

人工智能和聊天机器人

AI | 人工智能

神经网络 | 人工神经网络

机器学习 | 通过MNIST数据集了解机器学习

对话系统 | Retrieval Chatbot on Tensorflow

聊天机器人 | Botframework和LUIS

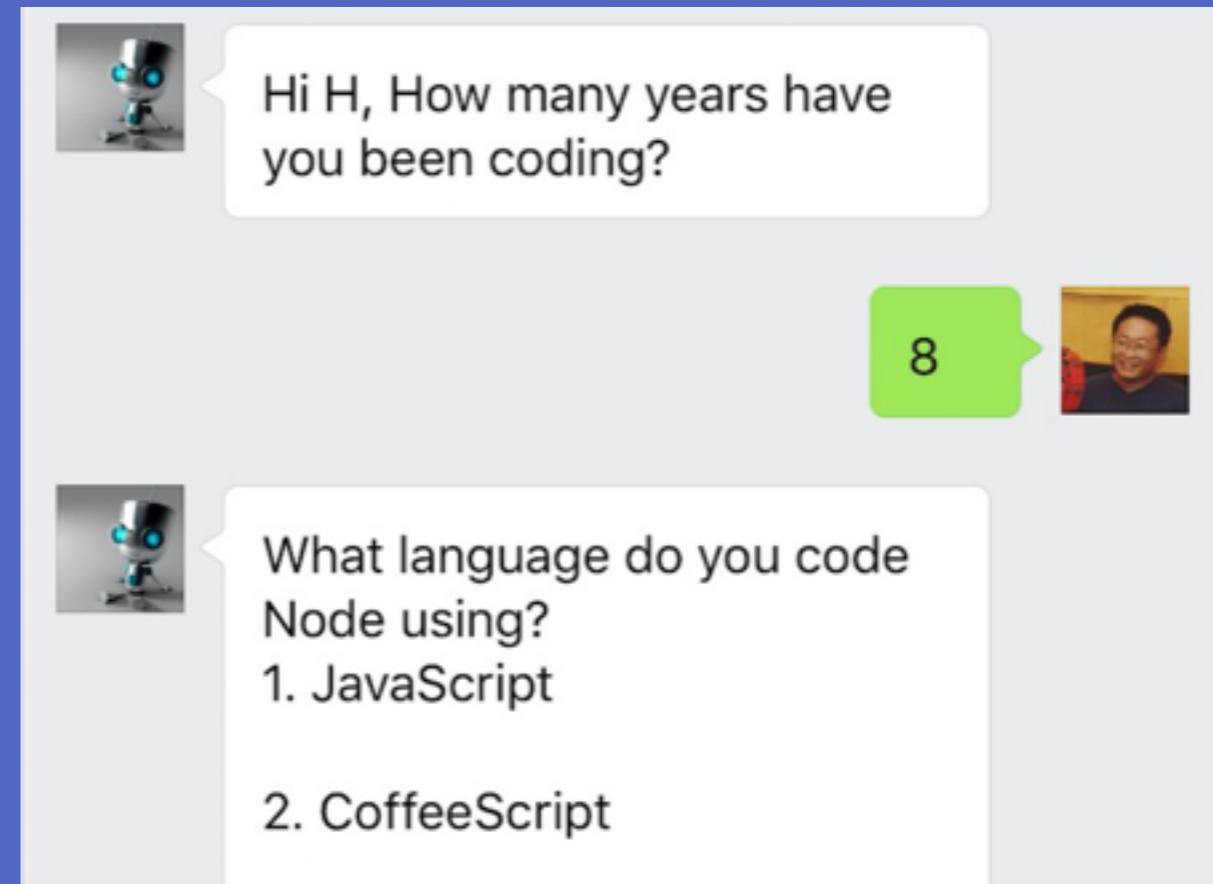


hain

