sutskever, Ilya; Hinton, Geoffrey E. (2017-05-24). "ImageNet classification with deep convolutional neural networks"

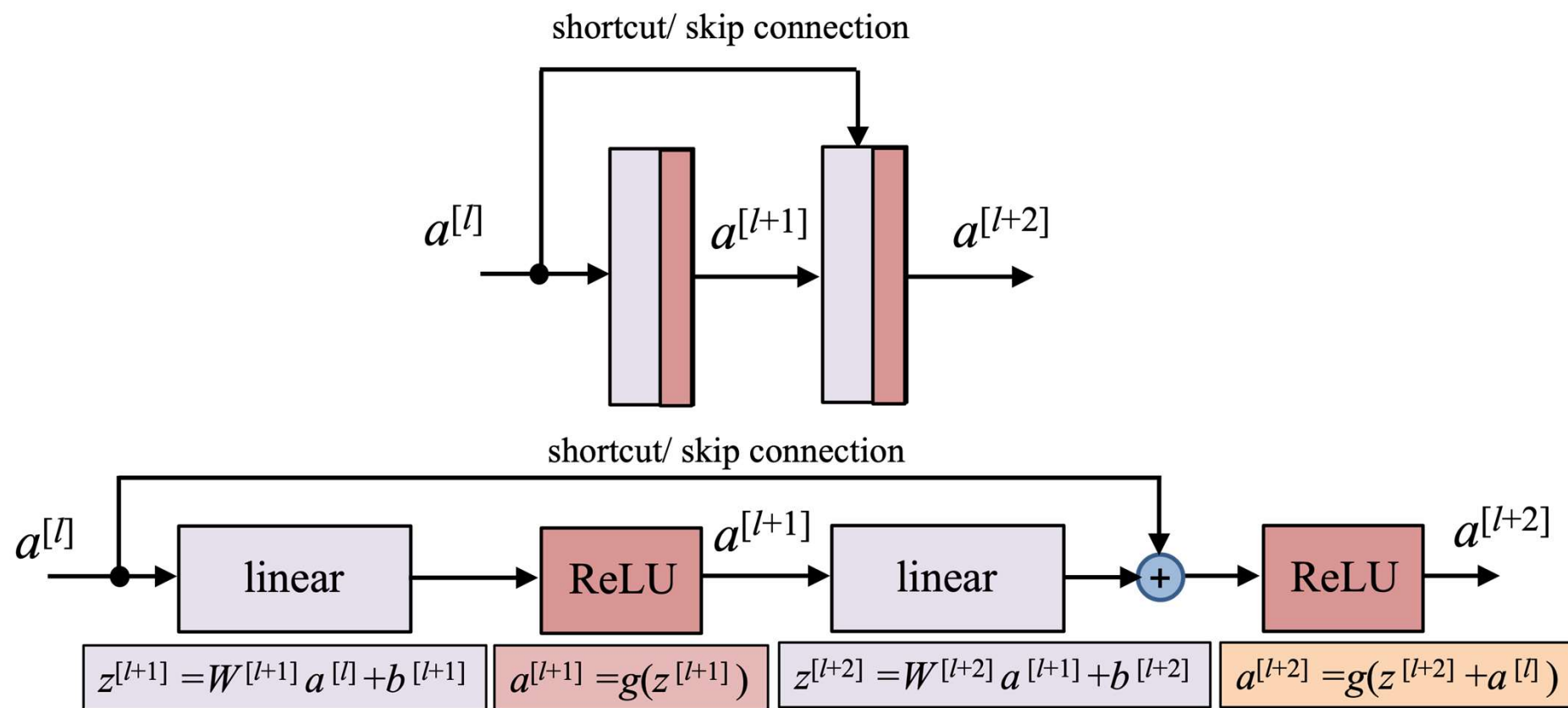
VGG-16



- Simonyan Sisserman. Very deep convolution networks for large-scale image recognition. 2015.

