



# Construindo um Modelo de Machine Learning do Zero



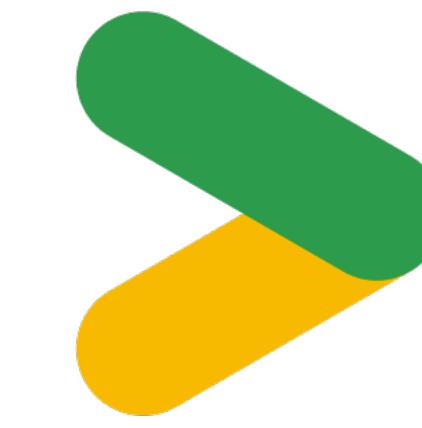
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# O que vamos ver?

O que Machine Learning?



Que Modelo Vamos Construir?



Living Code

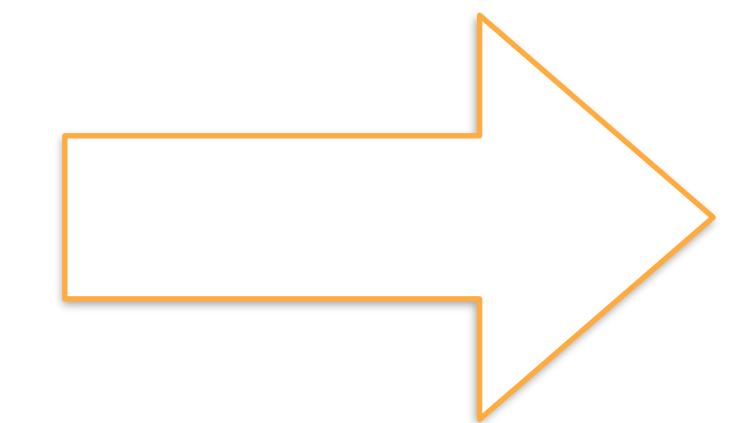
# O que é Machine Learning?



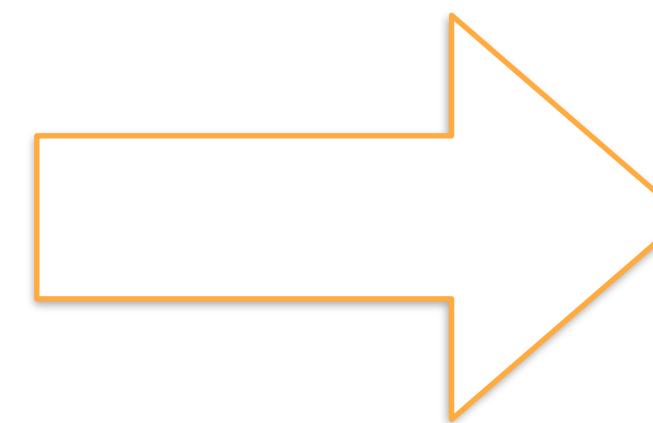
"É um ramo da **inteligência artificial** baseado na ideia de que sistemas podem **aprender** com dados, identificar padrões e tomar decisões com o mínimo de intervenção humana"

# Como funciona?

Dados para  
Treinamento

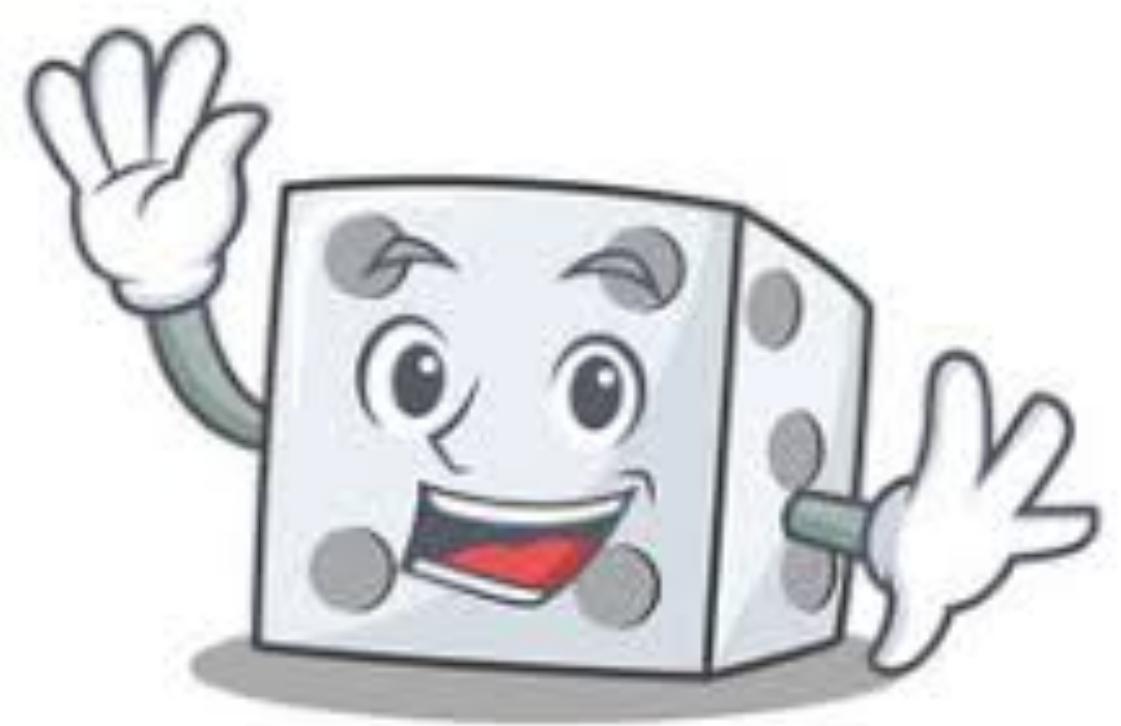


Modelo de  
Machine  
Learning



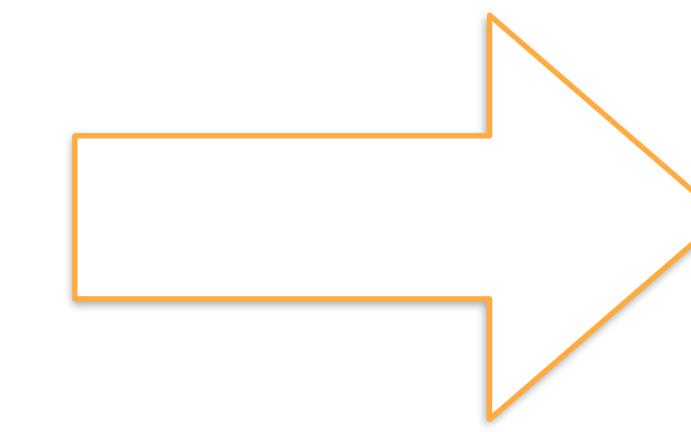
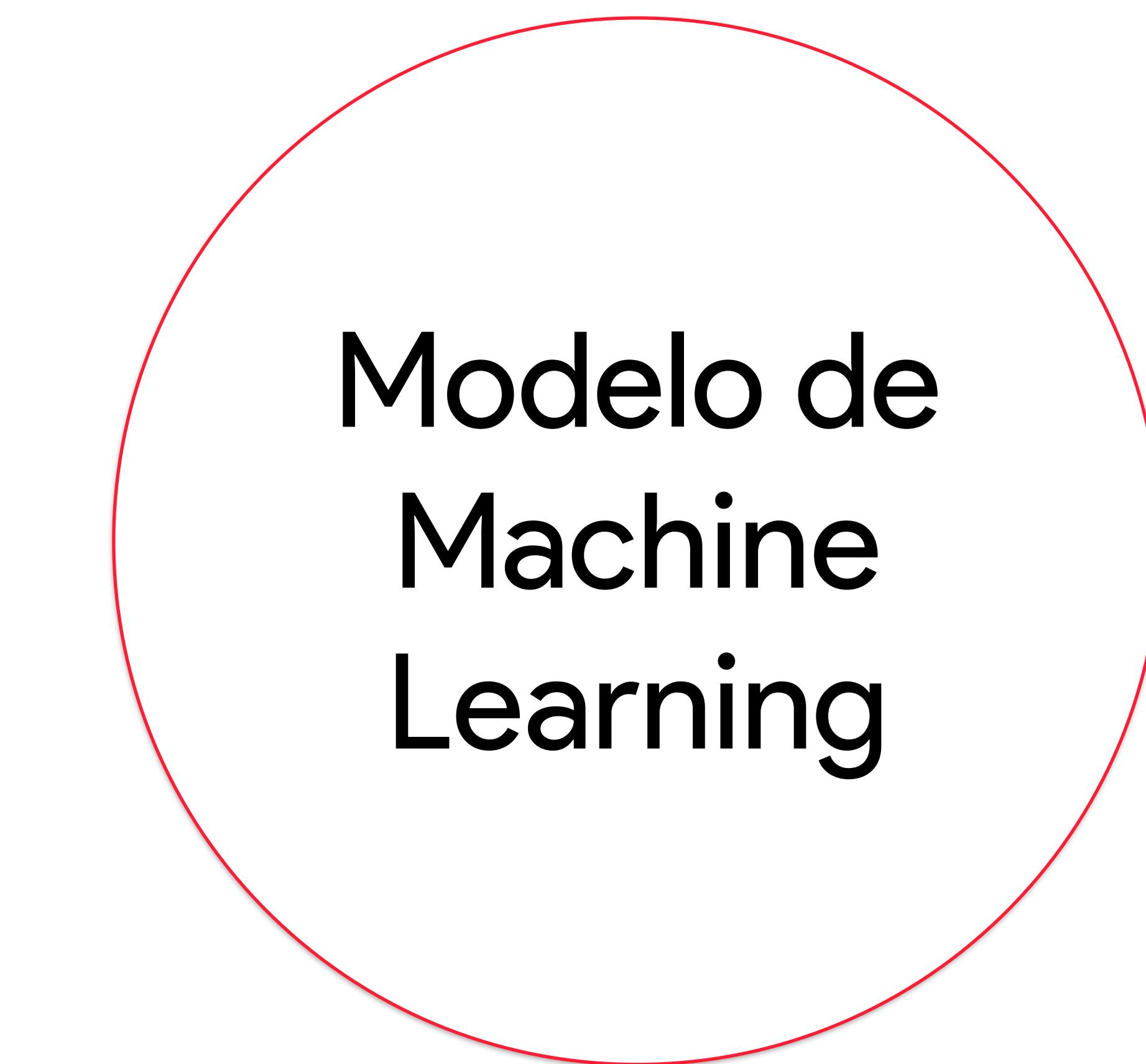
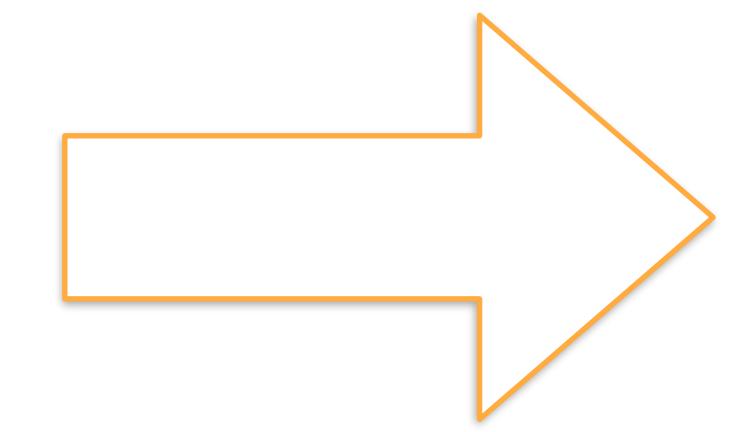
Predição

Que  
dados?



