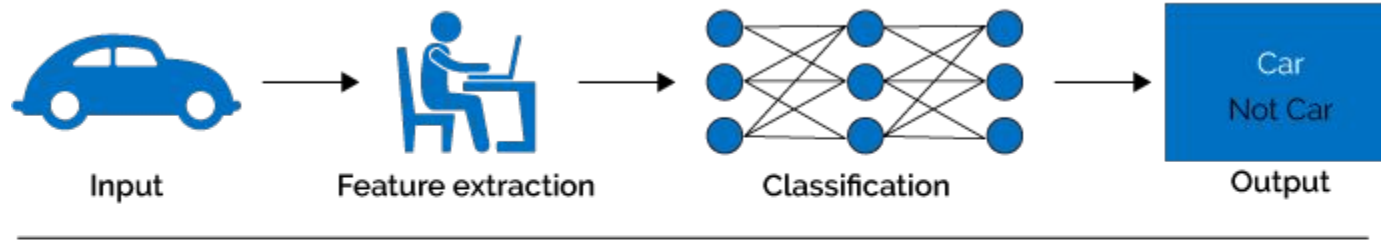


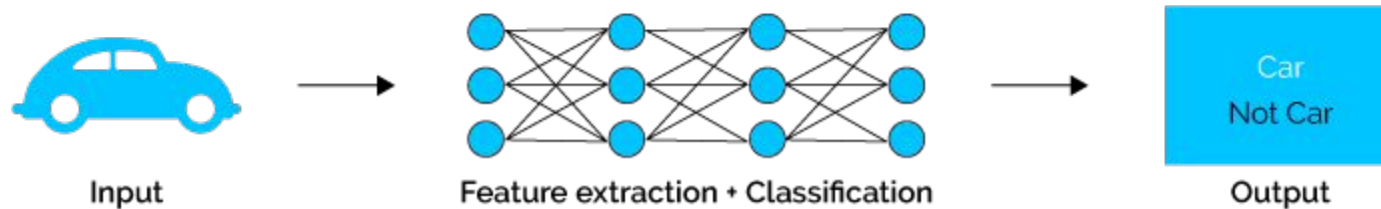
# **Modelos de Redes Neurais e Deep learning**

# Machine Learning e Deep Learning

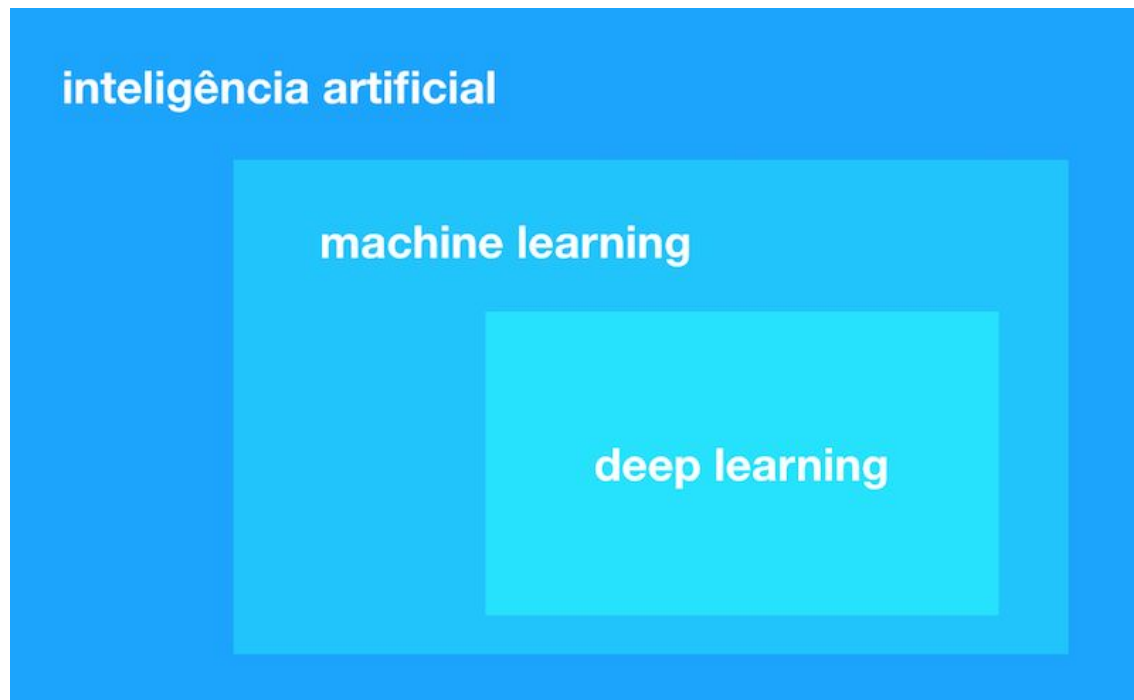
## Machine Learning



## Deep Learning



# Machine Learning e Deep Learning



# Machine Learning e Deep Learning

- Quando falamos de deep learning
  - ◆ Múltiplas camadas escondidas

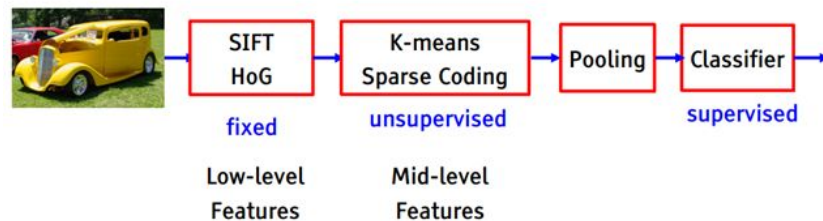
# Machine Learning e Deep Learning

→ Quando falamos de deep learning

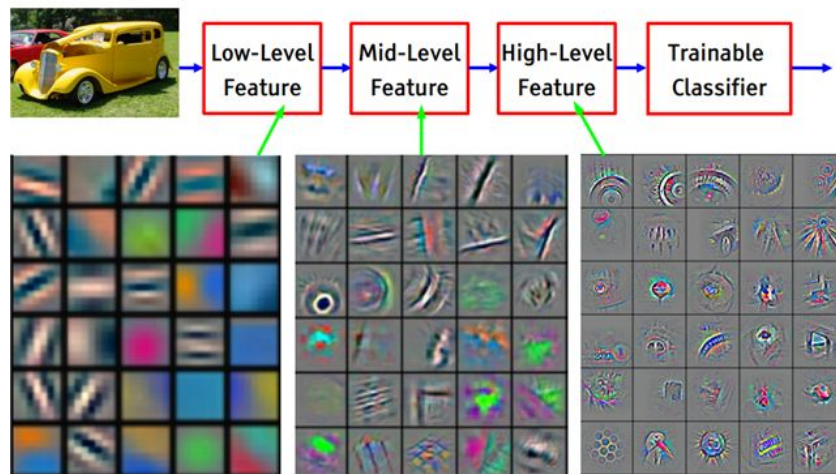
- ◆ Múltiplas camadas escondidas
- ◆ As camadas formam uma hierarquia representativa para cada feature de entrada