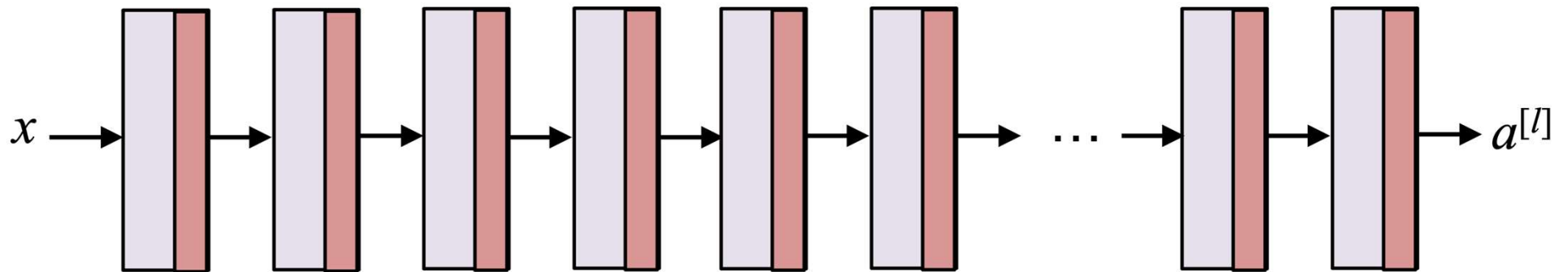
ResNets

He, K; Zhang X; Ren S.; Sun J.; Deep residual learning for image recognition. CVPR. 2015.

