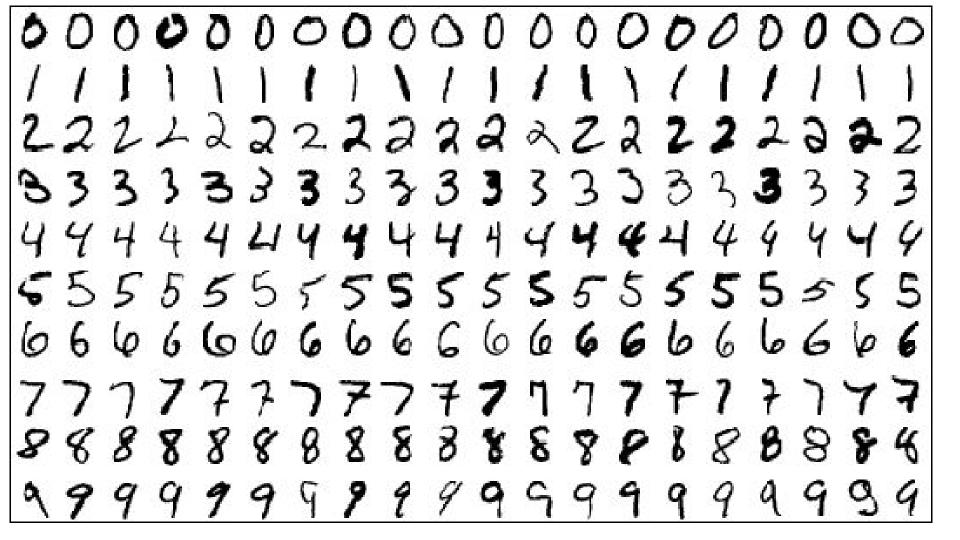
Keras Demo

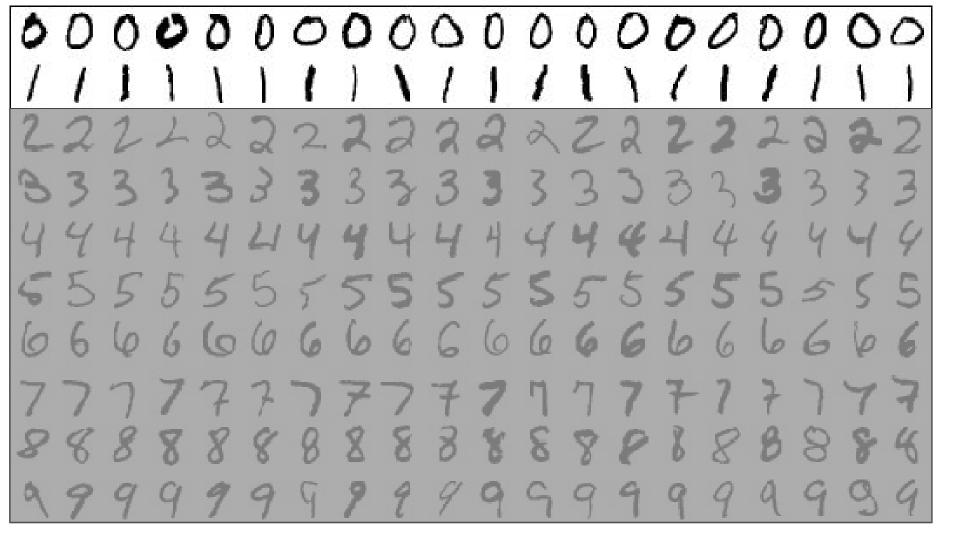
What is Keras?