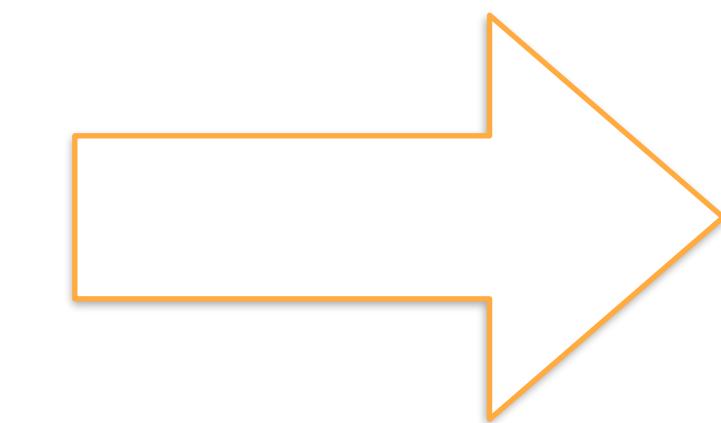
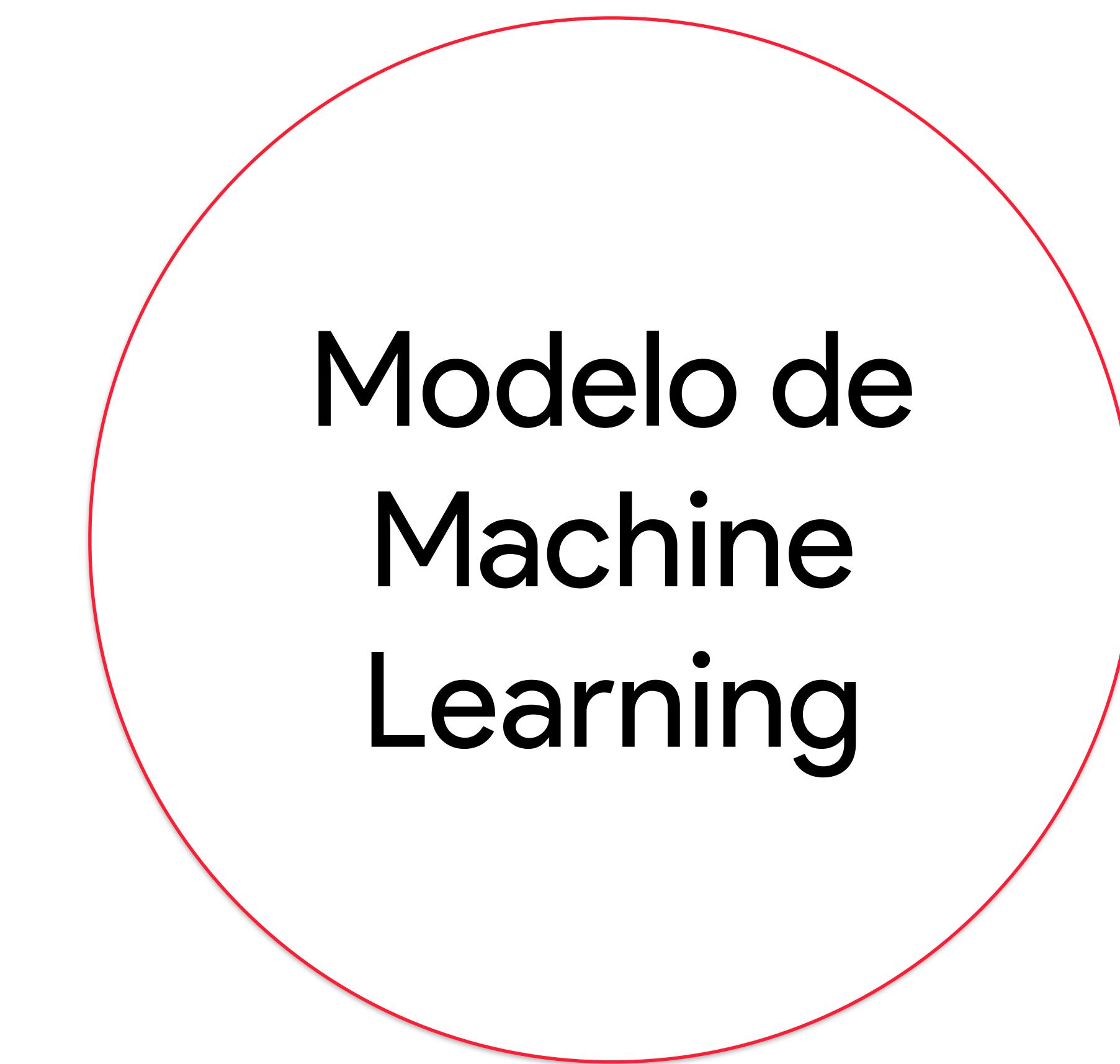
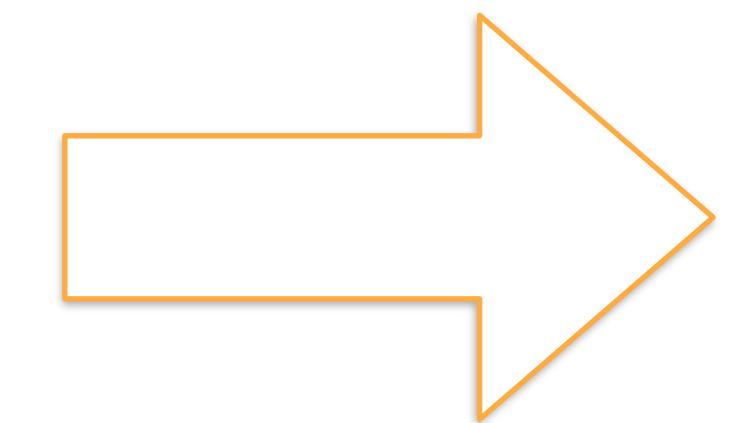
# Que dados?

20min caminhada  
10min descanso  
30min corrida



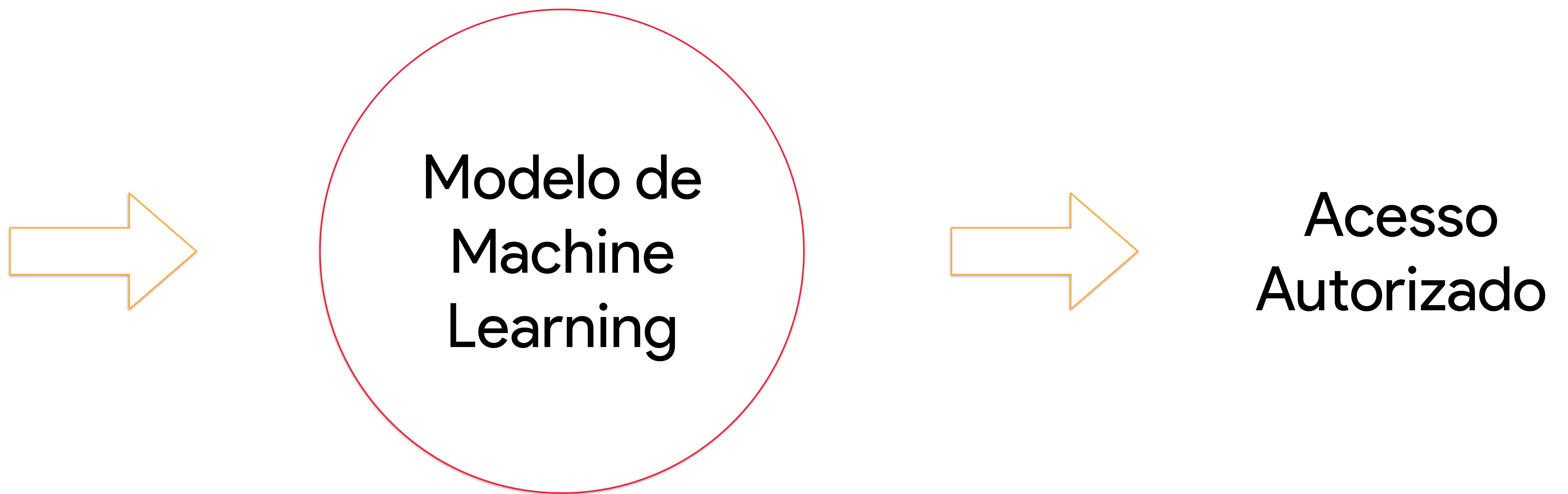
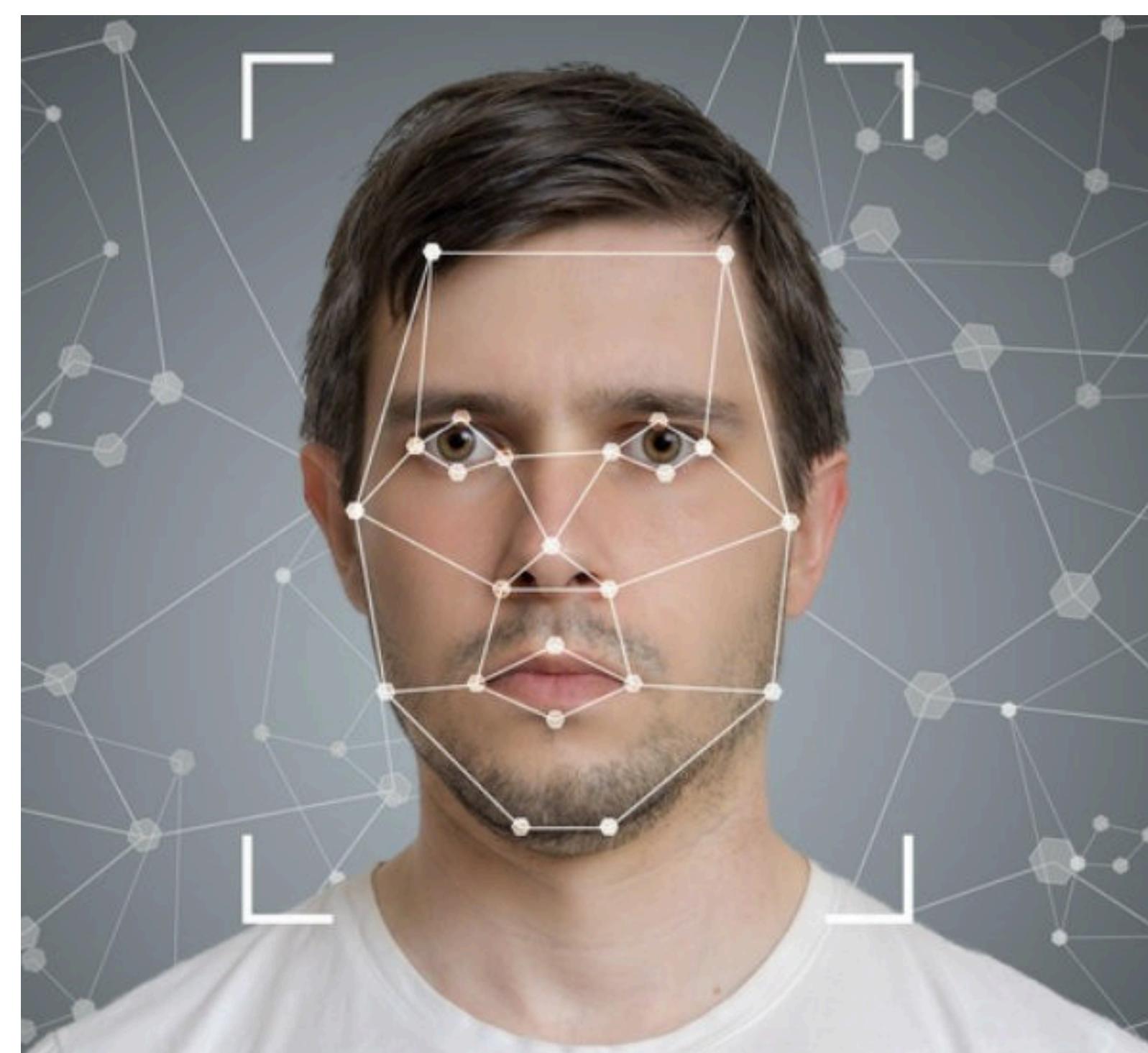
Qualidade  
do Treino