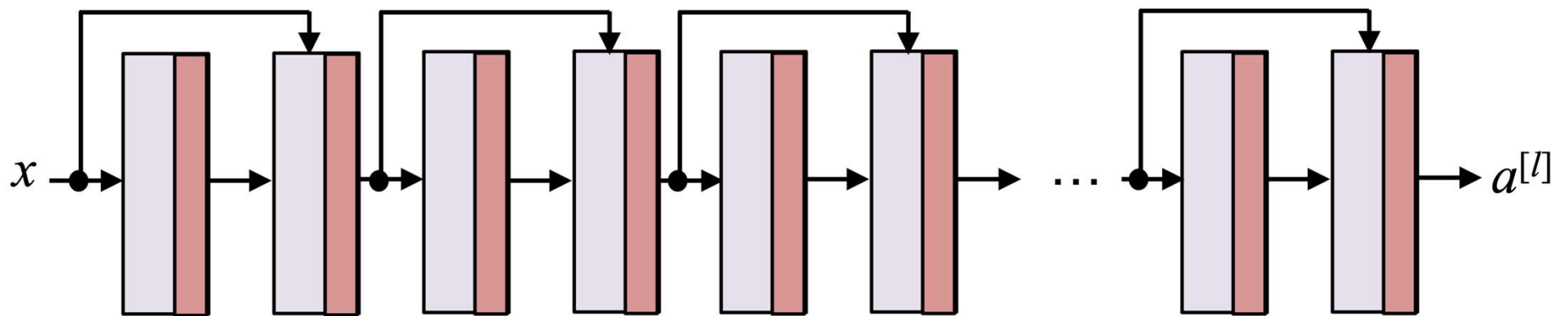


Residual block

Plain network



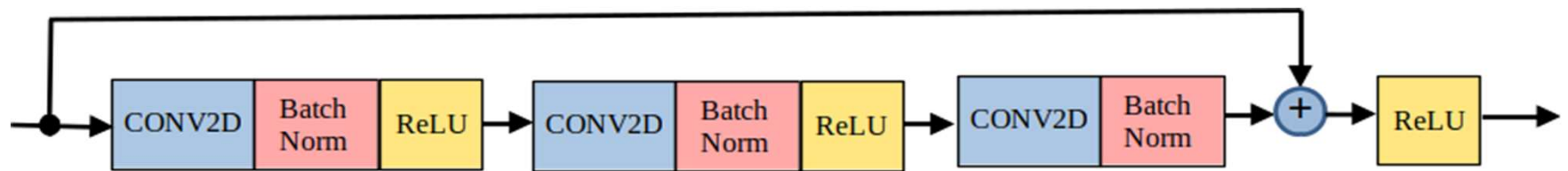
Residual network



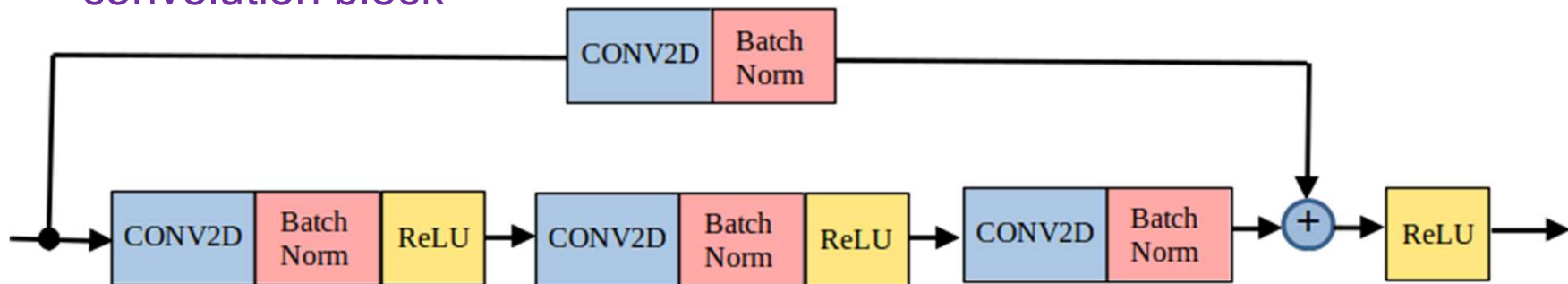
Plain v.s. residual network

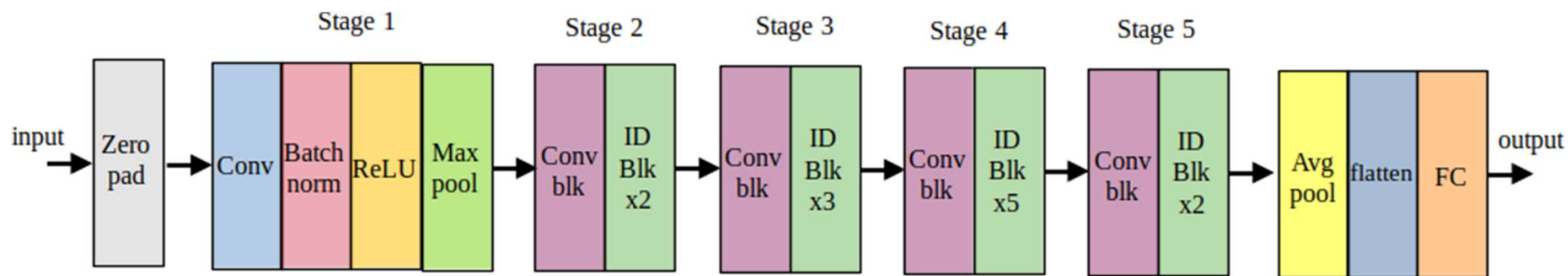
construct ResNets in TensorFlow

identity block



convolution block



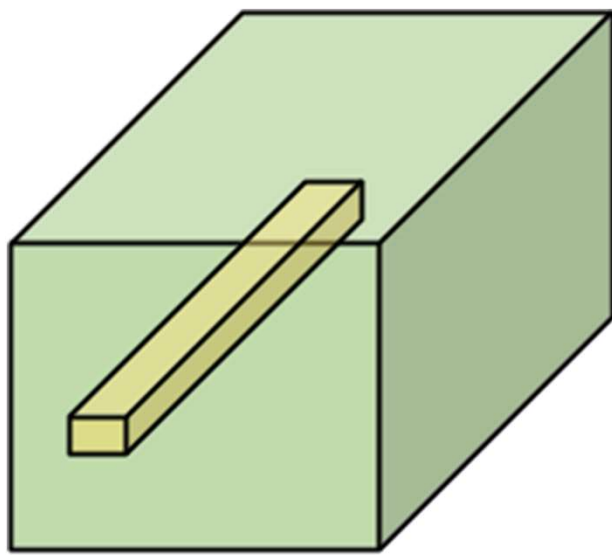


ResNet50 model

Inception model

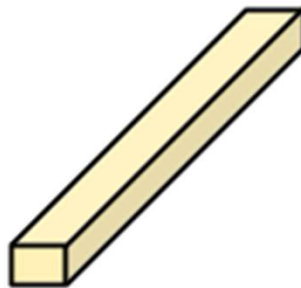
Szegedy et al. Going deeper with convolutions. 2014.

