

October 24,
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Deep learning: algorithms and deployment

iSense Big Data Summit

Rob Romijnders

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RomijndersRob@gmail.com

October 24, 2017

Overview

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Object detection

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Faster R-CNN

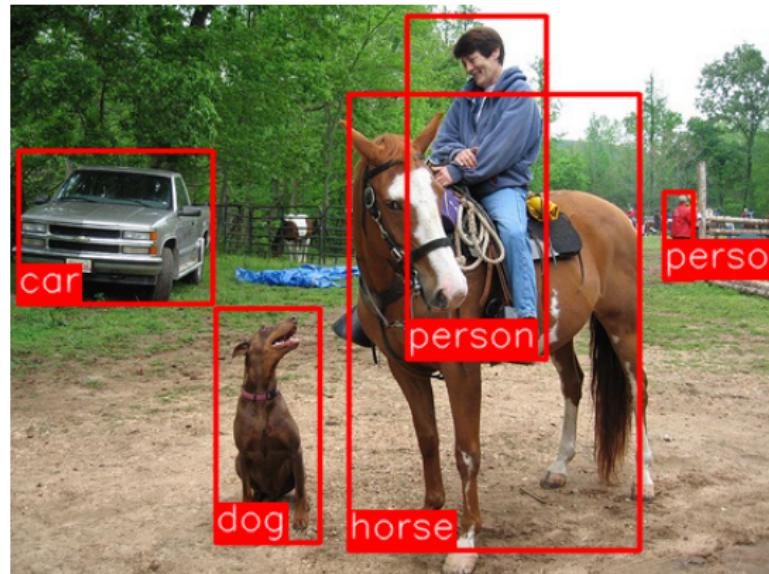


Figure: faster rcnn (image from Github *mitmul*)

Apple siri

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Siri



Figure: Photo: cultofmac.com

GMail reply

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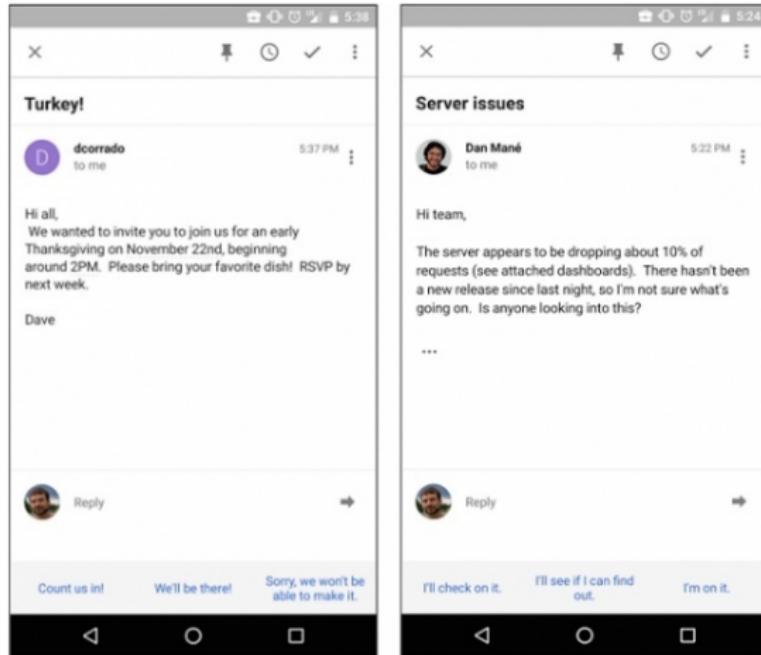


Figure: Photo: Greg Corrado, Google Research Blog

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Google Research Blog

The latest news from Research at Google

A Neural Network for Machine Translation, at Production Scale

Tuesday, September 27, 2016

Figure: credits: Google research blog

Segmentation

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object classes	building	grass	tree	cow	sheep	sky	airplane	water	face	car
bicycle	flower	sign	bird	book	chair	road	cat	dog	body	boat

Figure: Semantic Segmentation with CNN (image from jamie.shotton.org) or see [youtube.com/watch?v=Nok6XludcQ](https://www.youtube.com/watch?v=Nok6XludcQ)

Pose estimation

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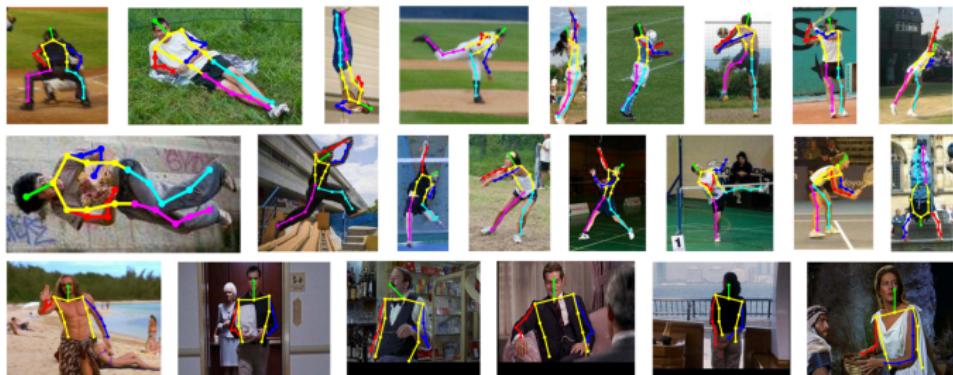


Figure: [Source](#)

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Figure: Credits:
popularmechanics.com/technology/a19863/googles-alphago-ai-wins-second-game-go/

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Generative modelling

Speech generation

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Figure: Source: deepmind.com/blog/wavenet-launches-google-assistant/

Generation

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THE MULTIVERSE —

Movie written by algorithm turns out to be hilarious and intense

For *Sunspring*'s exclusive debut on Ars, we talked to the filmmakers about collaborating with an AI.

ANNALEE NEWITZ - 6/9/2016, 12:30 PM



Sunspring, a short science fiction movie written entirely by AI, debuts exclusively on Ars today.

Figure: <http://arstechnica.com/the-multiverse/2016/06/an-ai-wrote-this-movie-and-its-strangely-moving/>

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Why not

Which data not

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YES: media type data

- 1 Text, language, speech
- 2 Images, video, maps
- 3 Time-series, stocks, valuta
- 4 Games, robots

NO: categorical data

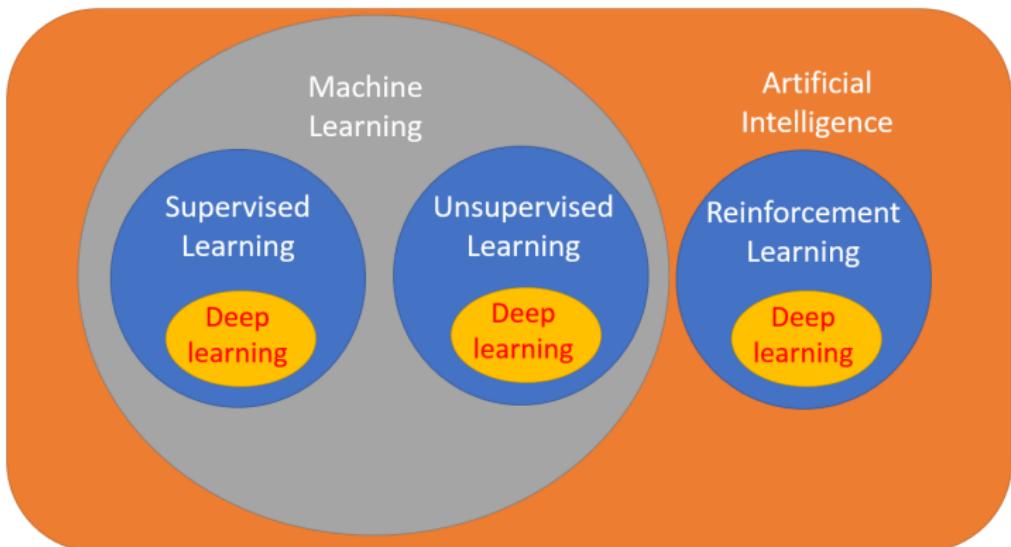
- 1 Properties
- 2 Features
- 3 Categories

Overview of the field

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Neural Networks

Neural nets

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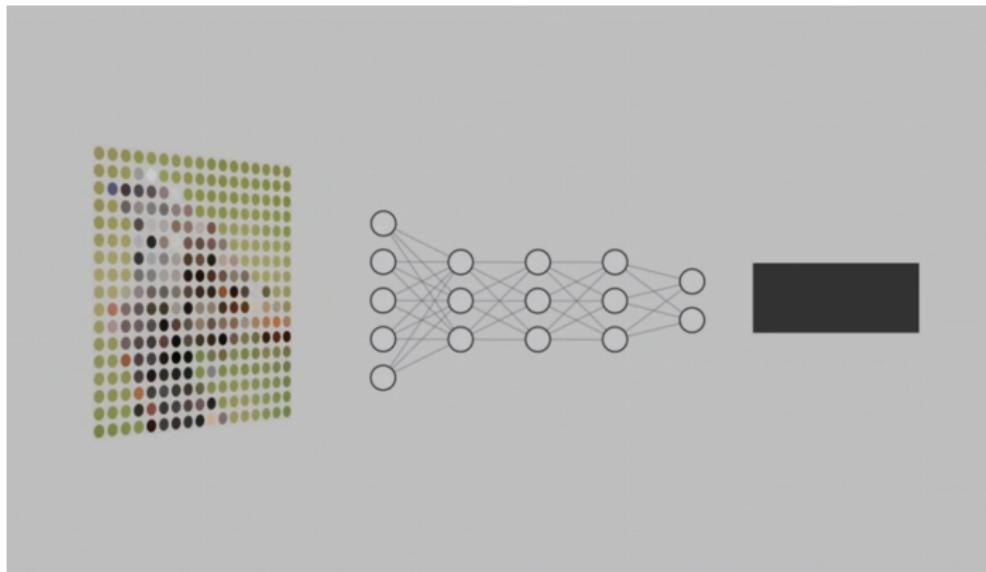