# Que dados?

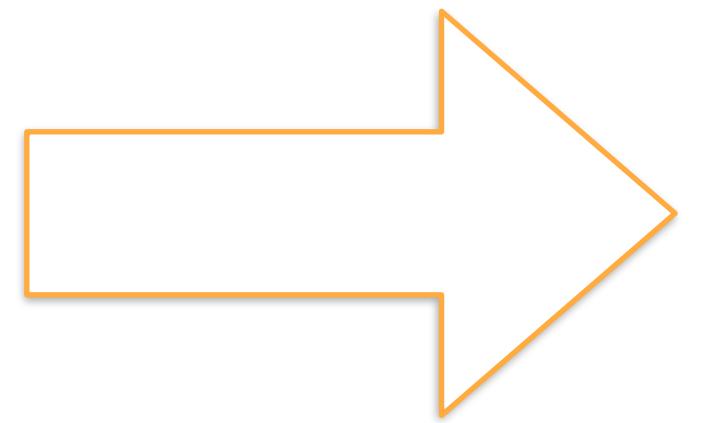
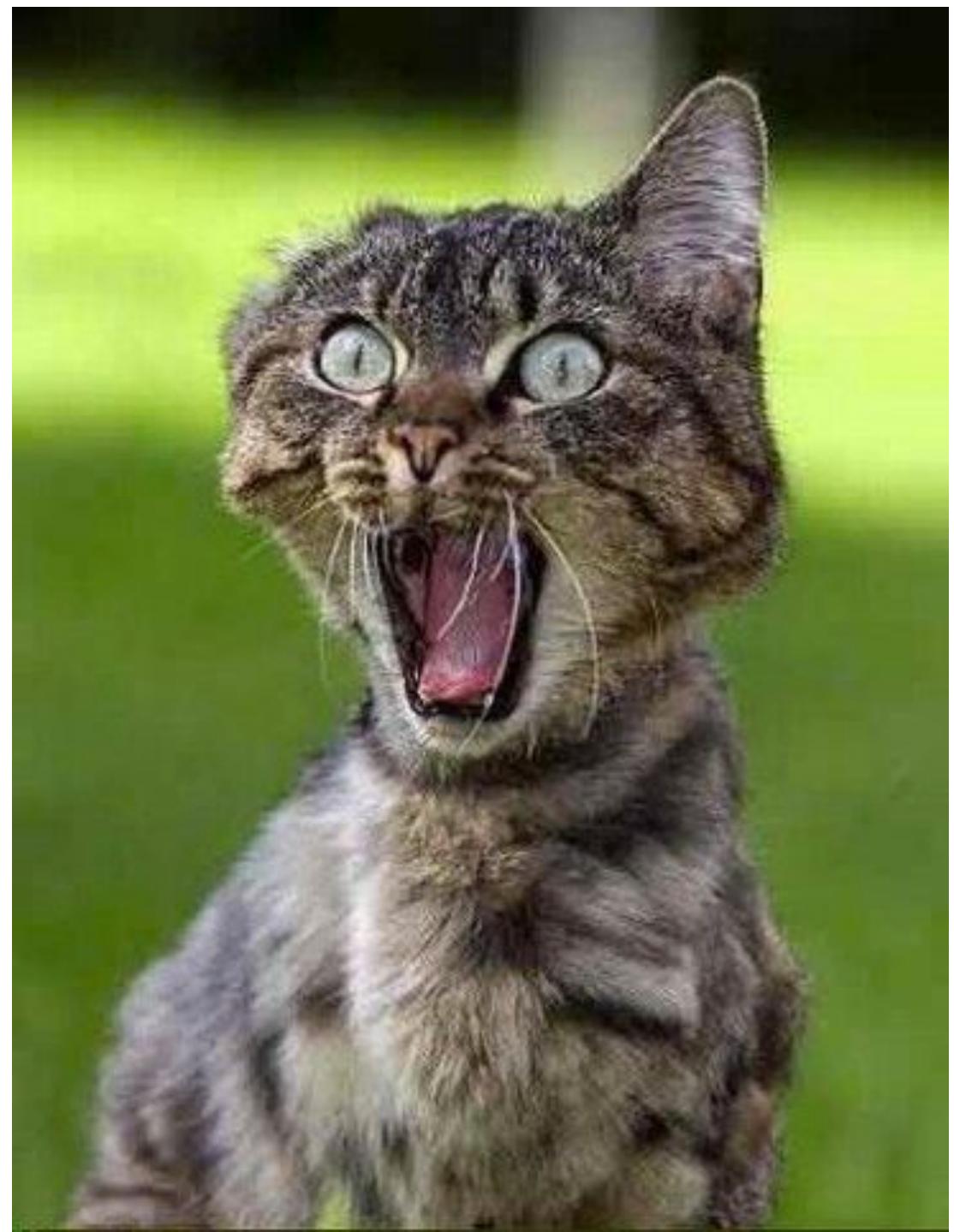


“Ligar Luzes”

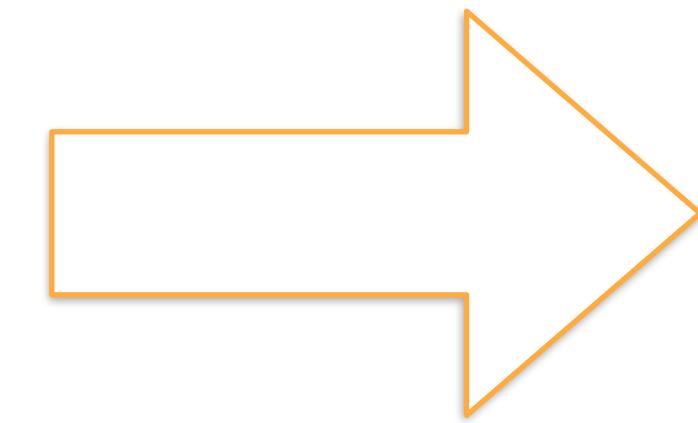
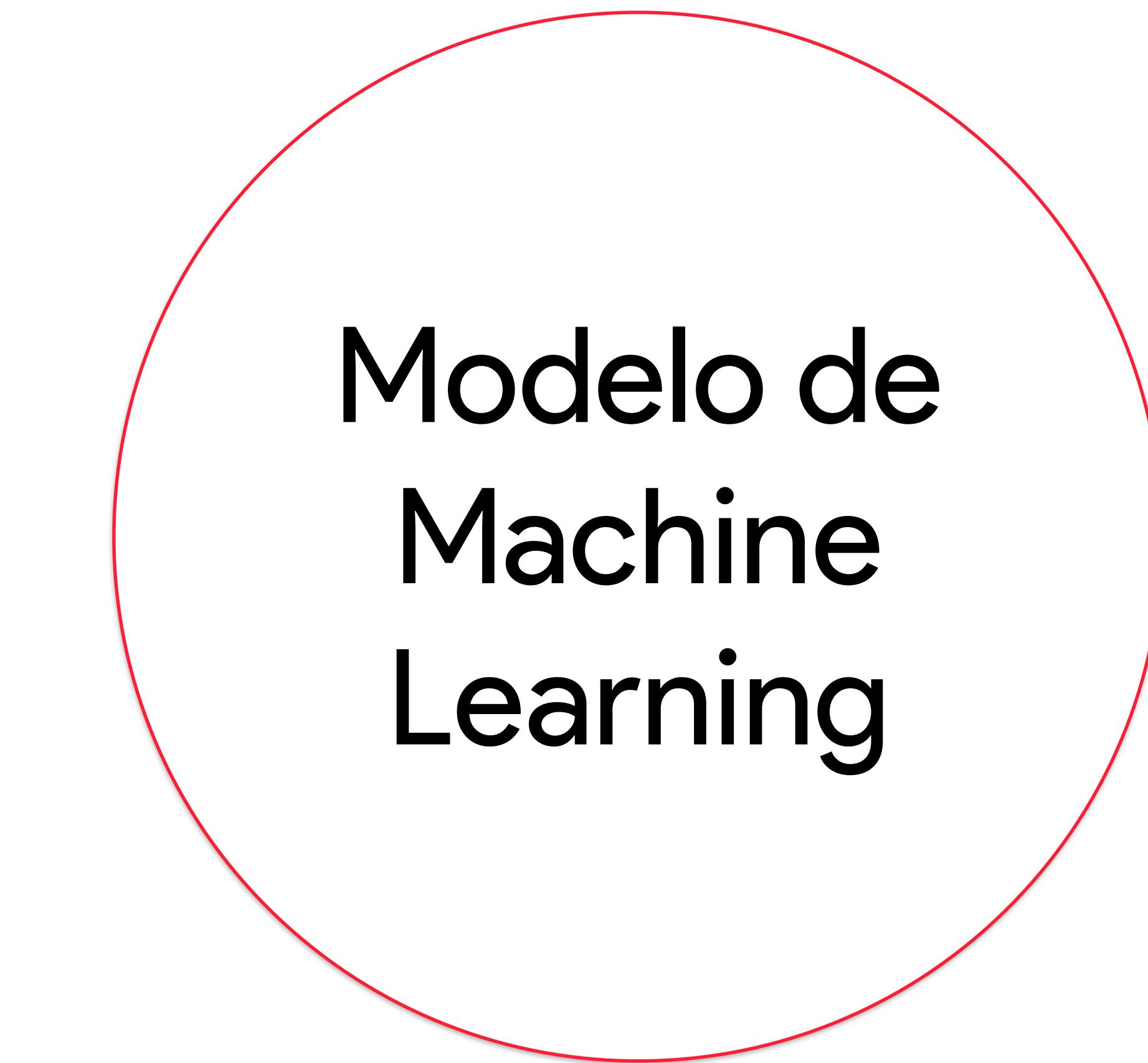
# Que dados?