# Machine Learning e Deep Learning

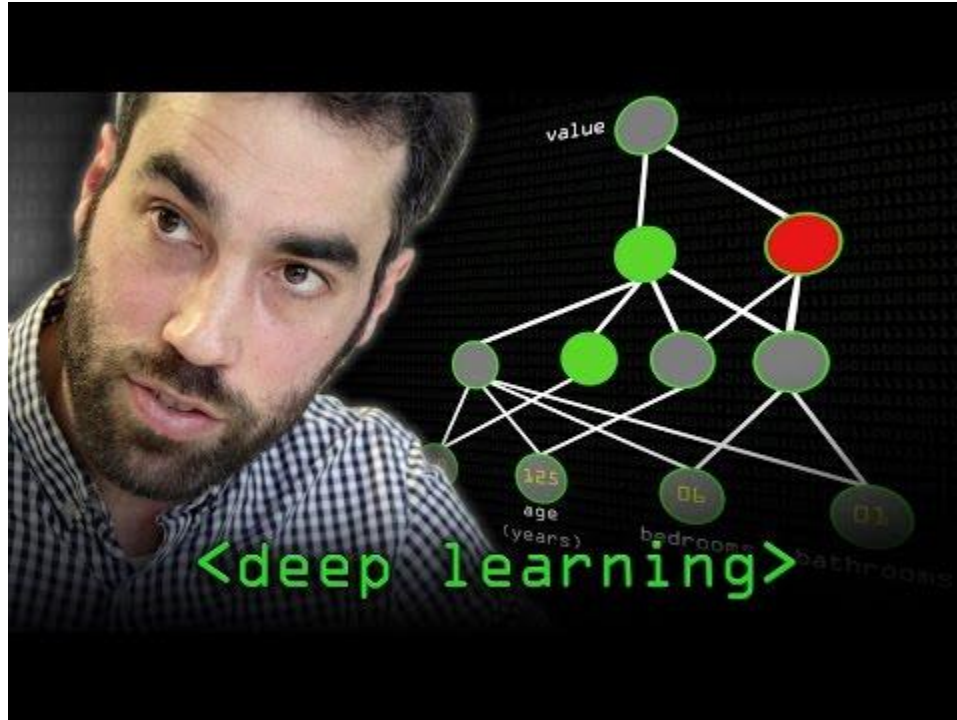
Object recognition 2006-2012



State of the art object recognition using CNNs



# Machine Learning e Deep Learning



# Machine Learning e Deep Learning

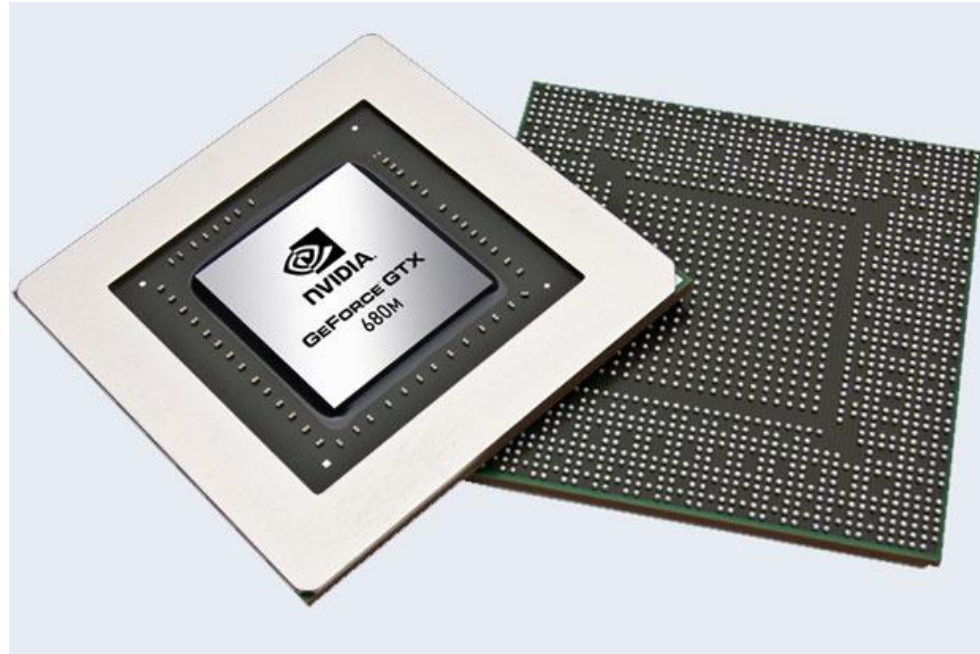
→ CPU (Central Process Unit ou Unidade Central de Processamento)





# Machine Learning e Deep Learning

→ GPU (Graphics Processing Unit ou Unidade de Processamento Gráfico)



# Machine Learning e Deep Learning

→ TPU (Tensor Processing Unit ou Unidade Processamento de Tensor)



# Machine Learning e Deep Learning

## → O que é um tensor?

- ◆ Tensores são entidades geométricas introduzidas na matemática e na física para generalizar a noção de escalares, vetores e matrizes.

<https://pt.wikipedia.org/wiki/Tensor>

## tensor

't'
'e'
'n'
's'
'o'
'r'

tensor of dimensions [6]  
(vector of dimension 6)

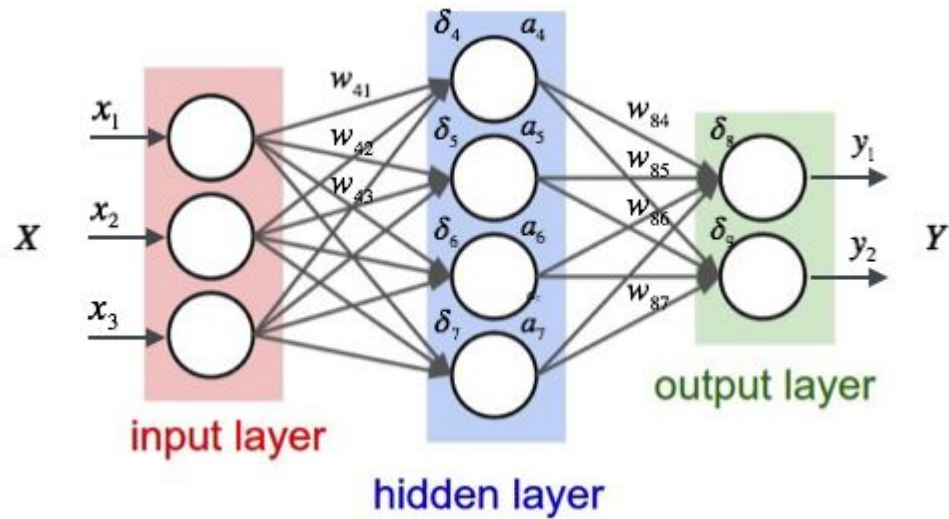
3	1	4	1
5	9	2	6
5	3	5	8
9	7	9	3
2	3	8	4
6	2	6	4

tensor of dimensions [6,4]  
(matrix 6 by 4)