Keras

- Python library for deep learning
- TensorFlow

MNIST





Multi-class classification

"One v. All" Classification

"One v. All" Classification

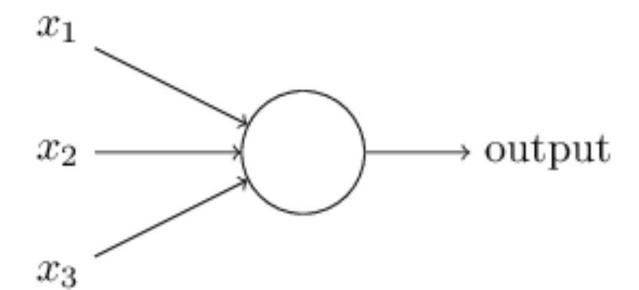
Training: 10 binary classifier "0" or "not 0" classifier "1" or "not 1" classifier, etc

"One v. All" Classification

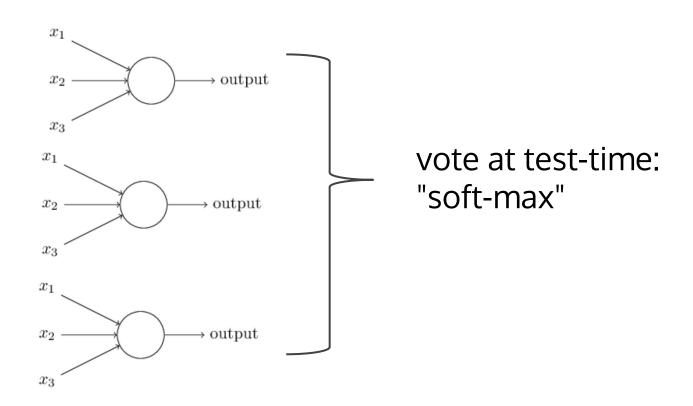
Training: 10 binary classifier "0" or "not 0" classifier "1" or "not 1" classifier, etc

Testing: each classifier votes "0" or "not 0" classifier ----> votes NO! "1" or "not 1" classifier ----> votes **YES!**

Binary Classifier

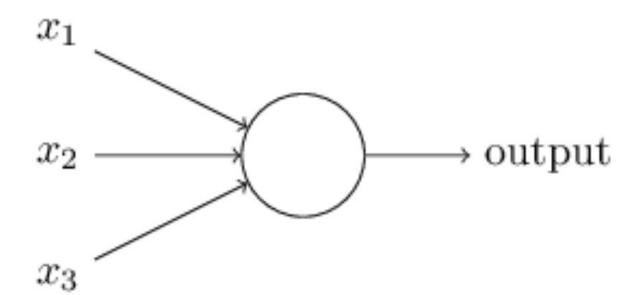


Many Classifiers



Neural Networks

Neural Networks



Activation Function

"Sign Activation Function"

$$\mathbf{y}_i \ \mathbf{w}^\mathsf{T} \mathbf{x}_i \leq \mathbf{1} \iff \operatorname{sign}(\mathbf{y}_i \mathbf{w}^\mathsf{T} \mathbf{x}_i)$$

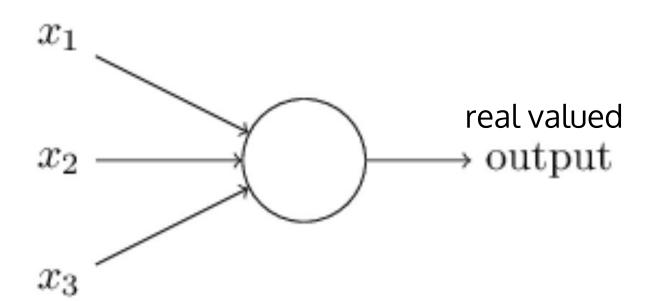
Activation Function

"Sign Activation Function"