# Que dados?



Modelo de  
Machine  
Learning



“Gato”



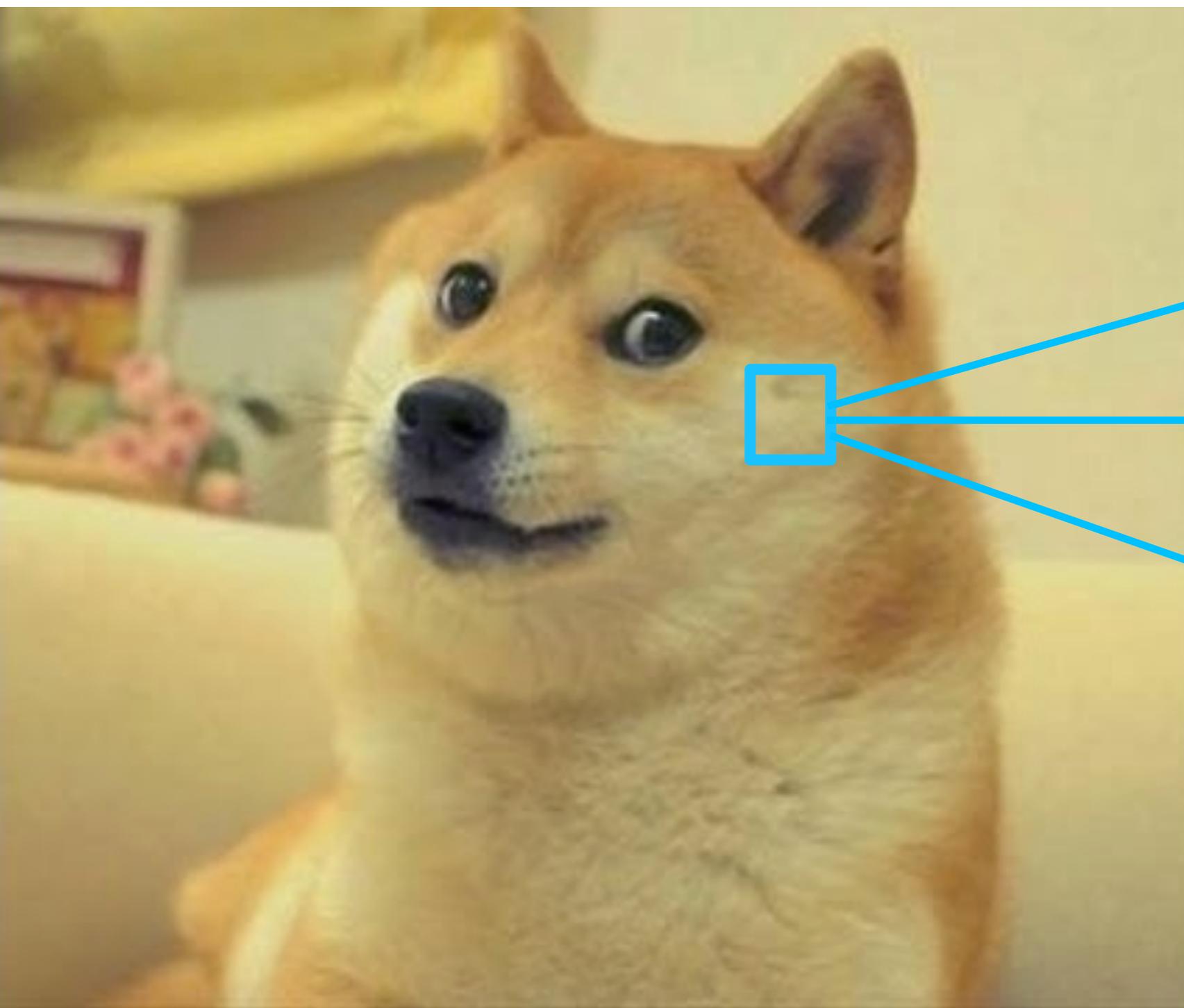
**MAGIC ?**

# Não é Mágica, é Multiplicação de Matrizes

$$\begin{bmatrix} 1 & 2 \\ 3 & 4 \end{bmatrix} * \begin{bmatrix} 2 & 0 \\ 1 & 2 \end{bmatrix} + \begin{bmatrix} 4 & 3 \\ 0 & 1 \end{bmatrix} = \begin{bmatrix} 8 & 7 \\ 10 & 9 \end{bmatrix}$$

entradas \* pesos + bias = prediction

# Todas as entradas são matrizes

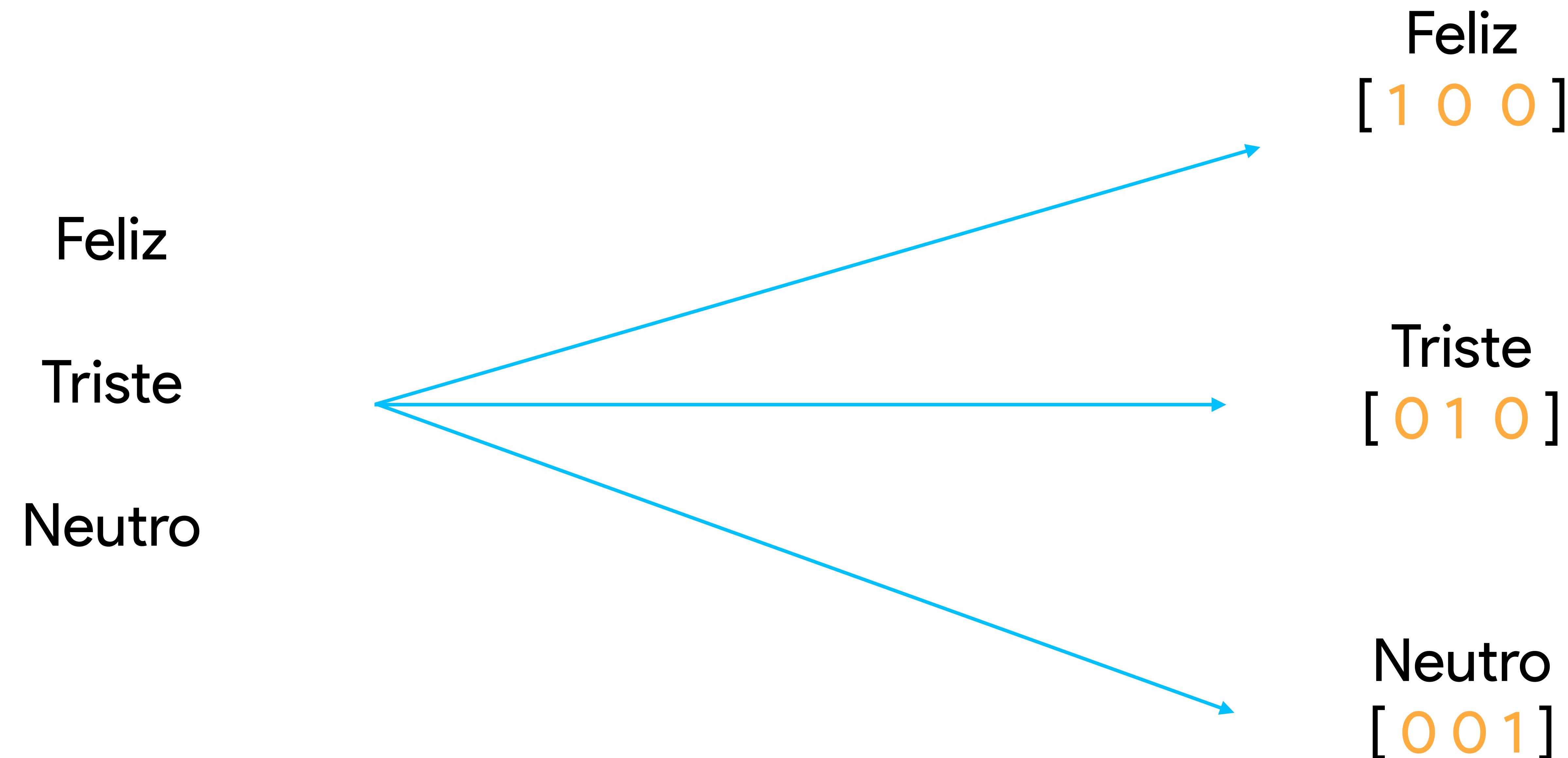


R  
[[ 186 233]  
 [ 91 162]]

G  
[[ 109 201]  
 [ 65 132]]

B  
[[ 123 144]  
 [ 13 128]]