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

tensor of dimensions [4,4,2]

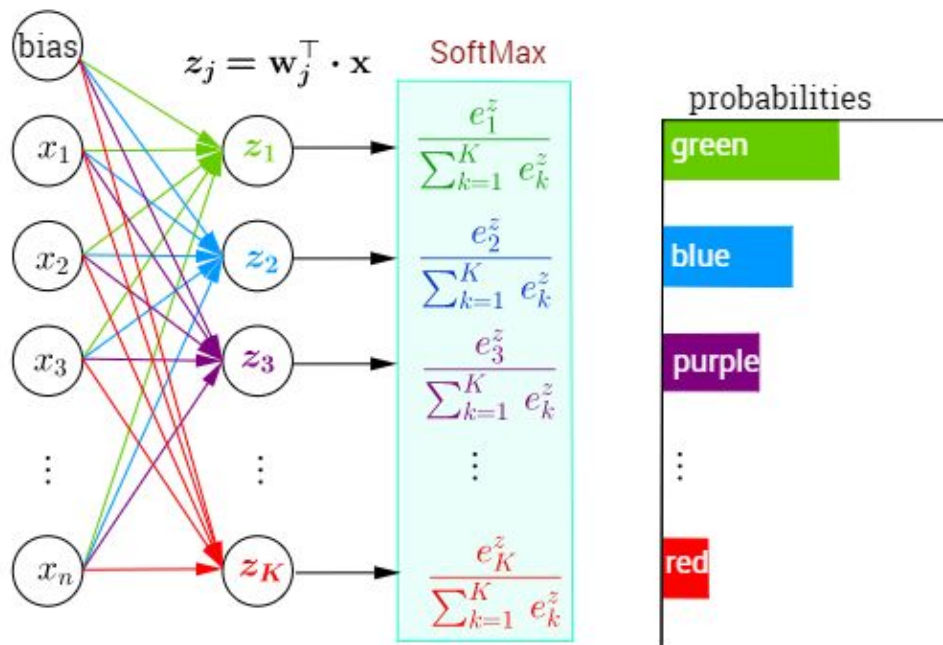
# Rede Neural



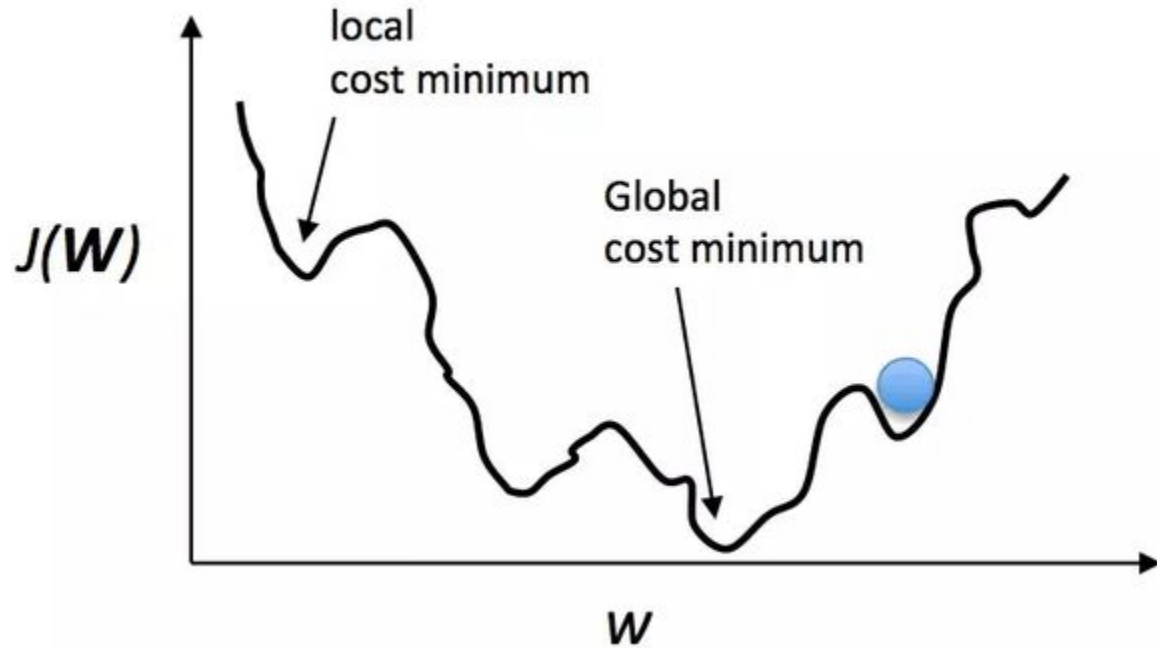
# Cross Entropy

## Multi-Class Classification with NN and SoftMax Function

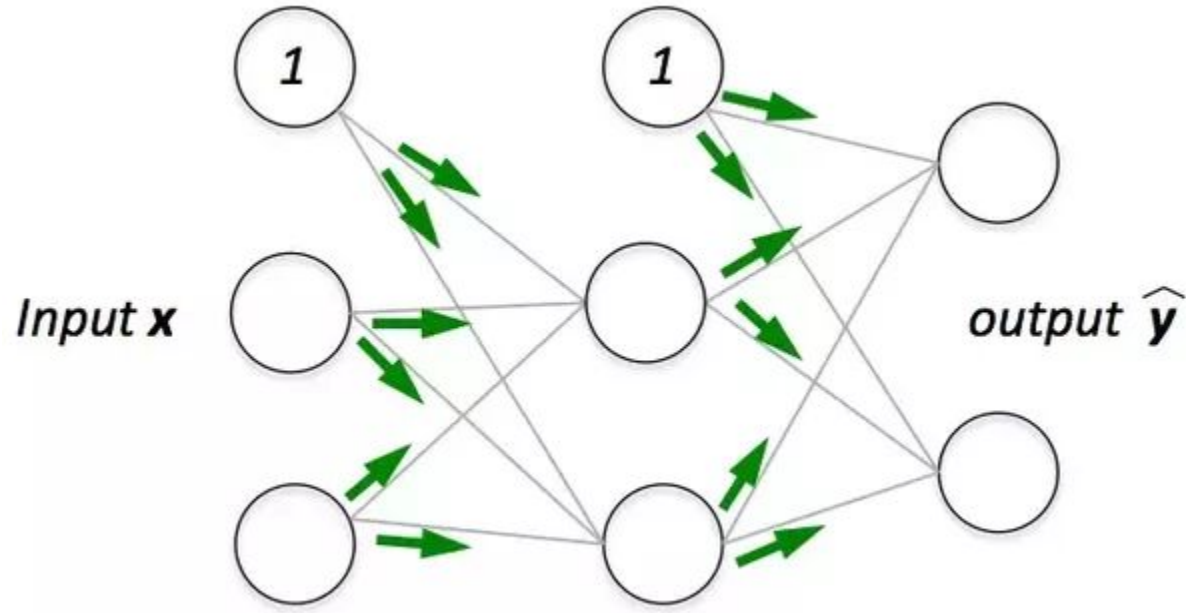
$$\mathbf{z} = \begin{bmatrix} z_1 \\ z_2 \\ z_3 \\ \vdots \\ z_K \end{bmatrix} = \begin{bmatrix} \mathbf{w}_1^\top \\ \mathbf{w}_2^\top \\ \mathbf{w}_3^\top \\ \vdots \\ \mathbf{w}_K^\top \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \\ x_3 \\ \vdots \\ x_n \end{bmatrix}$$