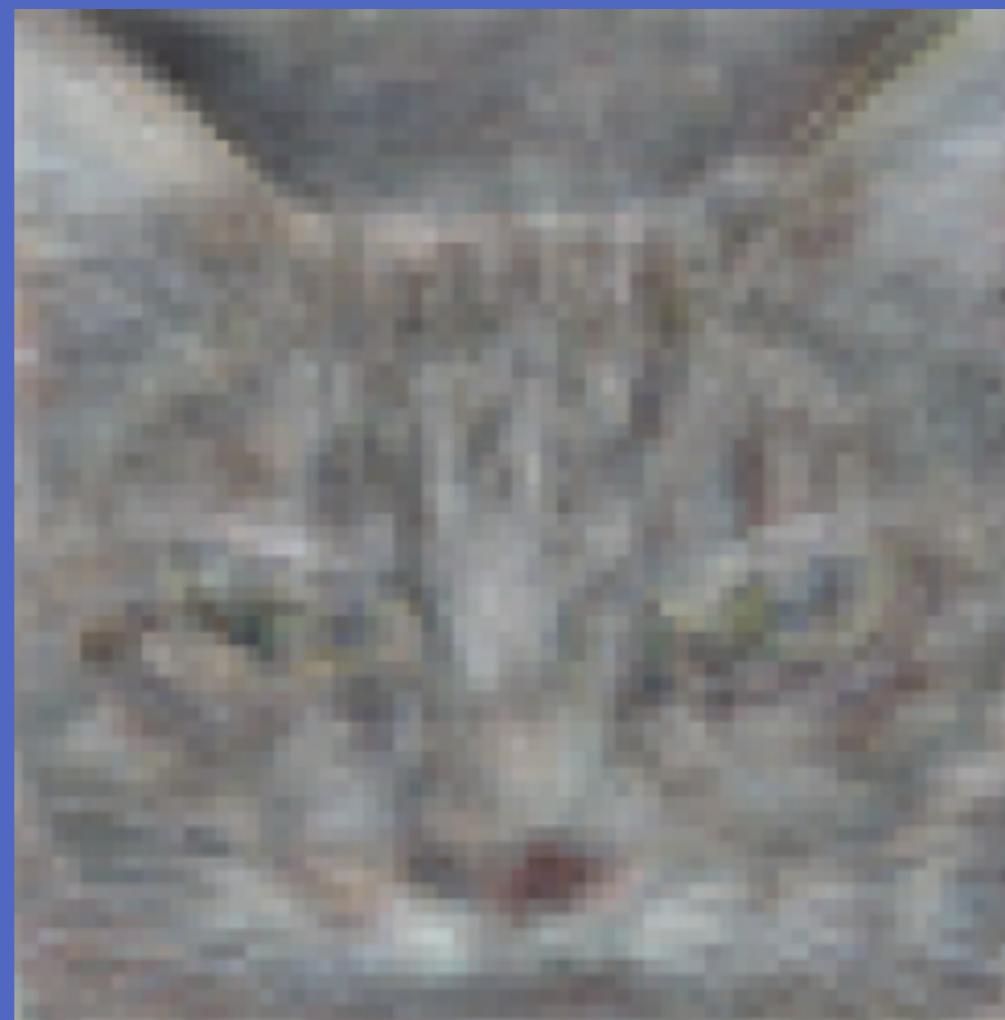
<https://rockq.org/user/hain>

AI

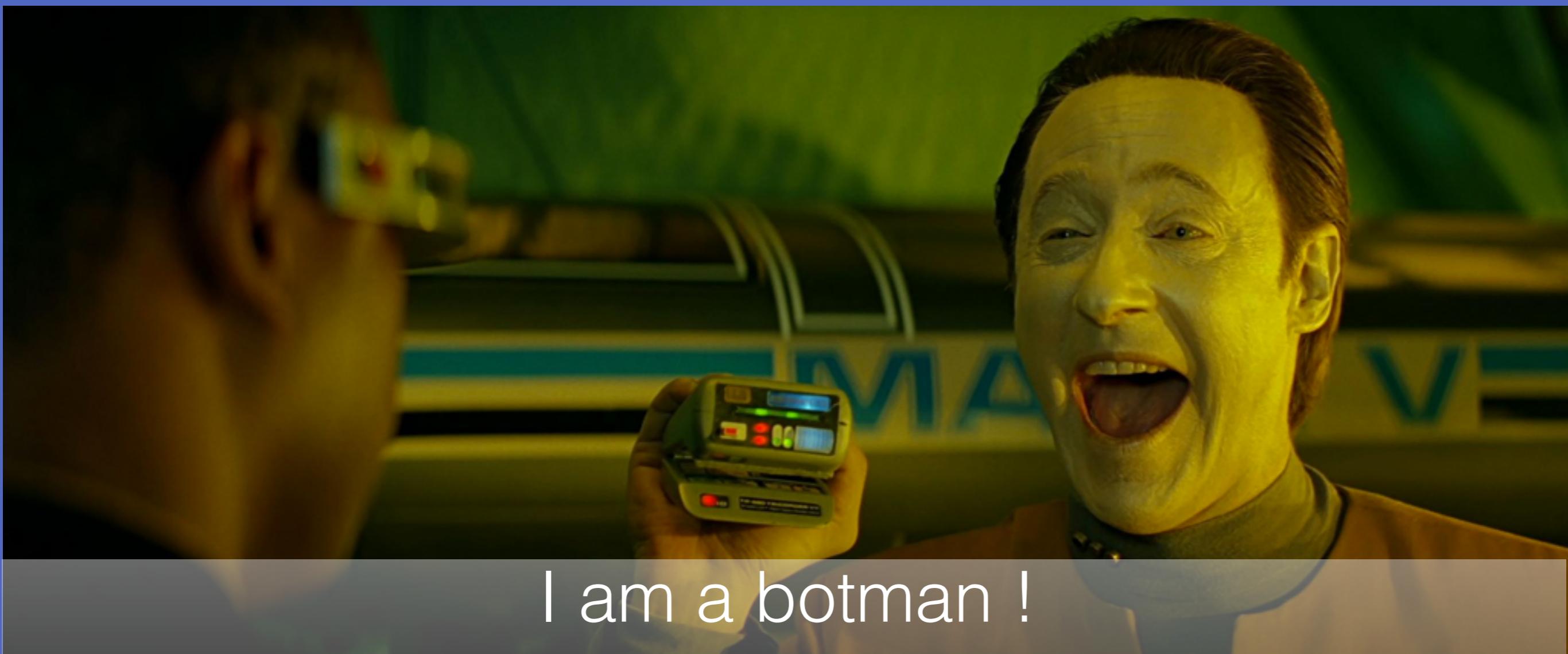




AI



Research at Google

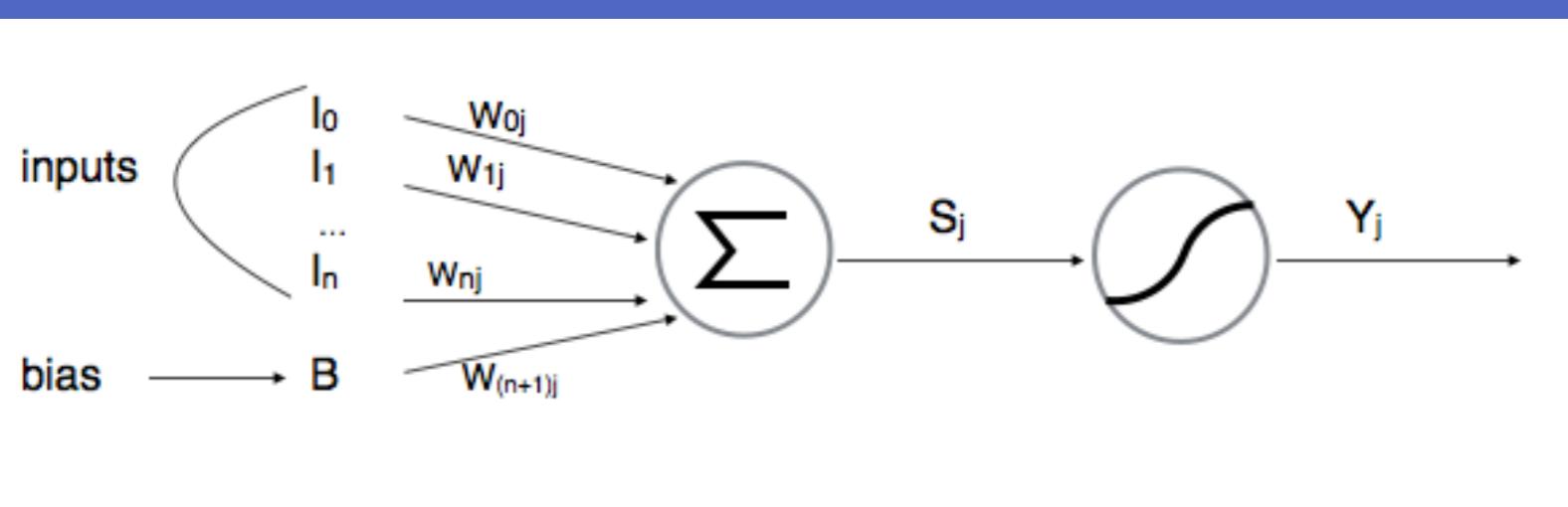


I am a botman !