# Todas as entradas são matrizes

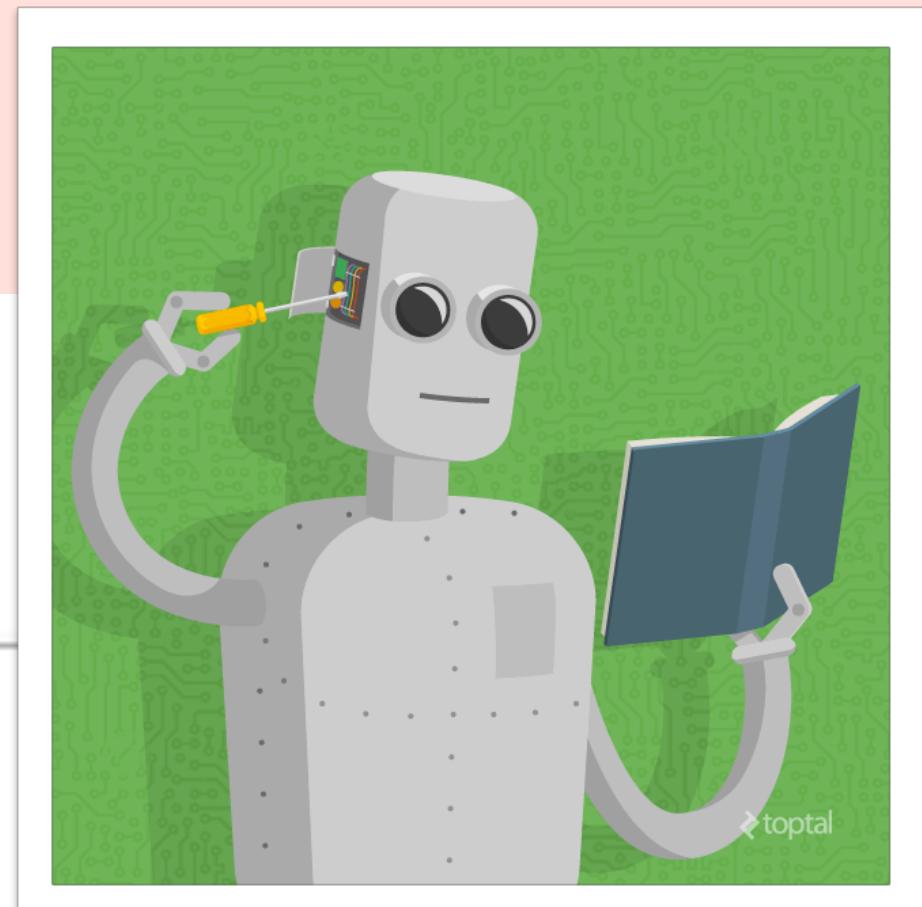


# O que o modelo precisa "aprender"?

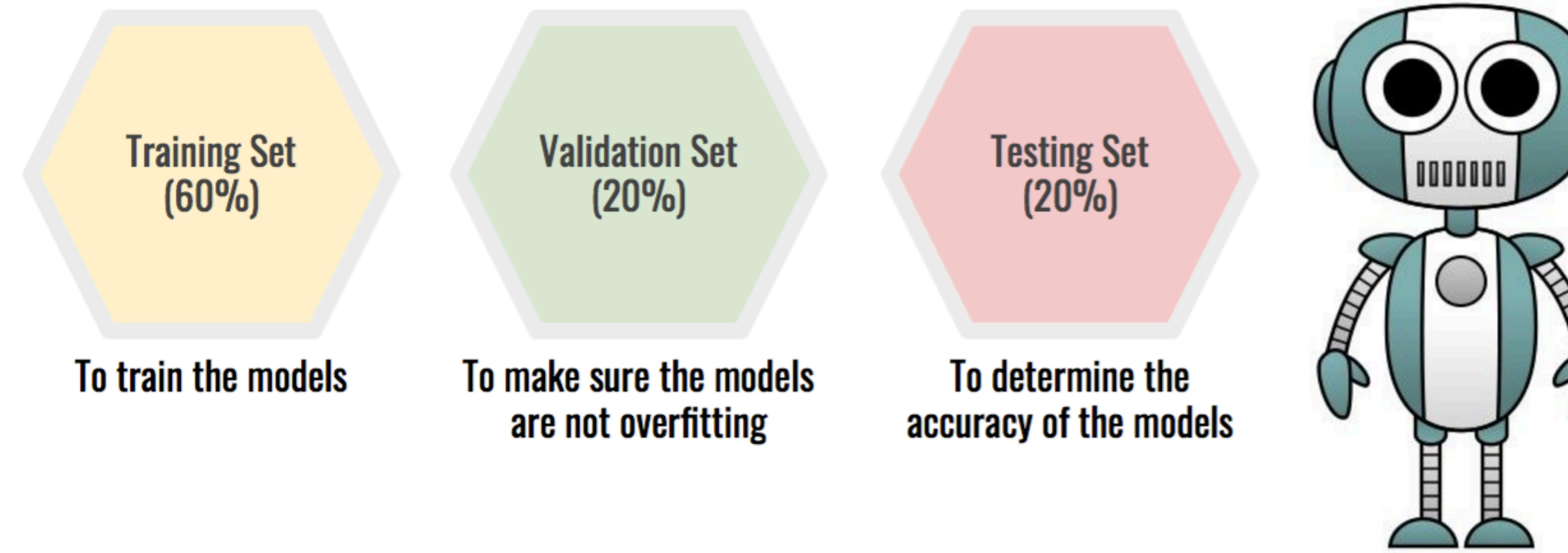
Durante o **Treinamento** é apresentado ao modelo o resultado esperado  
(Aprendizado Supervisionado)

$$\begin{bmatrix} 1 & 2 \\ 3 & 4 \end{bmatrix} * \begin{bmatrix} 2 & 0 \\ 1 & 2 \end{bmatrix} + \begin{bmatrix} 4 & 3 \\ 0 & 1 \end{bmatrix} = \begin{bmatrix} 8 & 7 \\ 10 & 9 \end{bmatrix}$$

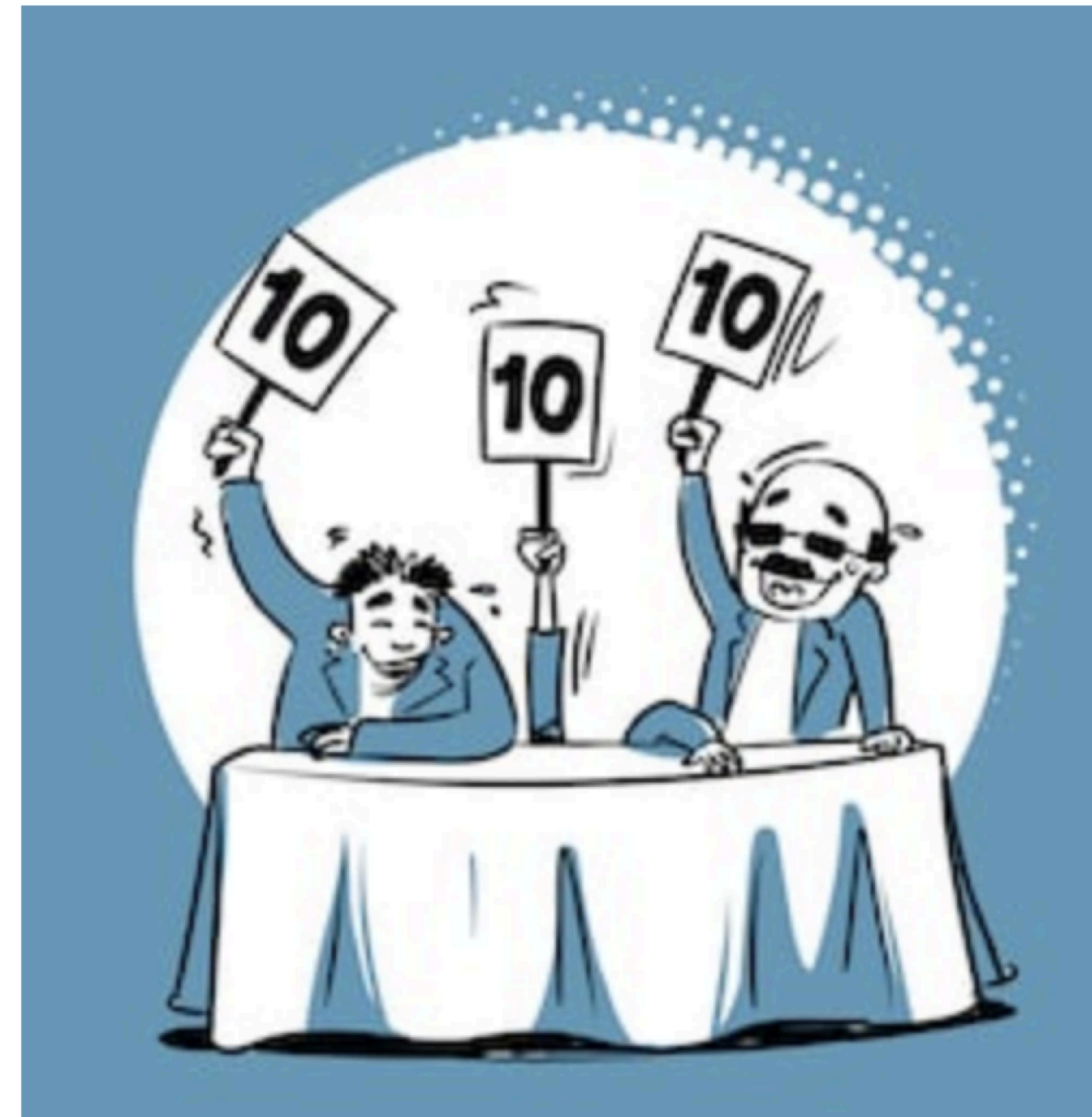
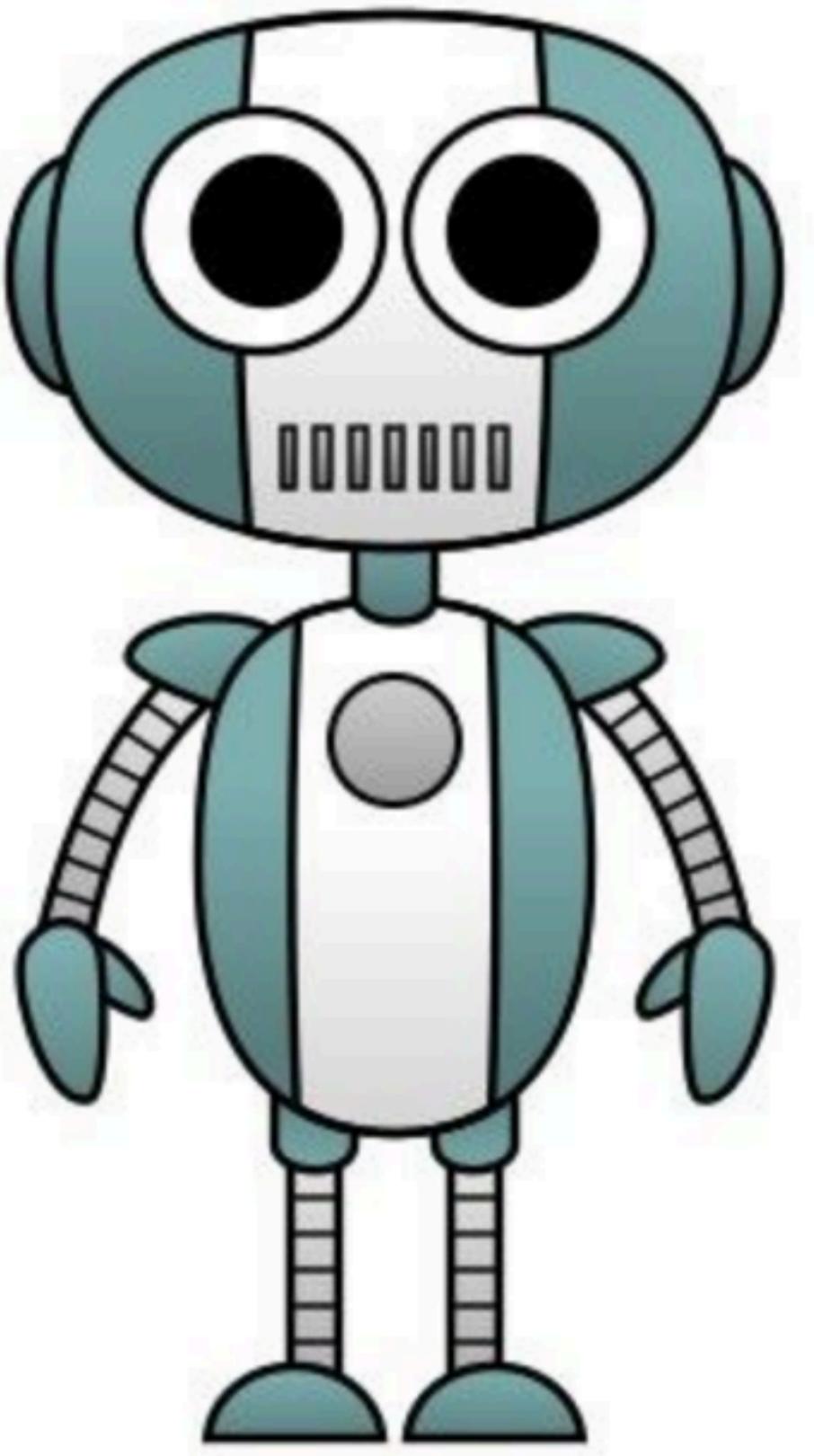
entradas \* pesos + bias = prediction



# Após aprender, o modelo é “Validado” e “Testado”



?!  
?



