

Machine Learning Using Tensorflow

Week 5: Keras and MNIST Handwritings

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MNIST Handwriting Numbers

What is MNIST?

Human Handwriting Numbers

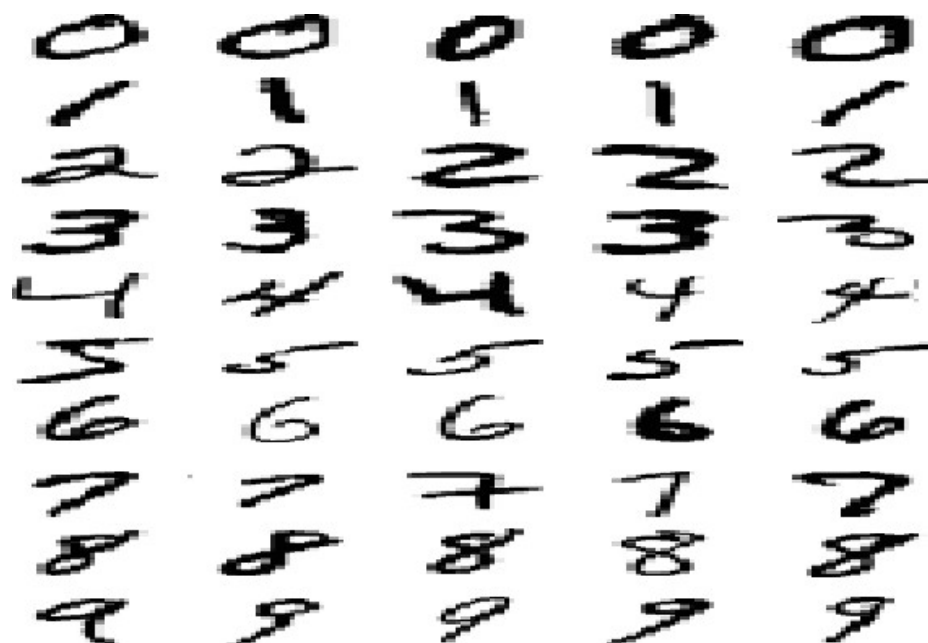
- 60000 train set
- 10000 test set

Each Picture

- 28x28 pixels

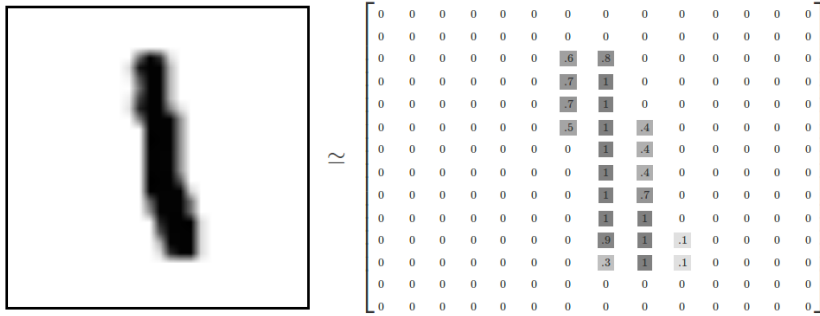
Record High

- 0.83% error via H2O.ai

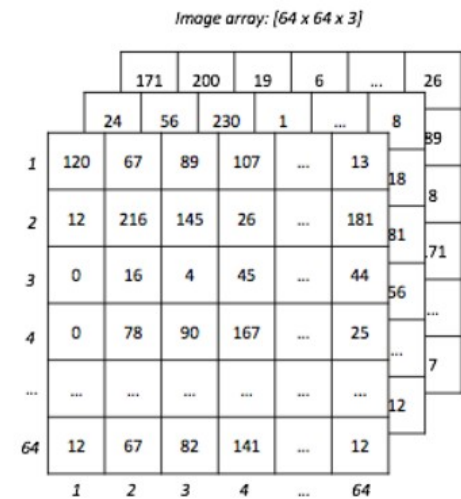


How to deal with pictures?