Convolution using 1x1 kernel



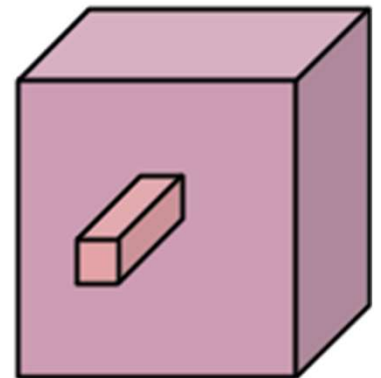
$6 \times 6 \times 32$

*



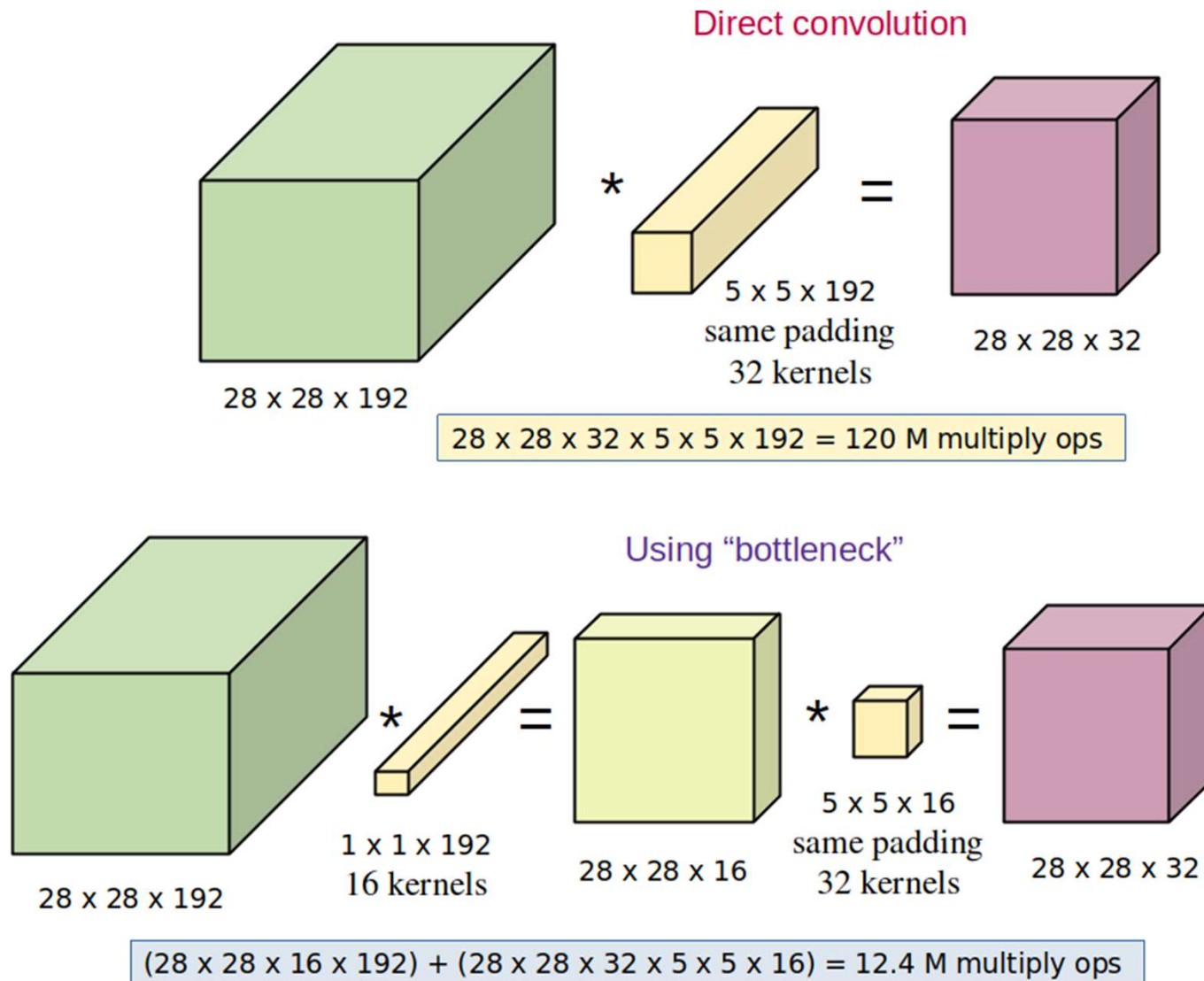