Figure: Neural network explained (credits: Blaise Aguera y Arcas)

Neural network

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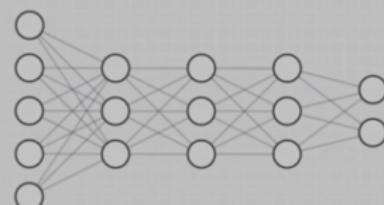
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Neural network

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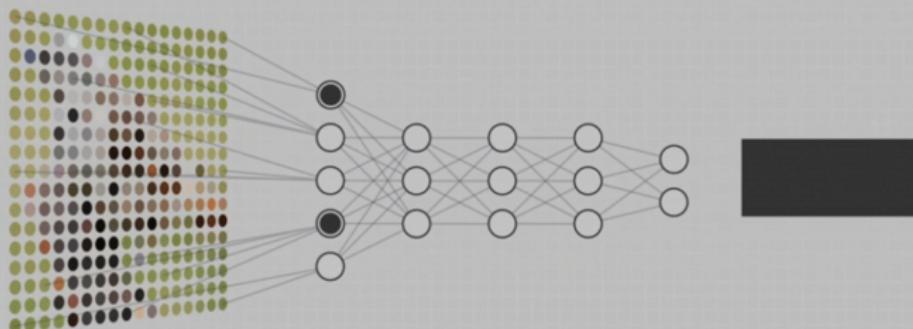
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Neural network

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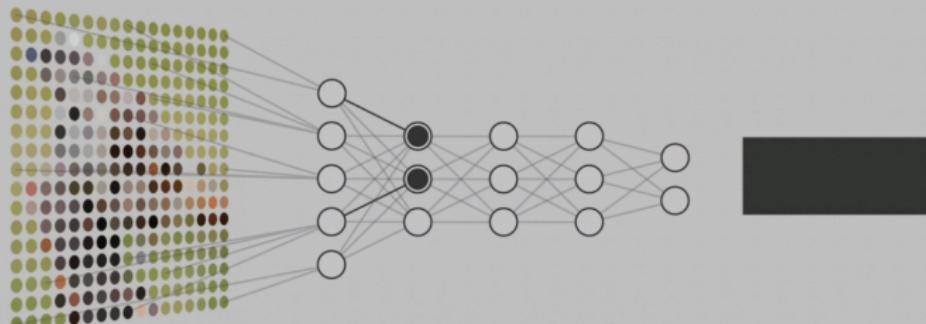
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Neural network

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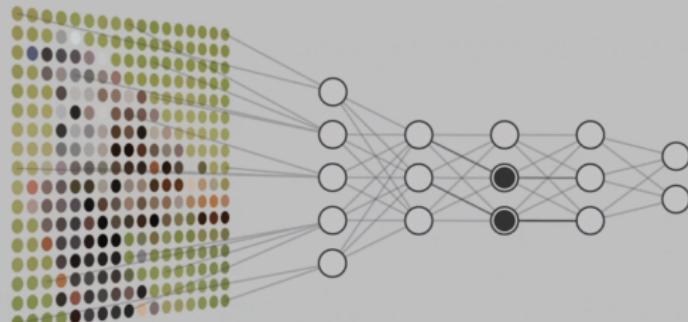
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Neural network

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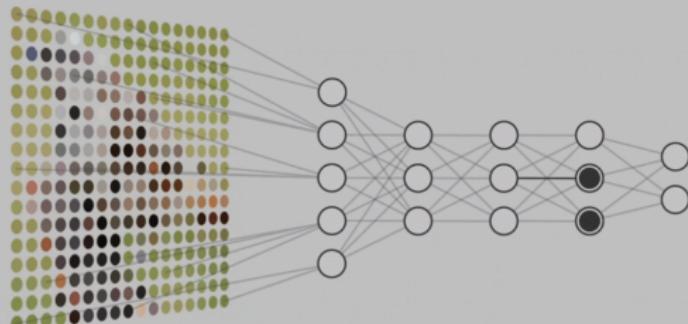
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Neural network

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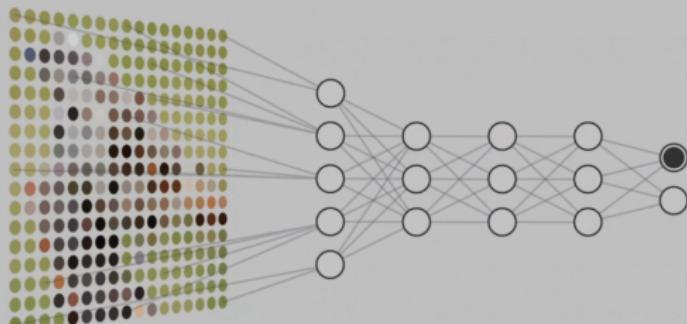
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Basic equation

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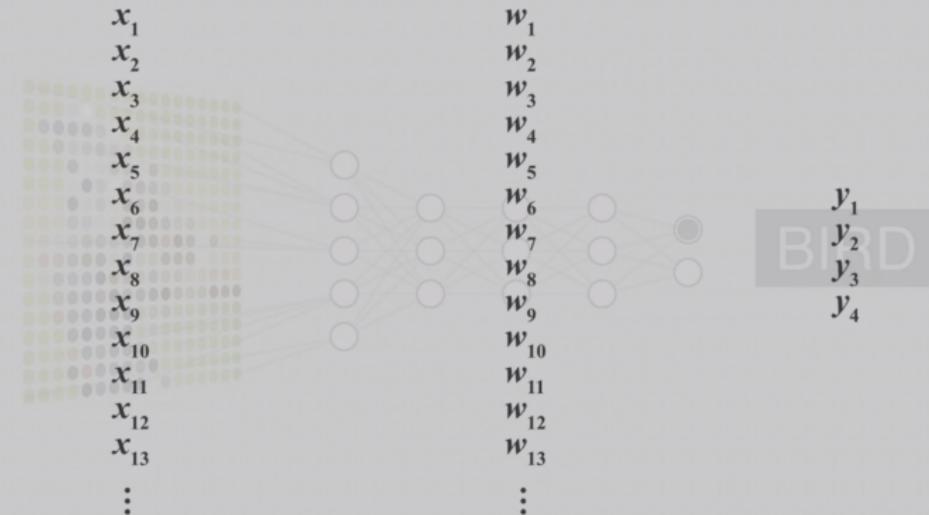


Figure: Neural net in algebraic form (credits: Blaise Aguera y Arcas)

Template equation

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Figure: Template equation neural net (credits: Blaise Aguera y Arcas)

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How to use them

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$$W \cdot X = y$$

$$2 \cdot 3 = y$$

Forward inference

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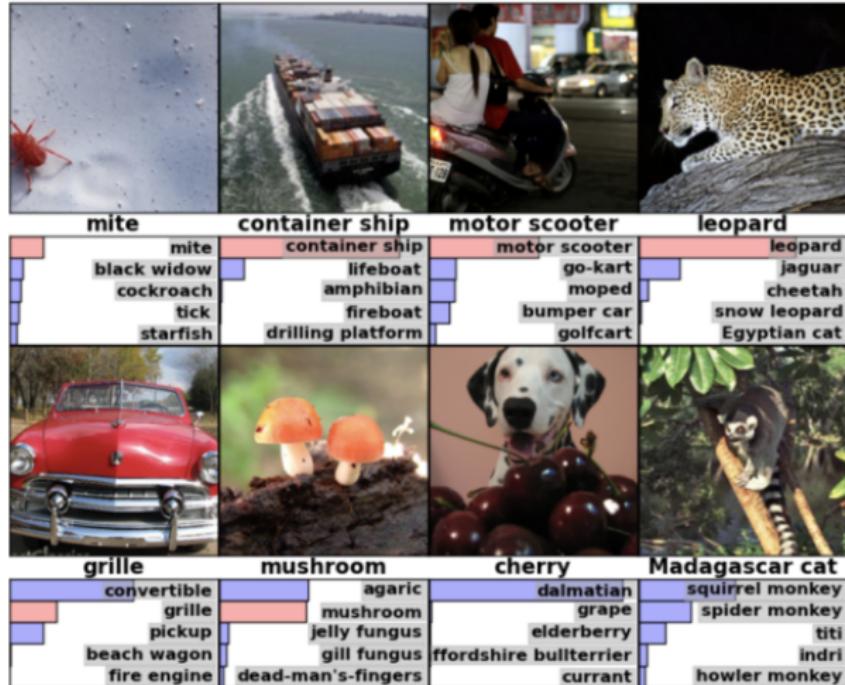


Figure: Forward inference CNN (Krizhevsky et al. 2012)

