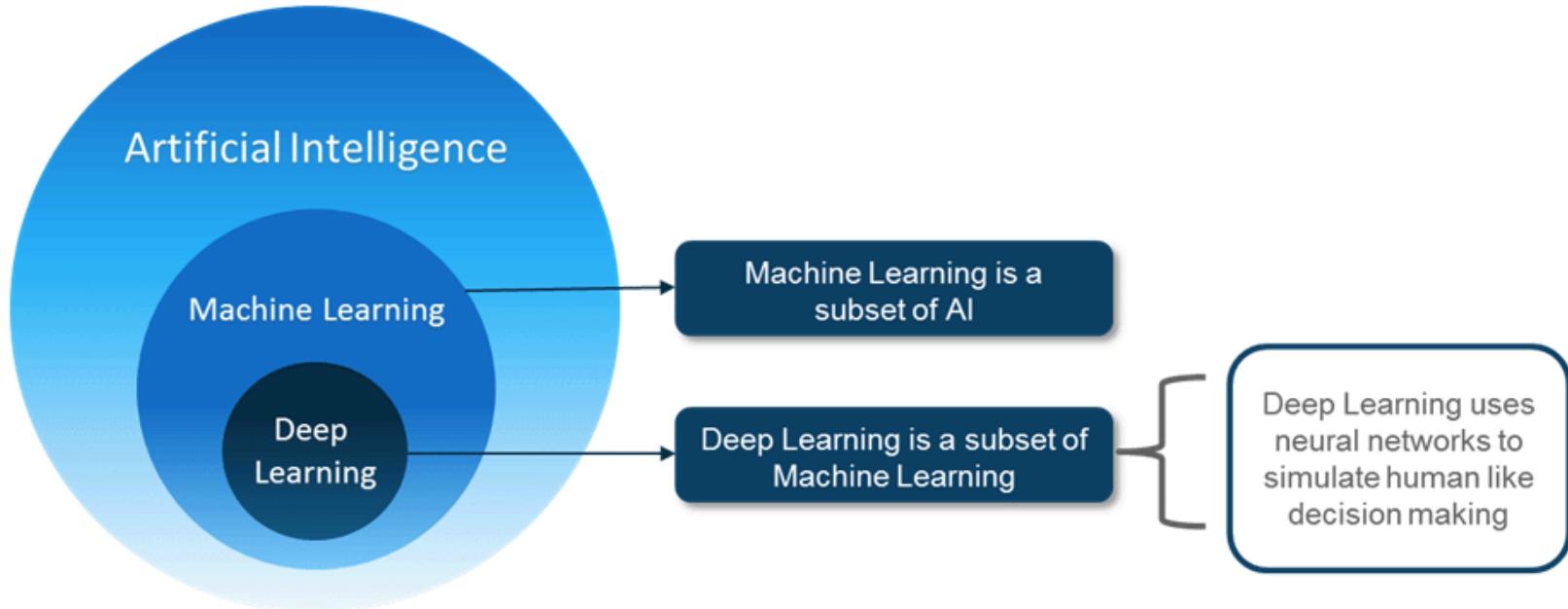


Machine Learning: Methods and Models

Machine Learning



Machine Learning

Types of ML (Neural / Non-neural)