# Deve-se evitar que o modelo “decore” os dados



<i>Input</i>	<i>Label</i>	<i>Prediction</i>
	CAT	
	NOT CAT	
	CAT	?

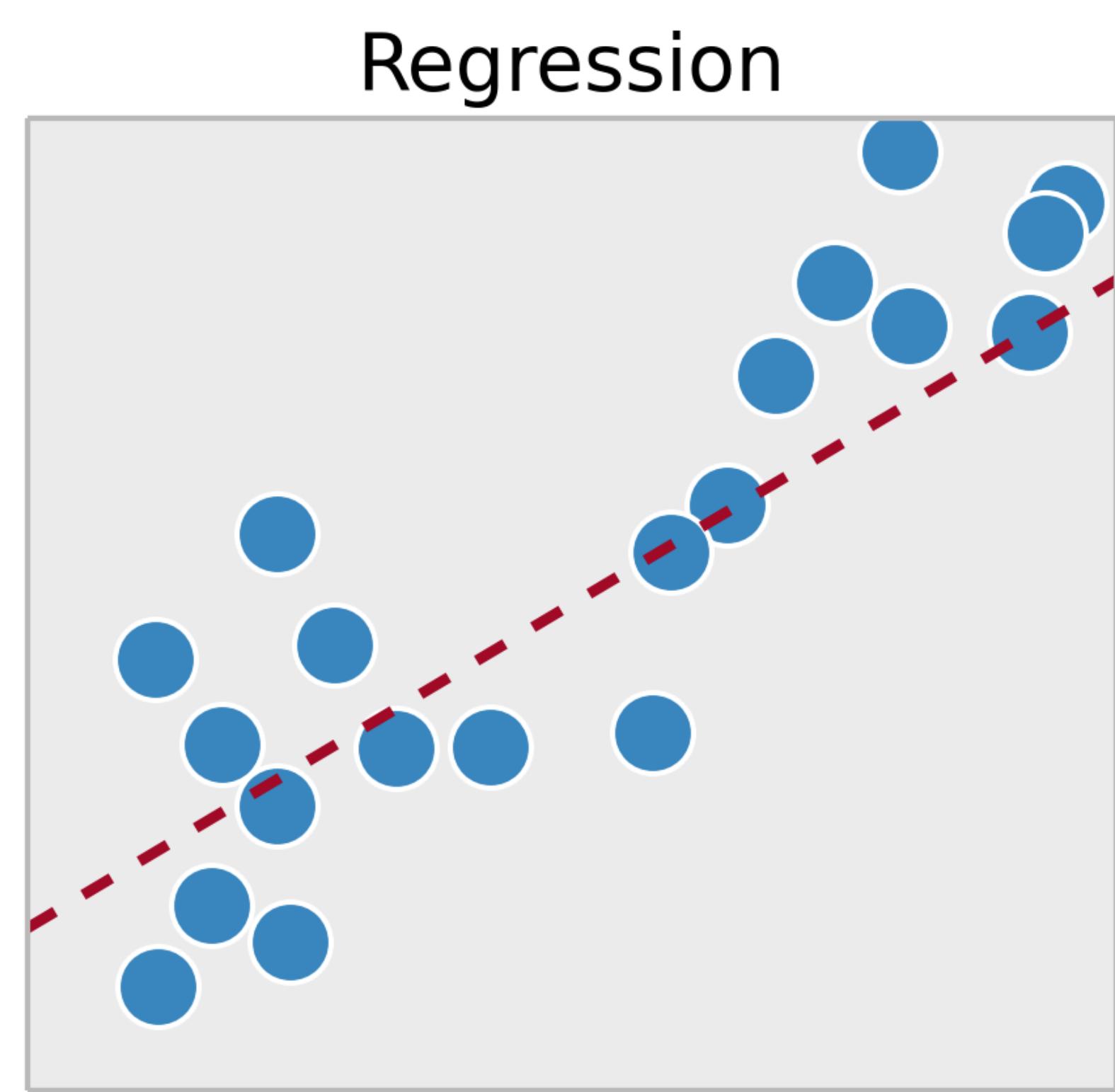
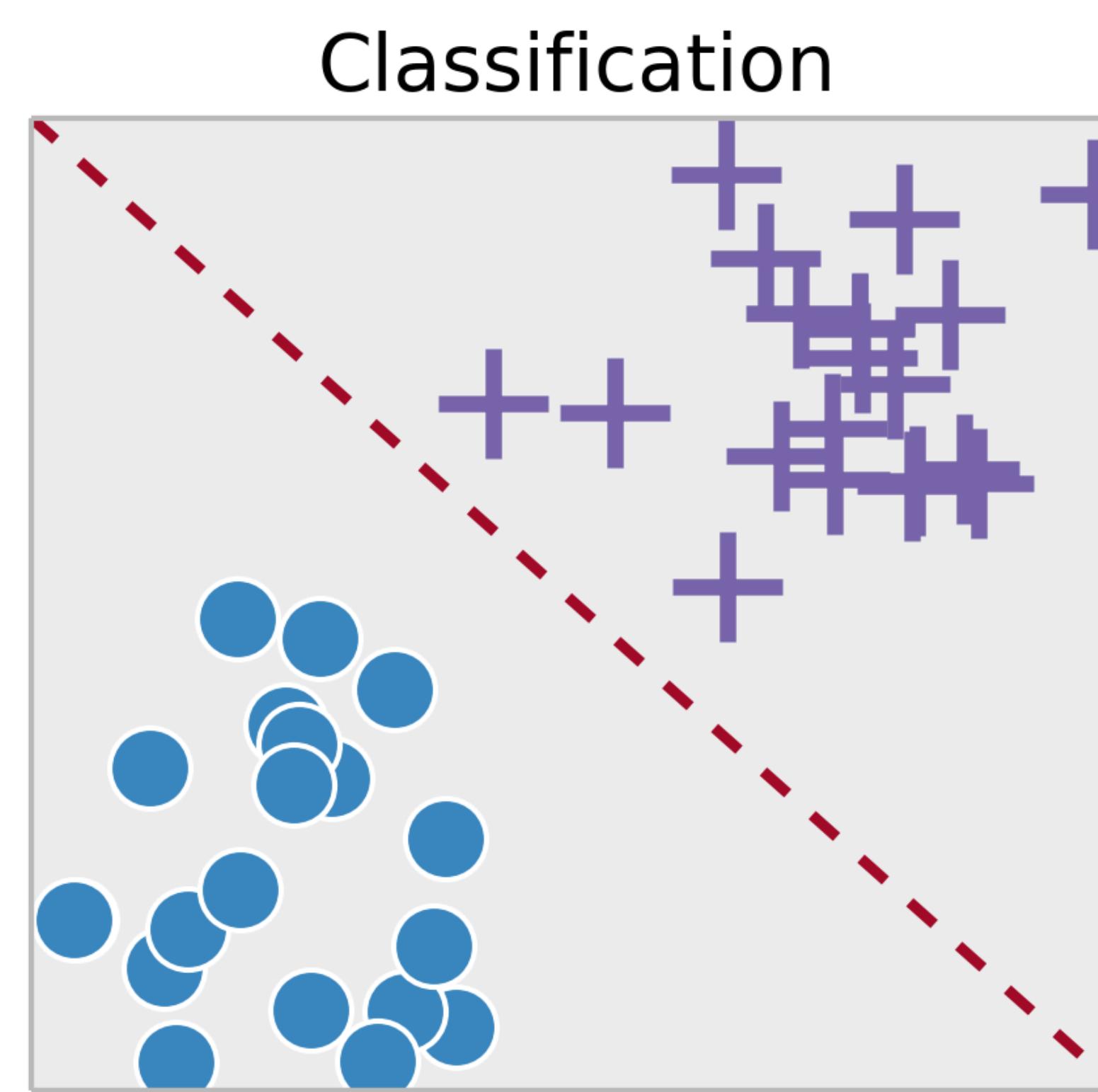


Um modelo de ML bem treinado  
consegue realizar previsões com alto  
nível de acertos mesmo com dados  
que ele nunca tinha visto antes

# Que Modelo Vamos Construir?

- **Regressão:** Dada uma imagem de homem/mulher, temos de prever sua idade com base em dados da imagem

- **Classificação:** Dado um exemplo de tumor cancerígeno, temos de prever se ele é benigno ou maligno através do seu tamanho e idade do paciente



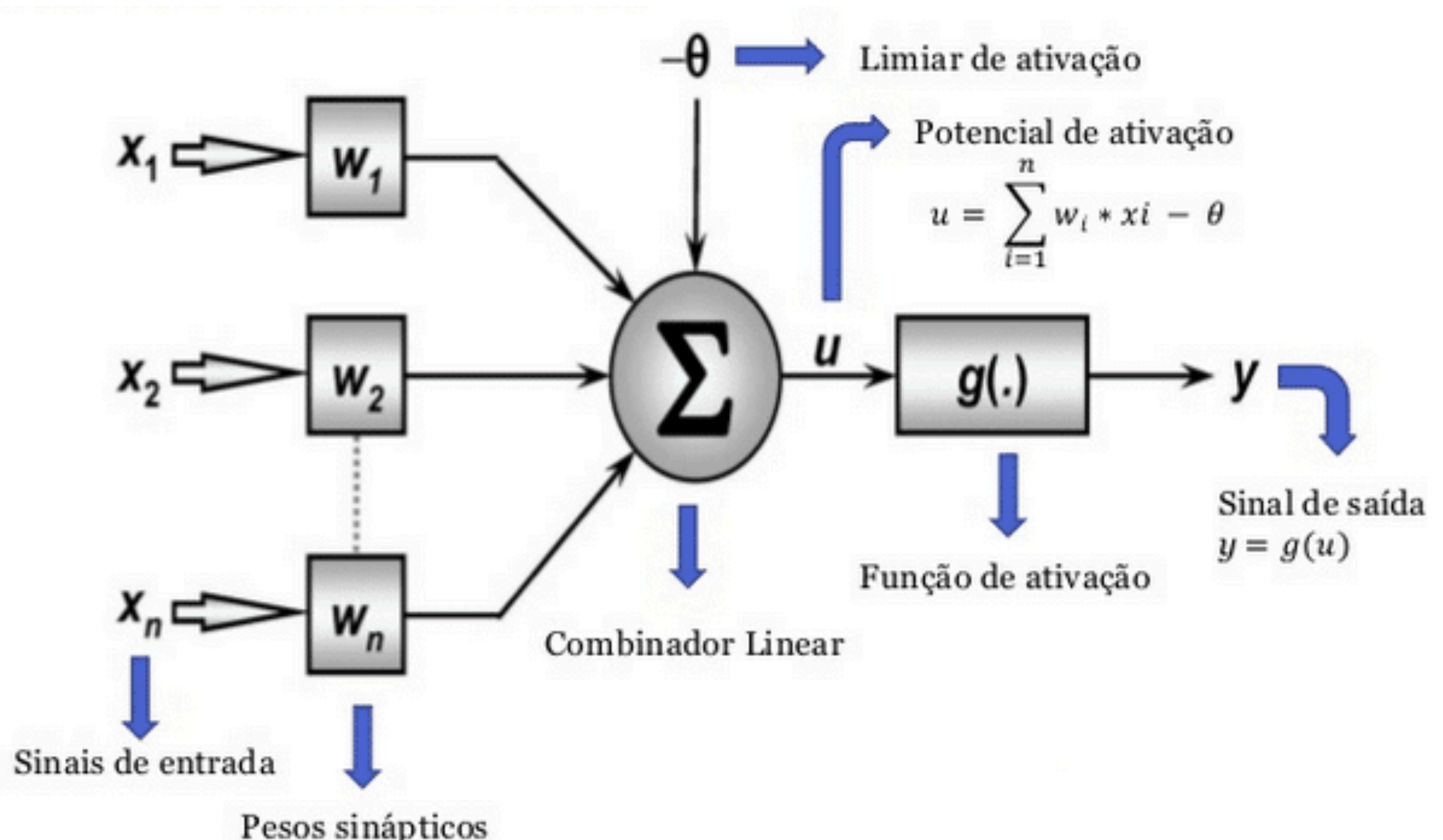
# Termos que precisamos entender...