A figure is essentially a data array

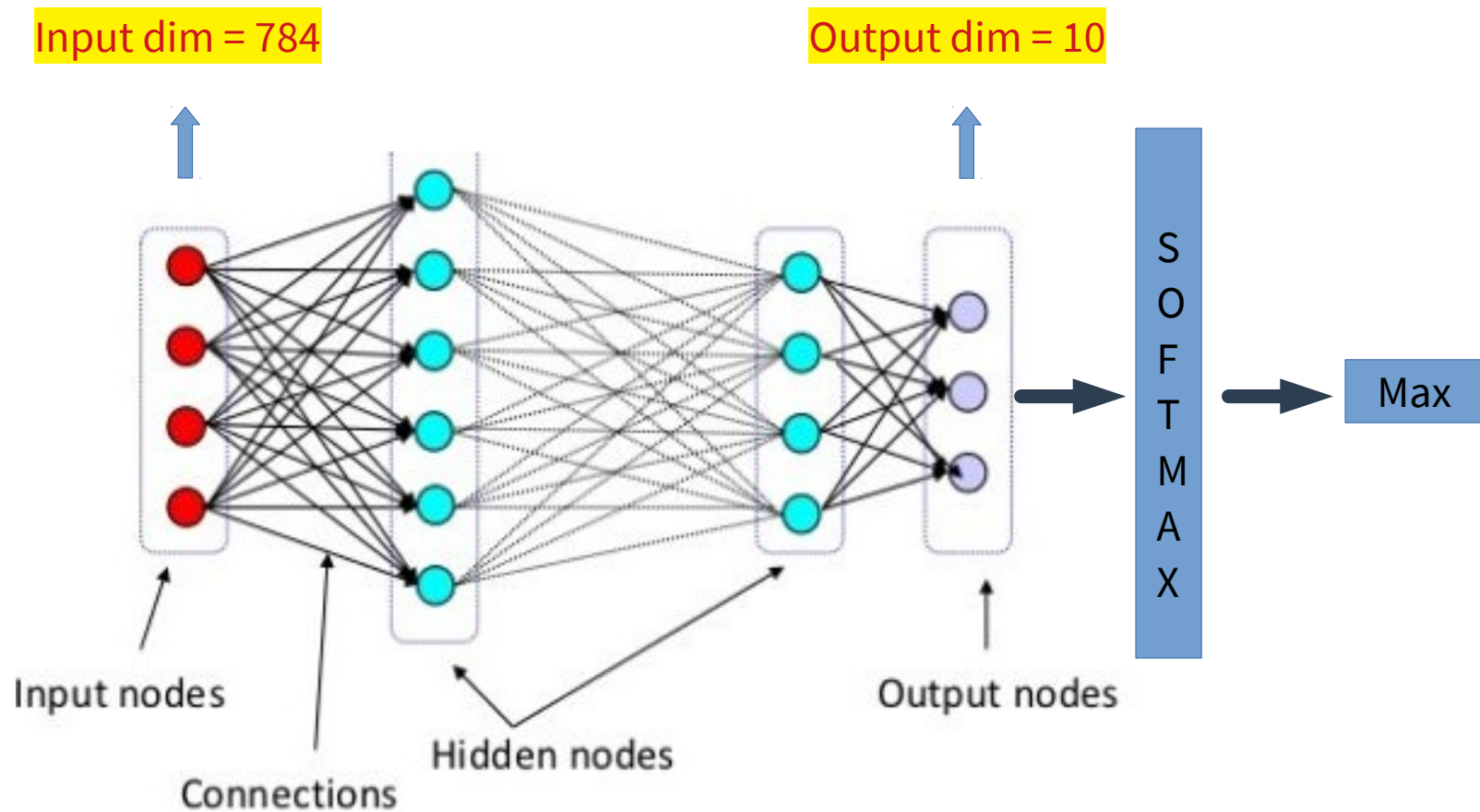


Single Channel



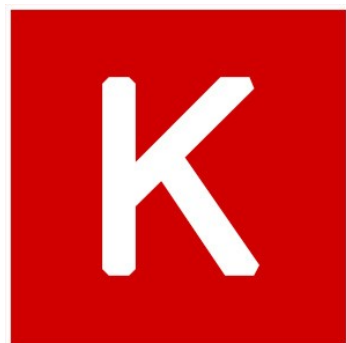
Multi Channel (RGB)