Supervised

- Knn, NB, SVM

Unsupervised

- Kmeans, Clustering, boosting

Reinforcement

- Q-Learning, DQN, DDPG

Incremental

- Fuzzy ARTAMP, Extension of most of the above algos

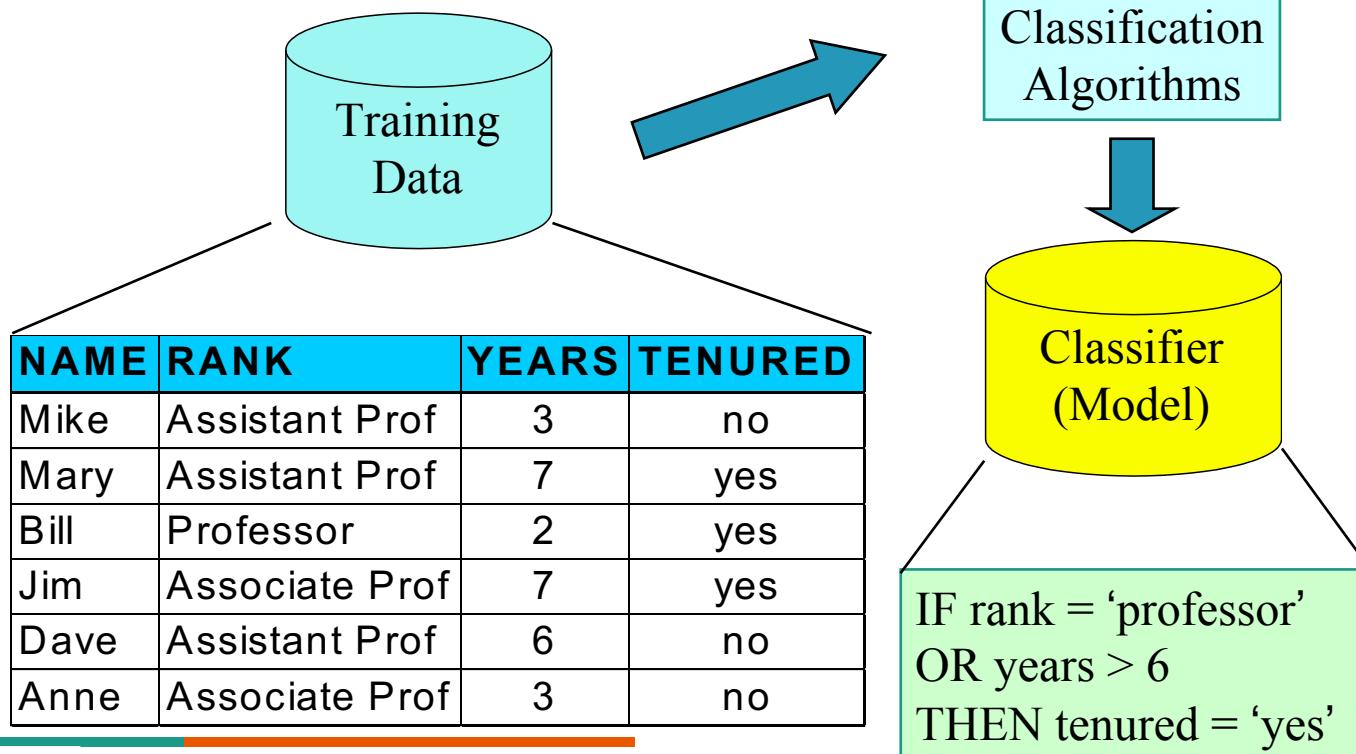
Learning Function

$$f(x) = w \cdot x + b$$

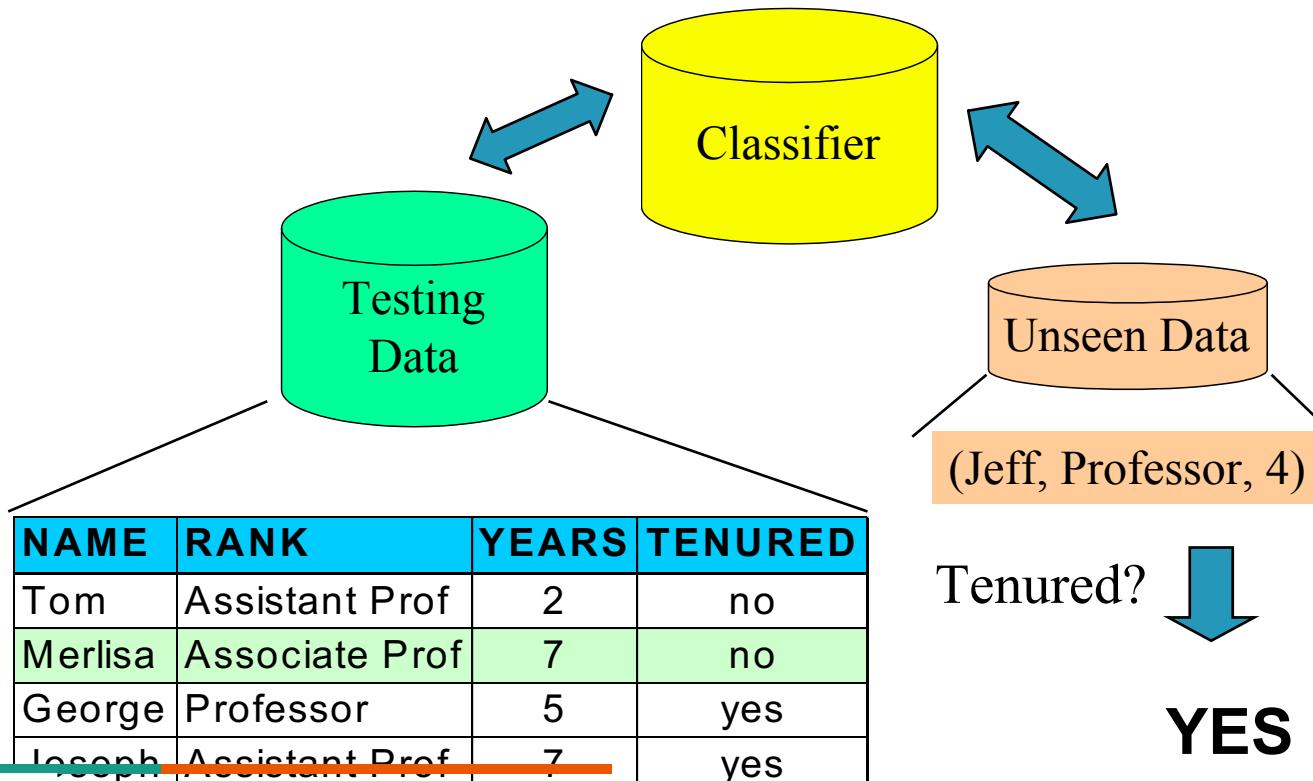
The diagram shows the equation $f(x) = w \cdot x + b$ at the top. Below it, a blue bracket on the left side groups the terms $w \cdot x$ and b . Four arrows point from the right side of this bracket to labels: 'Bias' points to b , 'Input Vector' points to x , 'Weight Vector' points to w , and 'Transfer Function' points to the entire term $w \cdot x$.