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$$(x, y) = (3, 6)$$

$$w \cdot x = y$$

$$w \cdot 3 = 6$$

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$$w \cdot x \approx y$$

$$y - w \cdot x \approx 0$$

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$$\text{Loss} = (y - w \cdot x)^2 \implies 0$$

Gradient Descent

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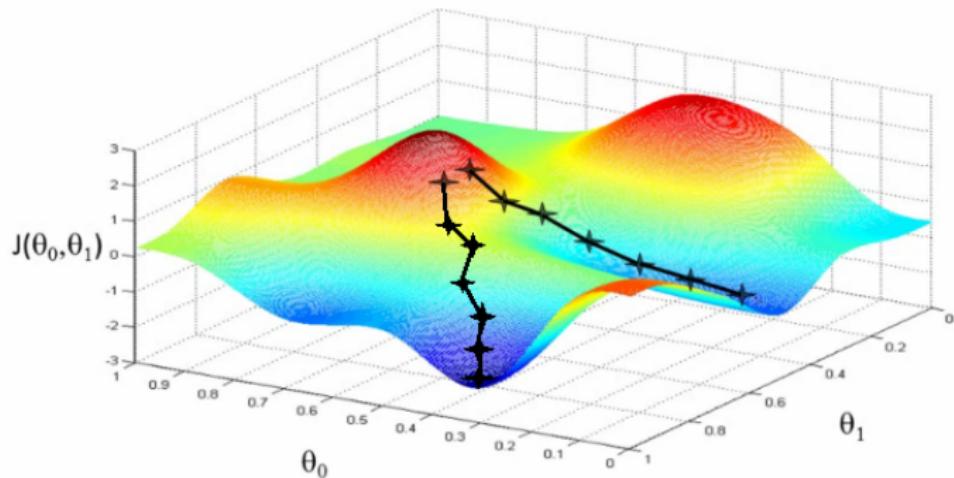


Figure: Credits: ML blog Vasilis Vryniotis

Loss function

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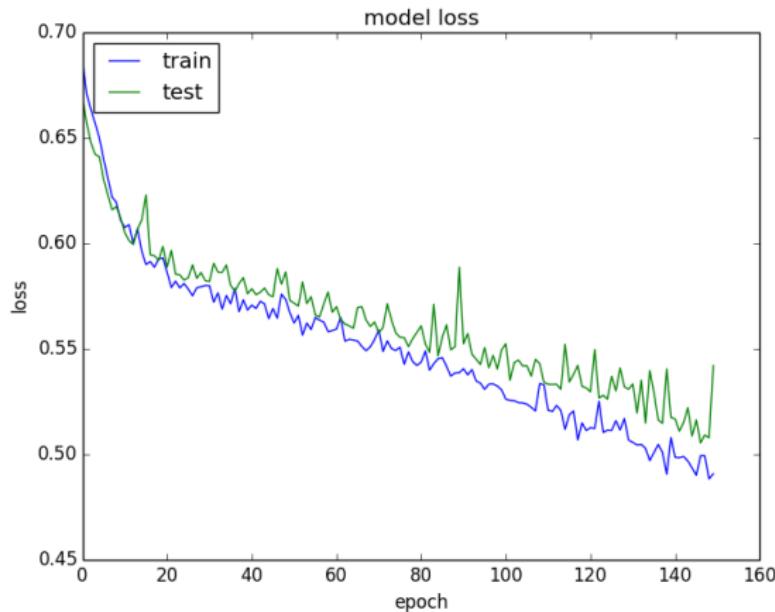


Figure: (<http://machinelearningmastery.com/>)

Training a neural network

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- 1 Define a neural network**
- 2 Define the loss function**

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1. Define a neural network!

One hidden layer

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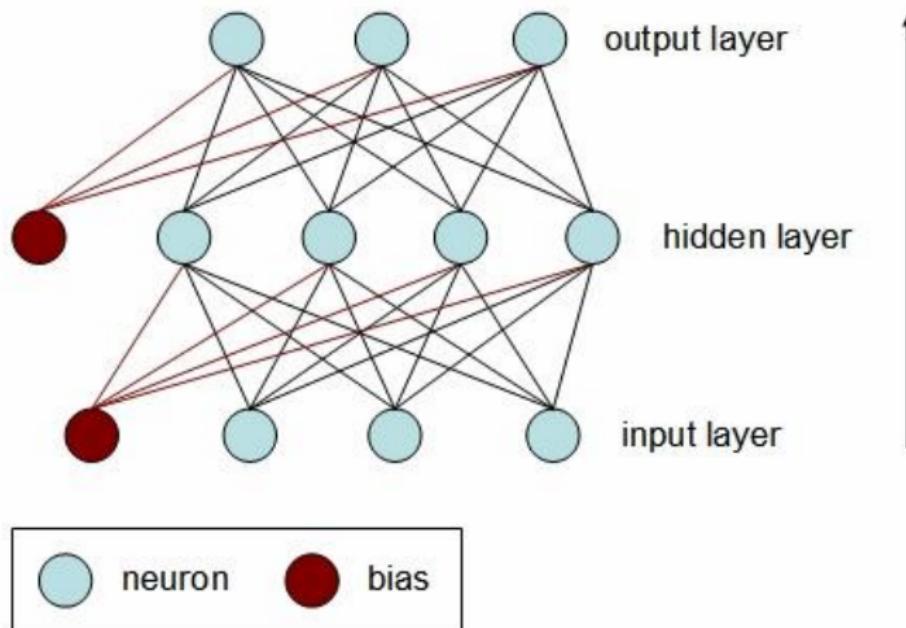


Figure: Neural network with one hidden layer

Activation function

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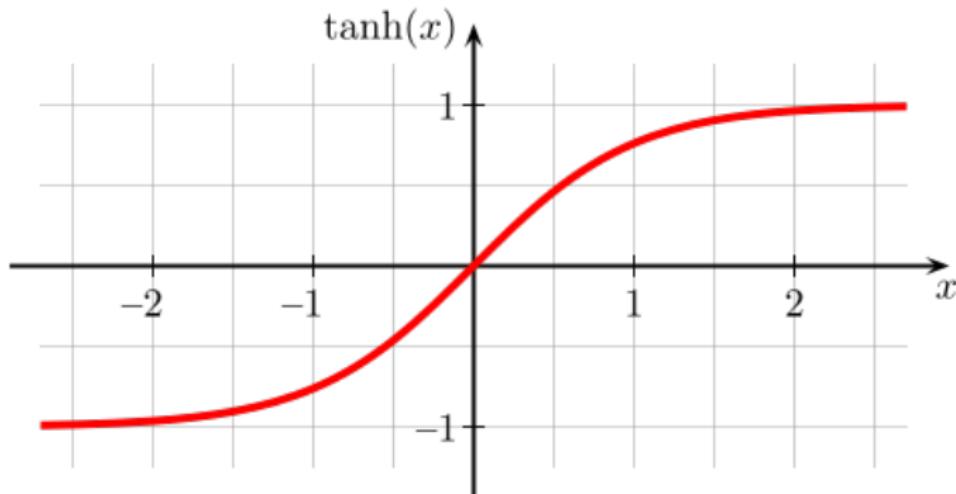


Figure: Hyperbolic tangent as activation function

Python code

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```
#FF
def step(x):
    h = np.tanh(np.dot(x, W1) + b1)
    y = np.dot(h, W2) + b2
    return y