## Características

Sepal length	Sepal width	Petal length	Petal width	Rótulo
5.1	3.5	1.4	0.2	Iris flower
4.9	3.0	1.4	0.2	Setosa
4.7	3.2	1.3	0.2	Setosa
4.6	3.1	1.5	0.2	Setosa
5.0	3.6	1.4	0.2	Setosa
5.4	3.9	1.7	0.4	Setosa

Iris data set

# Entendendo um neurônio artificial



$$u = \sum_{j=1}^n w_j \cdot x_j - \theta$$

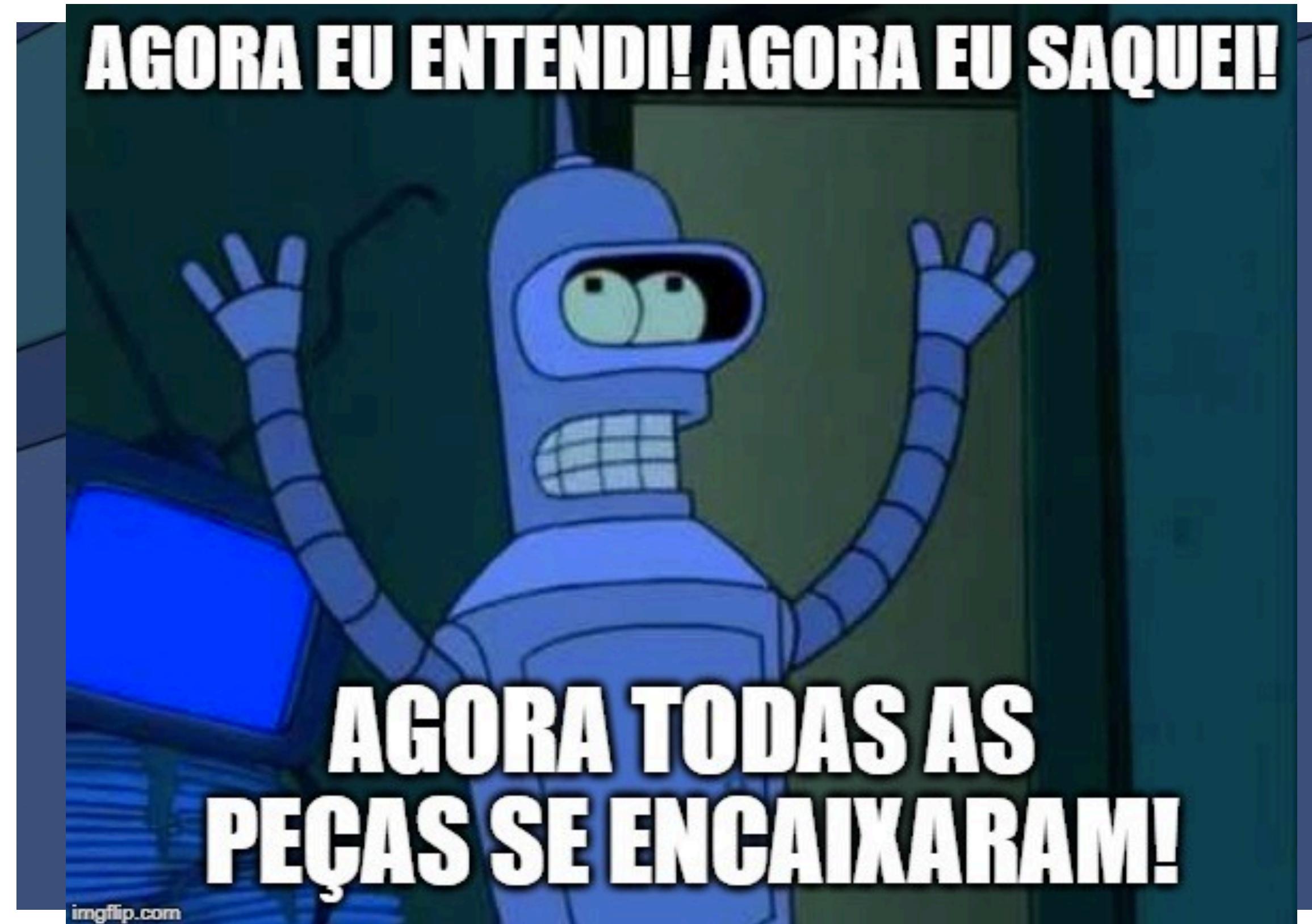
$$y = g(u)$$



$$u = \sum_{i=1}^n w_i \cdot x_i - \theta$$

$$y = g(u)$$

$$u = (w_1 * x_1 - b) + (w_2 * x_2 - b) \dots$$

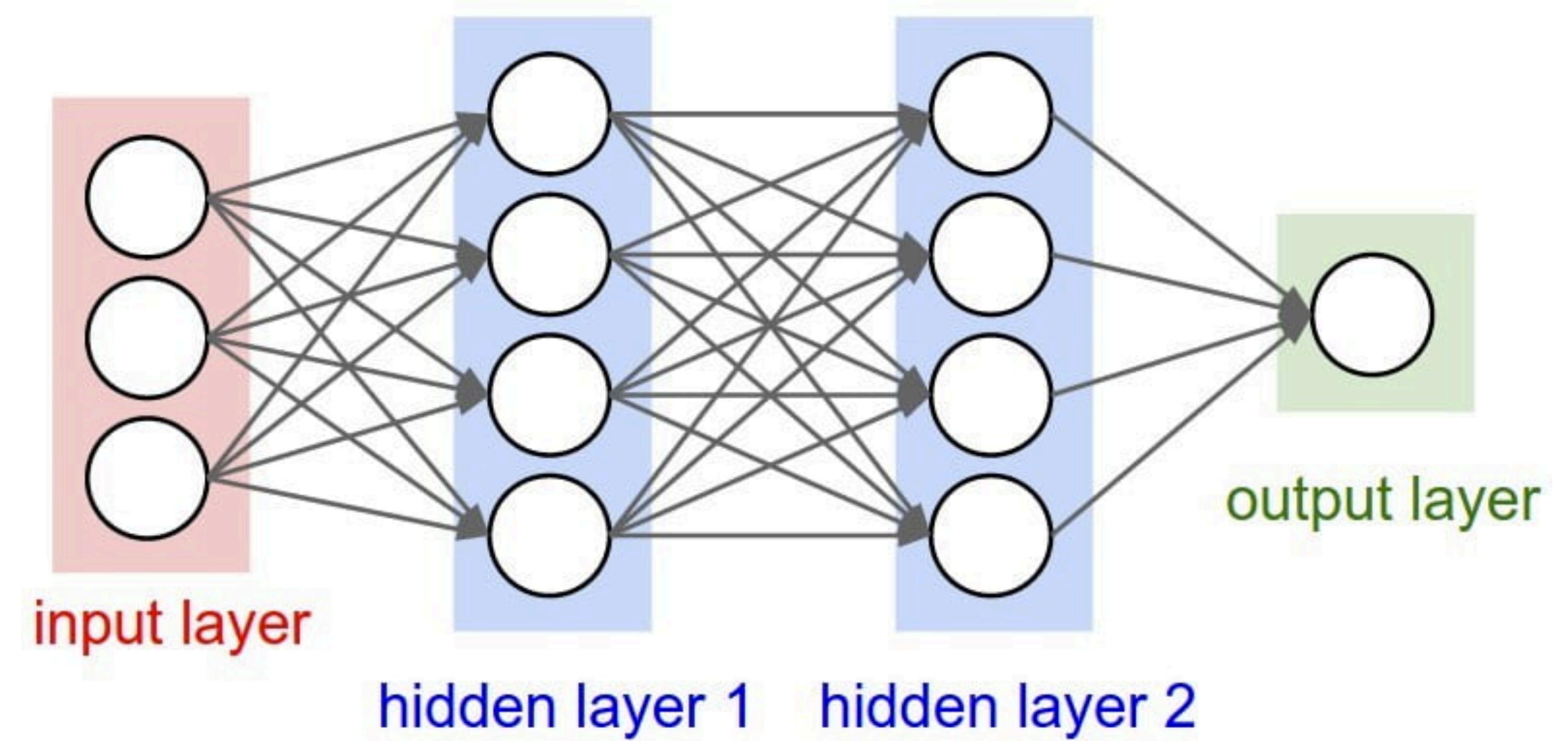
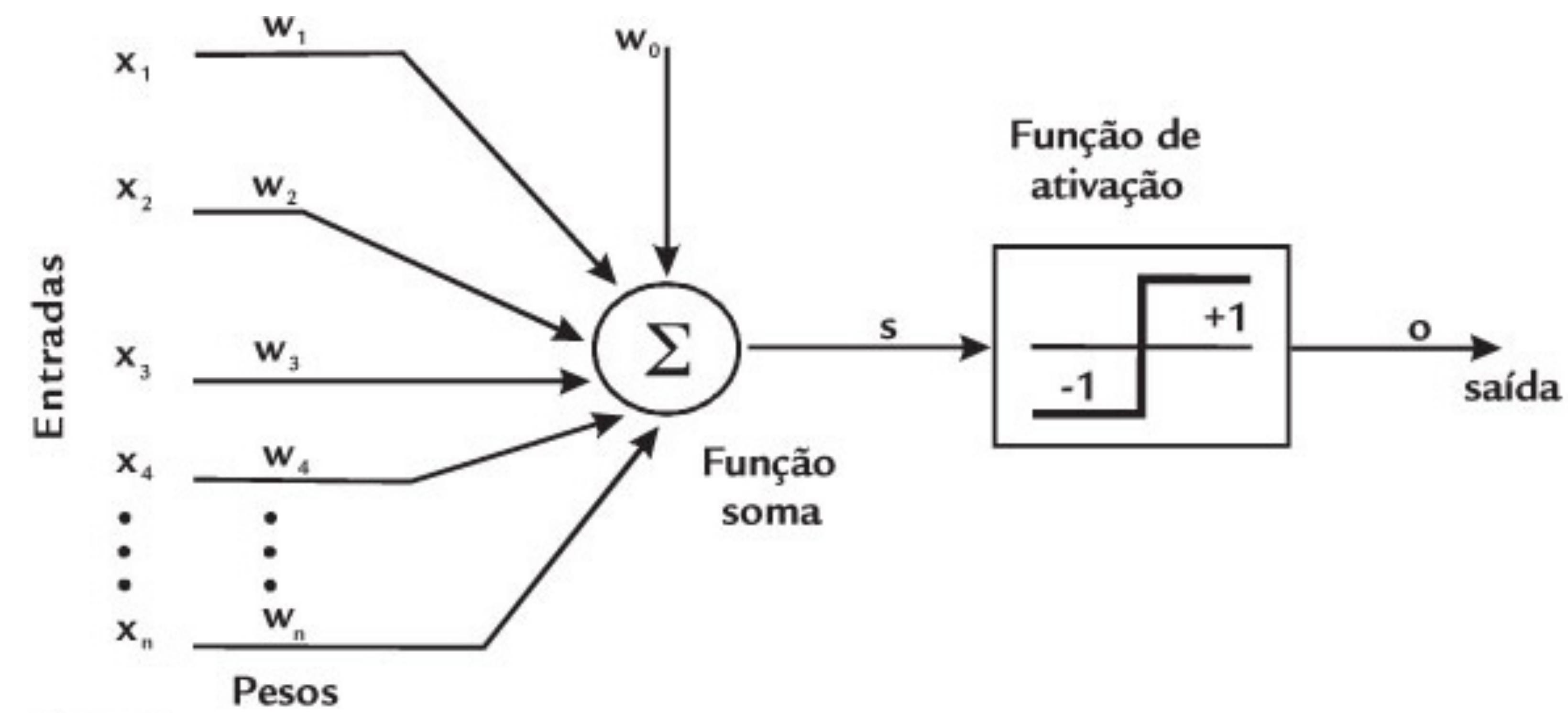