<http://localhost:8888/notebooks/Documents/Metamagics/Perceptron.ipynb>

Simple Model Construction



Using the Model in Prediction



Cosine Similarity

- If d_1 and d_2 are two document vectors, then

$$\cos(d_1, d_2) = (d_1 \bullet d_2) / \|d_1\| \|d_2\|,$$

where \bullet indicates vector dot product and $\|d\|$ is the length of vector d .

- Example:

$$d_1 = 3 \ 2 \ 0 \ 5 \ 0 \ 0 \ 0 \ 2 \ 0 \ 0$$

$$d_2 = 1 \ 0 \ 0 \ 0 \ 0 \ 0 \ 0 \ 1 \ 0 \ 2$$

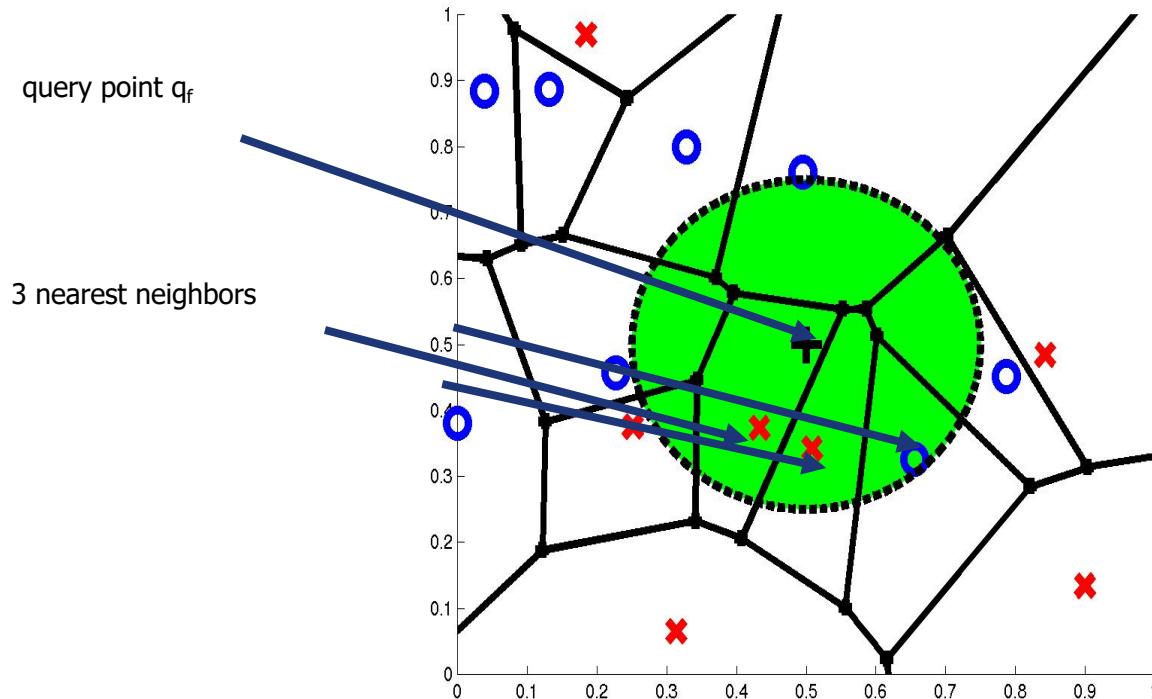
$$d_1 \bullet d_2 = 3*1 + 2*0 + 0*0 + 5*0 + 0*0 + 0*0 + 0*0 + 2*1 + 0*0 + 0*2 = 5$$

$$\|d_1\| = (3^2 + 2^2 + 0^2 + 5^2 + 0^2 + 0^2 + 0^2 + 2^2 + 0^2 + 0^2)^{0.5} = (42)^{0.5} = 6.481$$

