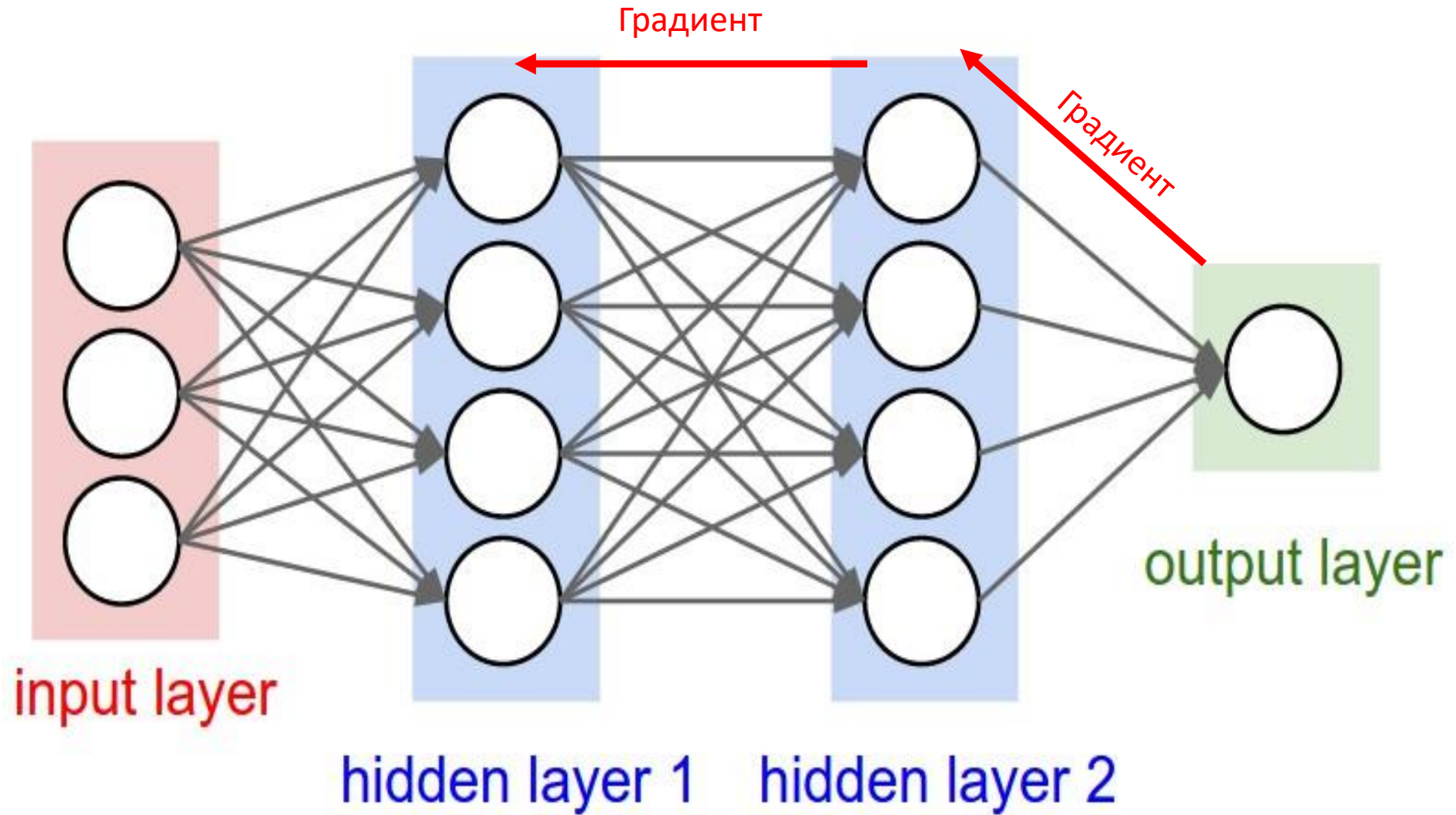


Deep Learning

Back-propagation



David Rumelhart, Geoffrey Hinton and Ronald Williams, 1986

Свертка (Convolution)