$1 \times 1 \times 32$
 n_c kernels

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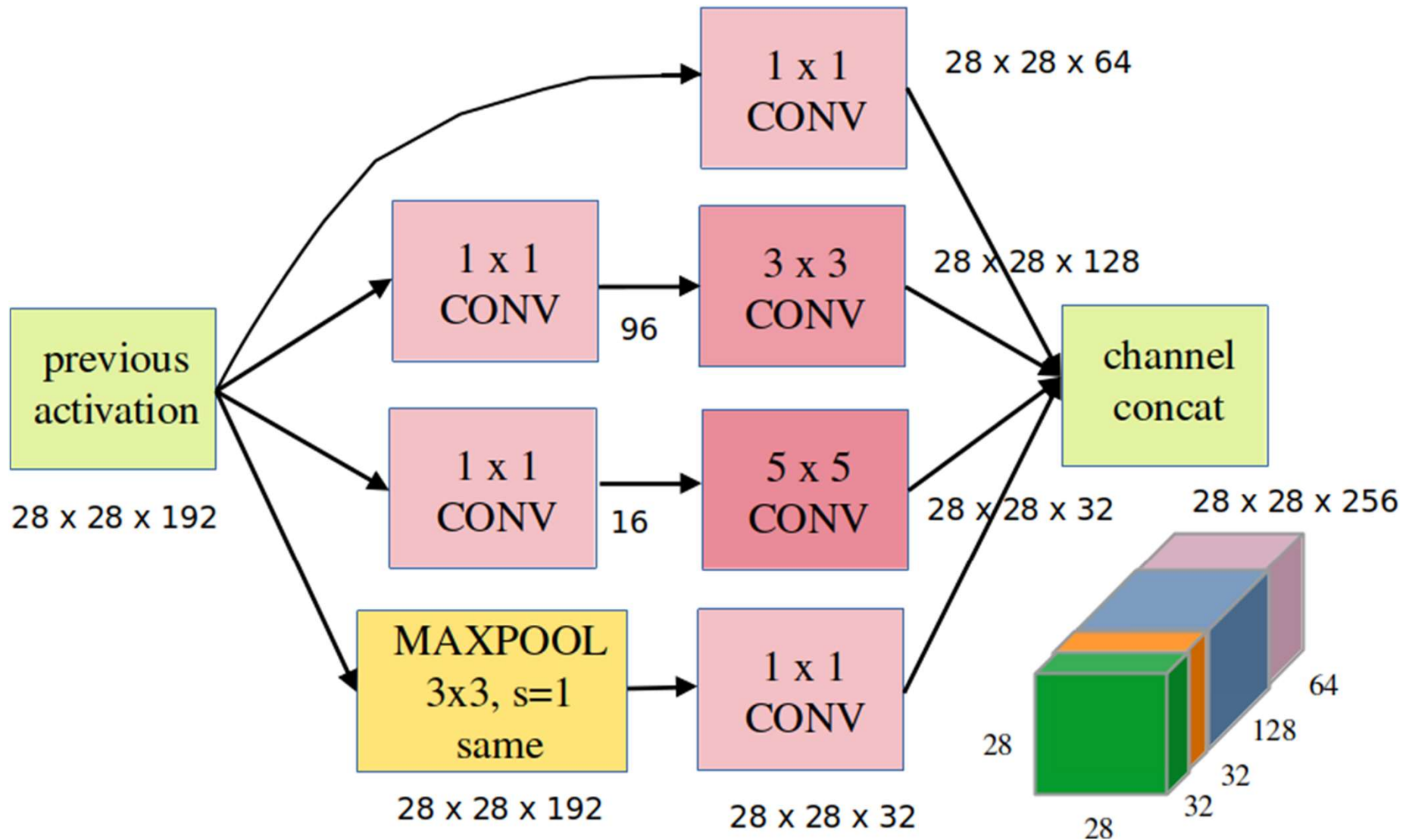