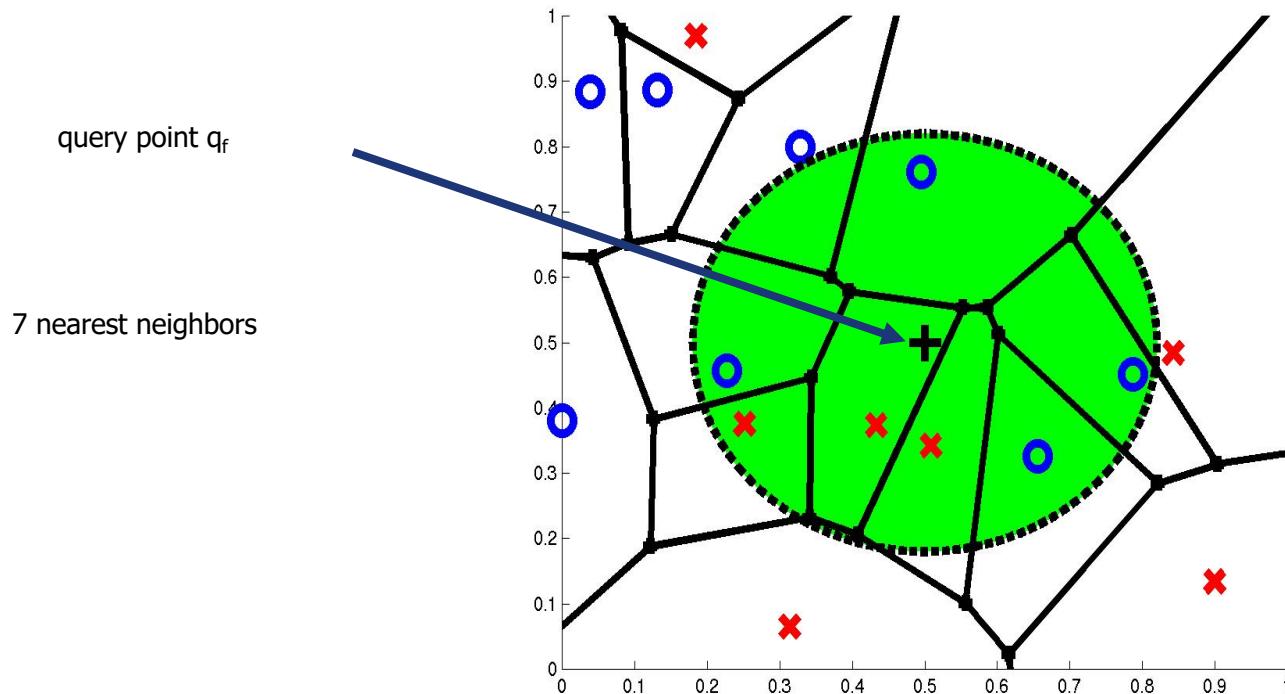
$$\|d_2\| = (1^2 + 0^2 + 0^2 + 0^2 + 0^2 + 0^2 + 0^2 + 1^2 + 0^2 + 2^2)^{0.5} = (6)^{0.5} = 2.245$$