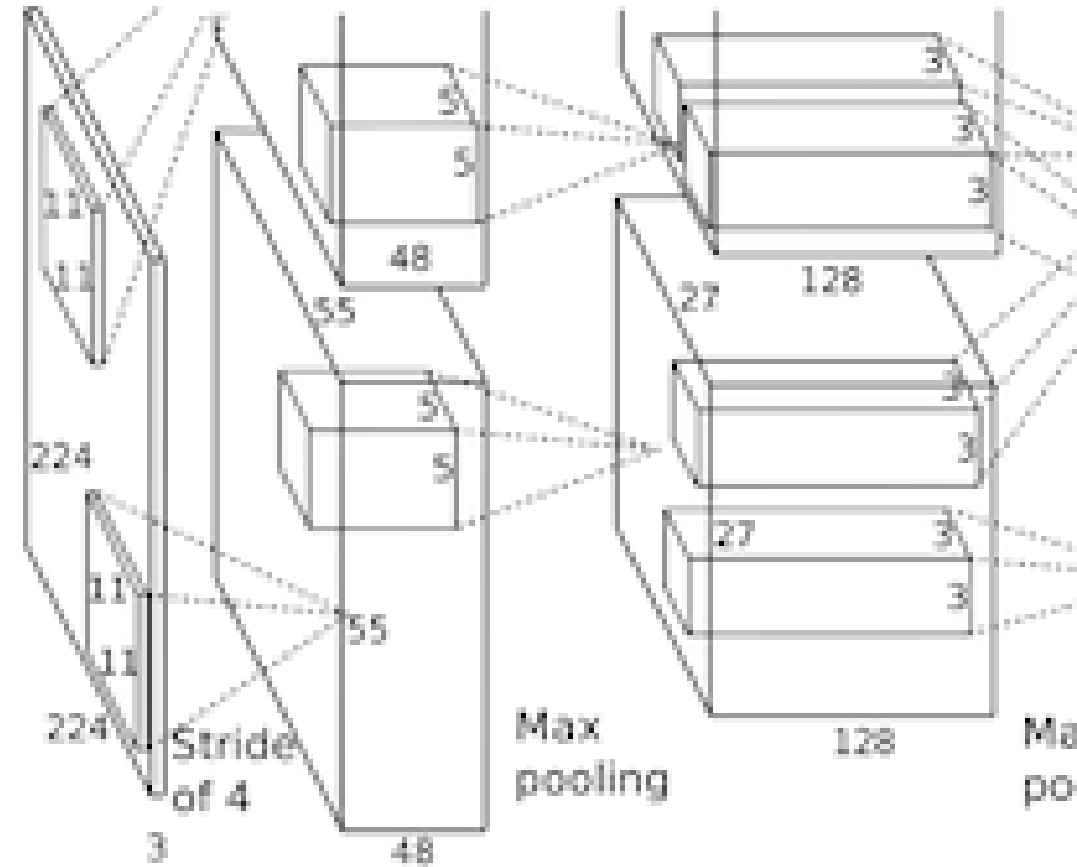
1 _{x1}	1 _{x0}	1 _{x1}	0	0
0 _{x0}	1 _{x1}	1 _{x0}	1	0
0 _{x1}	0 _{x0}	1 _{x1}	1	1
0	0	1	1	0
0	1	1	0	0