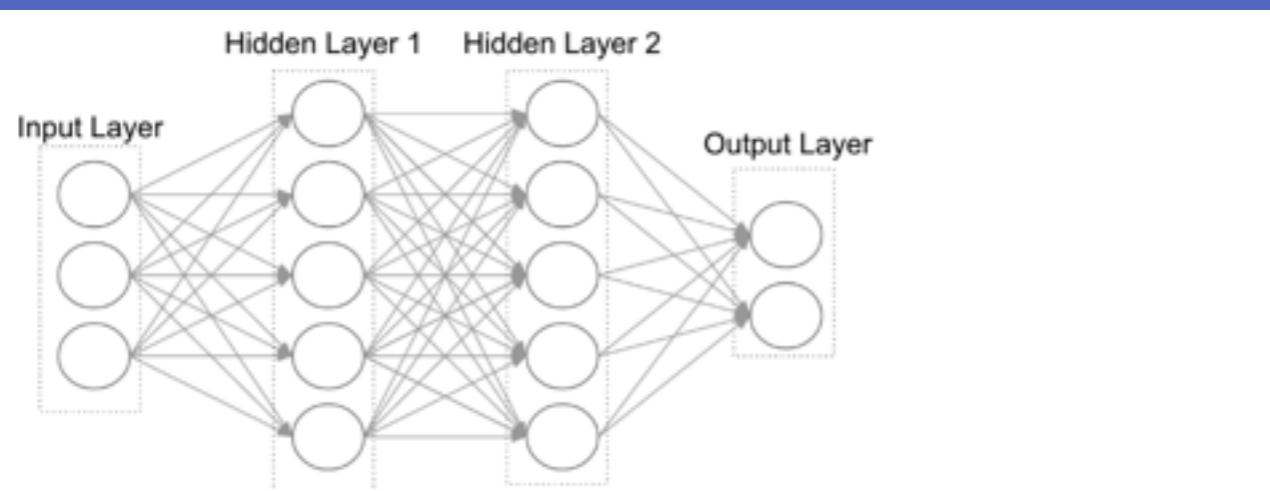
IBM Watson API / AlchemyAPI

腾讯优图

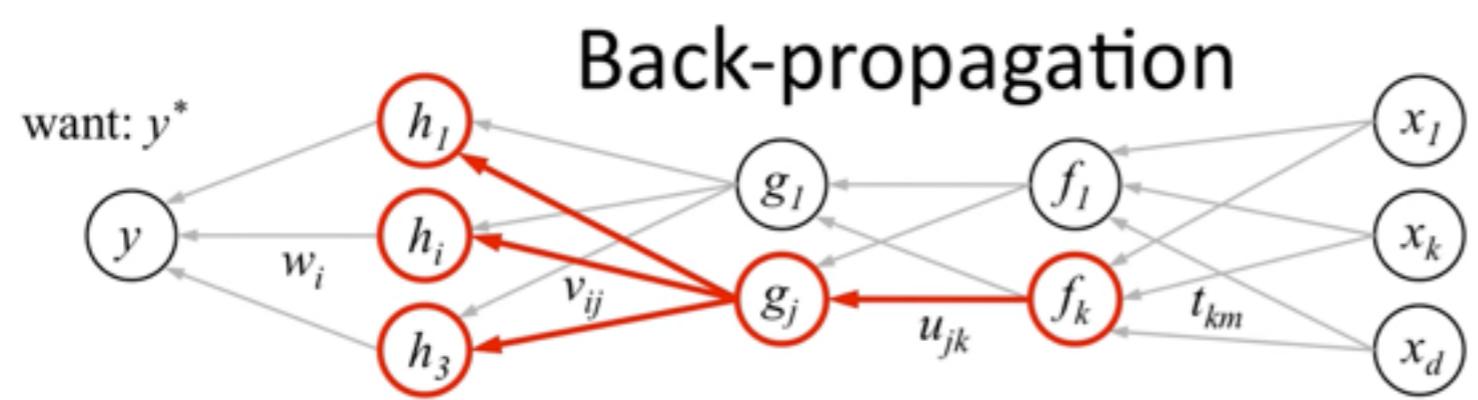
科大讯飞 / 云知声



神经元



前向传播网络

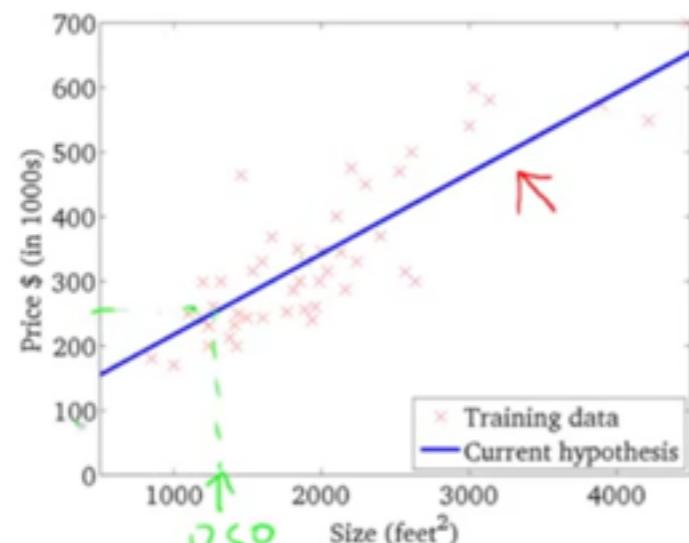


反向传播网络

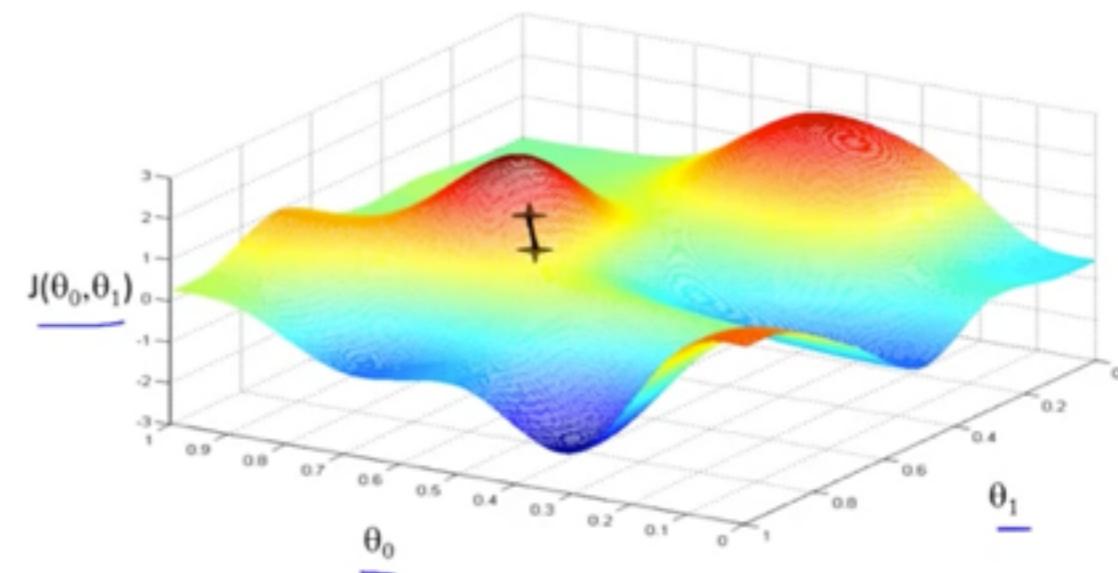


$$h_{\theta}(x)$$

(for fixed θ_0, θ_1 , this is a function of x)



$$y = \theta_0 x + \theta_1$$



Gradient descent algorithm

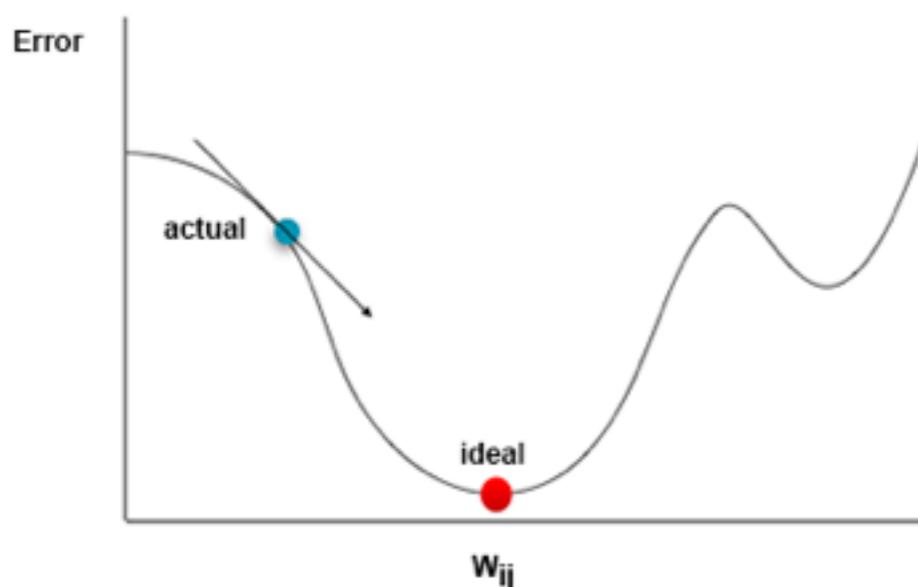
repeat until convergence {

$$\theta_j := \theta_j - \alpha \frac{\partial}{\partial \theta_j} J(\theta_0, \theta_1) \quad (\text{for } j = 0 \text{ and } j = 1)$$