MINST Recognition Using MLP



Keras

What is Keras



High-level API





Fast Growing of Keras

Deep learning libraries: GitHub activity from February 11 to April 12, 2017

new contributors from 2017-02-11 to 2017-04-12			new forks from 2017-02-11 to 2017-04-12		
#1: 131		tensorflow/tensorflow	#1: 4192		tensorflow/tensorflow
#2: 63		fchollet/keras	#2: 991		fchollet/keras
#3: 51		pytorch/pytorch	#3: 810		BVLC/caffe
#4: 49		dmlc/mxnet	#4: 517		deeplearning4j/deeplearning4j
#5: 18		Theano/Theano	#5: 414		dmlc/mxnet
#6: 11		BVLC/caffe	#6: 307		pytorch/pytorch
#7: 11		Microsoft/CNTK	#7: 244		Microsoft/CNTK
#8: 9		tflearn/tflearn	#8: 211		tflearn/tflearn
#9: 9		pfnet/chainer	#9: 134		torch/torch7
#10: 8		torch/torch7	#10: 131		Theano/Theano
#11: 5		deeplearning4j/deeplearning4j	#11: 116		baidu/paddle
#12: 4		NVIDIA/DIGITS	#12: 88		NVIDIA/DIGITS
#13: 3		baidu/paddle	#13: 55		pfnet/chainer
new issues from 2017-02-11 to 2017-04-12			aggregate activity from 2017-02-11 to 2017-04-12		
#1: 1175		tensorflow/tensorflow	#1: 36.64		tensorflow/tensorflow
#2: 568		fchollet/keras	#2: 12.52		fchollet/keras
#3: 499		dmlc/mxnet	#3: 8.53		dmlc/mxnet
#4: 286		pytorch/pytorch	#4: 6.09		BVLC/caffe
#5: 257		Microsoft/CNTK	#5: 5.92		pytorch/pytorch
#6: 239		deeplearning4j/deeplearning4j	#6: 5.12		deeplearning4j/deeplearning4j
#7: 219		baidu/paddle	#7: 4.12		Microsoft/CNTK
#8: 173		Theano/Theano	#8: 2.93		Theano/Theano
#9: 171		BVLC/caffe	#9: 2.86		baidu/paddle
#10: 112		NVIDIA/DIGITS	#10: 2.17		tflearn/tflearn
#11: 84		tflearn/tflearn	#11: 1.68		NVIDIA/DIGITS
#12: 57		pfnet/chainer	#12: 1.38		torch/torch7
#13: 47		torch/torch7	#13: 1.12		pfnet/chainer


What is Keras

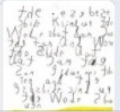

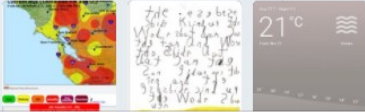
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François Chollet 
[@fchollet](#)
Deep learning @google. Author of Keras, neural networks library. Author of book "Deep Learning with Python". Founder of Wysp, learning platform for artists.
[Mountain View, CA](#)
[keras.io](#)
Joined August 2009
403 Photos and videos








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**François Chollet**  [@fchollet](#) · Mar 1
For all the progress made, it seems like almost all important questions in AI remain unanswered. Many have not even been properly asked yet.
32 270 670



 François Chollet Retweeted


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Official Resource of Keras

 Keras Documentation

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Keras: The Python Deep Learning library

You have just found Keras.

Keras is a high-level neural networks API, written in Python and capable of running on top of [TensorFlow](#), [CNTK](#), or [Theano](#). It was developed with a focus on enabling fast experimentation. *Being able to go from idea to result with the least possible delay is key to doing good research.*

Use Keras if you need a deep learning library that:

- Allows for easy and fast prototyping (through user friendliness, modularity, and extensibility).
- Supports both convolutional networks and recurrent networks, as well as combinations of the two.
- Runs seamlessly on CPU and GPU.

Read the documentation at [Keras.io](#).

Keras is compatible with: **Python 2.7-3.6**.

Guiding principles

- **User friendliness.** Keras is an API designed for human beings, not machines. In the center. Keras follows best practices for reducing cognitive load: it offers consistency, the number of user actions required for common use cases, and it provides clear feedback to user error.
- **Modularity.** A model is understood as a sequence or a graph of standalone, functional layers.

The Keras Blog

Keras is a Deep Learning library for Python, that is simple, modular, and extensible.

[Archives](#) [Github](#) [Documentation](#) [Google Group](#)

A ten-minute introduction to sequence-to-sequence learning in Keras

I see this question a lot -- how to implement RNN sequence-to-sequence learning in Keras? Here is a short introduction.