Image

Kernel 3x3, Stride 1

4		

Convolved
Feature



Примеры сверток

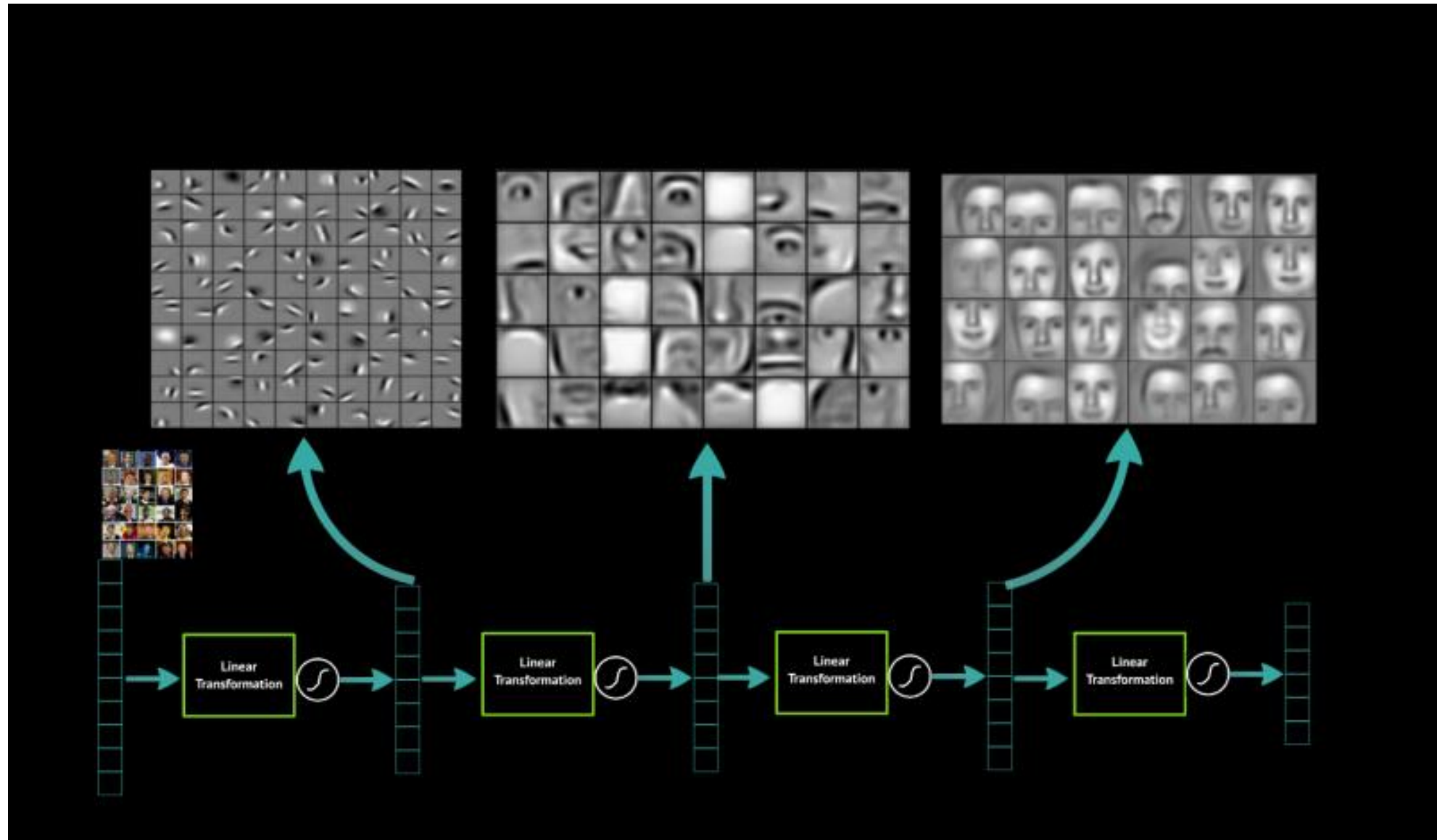
$$\begin{bmatrix} 0 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 0 \end{bmatrix}$$

$$\begin{bmatrix} 1 & 0 & -1 \\ 0 & 0 & 0 \\ -1 & 0 & 1 \end{bmatrix}$$

$$\begin{bmatrix} -1 & -1 & -1 \\ -1 & 8 & -1 \\ -1 & -1 & -1 \end{bmatrix}$$



Свертка (Convolution)