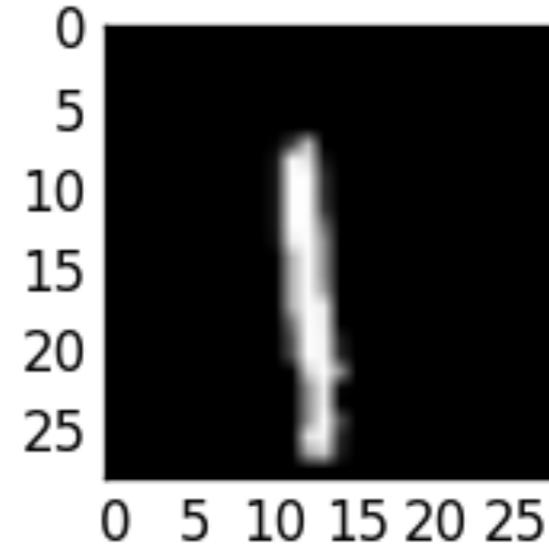
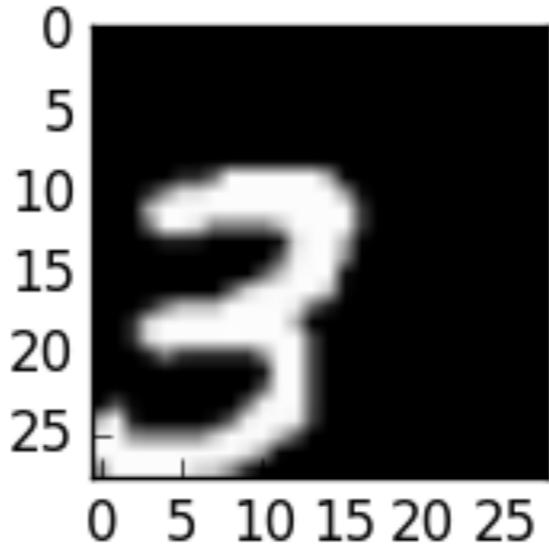
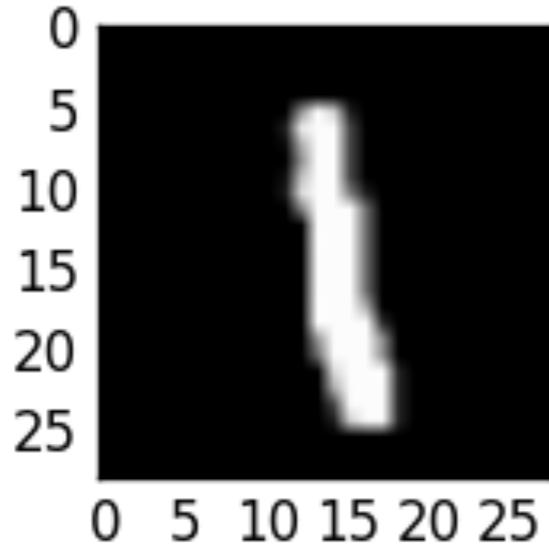
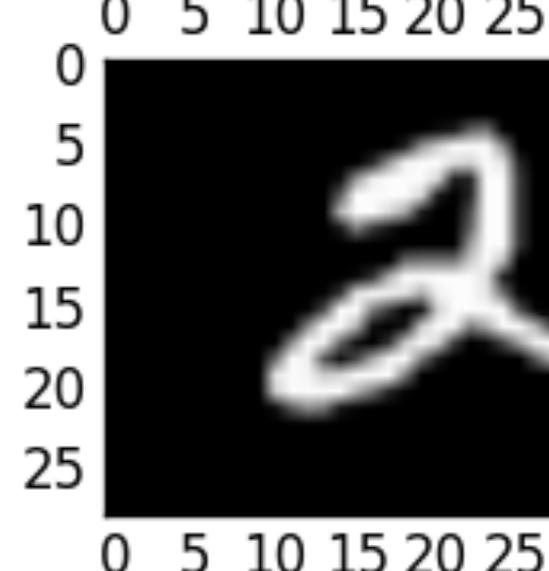
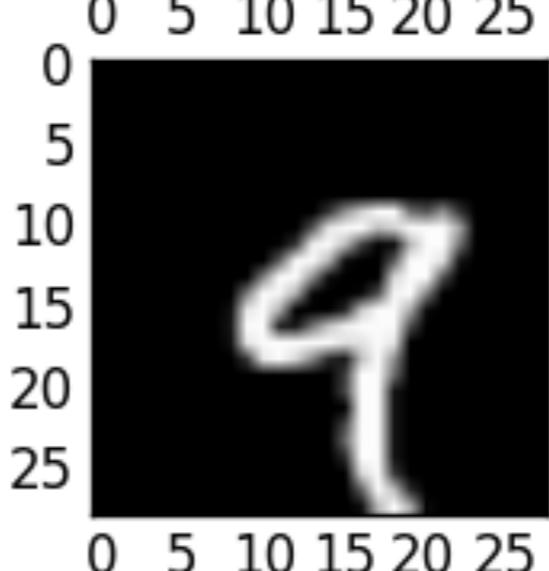
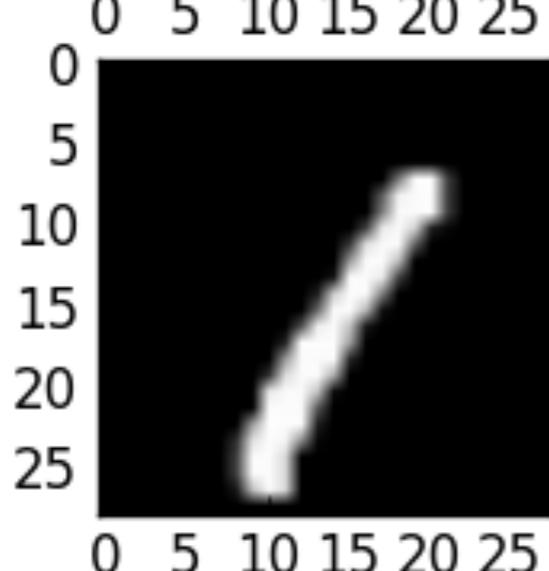
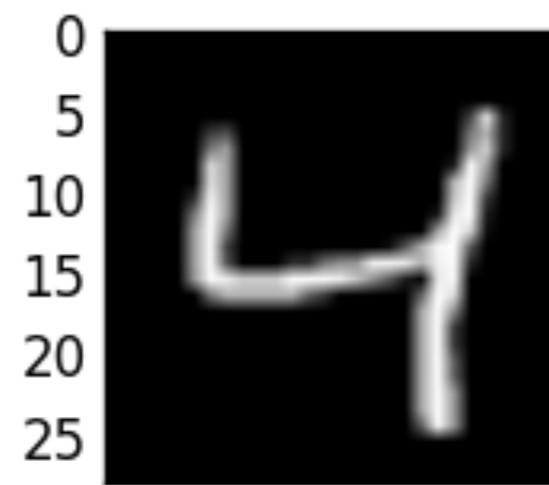
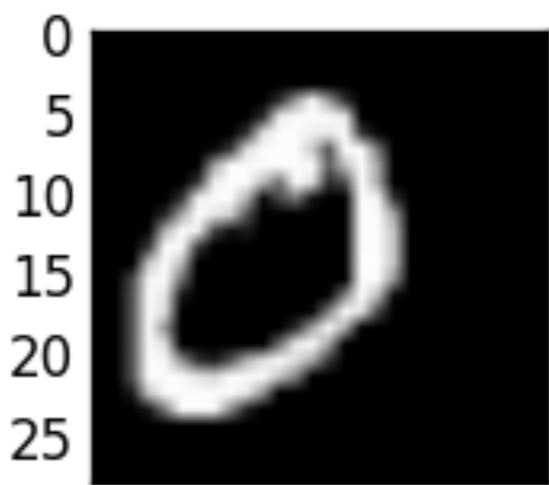
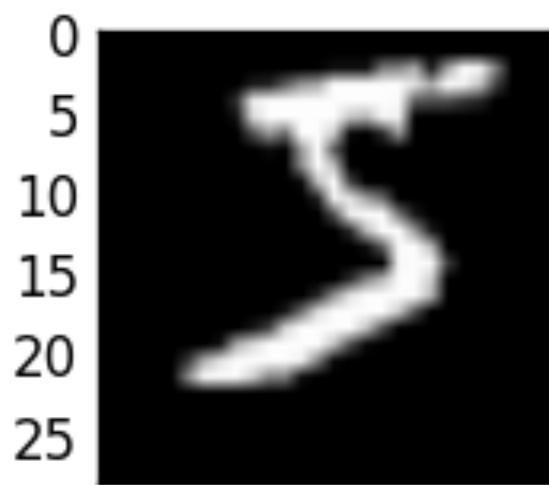
}

Correct: Simultaneous update

```
temp0 :=  $\theta_0 - \alpha \frac{\partial}{\partial \theta_0} J(\theta_0, \theta_1)$ 
temp1 :=  $\theta_1 - \alpha \frac{\partial}{\partial \theta_1} J(\theta_0, \theta_1)$ 
 $\theta_0 := \text{temp0}$ 
 $\theta_1 := \text{temp1}$ 
```