$$\sum x_n \cdot w_n - b = u$$

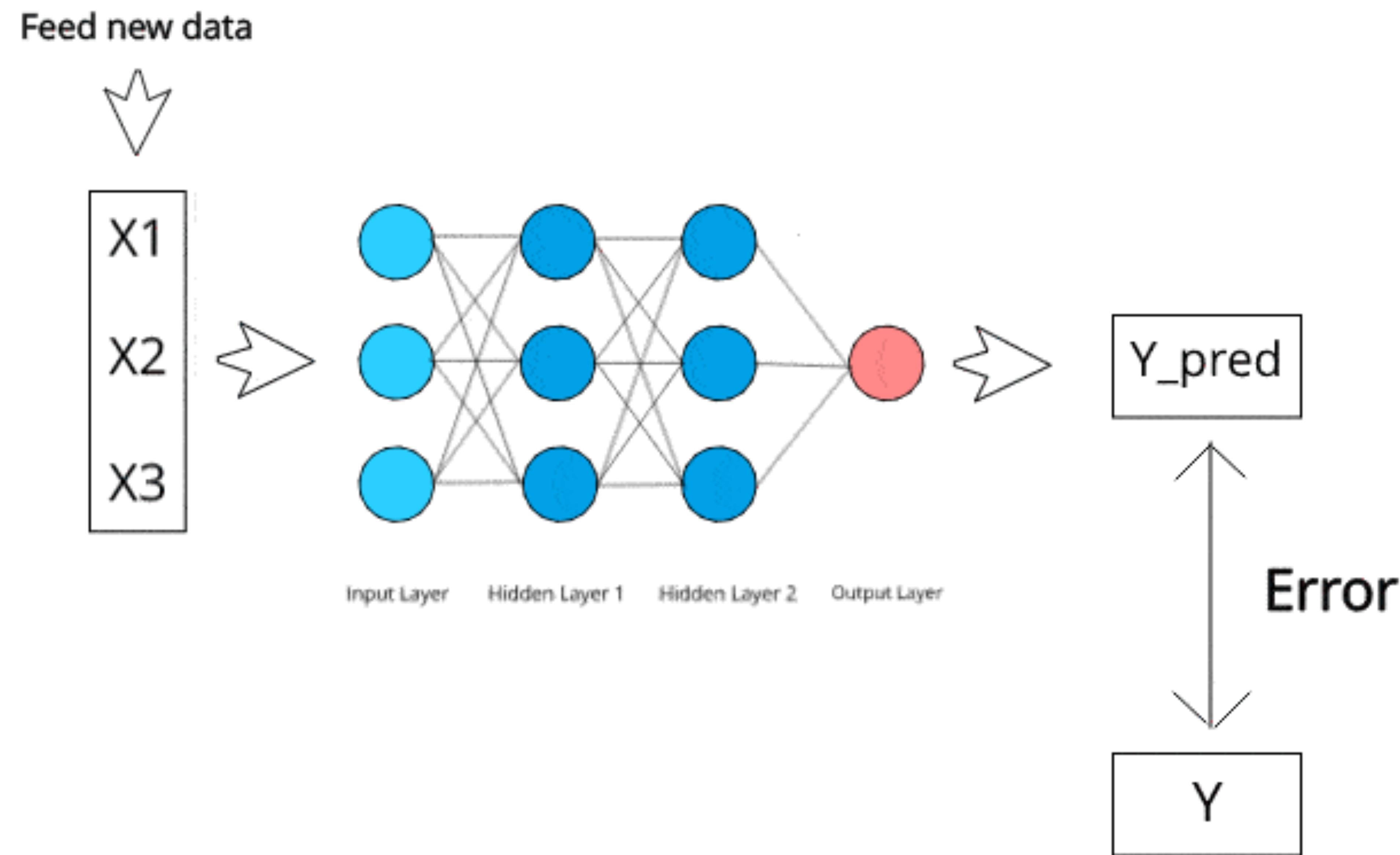
$$\sum \begin{bmatrix} 1 & 2 \\ 3 & 4 \end{bmatrix} * \begin{bmatrix} 2 & 0 \\ 1 & 2 \end{bmatrix} - \begin{bmatrix} 4 & 3 \\ 0 & 1 \end{bmatrix} = \begin{bmatrix} 8 & 7 \\ 10 & 9 \end{bmatrix}$$

entradas \* pesos - bias = prediction

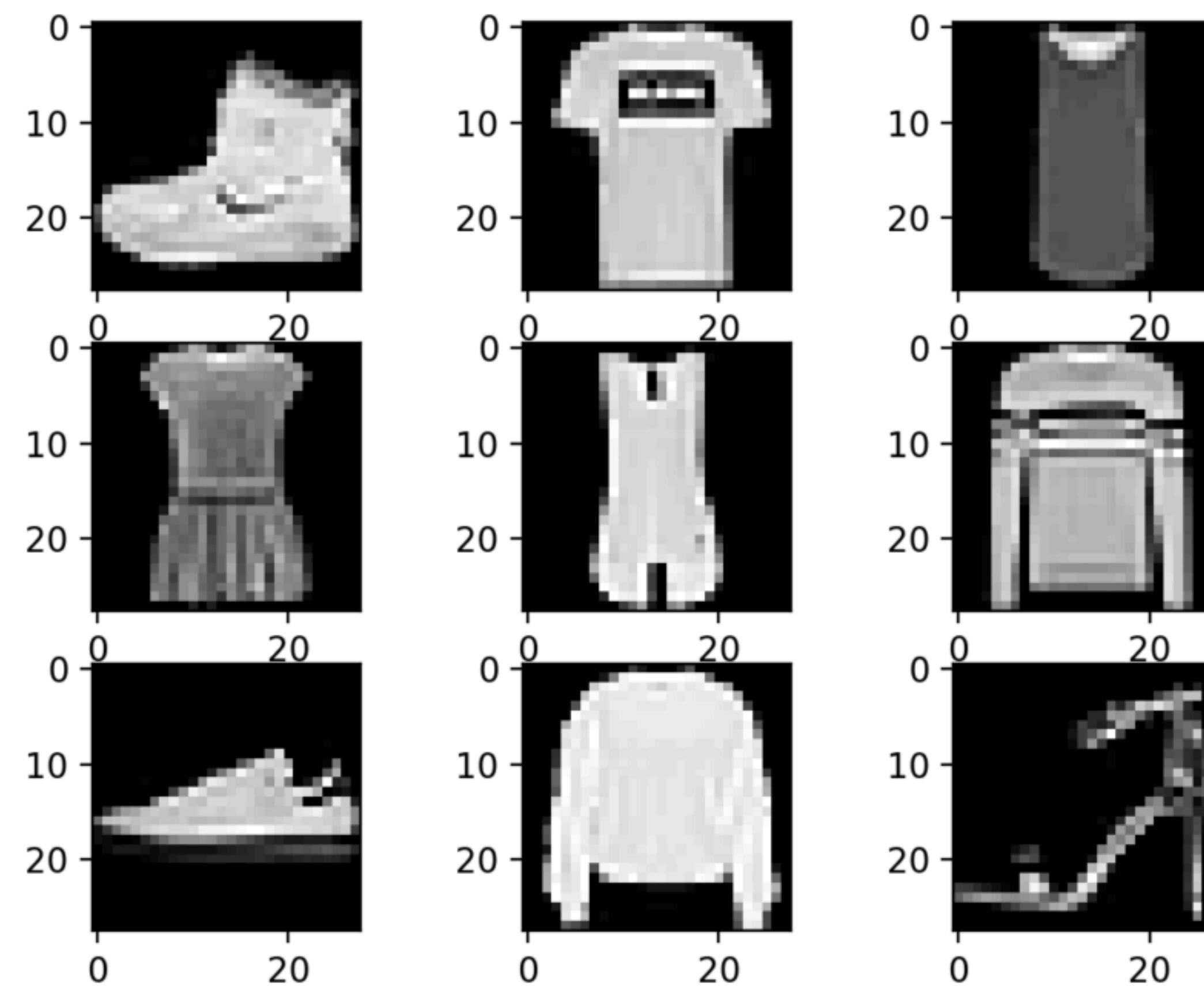
# De um neurônio para uma rede neural



# Ajustando pesos nos treinamentos



# Construindo uma rede neural para classificação de moda



A base de dados **Fashion MNIST** contém 70.000 imagens em tons de cinza em 10 categorias.

As imagens mostram artigos individuais de roupas com baixa resolução (28 por 28 pixels)

# Como construir esses modelos?

- Utilizaremos linguagem **Python**
- Bibliotecas Python (Pandas, Matplot, Scikit Learning)
- Framework **TensorFlow 2.0**
- Notebook **Jupyter (Colab)**







#devfest19

#devfestcerrado

#dfc

# Dúvidas?

## Construindo um Modelo de Machine Learning do Zero



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Essa apresentação e código notebook produzido encontram-se disponível em:  
[github.com/smoreira](https://github.com/smoreira)