Pooling

Kernel 2x2

Stride 2

12	20	30	0
8	12	2	0
34	70	37	4
112	100	25	12

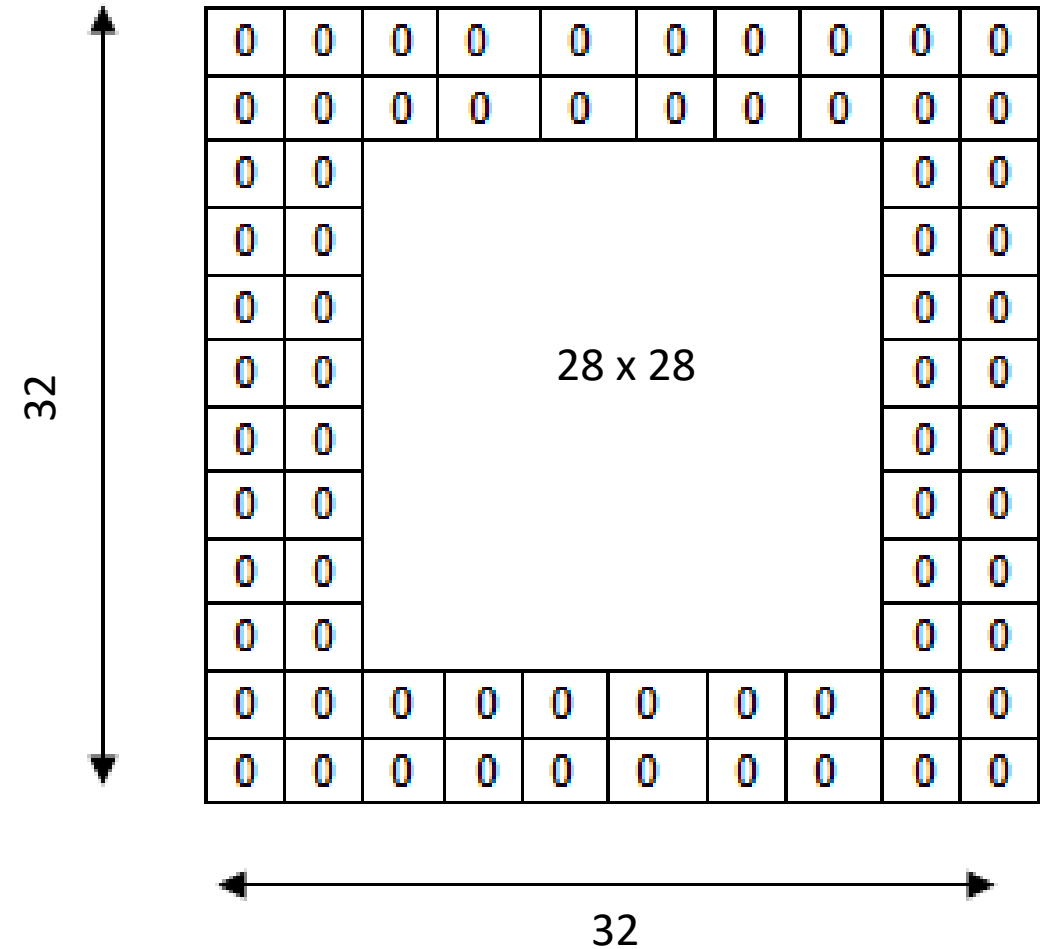
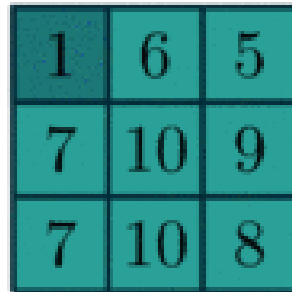
max pooling