梯度下降原理



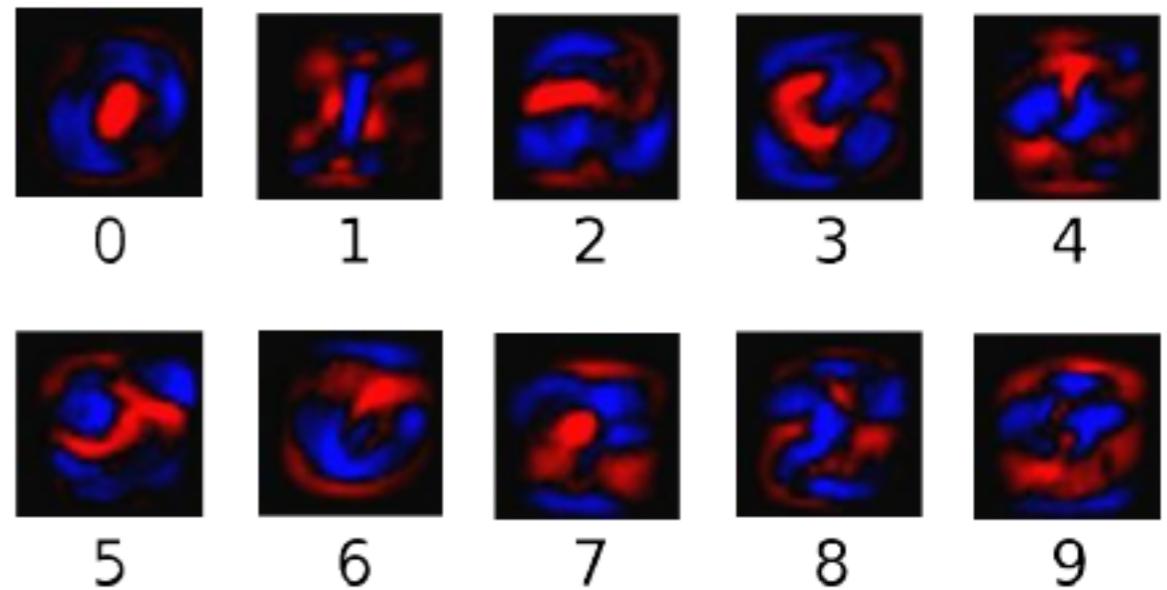
<http://yann.lecun.com/exdb/mnist/>

MNIST数据集



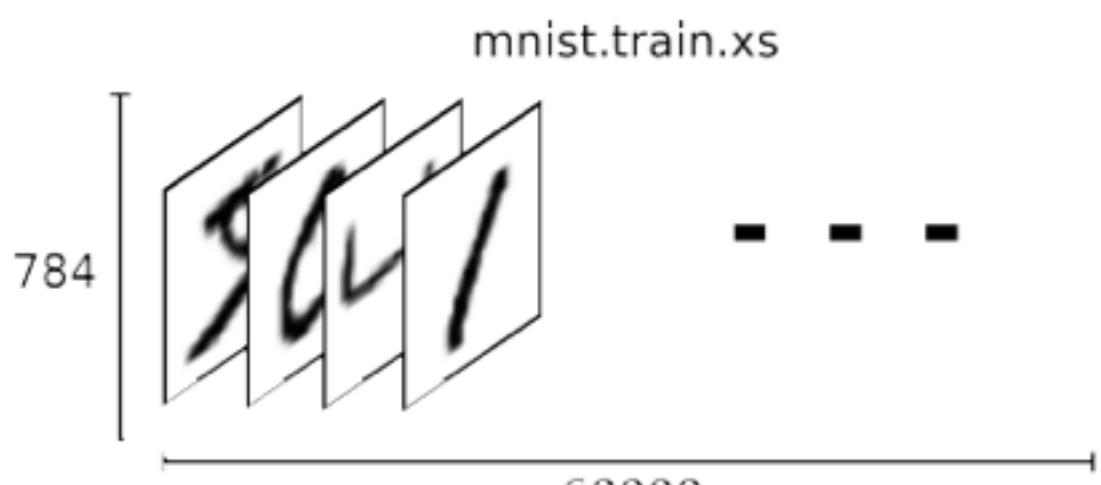
\approx

$$\begin{bmatrix} 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \end{bmatrix}$$

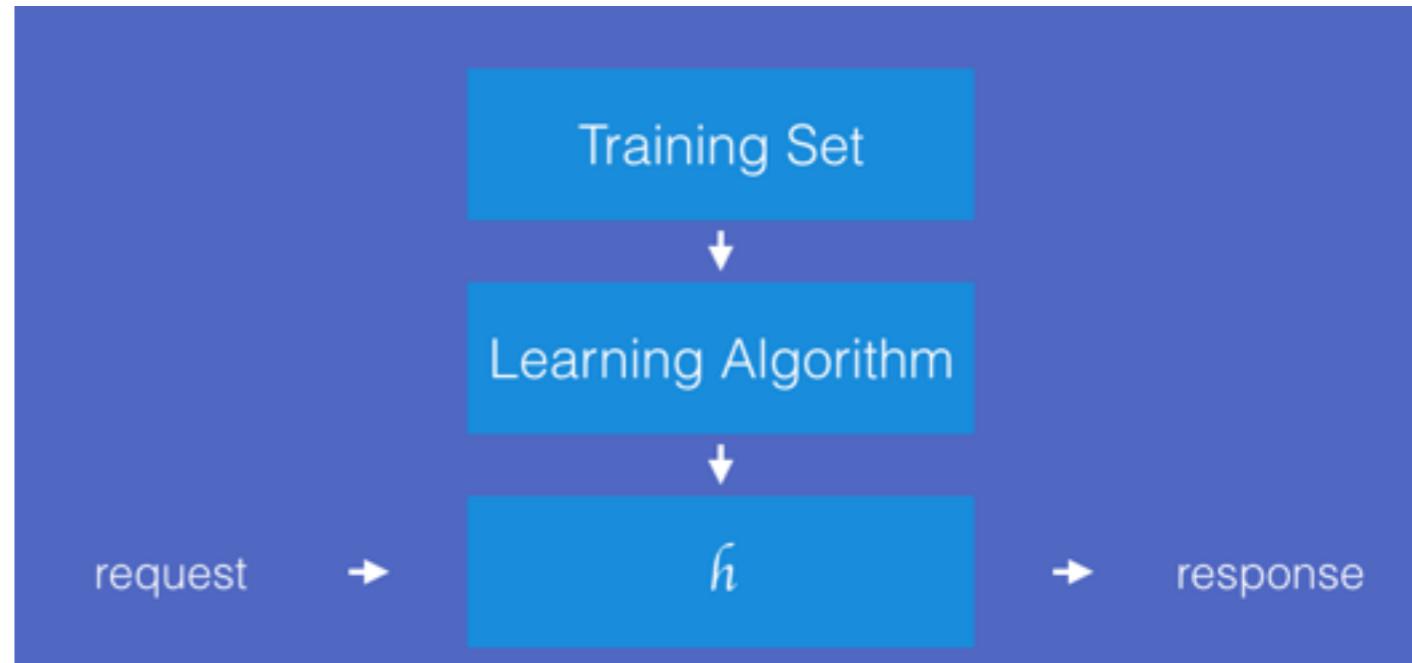


(1)

(4)



(2)



(3)

解决MNIST任务的基本原理



<https://github.com/rockq-org/mnist-nnm>

git clone git@github.com:rockq-org/mnist-nnm.git

cd mnist-nnm/src && npm install && npm test

```
1 // Get neural network model.  
2 var nnm = new require('mnist-nnm').Model();  
3 // Setup MNIST Dataset.  
4 var mnist = require('mnist');  
5 var set = mnist.set(700, 20);  
6 // Train neural network.  
7 nnm.train(set.trainingSet, options);  
8  
9 // Validate with test set.  
10 set.testSet.forEach(function(val, index) {  
11     nnm.validate(val);  
12 });
```



<https://github.com/rockq-org/mnist-nnm>

git clone git@github.com:rockq-org/mnist-nnm.git

cd mnist-nnm/src && npm install && npm test

```
> mnist-nnm@1.0.0 test /Users/hain/ai/node-mnist-sample/src
```

```
> ava "--watch"
```

```
[2016-07-22 11:09:23.569] [INFO] nn.test - start to train {"rate":0.1,"iterations":20,"error":0.01}
iterations 1 error 6.845912501699674 rate 0.1
iterations 2 error 4.504152991349747 rate 0.1
iterations 3 error 3.0283127316694527 rate 0.1
iterations 4 error 1.853700781831871 rate 0.1
iterations 5 error 1.3059480795633154 rate 0.1
iterations 6 error 0.9825529508504853 rate 0.1
iterations 7 error 0.7138775146444608 rate 0.1
iterations 8 error 0.6003610502375651 rate 0.1
iterations 9 error 0.4802941631822216 rate 0.1
iterations 10 error 0.34586961128024746 rate 0.1
iterations 11 error 0.38367775495915907 rate 0.1
iterations 12 error 0.3623804975595399 rate 0.1
iterations 13 error 0.2243141425155864 rate 0.1
iterations 14 error 0.2053262381883071 rate 0.1
```

Fully Connected Layer

Example: 200x200 image
40K hidden units
→ ~2B parameters!!!