y = step(x)
```

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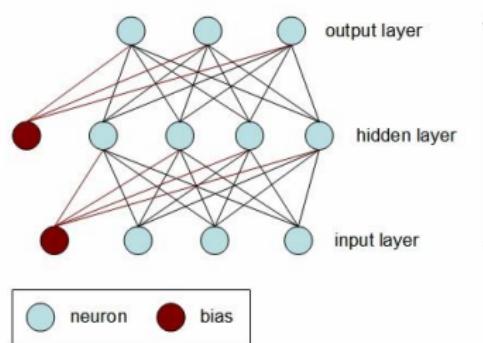


Figure: Neural network with one hidden layer

$W1.\text{shape} \Rightarrow (4, 3)$
 $b1.\text{shape} \Rightarrow (4,)$
 $W2.\text{shape} \Rightarrow (3, 4)$
 $b2.\text{shape} \Rightarrow (3,)$

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2. Define the loss function

Regression

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$$\text{Loss} = (y_{correct} - \hat{y})^2$$

Classification

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$$Loss = - \sum_i y_{correct} \log(\hat{y})$$

Softmax

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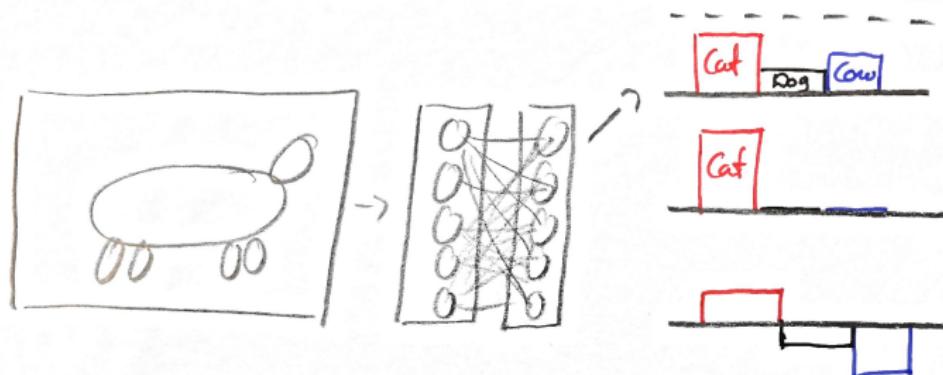


Figure: Gradient from softmax

Equations

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1 Softmax

$$\text{softmax}(a)_i = \frac{e^{a_i}}{\sum_j e^{a_j}}$$

2 Cross entropy

$$\text{loss} = \text{cross}(p, q) = - \sum_j p_j \log(q_j) = -\log(q_{y_{\text{correct}}})$$

3 Gradient

$$\frac{\delta \text{Loss}}{\delta a_i} = q_i - p_i$$

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3. Do stochastic gradient descent

Gradient Descent

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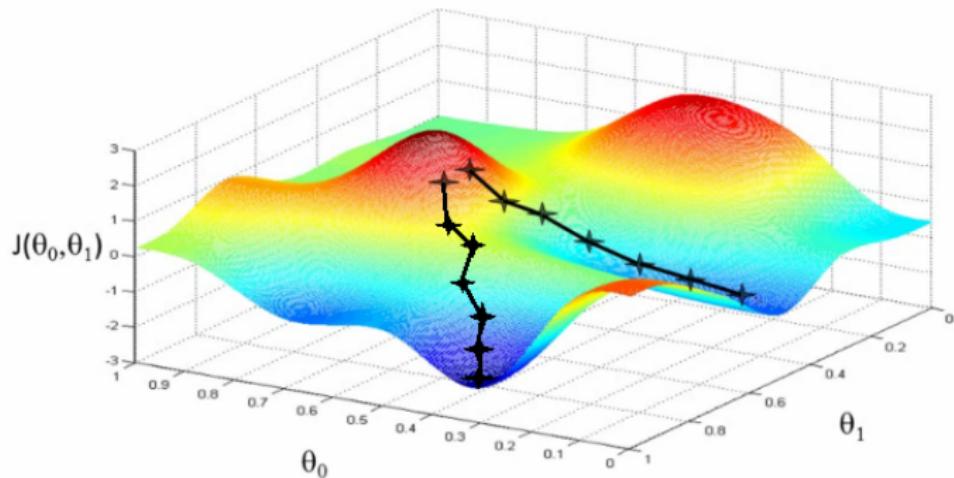


Figure: Credits: ML blog Vasilis Vryniotis

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Minimize loss

$$w = w - \eta \frac{\delta Loss}{\delta w}$$

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$$\frac{\delta Loss}{\delta w} = \frac{\delta Loss}{\delta a} \frac{\delta a}{\delta h_l} \frac{\delta h_l}{\delta h_{l-1}} \frac{\delta h_{l-1}}{\delta h_{l-2}} \dots \frac{\delta h_1}{\delta h_0} \frac{\delta h_0}{\delta w}$$

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Stochastic gradient descent

Use small batches of size e.g. 32

Two problems

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1 Too many weights

$$3 \times 1024 \times 100 + 100 \times 3 = 307500$$

2 No domain knowledge

Two architectures

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1 Convolution

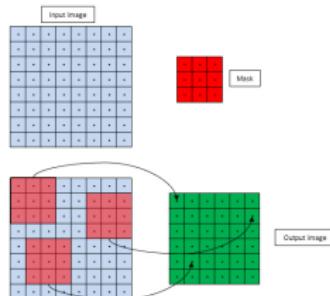


Figure: developer.amd.com

2 Recursion

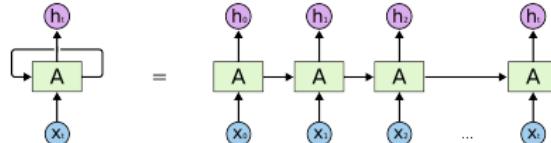


Figure: credits: colah.github.io

Detect patterns

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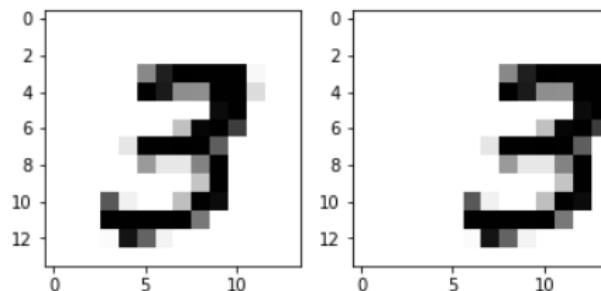


Figure: Translation of image does not change class

Convolution

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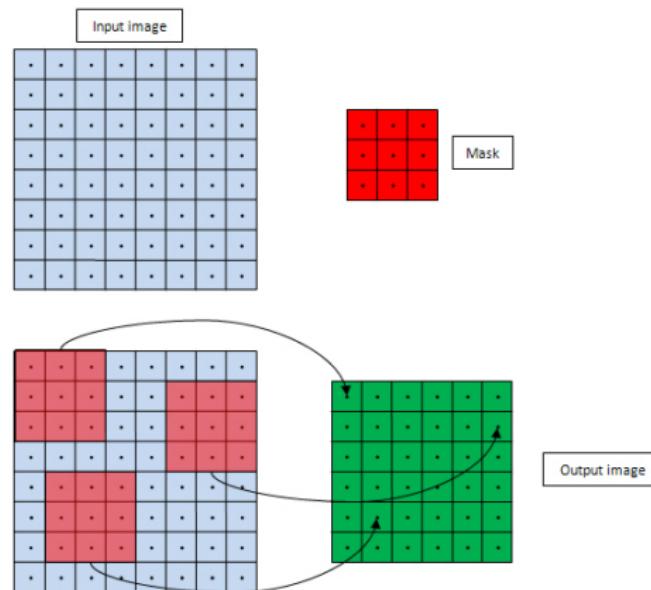


Figure: developer.amd.com

Python code

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#CNN

```
def step(x):
    h = np.tanh(convolve(x, W1) + b1)
    y = np.dot(h.flatten(), W2) + b2
    return y

y = step(x)
```

CNN

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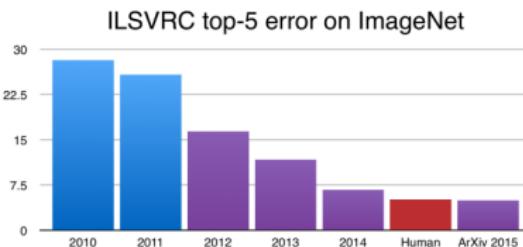


Figure: ImageNet results (credits jackkelly.github.io/)



Figure: Forward inference CNN (Krizhevsky et al. 2012)

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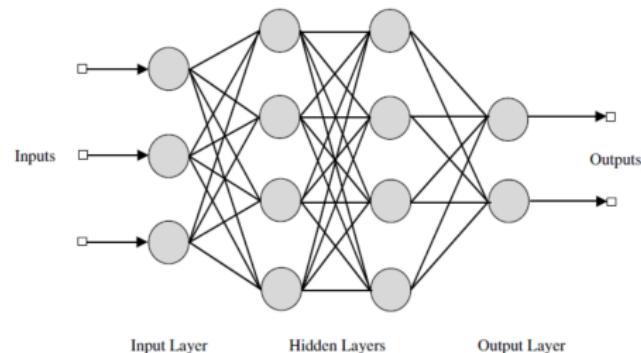


Figure: Feedforward neural network

$$3 \times 1024 \times 100 + 100 \times 3 = 307500$$

$$3 \cdot 5 \cdot 5 \cdot 100 + 100 \times 3 = 7800$$

Recursion

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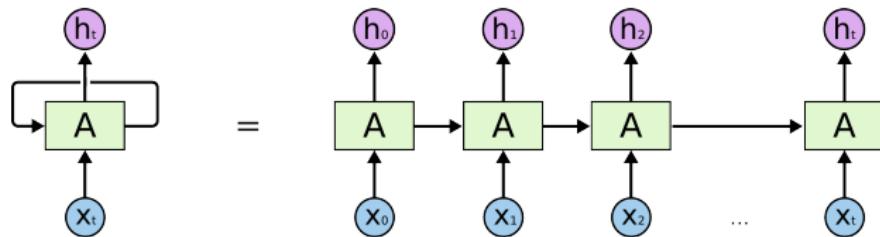


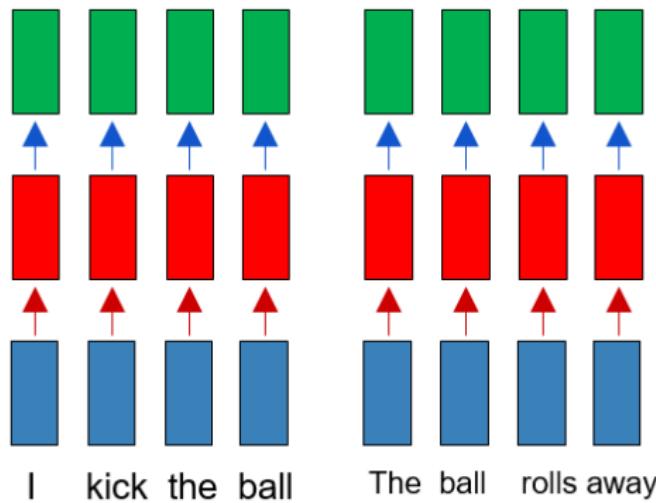
Figure: credits: colah.github.io

Word tagging

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Connect over time

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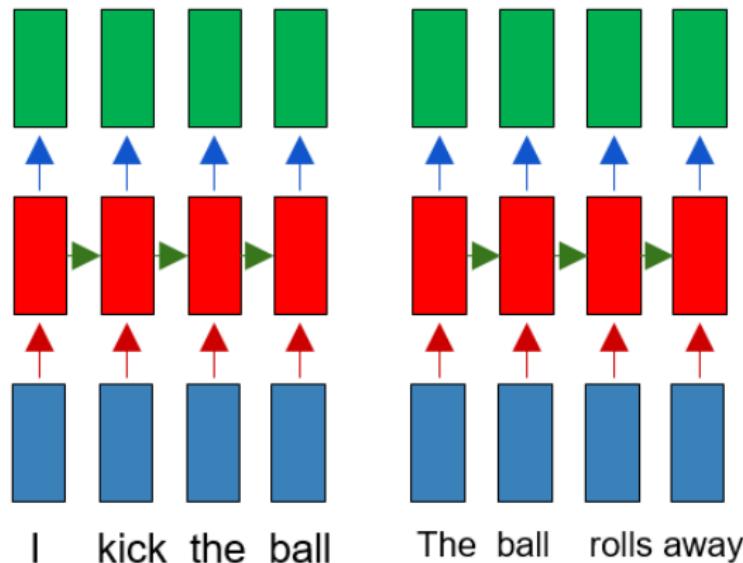


Figure: RNN in 112 lines

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```
#FF
def step(x):
    h = np.tanh(np.dot(x, W1) + b1)
    y = np.dot(h, W2) + b2
    return y

y = step(x)
```