$$\cos(d_1, d_2) = .3150, \text{ distance} = 1 - \cos(d_1, d_2)$$

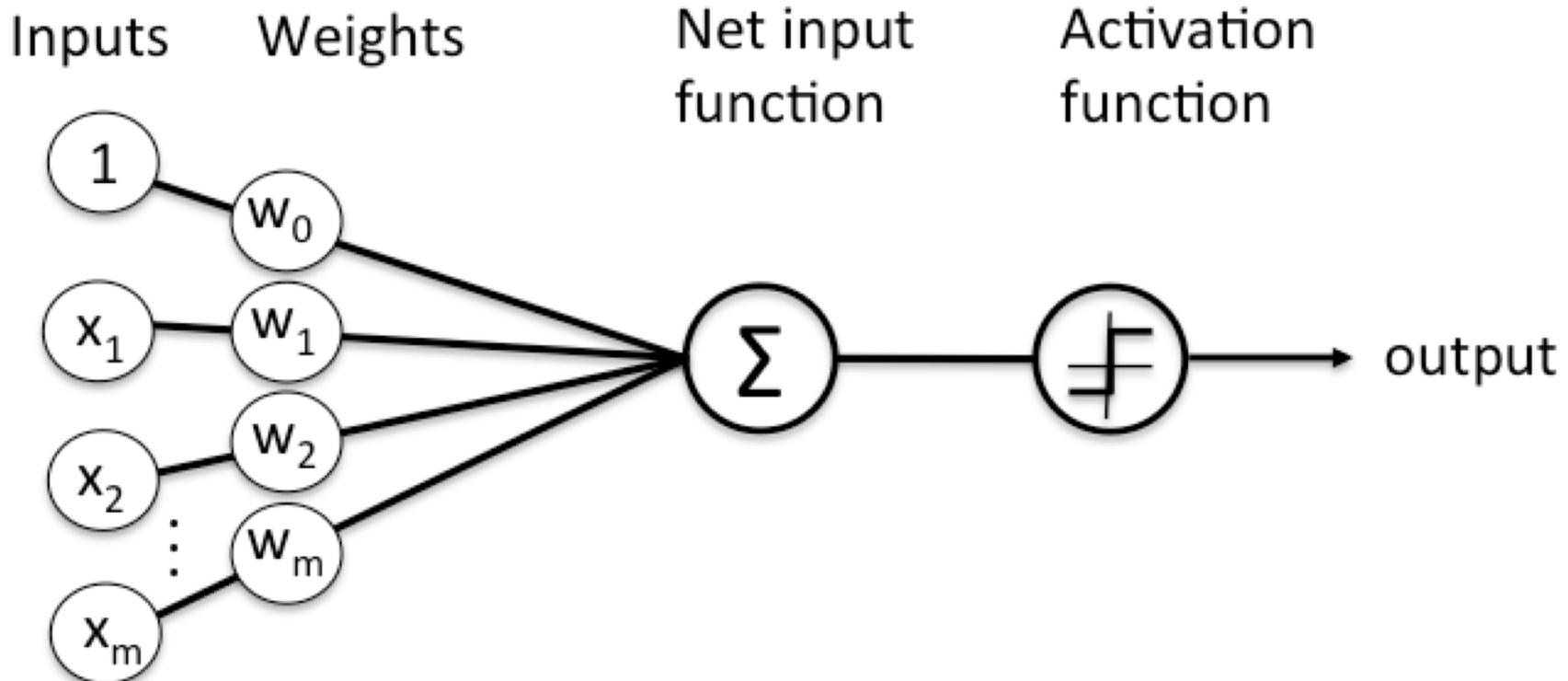
3-Nearest Neighbors



7-Nearest Neighbors



Deep Learning



Deep Learning

- **What is it:**
Extract useful patterns from data.
- **How:**
Neural network + optimization
- **How(Practical):**
Python + TensorFlow
- **Hard Part:**
Good Questions + Good Data
- **Why now:**
Data, hardware, community, tools, investment
- **Where do we stand?**
Most big questions of intelligence have not been answered nor properly formulated
- **Exciting progress:**
 - Face recognition
 - Image classification
 - Speech recognition
 - Text-to-speech generation
 - Handwriting transcription
 - Machine translation
 - Medical diagnosis
 - Cars: drivable area, lane keeping
 - Digital assistants
 - Ads, search, social recommendations
 - Game playing with deep RL

Deep Learning vocabulary

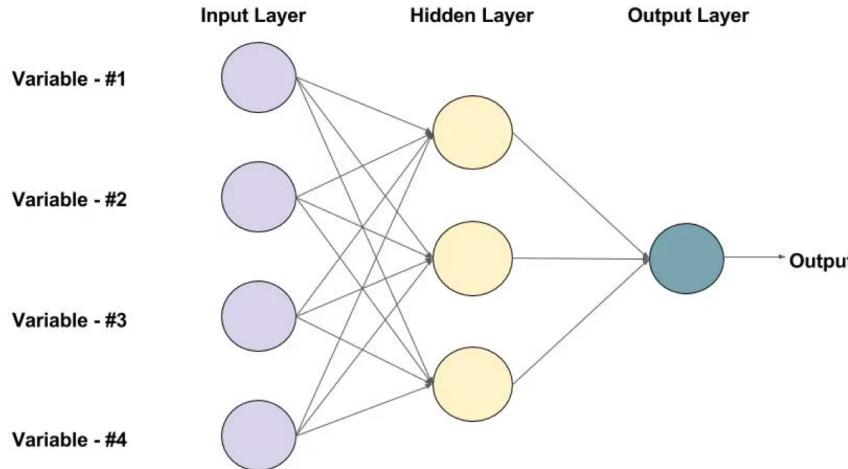
- Deep Learning, Machine Learning, Artificial Intelligence
- Deep Belief Net, Artificial Neural Net, Boltzmann Machine
- Convolutional Neural Nets
- Recurrent NN & LSTM (Long Short Term Memory)
- Activation Function: ReLU (Rectified Linear Unit)
- Deep Learning libraries and frameworks
 - TensorFlow, Caffe, Theano, Torch, DL4J
- Backpropagation, gradient descent, loss function