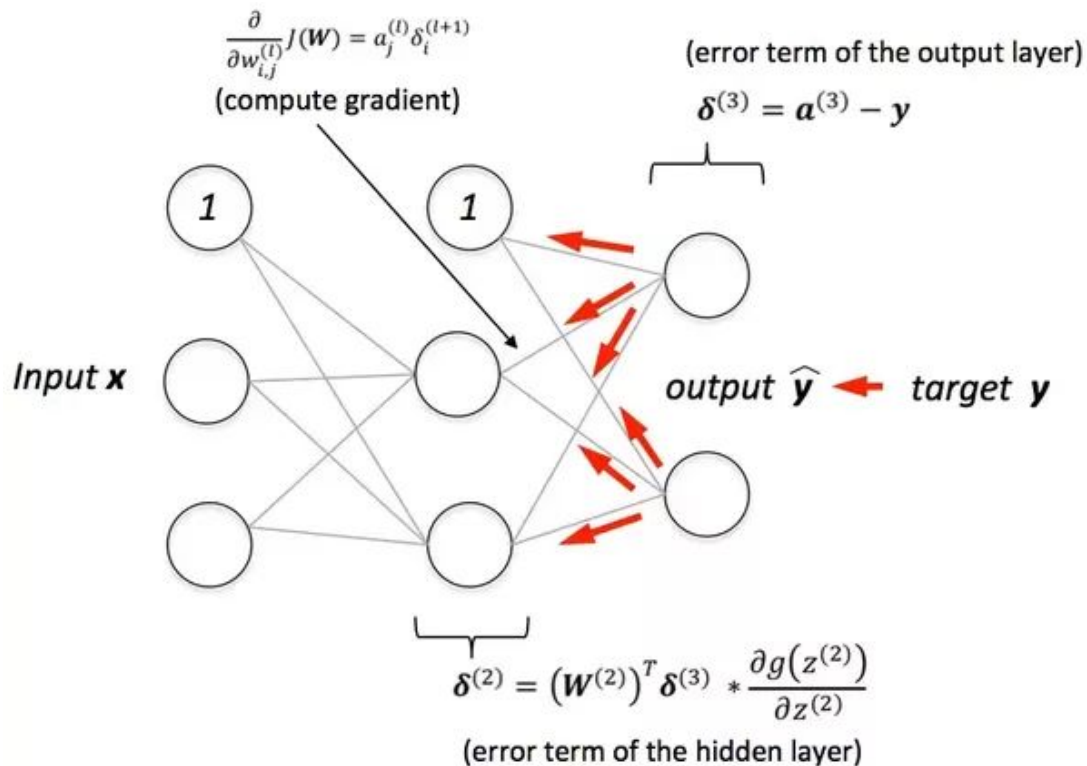
# Back Propagation



# Back Propagation

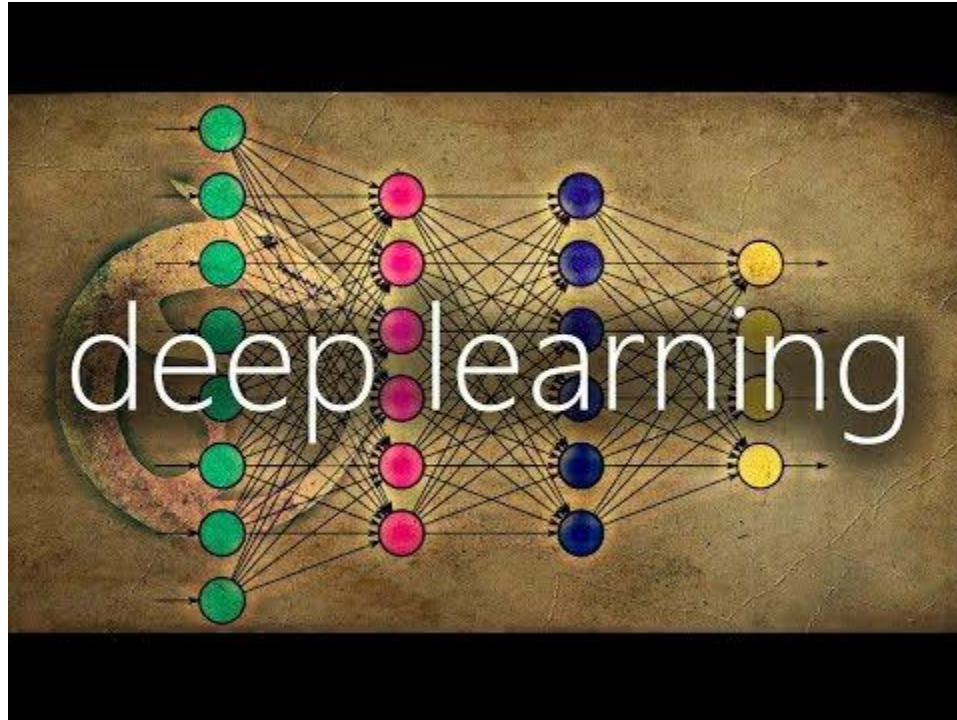


# Back Propagation



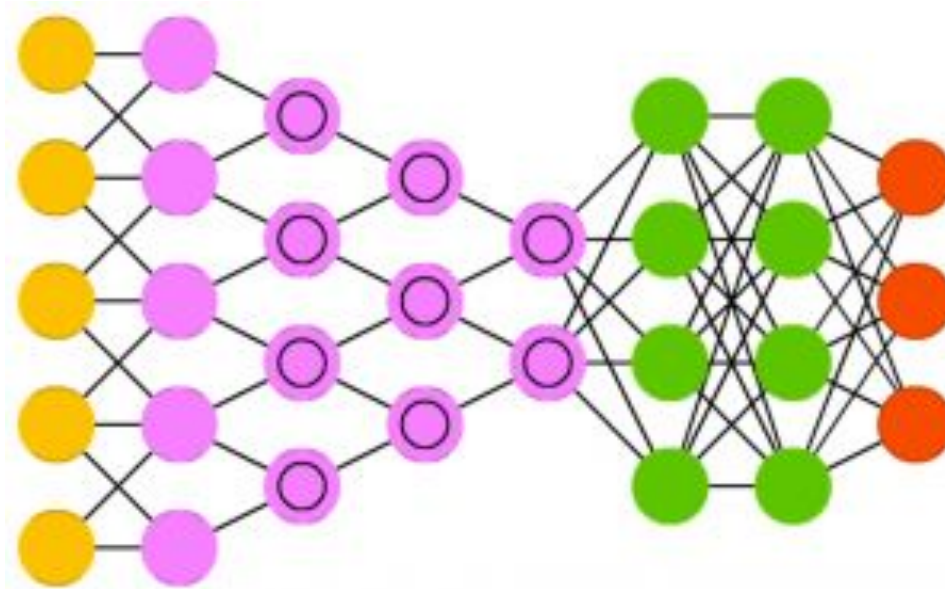


# Rede Neural



# CNN's

→ Redes Neurais Convolucionais



# CNN's

→ Redes Neurais Convolucionais

- ◆ É uma rede *feed-forward*;

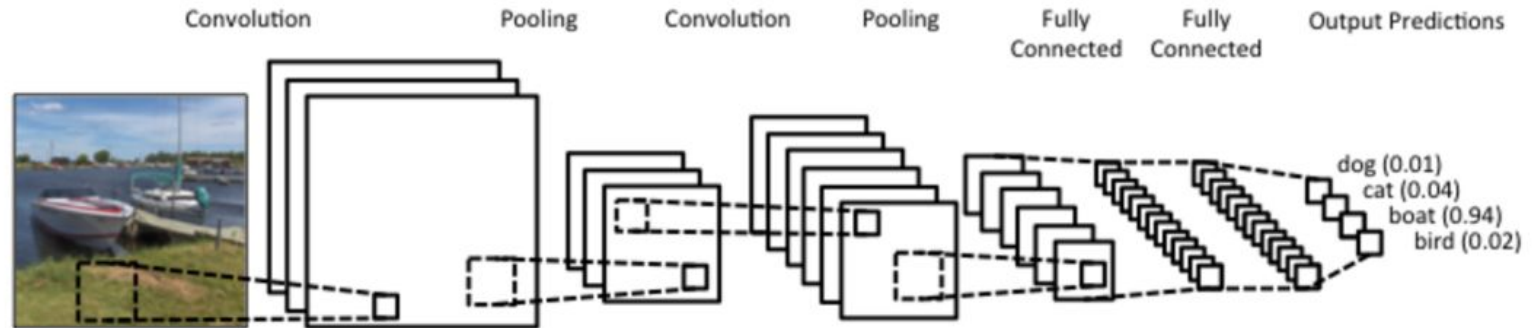
# CNN's

## → Redes Neurais Convolucionais

- ◆ É uma rede *feed-forward*;
- ◆ Boa aplicabilidade para problemas que envolvem análise de imagens.