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```
# RNN
rnn = RNN()

class RNN:
    def step(self, x):
        self.h = np.tanh(np.dot(self.h, W1)
                        + np.dot(x, W2))
        y = np.dot(self.h, W3)
        return y

y = rnn.step(x)
```

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```
#FF
def step(x):
    h = np.tanh(np.dot(W1, x) + b1)
    y = np.dot(W2, h) + b2
    return y

#RNN
class RNN:
    def step(self, x):
        self.h = np.tanh(np.dot(W1, self.h)
                         + np.dot(W2, x))
        y = np.dot(W3, self.h)
    return y
```

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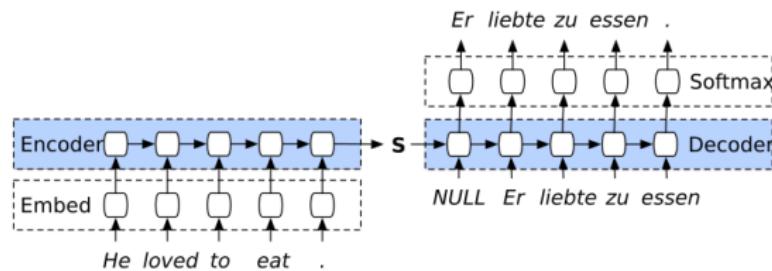


Figure: RNN for Machine Translation (credits: smerity.com)

Span

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1 CNN

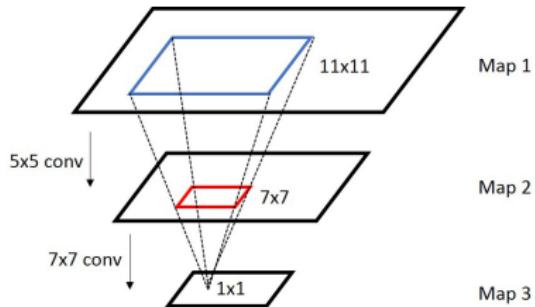


Figure: credits: cvmarcher.com/

2 RNN

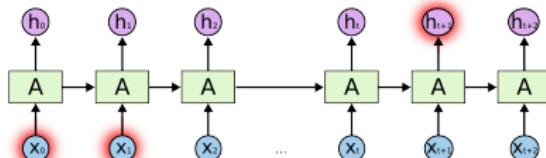


Figure: credits colah.github.io

Long Short-term memory

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$$i_t = \sigma(W_{xi}x_t + W_{hi}h_{t-1} + b_i)$$

$$f_t = \sigma(W_{xf}x_t + W_{hf}h_{t-1} + b_f)$$

$$o_t = \sigma(W_{xo}x_t + W_{ho}h_{t-1} + b_o)$$

$$c_t = f_t c_{t-1} + i_t \tanh(W_{xc}x_t + W_{hc}h_{t-1} + b_c)$$

$$h_t = o_t \tanh(c_t)$$

LSTM

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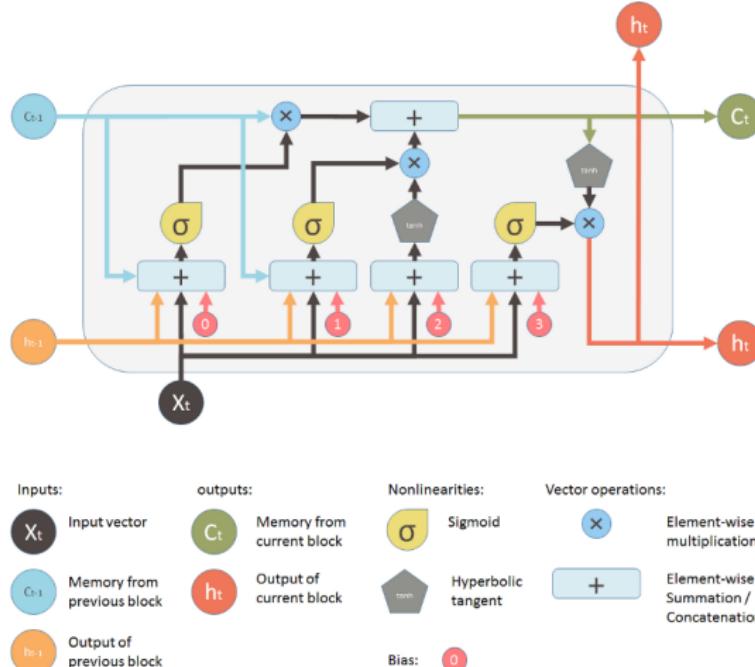


Figure: Diagram depicting LSTM block
Author: Shi Yan. Source: medium.com/@shiyanshiyan/

Overview			
	FF	RNN	CNN
- Basic computation - Typical data - Weights ties - Effective span	Matrix multiplies Feature vectors No Across input	Recurrent multiplications Sequences Sequential Long term	Convolutions Images Spatial Local receptive field
- How to train - Performance - Typical examples	Backprop No guarantee None	Backprop No guarantee Machine translation, speech tagging, text generation	Backprop No guarantee segmentation, image processing, object detection

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- Data
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Gather data

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Questions

1 SMALL:

- 1 MNIST: 60.000 samples
- 2 TIMIT: 630 speakers, 10 sentences

2 NORMAL:

- 1 Imagenet: 3.2 million images
- 2 FLICKR: 1 million images
- 3 Word vectors on all of Wikipedia

Semi supervised learning

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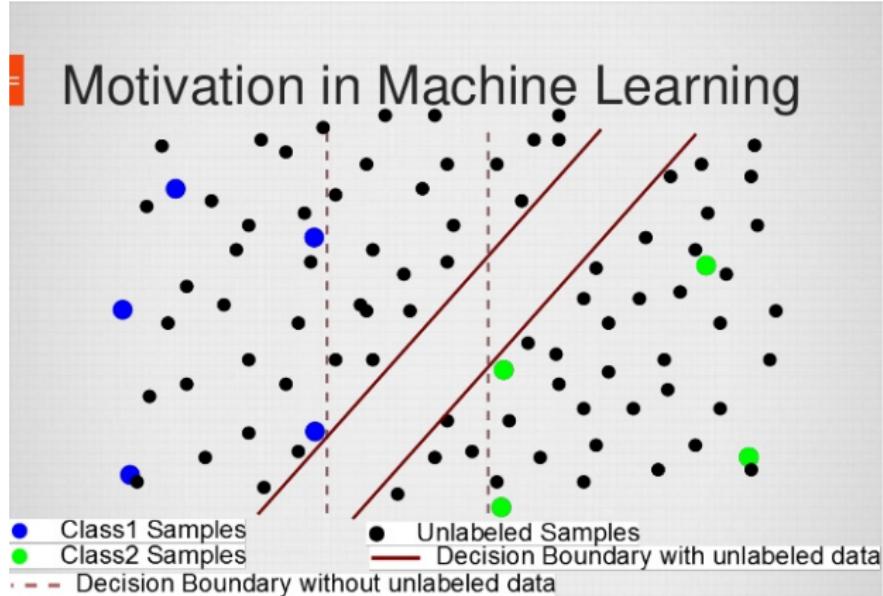
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:: Semi-Supervised Learning :: Lukas Tencer :: MTL Data ::