20	30
112	37

average pooling

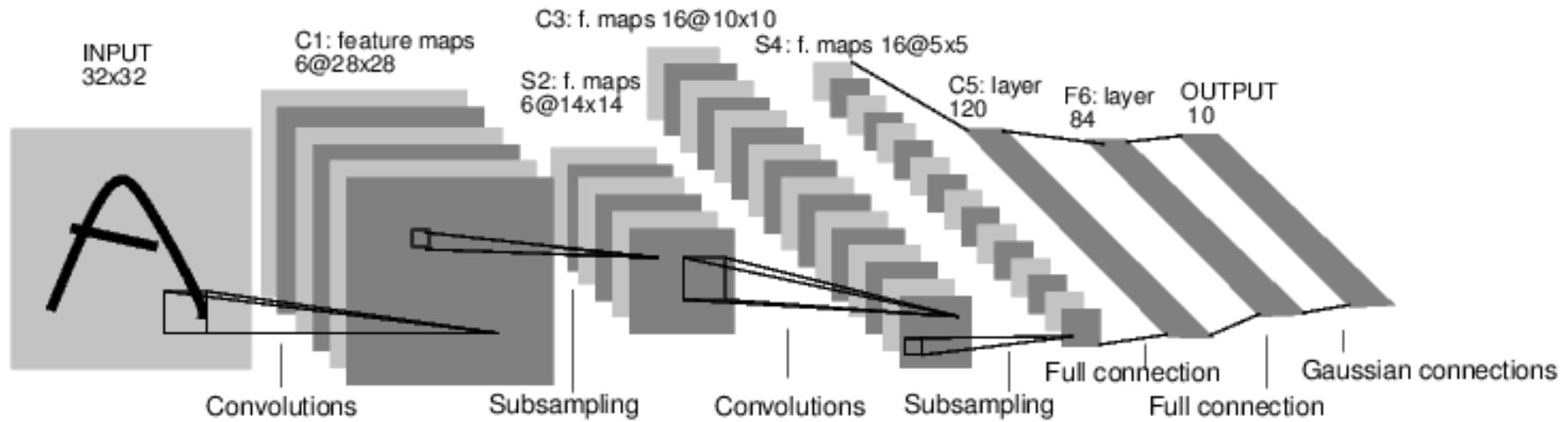
13	8
79	20

Padding



Deep learning

LeNet-5 (1998)