Note that this post assumes that you already have some experience with recurrent networks and Keras.

Fri 29 September 2017
By [Francois Chollet](#)
In [Tutorials](#).

What is sequence-to-sequence learning?

Sequence-to-sequence learning (Seq2Seq) is about training models to convert sequences from one domain (e.g. sentences in English) to sequences in another domain (e.g. the same sentences translated to French).

```
"the cat sat on the mat" -> [Seq2Seq model] -> "le chat etait assis sur le tapis"
```

This can be used for machine translation or for free-form question answering (generating a natural language answer given a natural language question) -- in general, it is applicable any time you need to generate text.

There are multiple ways to handle this task, either using RNNs or using 1D convnets. Here we will focus on RNNs.

The trivial case: when input and output sequences have the same length

When both input sequences and output sequences have the same length, you can implement such models simply with a Keras LSTM or GRU layer (or stack thereof). This is the case in [this example script](#) that shows how to teach a RNN to learn to add numbers, encoded as character strings:

Installation

You may also consider installing the following **optional dependencies**:

- cuDNN (recommended if you plan on running Keras on GPU).
- HDF5 and h5py (required if you plan on saving Keras models to disk).
- graphviz and pydot (used by **visualization utilities** to plot model graphs).

Then, you can install Keras itself. There are two ways to install Keras:

- Install Keras from PyPI (recommended):

```
sudo pip install keras
```



Graphviz - Graph Visualization Software

Envisioning connections

Graphviz Site Changes

Models in Keras

Sequential Model

Using a list

```
from keras.models import Sequential
from keras.layers import Dense, Activation

model = Sequential([
    Dense(32, input_shape=(784,)),
    Activation('relu'),
    Dense(10),
    Activation('softmax'),
])
```

Using add method

```
from keras.models import Sequential
from keras.layers import Dense, Activation

model = Sequential()
model.add(Dense(32, input_dim=784))
model.add(Activation('relu'))
model.add(Dense(10))
model.add(Activation('softmax'))
```

Functional API

```
from keras.layers import Input, Dense
from keras.models import Model

# This returns a tensor
inputs = Input(shape=(784,))

# a layer instance is callable on a tensor, and returns a tensor
x = Dense(64, activation='relu')(inputs)
x = Dense(64, activation='relu')(x)
predictions = Dense(10, activation='softmax')(x)

# This creates a model that includes
# the Input layer and three Dense layers
model = Model(inputs=inputs, outputs=predictions)
```

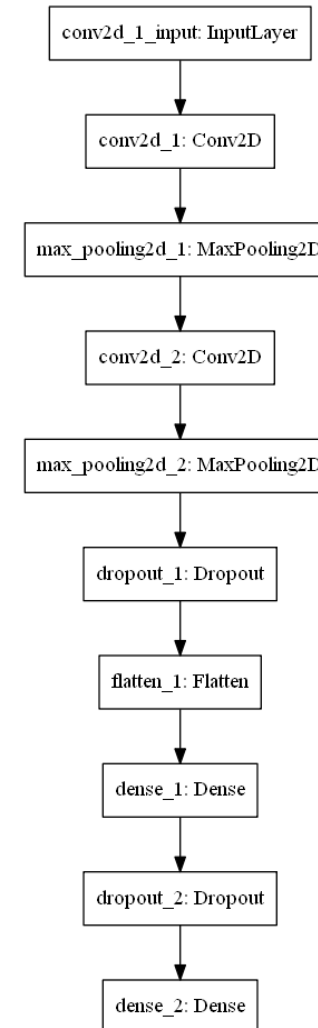
How to plot a model

Prerequisite

- install graphviz
- pip install graphviz, pip install pydot

How to

- from keras.utils import plot_model
- plot_model(model, to_file='model.png')



How to run a model

```
# Train model =====  
model.compile(loss='categorical_crossentropy',  
              optimizer='adam', metrics=['accuracy'])  
  
train_history=model.fit(x=x_train,y=y_train,validation_split=0.2,  
                       epochs=10, batch_size=200,verbose=2)
```

model.compile

- define postprocess after output, e.g: loss, optimizer, metrics

model.fit

- perform training
- output will be an object contains train history

save and reload a model

Save model:

- `model.save(model,'model.h5')`

Reload model:

- `from keras.model import load_model`
- `model=model.load('model.h5')`