Figure: Credits: Lukas Tencer

MNIST

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Random Sampling of MNIST

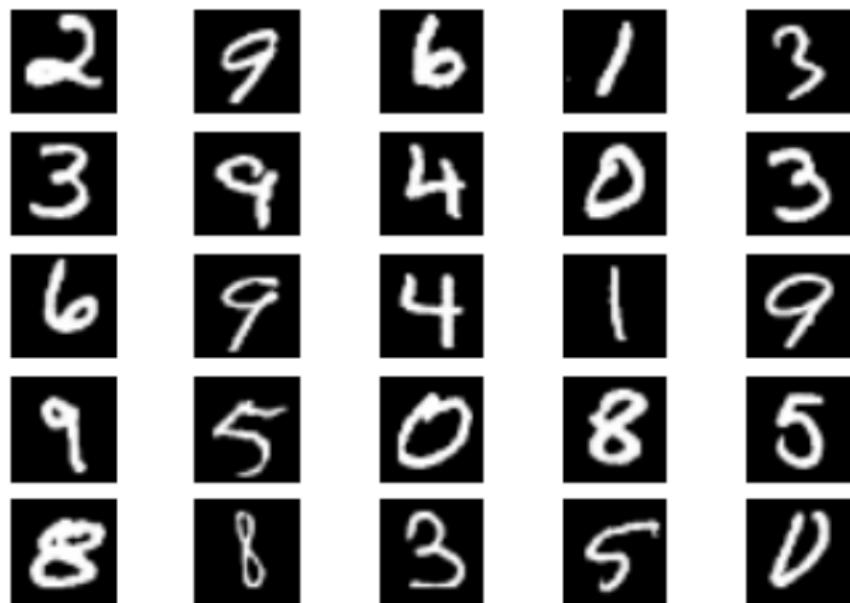


Figure: MNIST images

Code

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Questions

1 Low level

- 1 Tensorflow
- 2 Torch, pyTorch

2 High level

- 1 Keras
- 2 Scikit flow, pretty tensor, tfslim, ...

Train

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Questions

- 1 No bells and whistles**
- 2 Small sub dataset**
- 3 See if you can overfit**

Choose algorithm

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1 Convolution

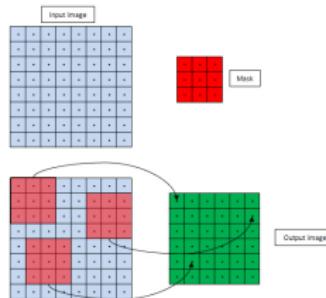


Figure: developer.amd.com

2 Recursion

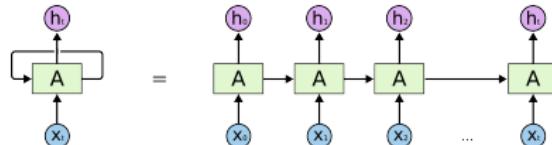


Figure: credits: colah.github.io

Bells and whistles

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Questions

- 1 Batch normalization, layer normalization
- 2 Dropout
- 3 Activation functions
- 4 Residual connections
- 5 etcetera, etcetera

Activation functions

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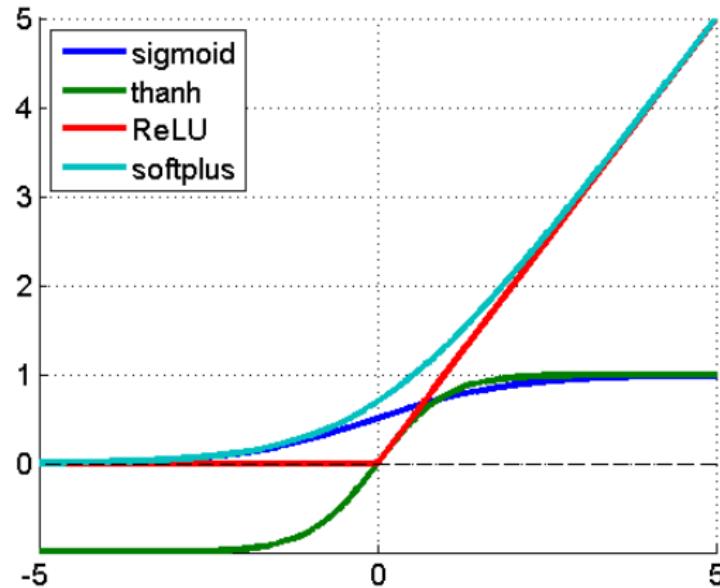


Figure: Common activation functions (credits Vanessa Imiloa)

Play with activation functions here

Cloud services

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- 1 AWS**
- 2 Azure**
- 3 Google cloud**

Docker

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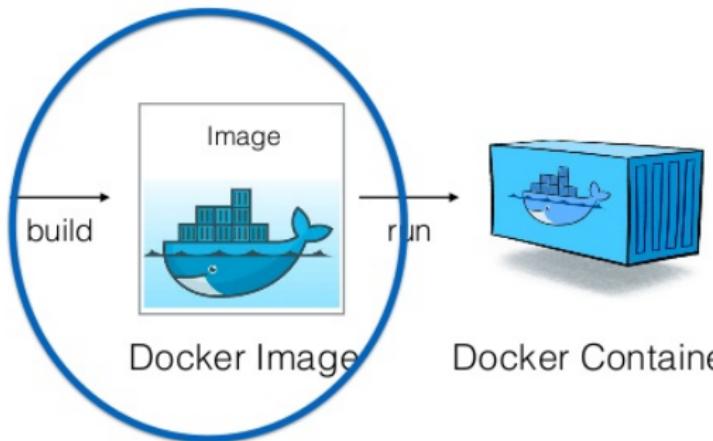
Wrap up

Questions

Single Container Docker Workflow

```
FROM ubuntu:16.04
MAINTAINER Rob Romijnders <rob@romijnders.net>
ADD . /app
WORKDIR /app
RUN apt-get update
RUN apt-get install -y curl
RUN curl -s https://raw.githubusercontent.com/rob-romijnders/docker-training/master/app/app.py > app.py
CMD ["python", "app.py"]
```

Dockerfile



Docker pipeline

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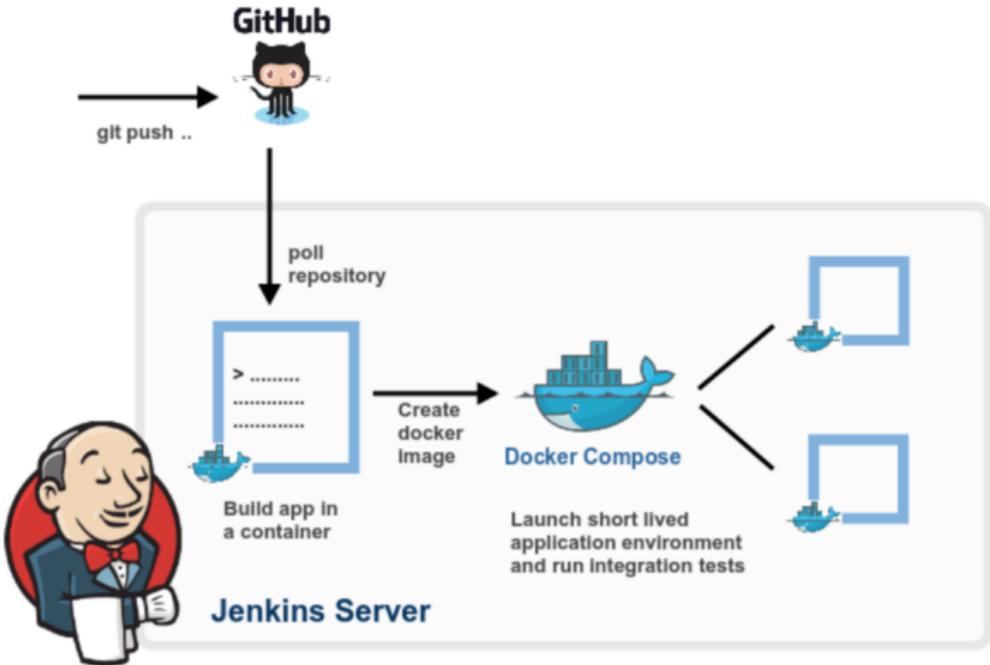


Figure: Source: rancher.com

Gradient Descent

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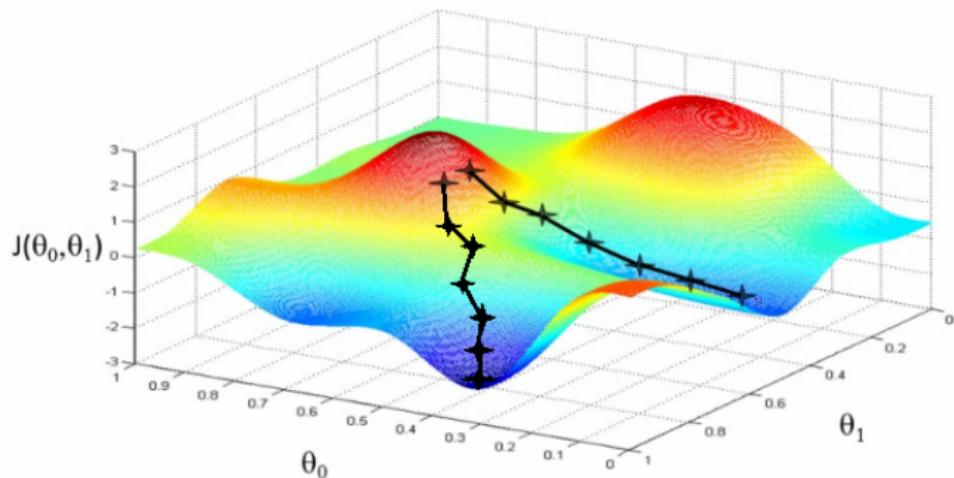