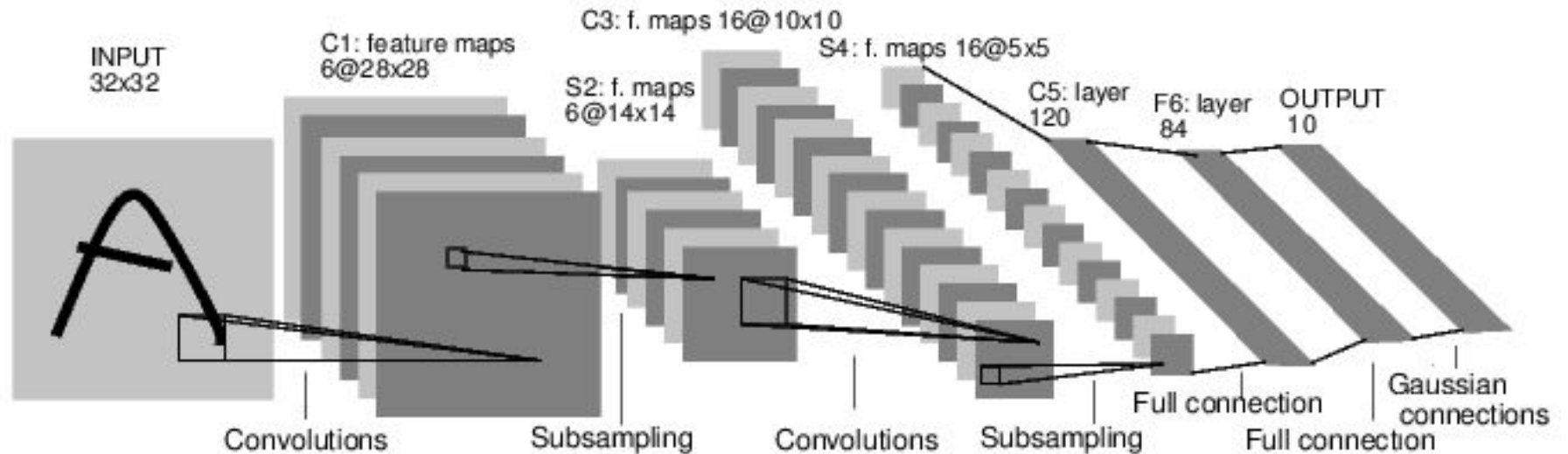
# CNN's

→ Redes Neurais Convolucionais



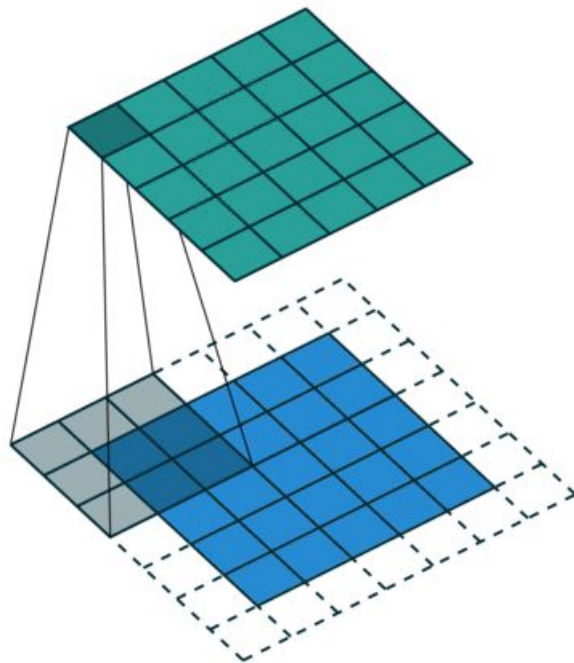
# CNN's

→ Redes Neurais Convolucionais



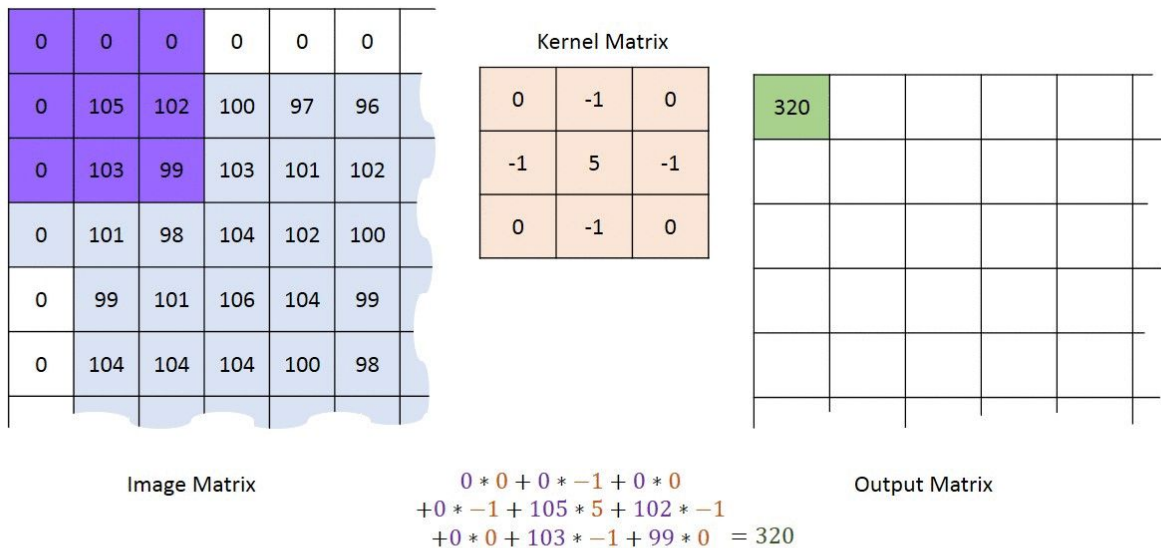
# CNN's

→ Convolução?



# CNN's

→ Convolução?



**Convolution with horizontal and  
vertical strides = 1**



# CNN's

## → Exemplo de filtro (Sobel)

Matematicamente este operador utiliza duas matrizes 3×3 que são convoluídas com a imagem original para calcular aproximações das derivadas - uma para as variações horizontais e uma para as verticais. Sendo **A** a imagem inicial então, **G<sub>x</sub>** e **G<sub>y</sub>** serão duas imagens que em cada ponto contêm uma aproximação às derivadas horizontal e vertical de A.