History of Deep Learning Ideas, Milestones, Tools

- 1943: Neural networks
- 1957: Perceptron
- 1974-86: Backpropagation, RBM, RNN
- 1989-98: CNN, MNIST, LSTM, Bidirectional RNN
- 2006: “DeepLearning”, DBN
- 2009: ImageNet
- 2012: AlexNet, Dropout
- 2014: GANs
- 2014: DeepFace
- 2016: AlphaGo
- 2017: AlphaZero, Capsule Networks
- 2018: BERT
- Mark 1 Perceptron – 1960
- Torch – 2002
- CUDA – 2007
- Theano – 2008
- Caffe – 2014
- DistBelief – 2011
- TensorFlow 0.1 – 2015
- PyTorch 0.1 – 2017
- TensorFlow 1.0 – 2017
- PyTorch 1.0 – 2017
- TensorFlow 2.0 – 2019

Neural network -> Deep Learning

- Multiple - Layers
- Feed Forward Network - do not form cycles
- Backpropagation - Cycle in network node



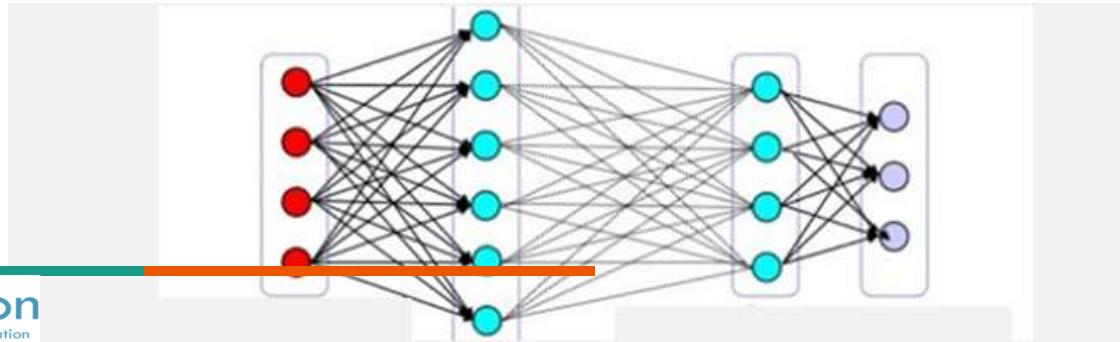
An example of a Feed-forward Neural Network with one hidden layer (with 3 neurons)

Deep Learning vs Machine Learning

- Handling of High Dimensional Data
- Feature Selection
- universal approximator $f(x) = y$

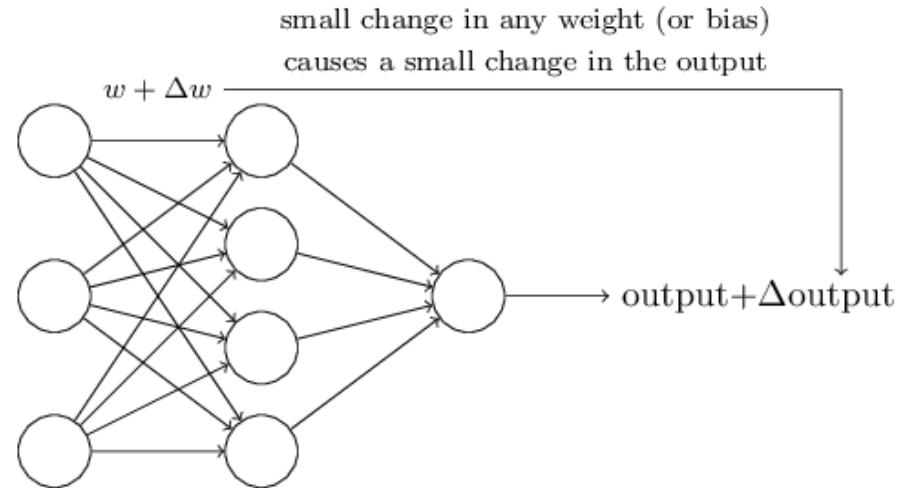
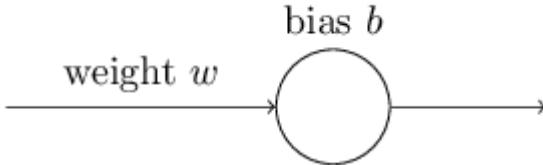
What happens in the Hidden Layers