Figure: Credits: ML blog Vasilis Vryniotis

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DIY

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- 1 Fast inference at testtime**
- 2 Microservices**
- 3 Post processing**

Quantization

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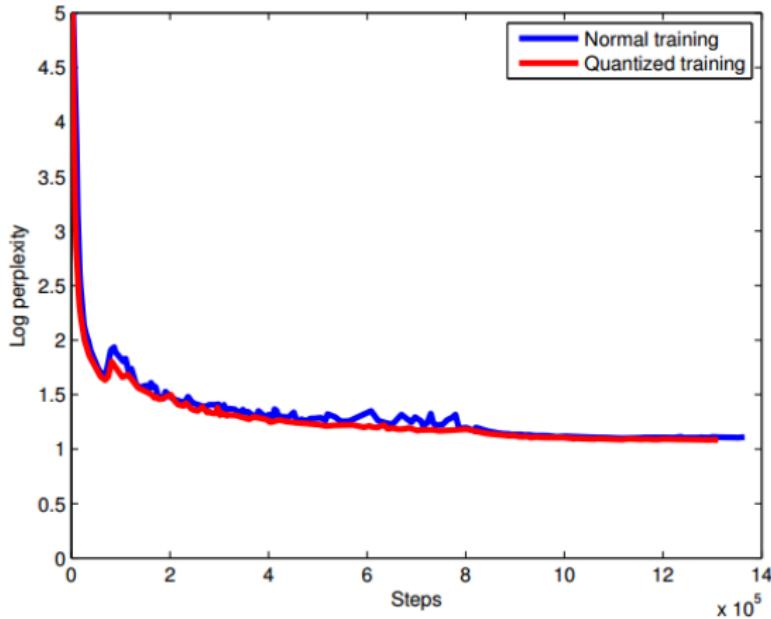


Figure: Credits: Arxiv GNMT paper

Quantization

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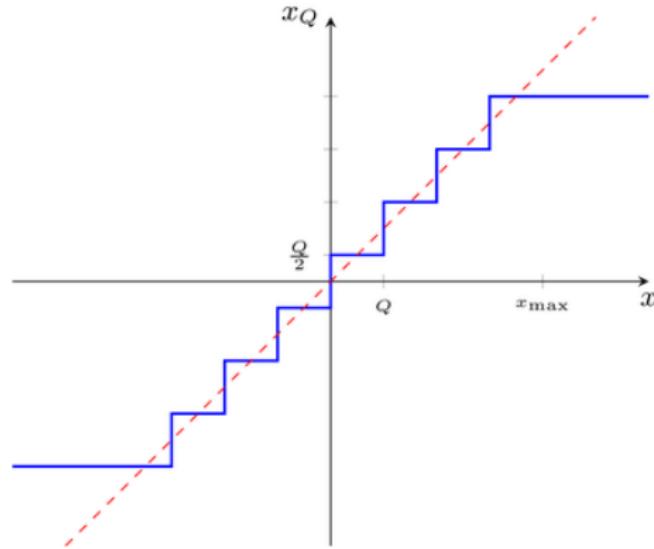


Figure: Credits: Sascha Spors

Speed up

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	BLEU	Log Perplexity	Decoding time (s)
CPU	31.20	1.4553	1322
GPU	31.20	1.4553	3028
TPU	31.21	1.4626	384

Figure: Credits: [Arxiv GNMT paper](#)

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Micro services

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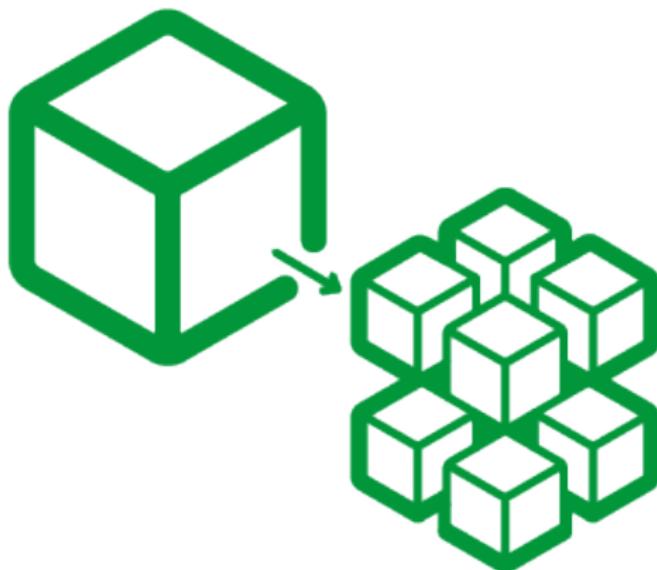


Figure: Source: nginx.com

Post processing

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Questions

- 1 Plot low confidence / high uncertainty**
- 2 Plot confusion matrix**
- 3 Inspect neurons**

Regularization

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Figure: Example for regularization

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Further learning

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1 Blogs

- 1 [The Unreasonable Effectiveness of Recurrent Neural Networks, Andrej Karpathy](#)
- 2 [Chris Olah's blog colah.github.io](#)

2 Courses

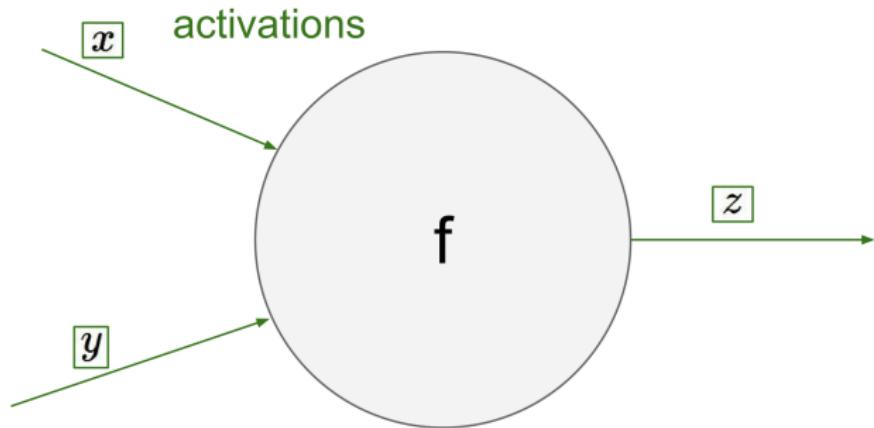
- 1 [Course on CNN: cs231n](#)
- 2 [Udacity on Deep learning](#)
- 3 [Fast.ai: Deep learning for Coders](#)

3 My page (robromijnders.github.io)

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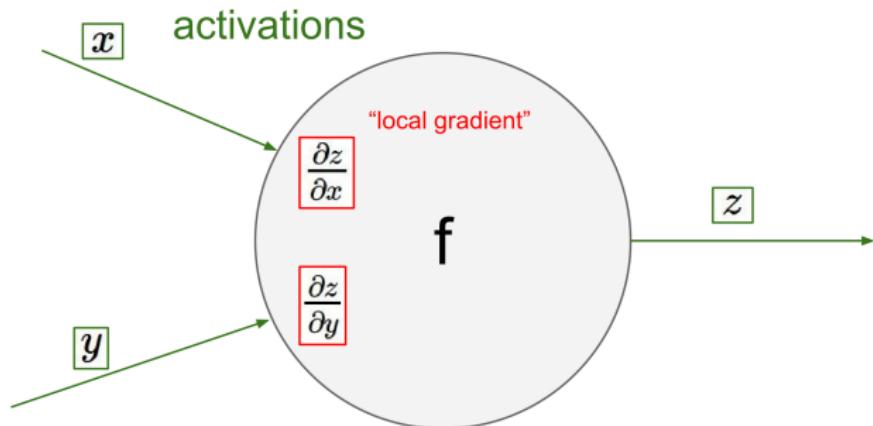
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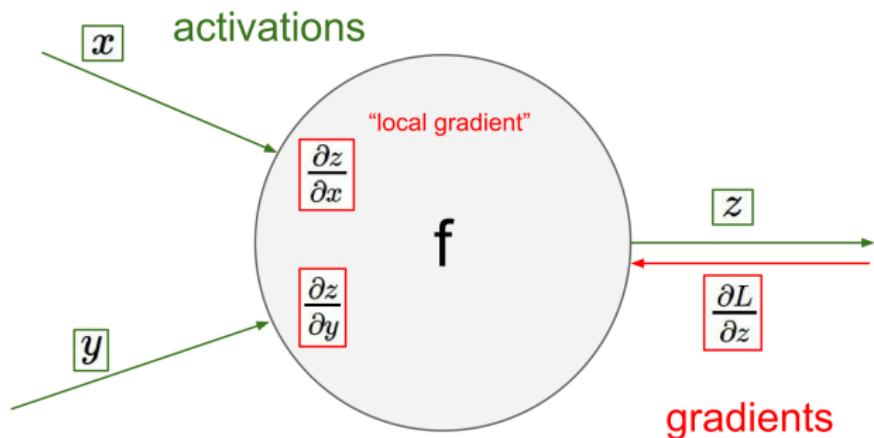
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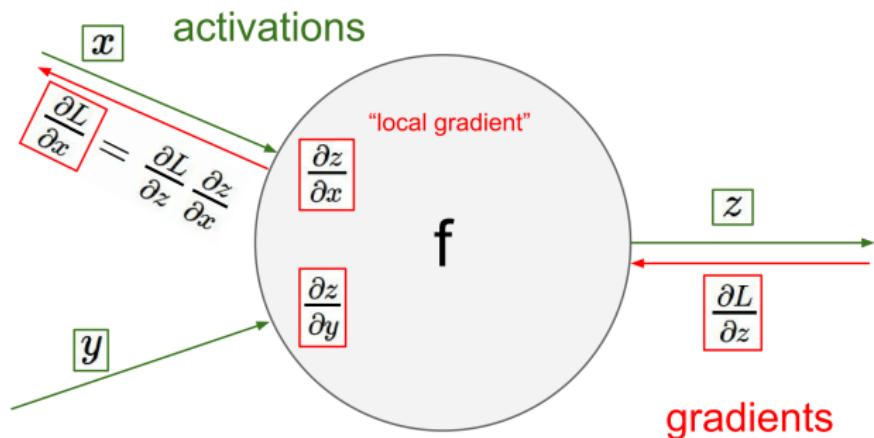