$$\mathbf{G}_x = \begin{bmatrix} -1 & 0 & +1 \\ -2 & 0 & +2 \\ -1 & 0 & +1 \end{bmatrix} * \mathbf{A} \quad \text{e} \quad \mathbf{G}_y = \begin{bmatrix} +1 & +2 & +1 \\ 0 & 0 & 0 \\ -1 & -2 & -1 \end{bmatrix} * \mathbf{A}$$

Portanto a magnitude, **G**, e a direcção, **Θ**, do gradiente são dados por:

$$\mathbf{G} = \sqrt{\mathbf{G}_x^2 + \mathbf{G}_y^2}$$

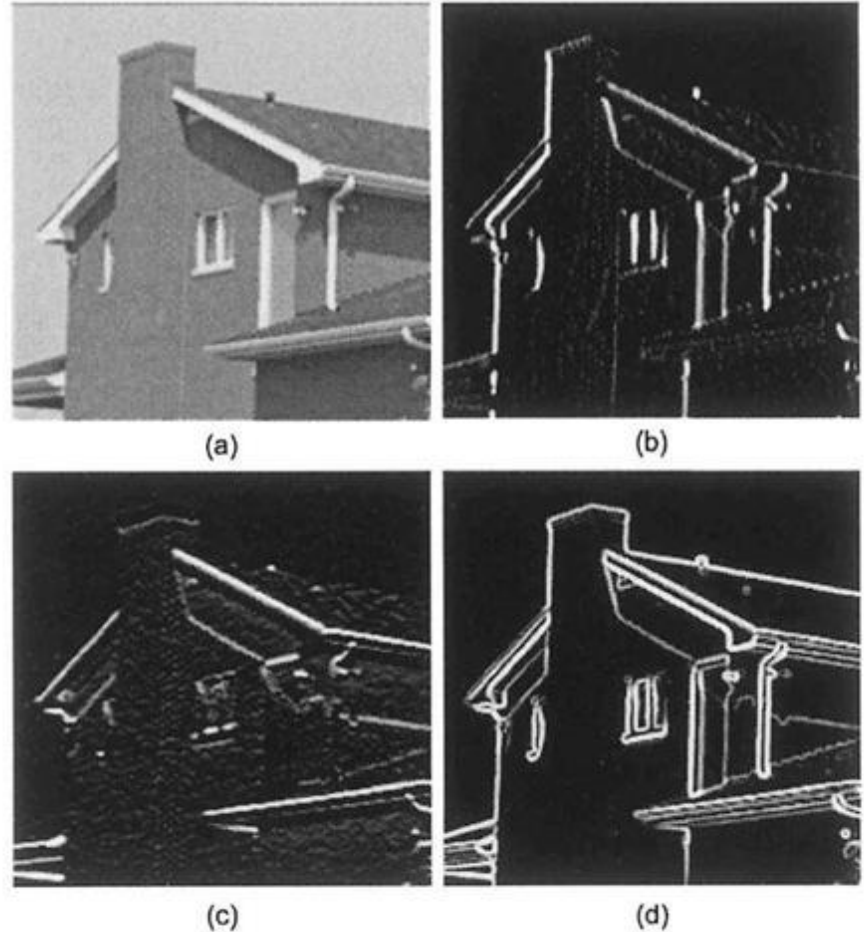
$$\Theta = \arctan\left(\frac{\mathbf{G}_y}{\mathbf{G}_x}\right)$$

[https://pt.wikipedia.org/wiki/Filtro\\_Sobel](https://pt.wikipedia.org/wiki/Filtro_Sobel)