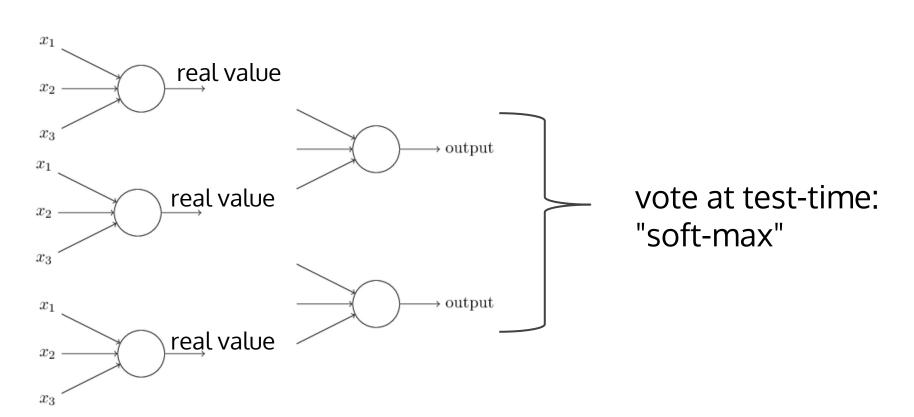
$$\mathbf{y}_i \ \mathbf{w}^\mathsf{T} \mathbf{x}_i \leq \mathbf{1} \iff \mathrm{sign}(\mathbf{y}_i \mathbf{w}^\mathsf{T} \mathbf{x}_i)$$

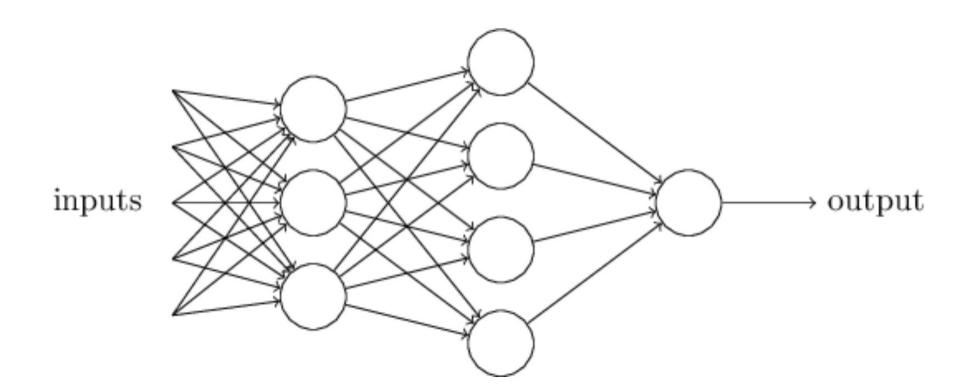
"Relu Activation Function" $max(0, y_i w^T x_i)$

Neural Networks

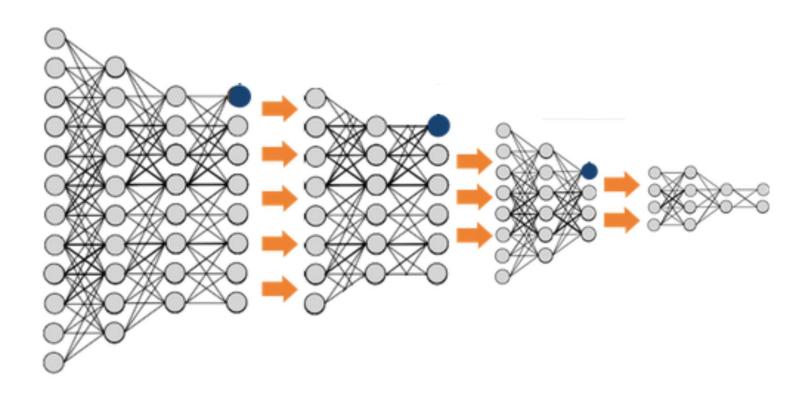


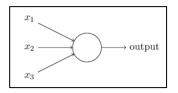
Many Classifiers

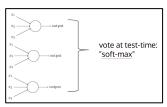


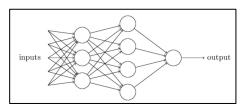


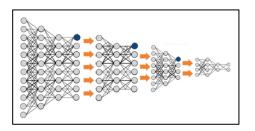
Deep Learning: "Deep" Neural Networks











Demo Outline

- 1. Binary classification
- 2. Multiclass classification
- 3. A simple NN
- 4. A deeper NN
- 5. Fancy NN's that get much better accuracy