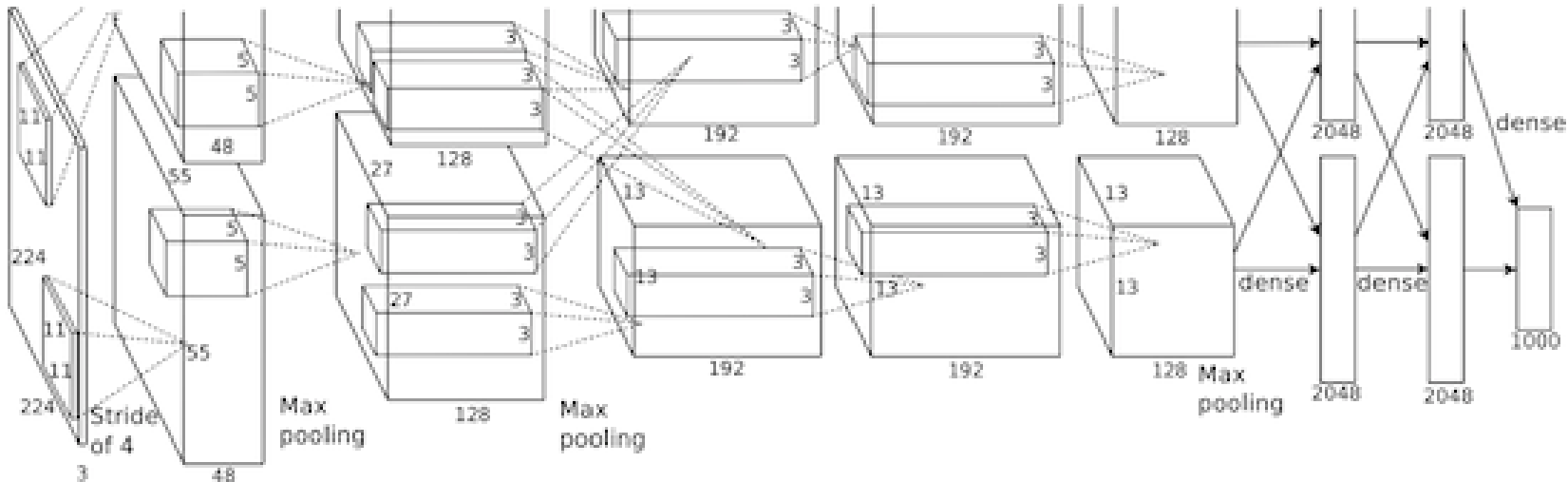


$$(5 \times 5) \times 6$$

+

$$(5 \times 5 \times 6) \times 16 + (16 \times 5 \times 5) \times 120 + 120 \times 84 + 84 \times 10 = 61470$$

AlexNet (2012)



$$(11 \times 11 \times 3) \times 48 + (5 \times 5 \times 48) \times 128 + (3 \times 3 \times 128) \times 192 \times 2 + (3 \times 3 \times 192) \times 192 + (3 \times 3 \times 192) \times 128 + (13 \times 13 \times 128) \times 2048 \times 2 + 2048 \times 2048 \times 2 + 2048 \times 1000 = 100\,207\,632$$