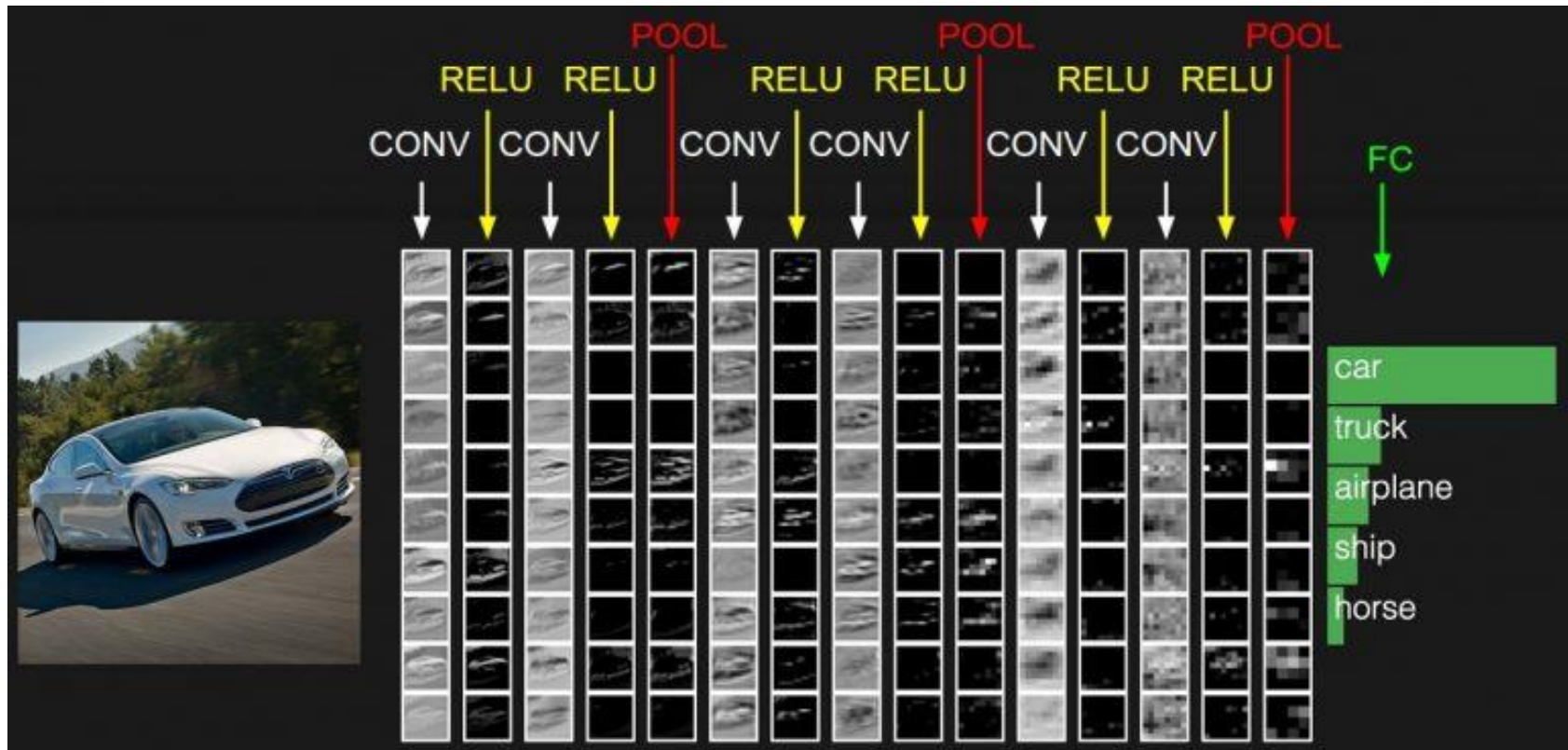
# CNN's

→ Exemplo de filtro (Sobel)

- a) Imagem original
- b) Sobel (Gx)
- c) Sobel (Gy)
- d) Sobel (Magnitude G)

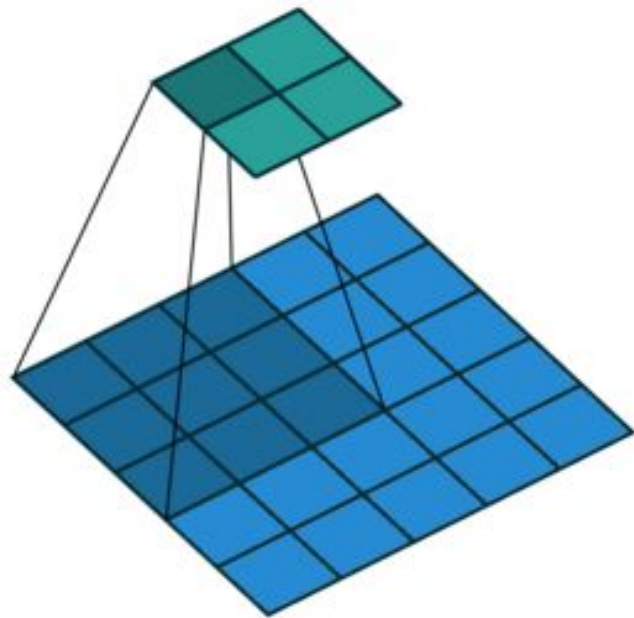


# CNN's



# CNN's

→ Pooling?



