Short Takes 331

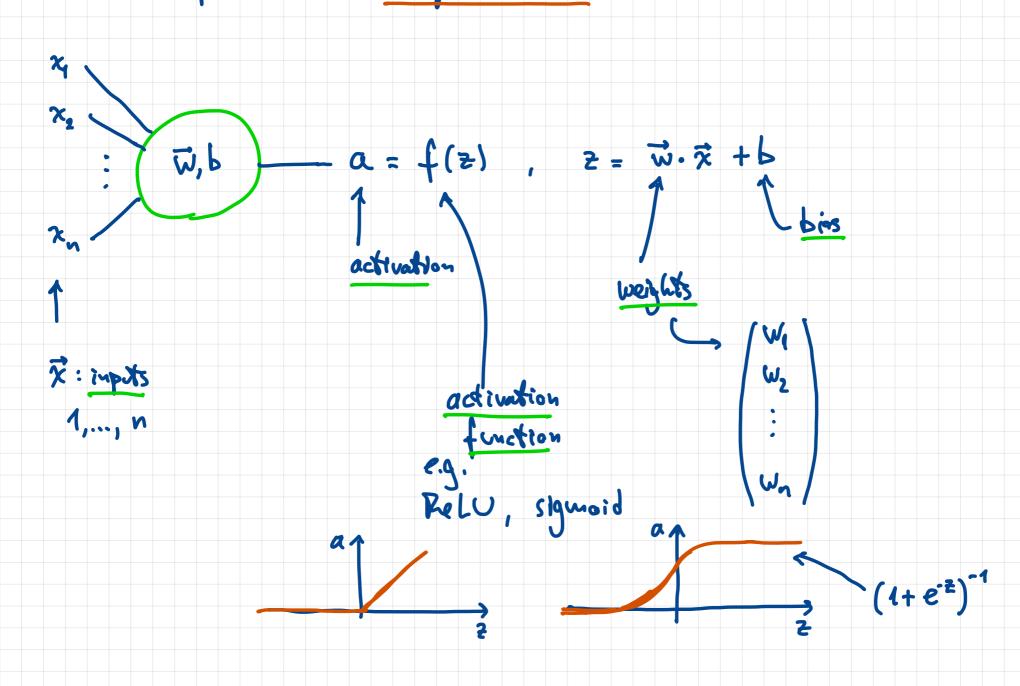
Machine learning and linear algebra



Machine learning & linear algebra

At its basic level, ML is about training a compiler program to identify be predict pothers.

This is accomplished via artificial neural networks, which are collections of interlinked artificial neurons...



If we have many neurons ...

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Note: same input à Me won S. Use matrix-vector multiplication. In practèce... many layers !\
(hidden) 至(1) = W(2)及(4) + 【(2) 3(1)= W(1) x + B(1) $\vec{a}^{(L)}$ $\mathcal{Q}_{(1)} = \{(\Sigma_{(1)})$ $\vec{\alpha}^{(2)} = \int \left(\vec{z}^{(2)}\right)$ Way is Nxn W(2) is MxN 又 is size w **見(2)**, 元(2) is size M 及(1), 至(1) is size N $\vec{a}^{(4)} = \{(\dots$ $f(\omega^{(2)}f(\omega^{(4)}\vec{x}+\vec{b}^{(4)})+\vec{b}^{(2)})+\vec{b}^{(3)}...)$

The weights & biases define the neural network (along with f).
They are fit to minimize a given cost function on training data.

The process of oppinizing these parameters is where "learning" happens and usually involves stochaston gradient descent.