- Spatial correlation is local
- Waste of resources + we have not enough training samples anyway..

Locally Connected Layer

Example: 200x200 image
40K hidden units
Filter size: 10x10
4M parameters

Note: This parameterization is good when input image is registered (e.g., face recognition).

Locally Connected Layer

STATIONARITY? Statistics is similar at different locations

Example: 200x200 image
40K hidden units
Filter size: 10x10
4M parameters

Note: This parameterization is good when input image is registered (e.g., face recognition).

Convolutional Layer

Share the same parameters across different locations (assuming input is stationary):
Convolutions with learned kernels



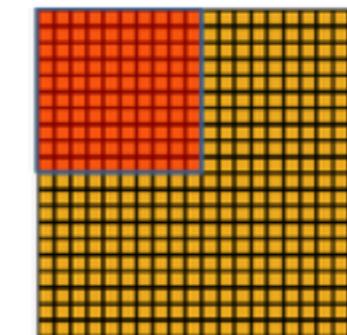
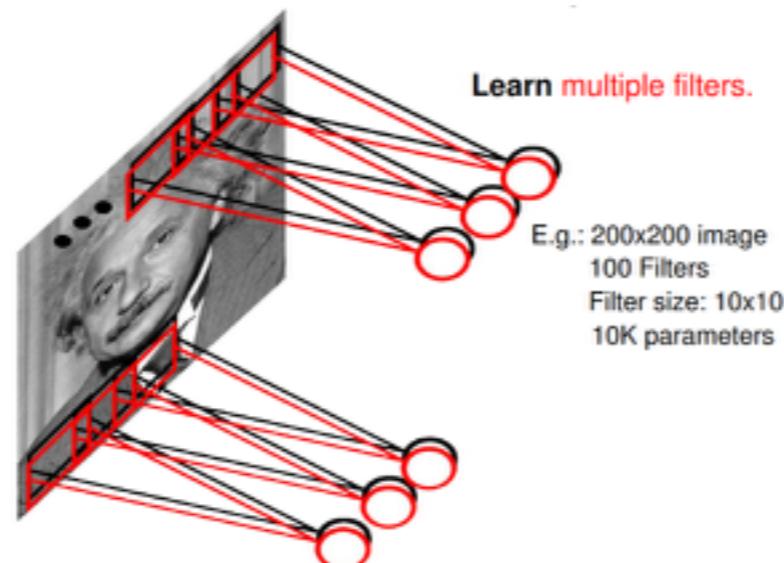
卷积