- First layer learns primitive features (line, edge, tiniest unit of sound) by finding combinations of the input vector data that occur more frequently than by chance
- Logistic regression performed and encoded at each processing node (Y/N (0,1)), does this example have this feature?
- Feeds these basic features to next layer, which trains itself to recognize slightly more complicated features (corner, combination of speech sounds)
- Feeds features to new layers until recognizes full objects



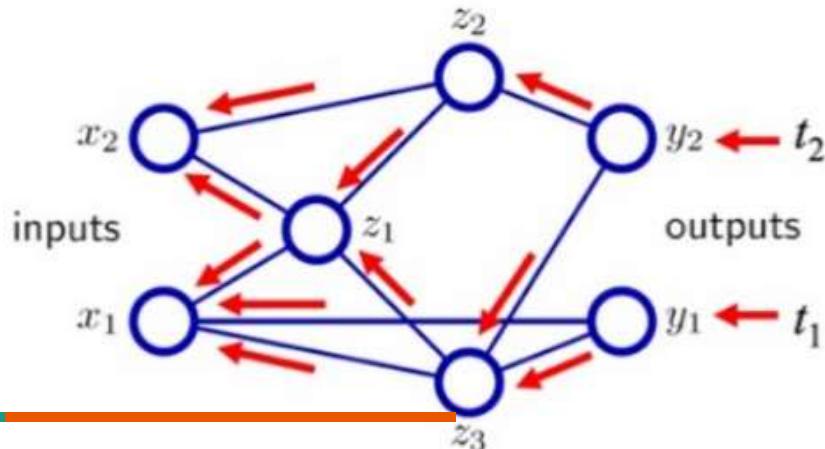
How does the neural net actually learn?

- Structural system based on cascading layers of neurons with variable parameters: weight and bias
- Vary the weights and biases to see if a better outcome is obtained
- Repeat until the net correctly classifies the data



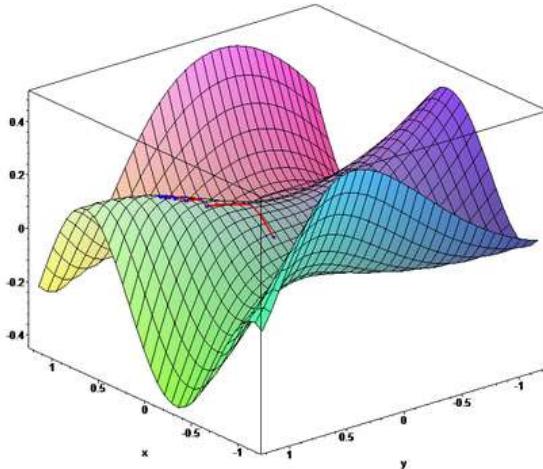
FF and Backpropogation - How #W + B combinations works

- Problem: Inefficient to test the combinatorial explosion of all possible parameter variations
- Backpropagation is an optimization method used to calculate the error contribution of each neuron after a batch of data is processed

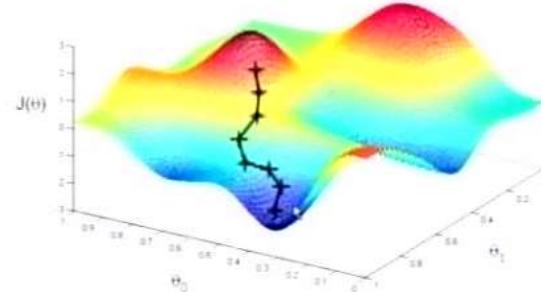


Gradient Descent

- Gradient: derivative to find the minimum of a function
 - Gradient descent: optimization algorithm to find the biggest errors (minima) most quickly
 - Error = MSE, log loss, cross-entropy; e.g.; least correct predictions to correctly identify data



Gradient Descent



<http://www.briandolhansky.com/blog/2013/9/27/artificial-neural-networks-backpropagation-part-4>