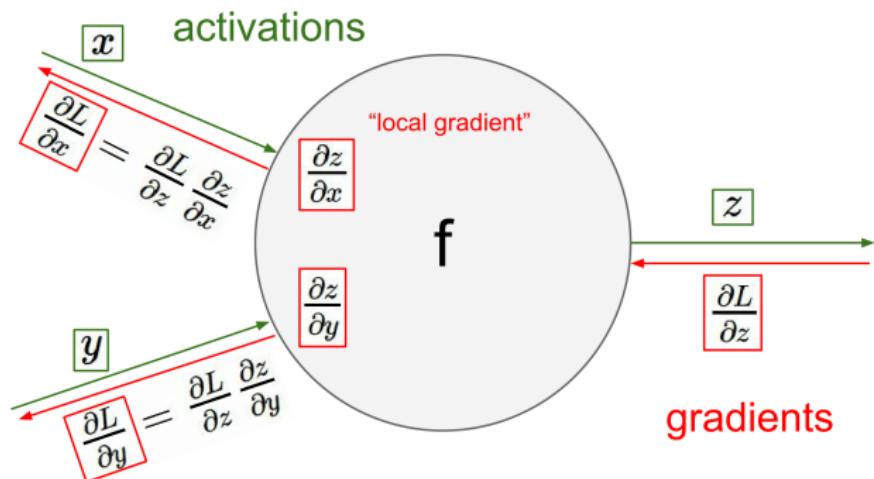
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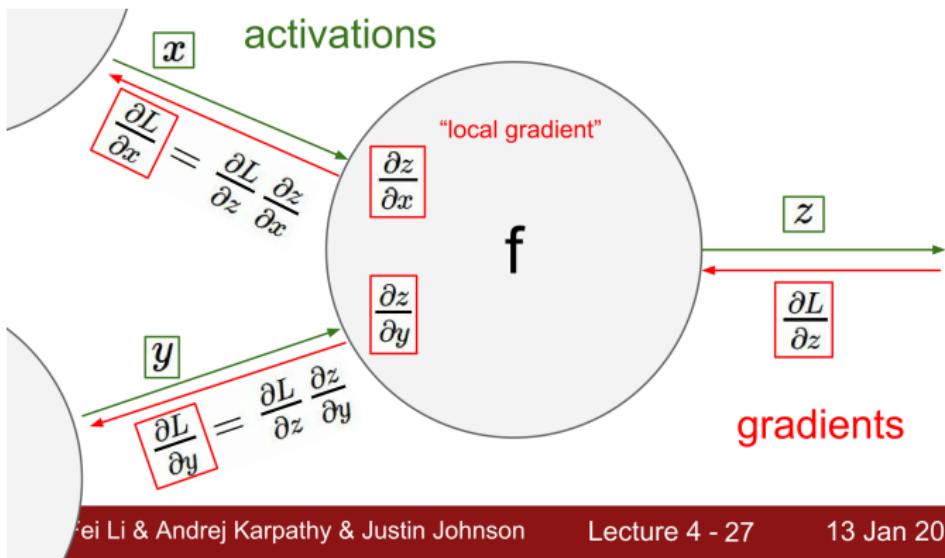
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Softmax

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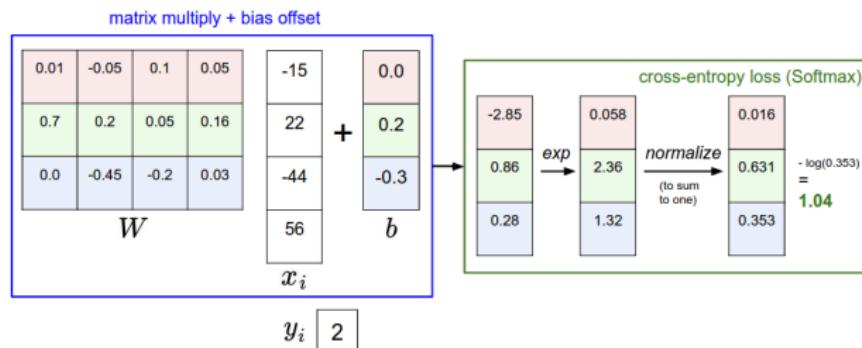


Figure: Adapted from cs231n.github.io/linear-classify/

Example

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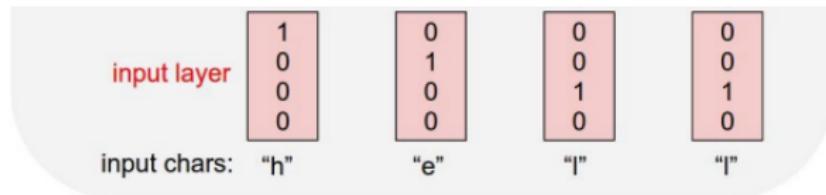


Figure: cs231n, Andrej Karpathy

Example

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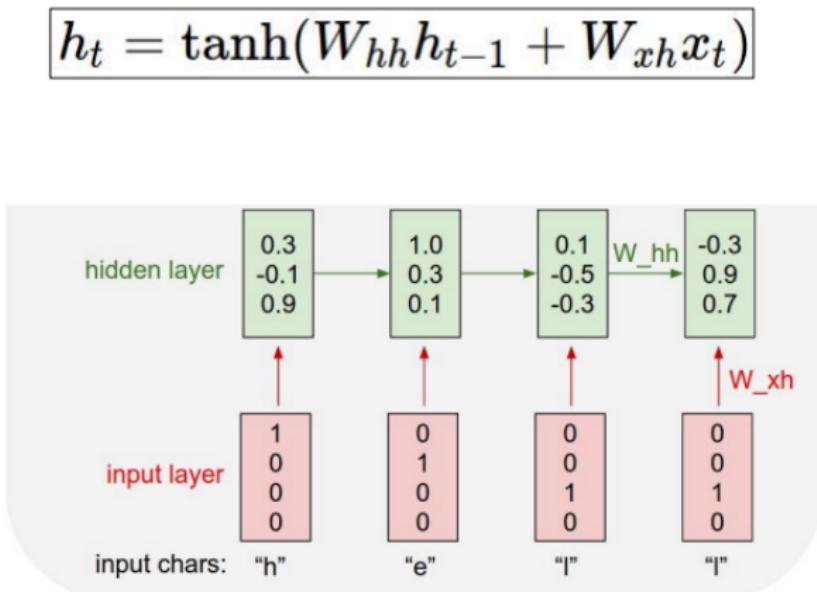


Figure: cs231n, Andrej Karpathy

Example

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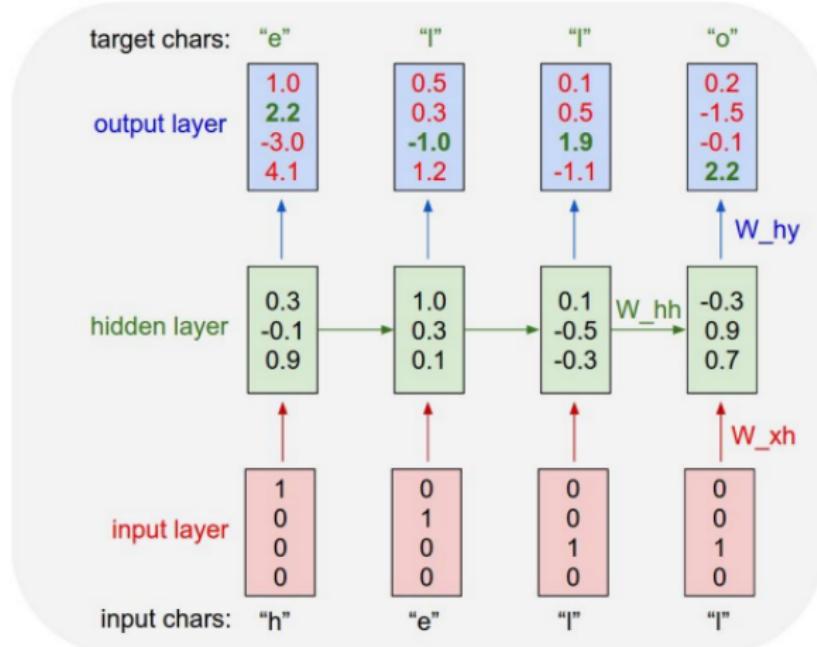


Figure: cs231n, Andrej Karpathy