1	1	1	0	0
0	1	1	1	0
0	0	1	1	1
0	0	1	1	0
0	1	1	0	0

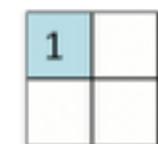
Image

4		

Convolved Feature

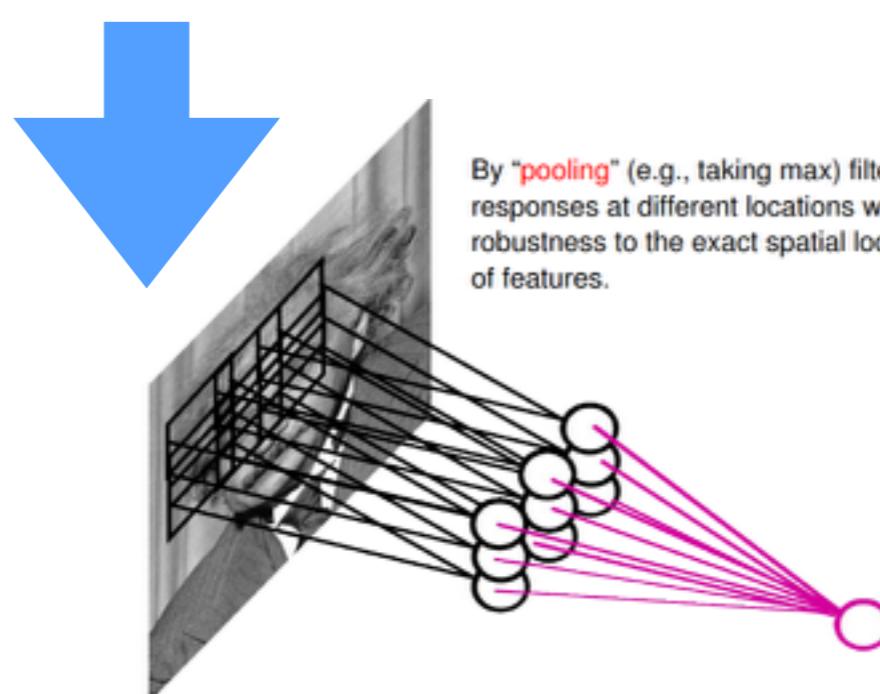


Convolved feature



Pooled feature

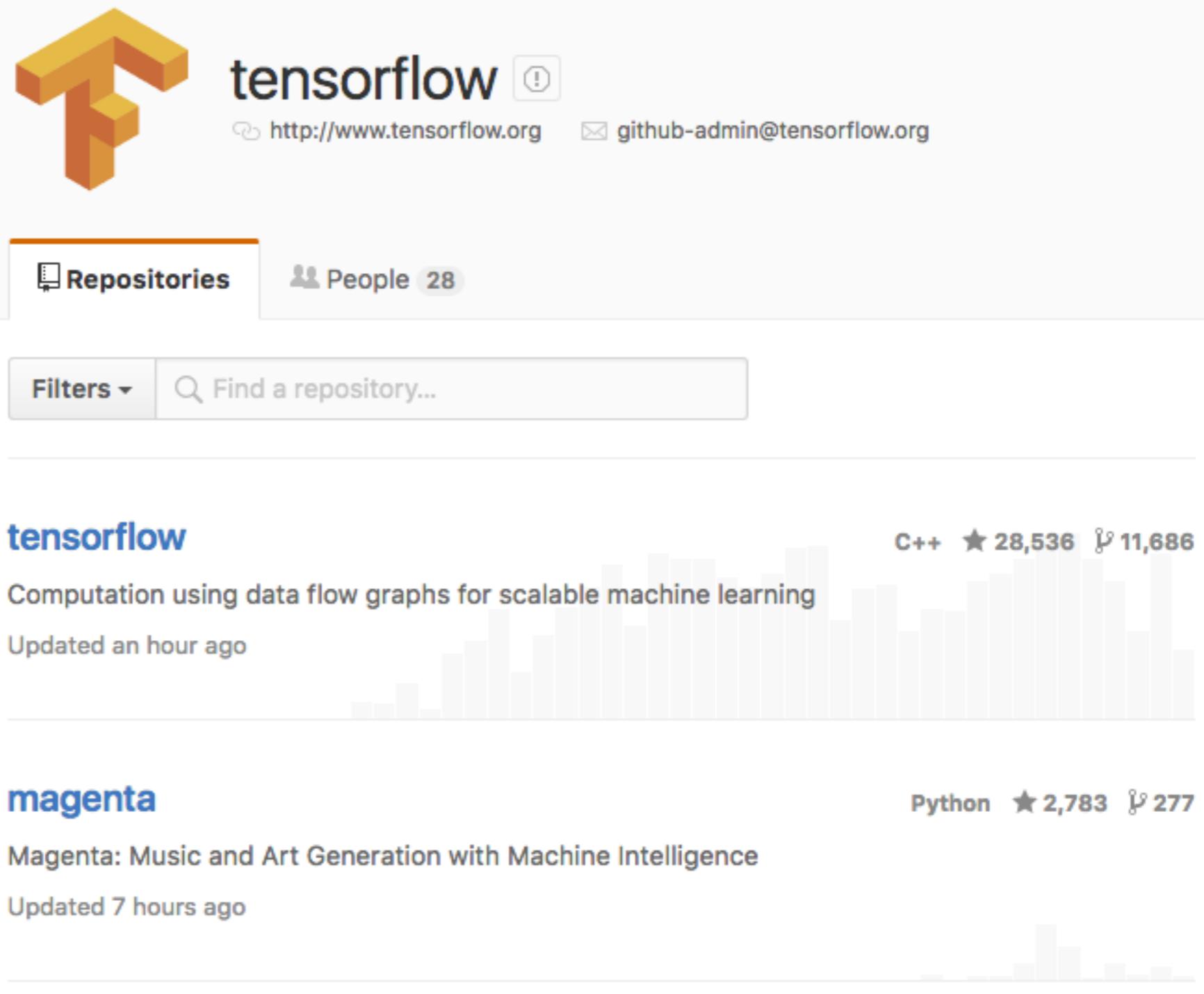
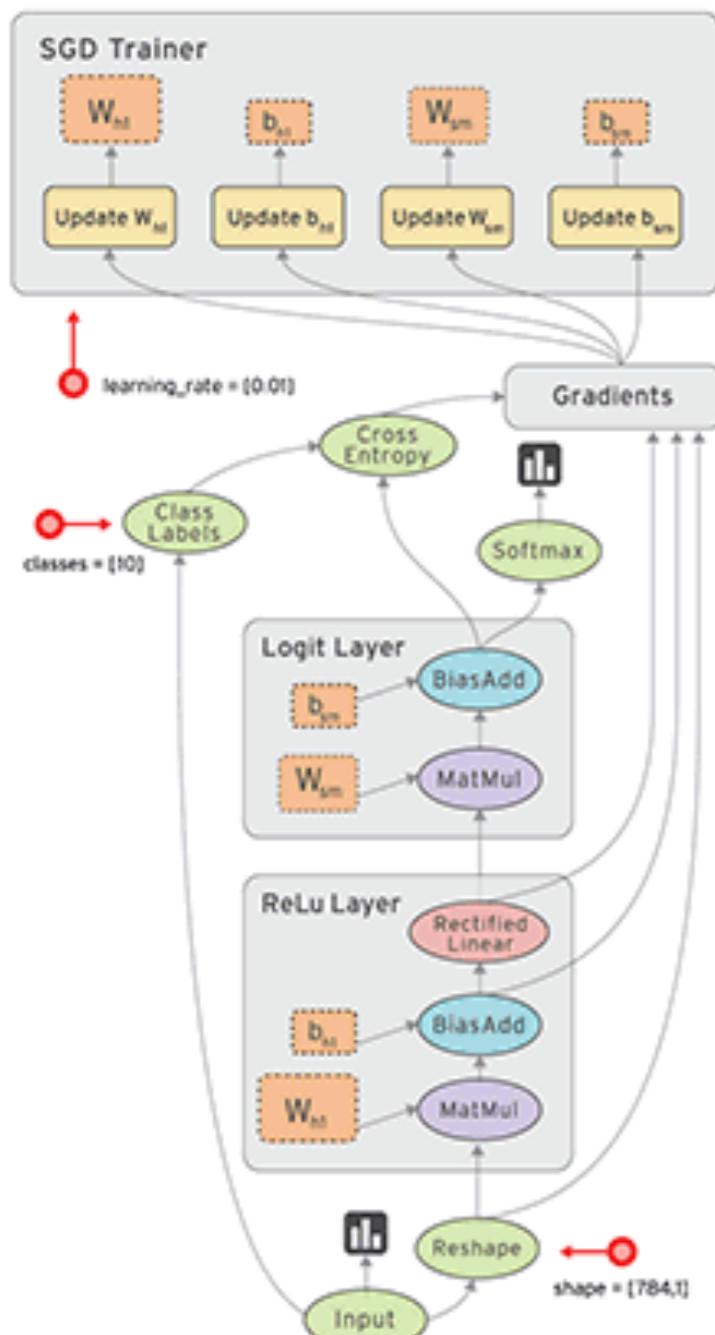
$$\begin{bmatrix} \text{Input Patch} \\ \times \begin{bmatrix} -1 & 0 & 1 \\ -1 & 0 & 1 \\ -1 & 0 & 1 \end{bmatrix} = \end{bmatrix} \begin{bmatrix} \text{Output Feature Map} \end{bmatrix}$$



卷积神经网络



Google TensorFlow





#1 检索的系统



#2 简短的对话



#3 特定的语境



<https://github.com/dennybritz/chatbot-retrieval>

```
git clone git@github.com:dennybritz/chatbot-retrieval.git  
python udc_train.py
```

```
INFO:tensorflow:Input queue is exhausted.  
INFO:tensorflow:Saving evaluation summary for 0 step: loss = 6.19901, recall_at_5 = 0.4931306  
INFO:tensorflow:Step 1: loss = 4.48393  
INFO:tensorflow:training step 100, loss = 1.43115 (4.198 sec/batch).  
INFO:tensorflow:Step 101: loss = 1.58307  
INFO:tensorflow:training step 200, loss = 0.88204 (5.462 sec/batch).  
INFO:tensorflow:Step 201: loss = 0.771809  
INFO:tensorflow:training step 300, loss = 0.82967 (4.408 sec/batch).  
INFO:tensorflow:Step 301: loss = 0.808524  
INFO:tensorflow:training step 400, loss = 0.69053 (4.296 sec/batch).  
INFO:tensorflow:Step 401: loss = 0.725083  
INFO:tensorflow:training step 500, loss = 0.70153 (4.188 sec/batch).  
INFO:tensorflow:Step 501: loss = 0.687135  
INFO:tensorflow:training step 600, loss = 0.70823 (4.896 sec/batch).  
INFO:tensorflow:Step 601: loss = 0.662524  
INFO:tensorflow:training step 700, loss = 0.69382 (4.257 sec/batch).  
INFO:tensorflow:Step 701: loss = 0.702078  
INFO:tensorflow:training step 800, loss = 0.69694 (4.268 sec/batch).  
INFO:tensorflow:Step 801: loss = 0.685443
```



<https://github.com/dennybritz/chatbot-retrieval>

```
git clone git@github.com:dennybritz/chatbot-retrieval.git  
python udc_train.py
```

```
INFO:tensorflow:Input queue is exhausted.  
INFO:tensorflow:Saving evaluation summary for 0 step: loss = 6.19901, recall_at_5 = 0.4931306  
INFO:tensorflow:Step 1: loss = 4.48393  
INFO:tensorflow:training step 100, loss = 4.11757 (1.19 sec/batch).  
INFO:tensorflow:Step 101: loss = 1.58307  
INFO:tensorflow:training step 200, loss = 0.88204 (5.462 sec/batch).  
INFO:tensorflow:Step 201: loss = 0.771809  
INFO:tensorflow:training step 300, loss = 0.92907 (4.708 sec/batch).  
INFO:tensorflow:Step 301: loss = 0.69556  
INFO:tensorflow:training step 400, loss = 0.69053 (4.296 sec/batch).  
INFO:tensorflow:Step 401: loss = 0.72583  
INFO:tensorflow:training step 500, loss = 0.70153 (4.188 sec/batch).  
INFO:tensorflow:Step 501: loss = 0.687135  
INFO:tensorflow:training step 600, loss = 0.70822 (4.896 sec/batch).  
INFO:tensorflow:Step 601: loss = 0.662524  
INFO:tensorflow:training step 700, loss = 0.69382 (4.257 sec/batch).  
INFO:tensorflow:Step 701: loss = 0.702078  
INFO:tensorflow:training step 800, loss = 0.69694 (4.268 sec/batch).  
INFO:tensorflow:Step 801: loss = 0.685443
```