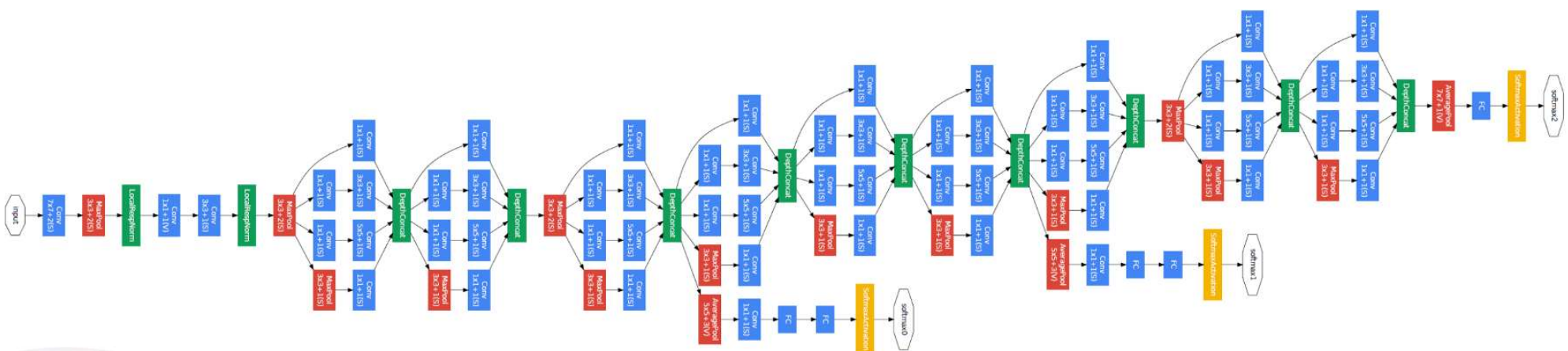
$6 \times 6 \times n_c$

Implement “bottleneck” with 1x1 convolution

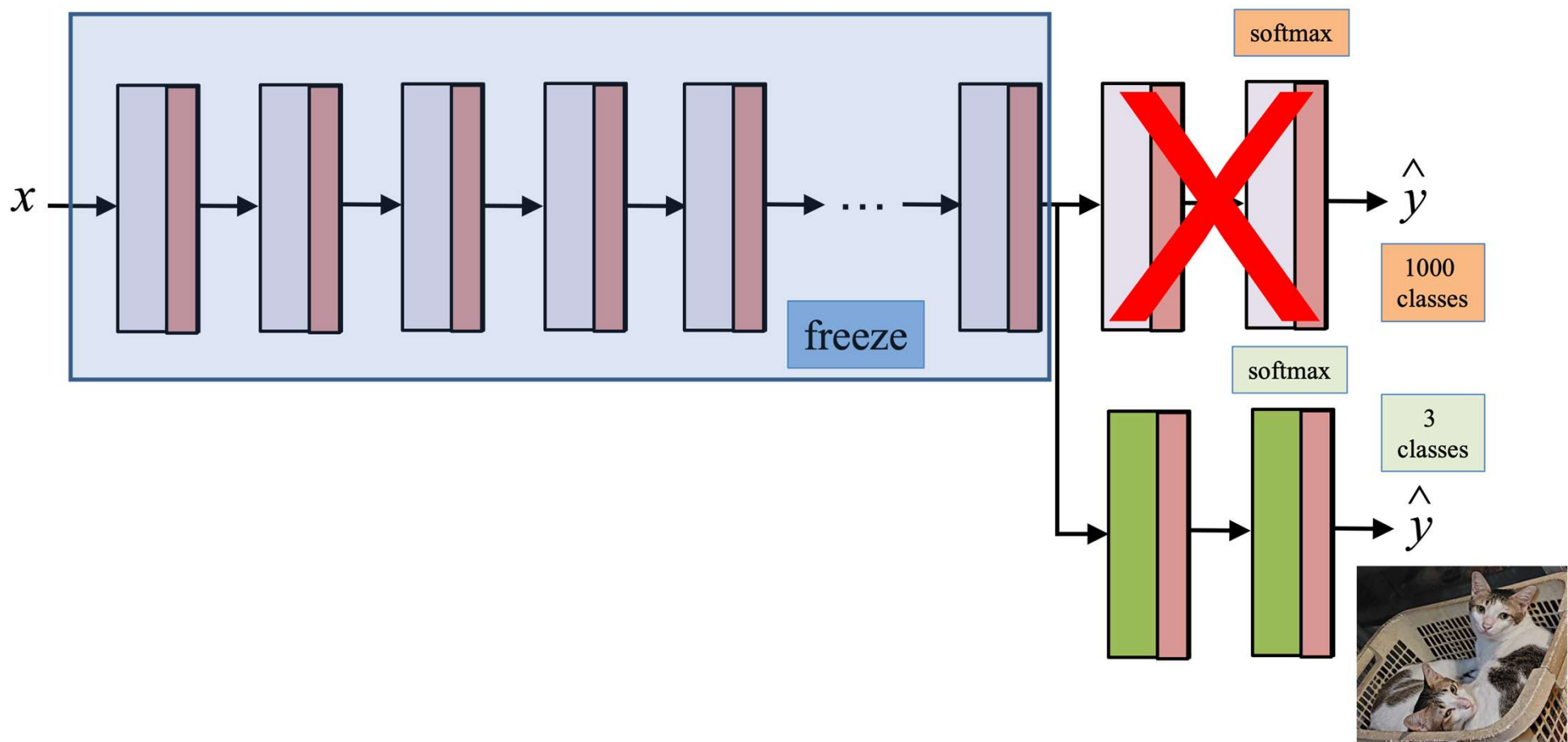


Inception module





googLenet



transfer learning