Learning Model: Components

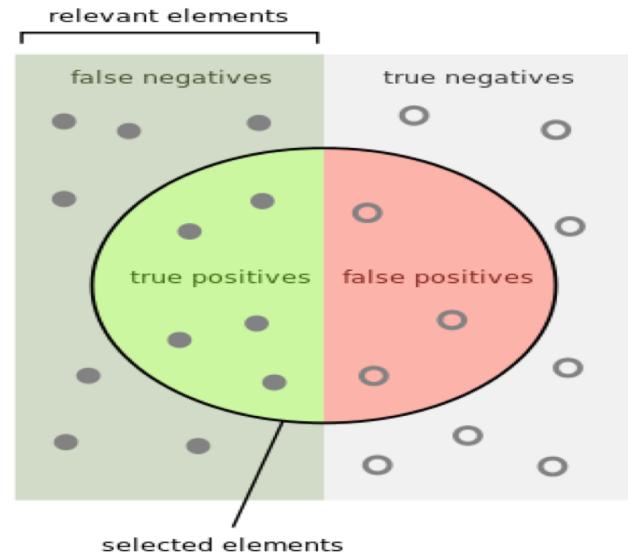
- Data (Train, Test)
- Model
- Cost Function
- Optimization Function
- Evaluation Matrix

Accuracy Metric

Accuracy

F1 – Measure

Precision
Recall



How many selected items are relevant?

$$\text{Precision} = \frac{\text{true positives}}{\text{true positives} + \text{false positives}}$$

How many relevant items are selected?

$$\text{Recall} = \frac{\text{true positives}}{\text{true positives} + \text{false negatives}}$$

TensorFlow

What is it: Deep Learning Library (*and more*)

Facts : Open Source, Python, Google

Community:

117,000+GitHub stars

TensorFlow.org: Blogs, Documentation, Dev Summit,
YouTube talks

Extras:

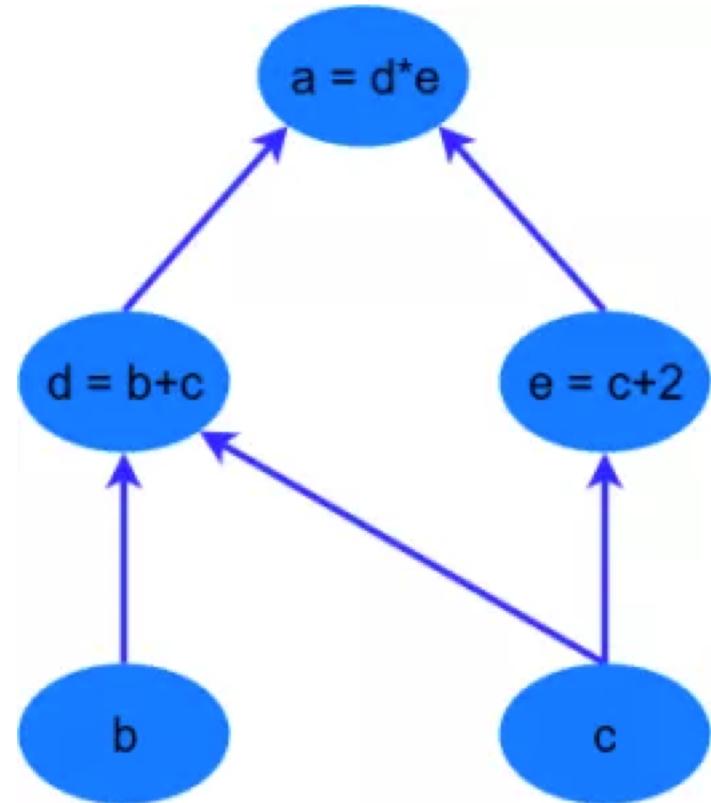
- Swift for TensorFlow
- TensorFlow Serving
- TensorFlow Extended (TFX)
- TensorFlow Probability
- Tensor2Tensor

- **Ecosystem:**

- Keras: high-level API
- TensorFlow.js: in the browser
- TensorFlow Lite: on the phone
- Colaboratory: in the cloud
- TPU: optimized hardware
- TensorBoard: visualization
- TensorFlowHub: graphmodules
- **Alternatives:** PyTorch, MXNet, CNTK

TensorFlow

Tensor - Multidimensional Array
Flow - Graph



Notebook

http://localhost:8888/notebooks/Documents/Metamagics/Basics_tensorflow_1.ipynb

Supervised Learning

1. Feed Forward Neural Networks



2. Convolutional Neural Networks



3. Recurrent Neural Networks



4. Encoder-Decoder Architectures