After training for about 20,000 steps:

recall_at_1 = 0.507581018519

recall_at_2 = 0.689699074074

recall_at_5 = 0.913020833333

(around an hour on a fast GPU)

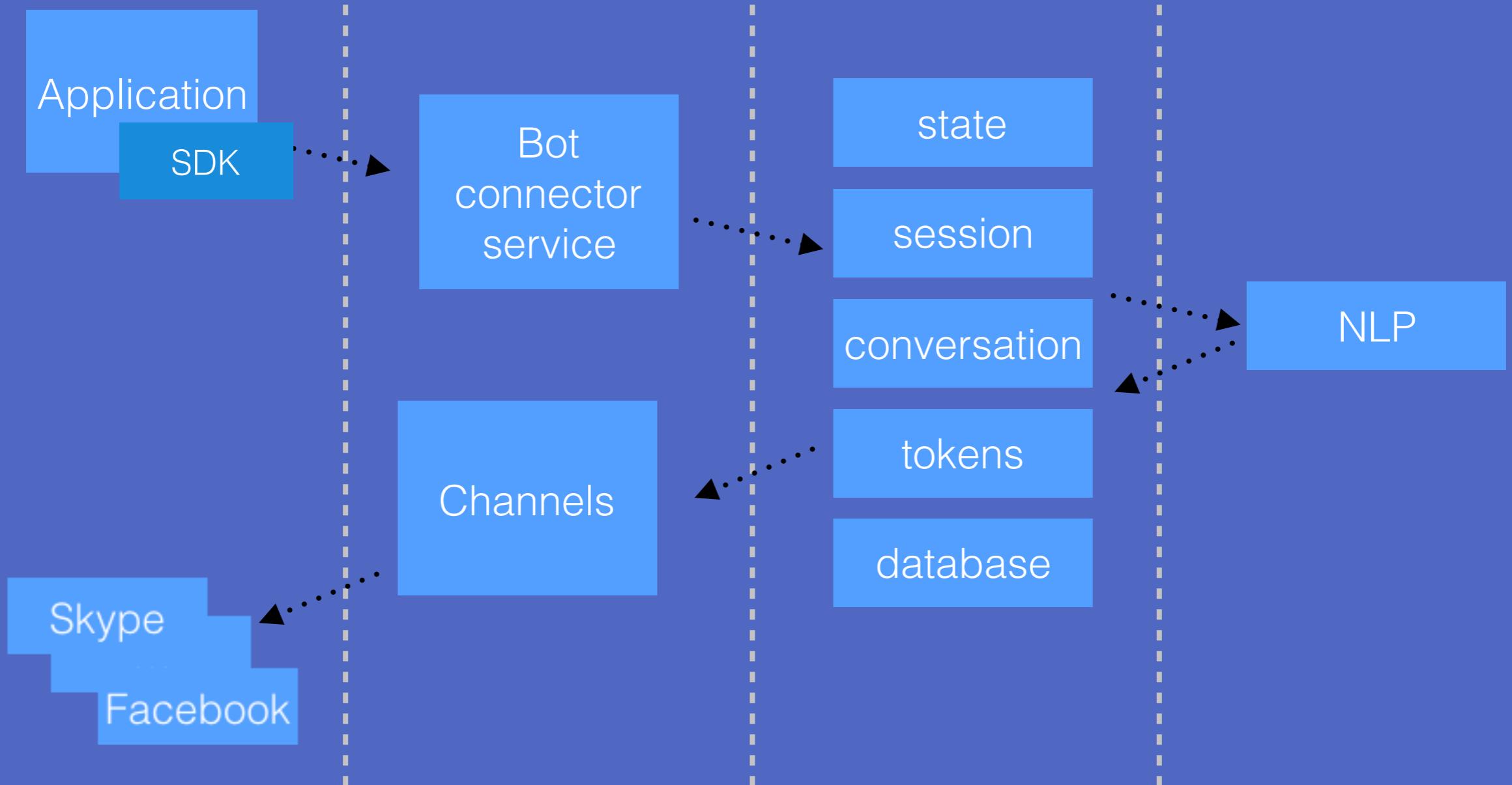


Client

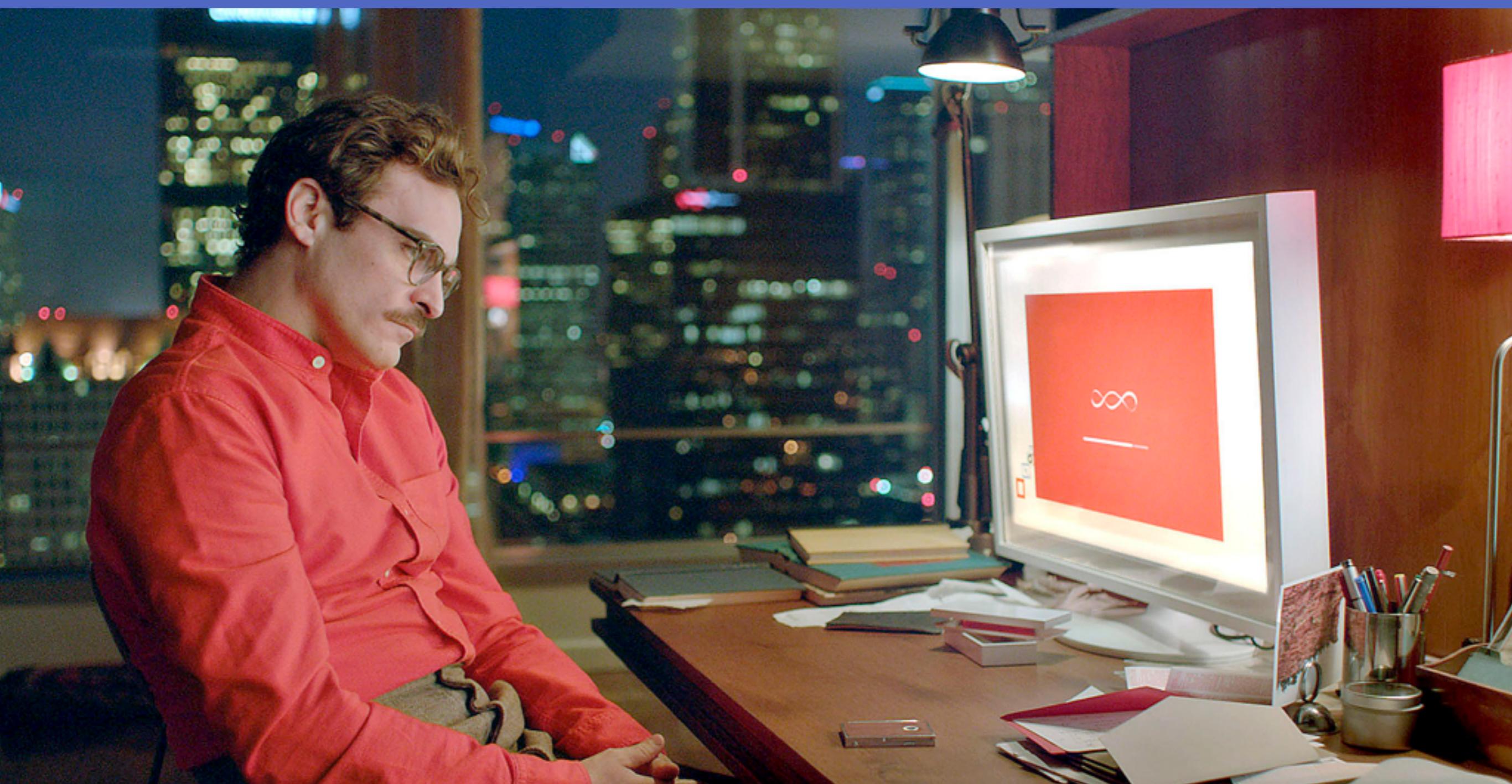
Web services

Server

LUIS



Microsoft Botframework



Cool, wanna hands on, where to start?



Thank you.