Работа нейронной сети

Deep Visualization Toolbox

yosinski.com/deepvis

#deepvis



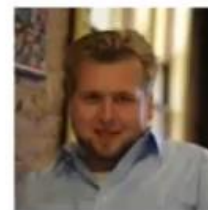
Jason Yosinski



Jeff Clune



Anh Nguyen



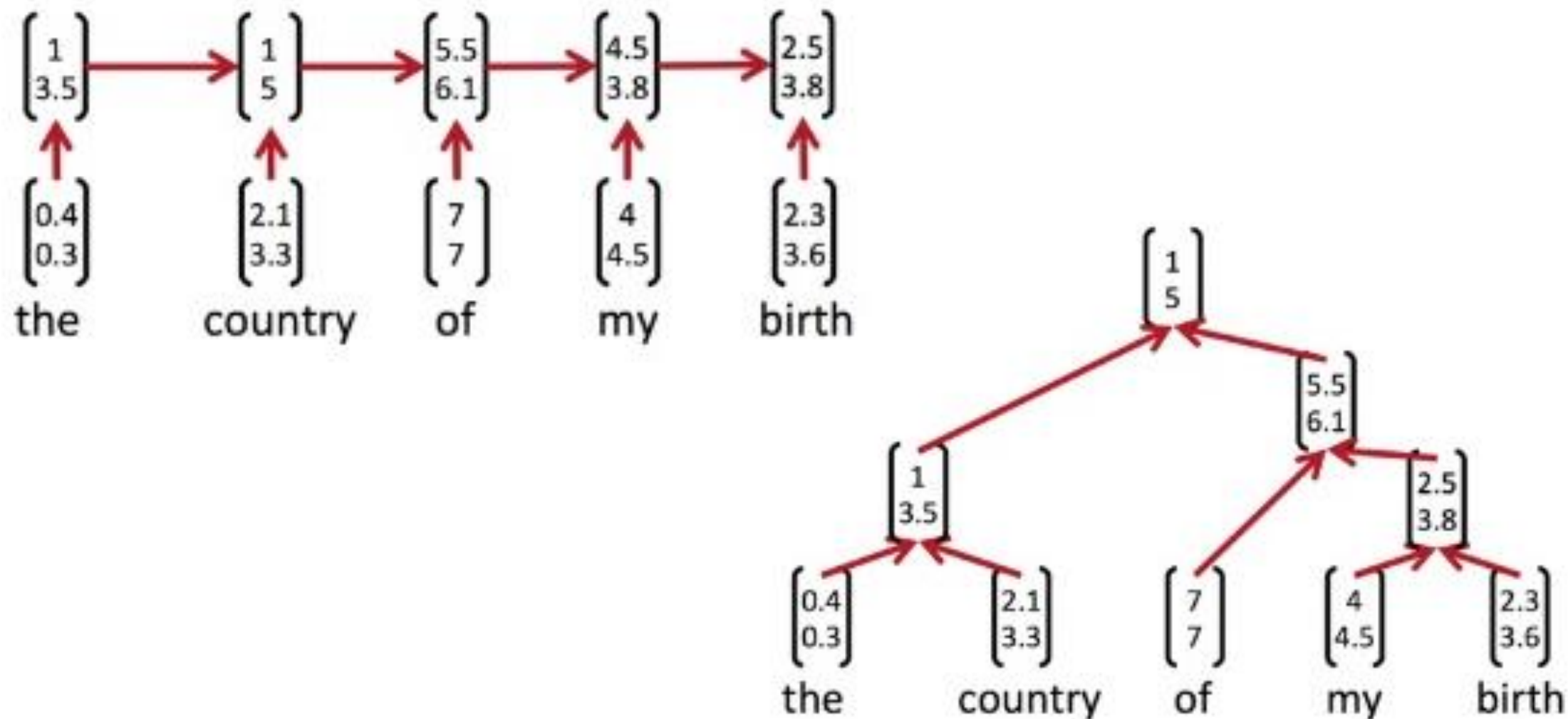
Thomas Fuchs



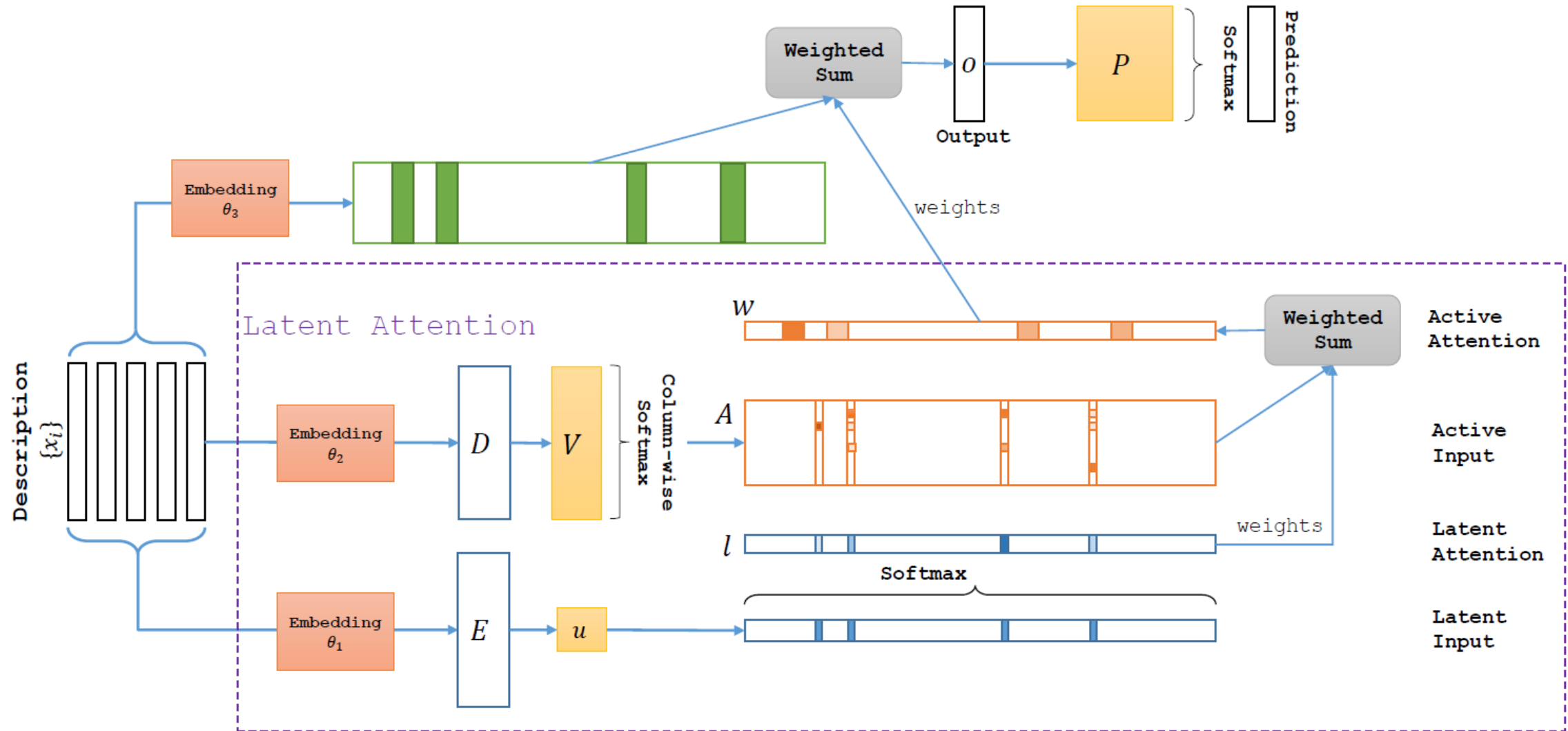
Hod Lipson



Recurrent and Recursive Neural Networks



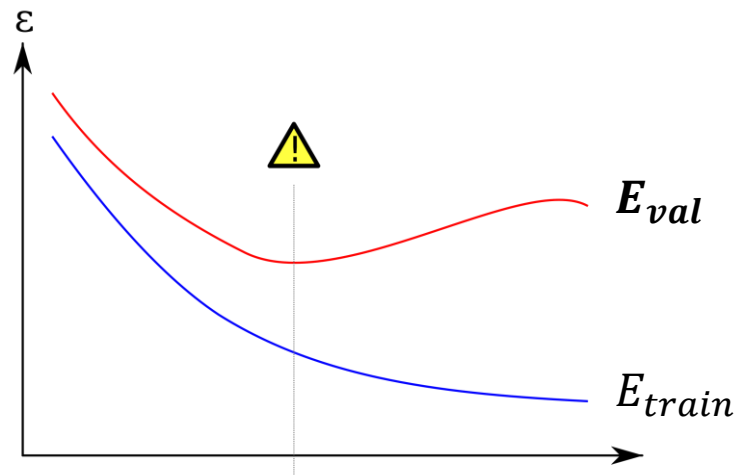
Complex DNN Architecture and Layers



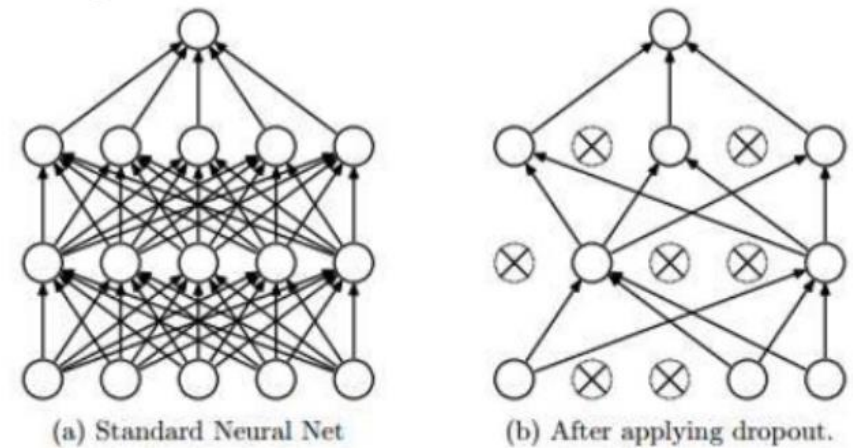
Регуляризация

L2 регуляризация — $C'(w) = C(w) + \frac{\lambda}{2N} ||w||_2^2$

Ранняя остановка (Early Stopping):



Dropout:



Искусственное увеличение обучающей выборки (Artificial expansion)

Из-за большого количества гиперпараметров нужно перейти:

Train, Test → Train, Validate, Test.

Подготовка к домашнему заданию

Пакеты deep learning:

Theano (deeplearning.net/software/theano)

TensorFlow (www.tensorflow.org)

} + Keras (keras.io)

Torch (torch.ch) - PyTorch

Deeplearning4j (deeplearning4j.org)