Single depth slice

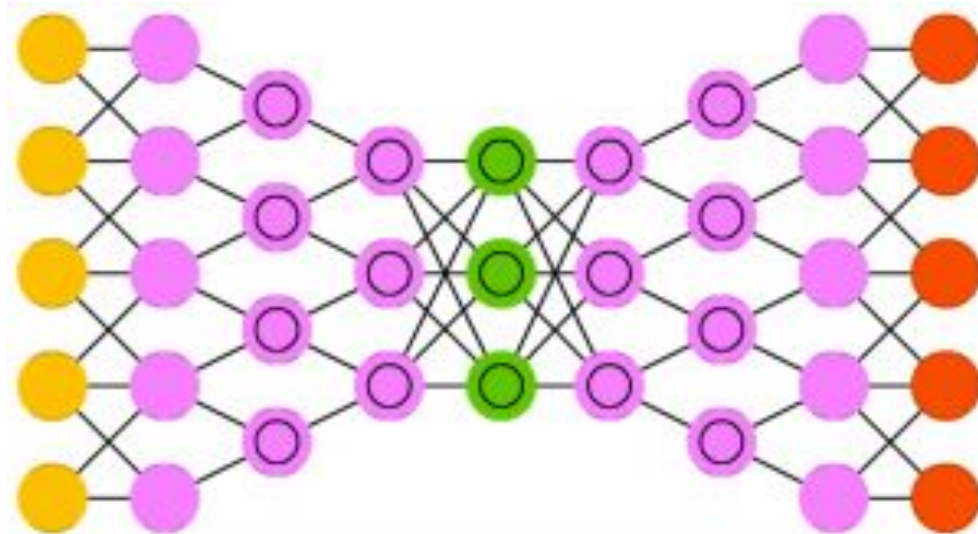
x	1	1	2	4
	5	6	7	8
	3	2	1	0
	1	2	3	4
	y			

max pool with 2x2 filters  
and stride 2

6	8
3	4

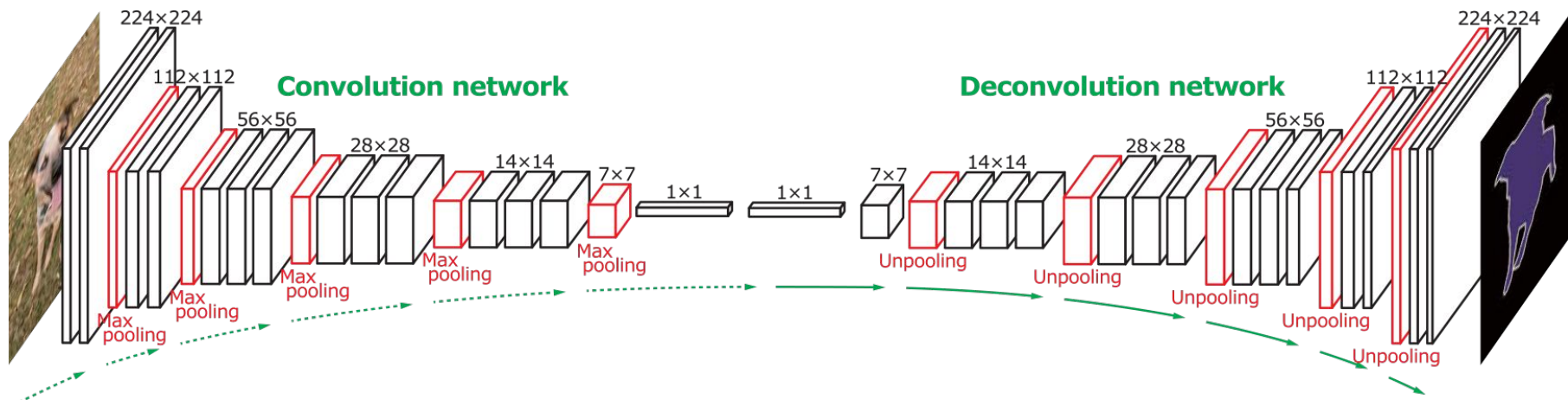
# CNN's

→ Redes Neurais Convolucionais Gráficas inversas Profundas



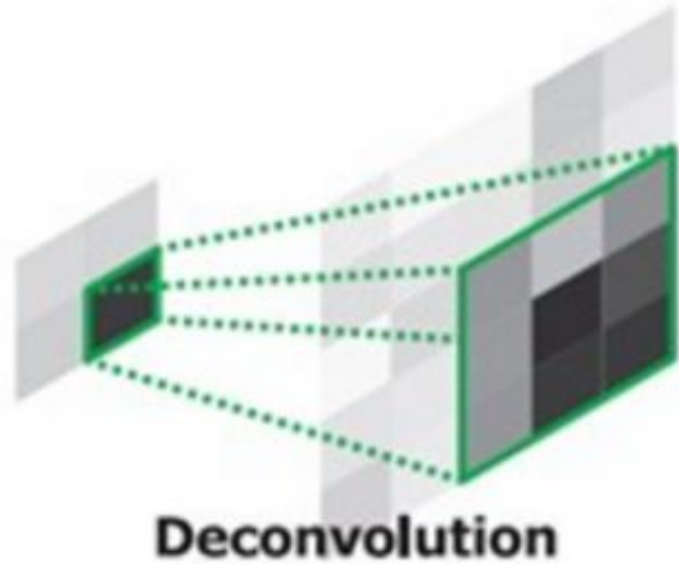
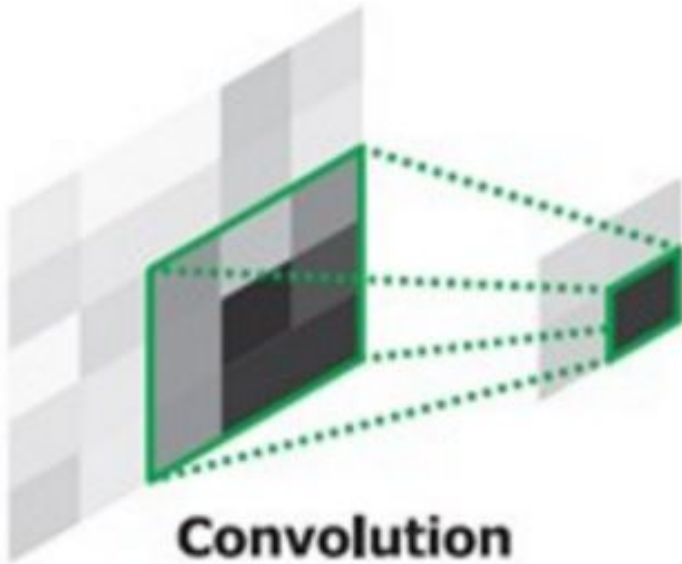
# CNN's

→ Redes Neurais Convolucionais Gráficas inversas Profundas



# CNN's

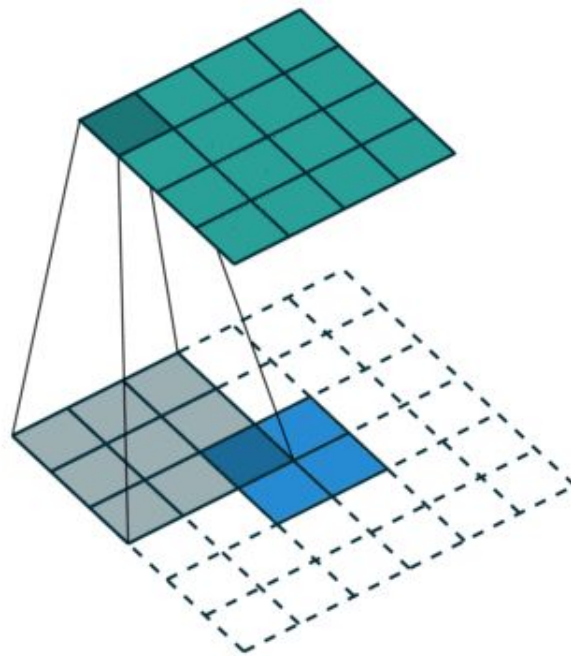
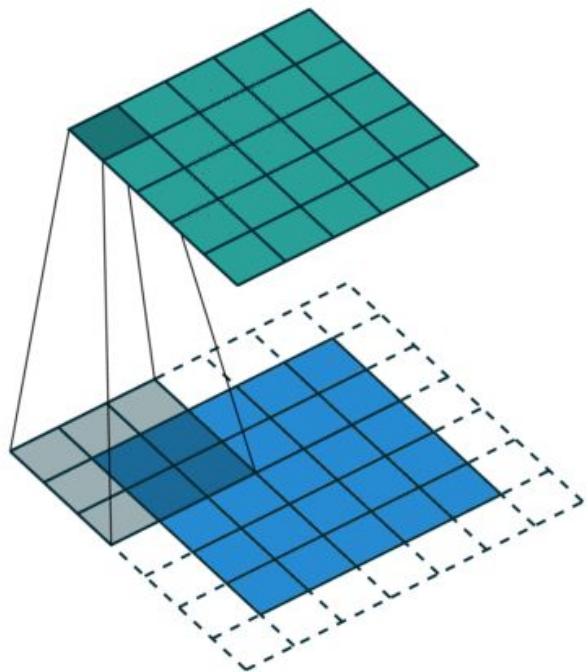
→ Convolution e Deconvolution?





# CNN's

→ Convolution e Deconvolution?





# CNN's

