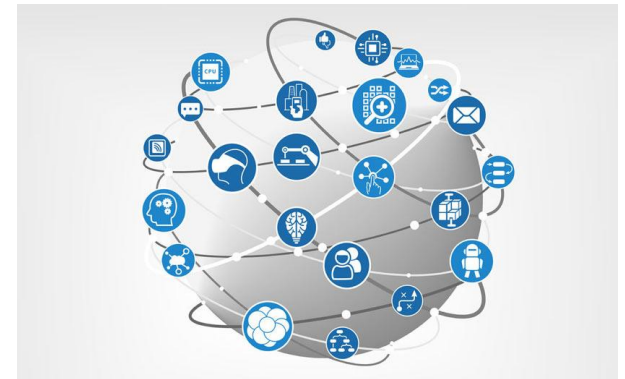
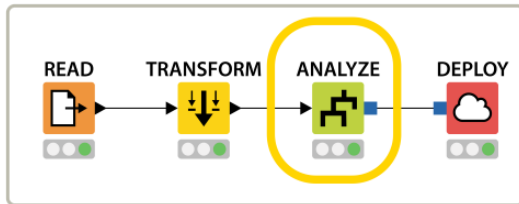
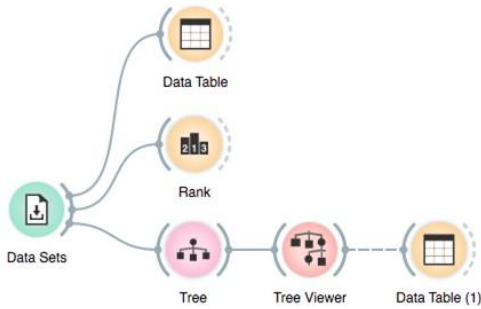


Predictive Analytics and Machine Learning Basics

Class 3: Machine Learning Basics



July 18, 2018
Don Wilcher

Class 3: Machine Learning Basics



Agenda

- What is Machine Learning?
- What is Classification?
- Lab Project: Hand Writing Recognition Training Model.

What is Machine Learning?



Machine learning is a subset of artificial intelligence in the field of computer science that often uses statistical techniques to give computers the ability to "learn" (i.e., progressively improve performance on a specific task) with data, without being explicitly programmed.

Source:

https://en.wikipedia.org/wiki/Machine_learning

What is Machine Learning? . . .



Deriving meaning from data is the promise that machine learning provides (Guo, 2017).

“ Machine learning draws on concepts and results from many fields, including statistics, artificial intelligence, philosophy, information theory, biology, cognitive science, computational complexity, and control theory” (Hall, 1997).

Devices act like human brains through cognition using computers and software (Daffodil Software,2017).

Source:

Hall, T.M. (1997). Machine learning. Ithaca, NY: McGraw-Hill.

Guo, Y. (2017). What is machine learning?. Retrieved from <https://towardsdatascience.com/what-is-machine-learning-8c6871016736>

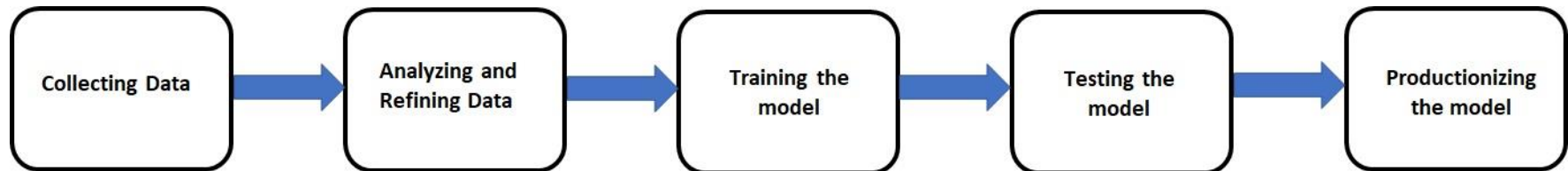
Daffodil Software (2017). 9 applications of machine learning from day-to-day life. Retrieved from <https://medium.com/app-affairs/9-applications-of-machine-learning-from-day-to-day-life-112a47a429d0>

What is Machine Learning? . . .



What is Machine Learning Workflow?

It's a development process that allows for the aggregation and training of data against a specific analytical model. Testing and productionizing of the model is also part of the machine learning workflow process. There five steps for the machine learning workflow process.



Question 1:



What is Machine Learning?

What is Machine Learning? . . .



What is Machine Learning Workflow?

Collecting Data:

The beginning step of the machine learning process. Data drives the entire machine learning workflow. Good quality and accurate data can provide better results for the machine learning model.

Analyzing and Refining the Data:

All data pre-processing takes place in this step. The dataset is analyzed and cleansed to ensure good results from the machine learning model.

Training the model:

An appropriate machine learning algorithm is selected. The dataset is split into training and test sets. The training set is the one where the model learns. The test set provides the analytics on the accuracy of the model.

What is Machine Learning? . . .



What is Machine Learning Workflow?

Testing the model:

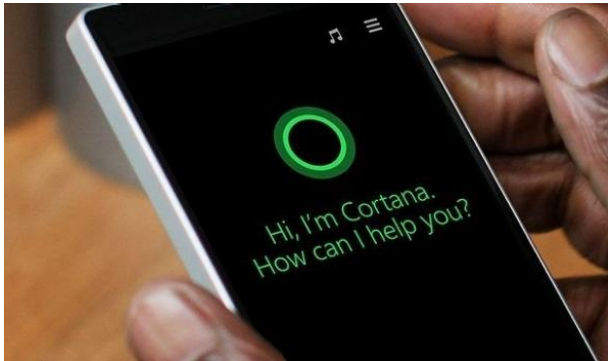
With the model trained, live data can be applied to the model. If the results are not accurate, the model should be improved and retested.

Productionizing the model:

With the model tested and trained its released for production. This task is as simple as including the machine learning into the target software app or electronics product. Most machine learning models are deployed from the cloud.

What is Machine Learning? . . .

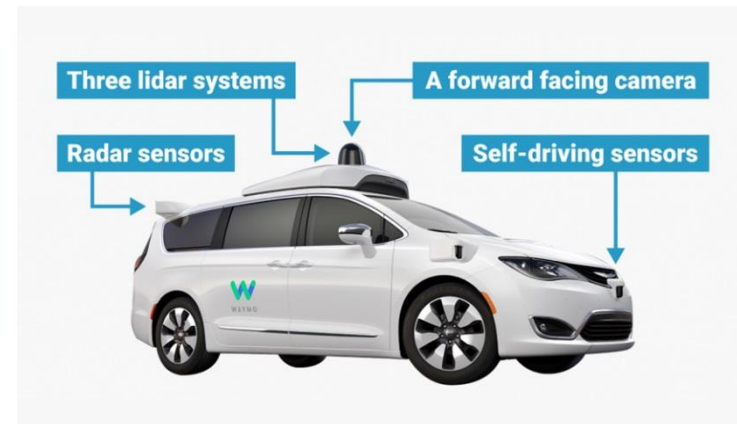
Machine Learning Applications



amazon.com Recommended for You

Amazon.com has new recommendations for you based on [items](#) you purchased or told us you own.

 Google Apps Deciphered: Compute in the Cloud to Streamline Your Desktop	 Google Apps Administrator Guide: A Private-Label Web Workspace	 Googlepedia: The Ultimate Google Resource (3rd Edition)
---	--	---



LIDAR: Laser Imaging Detecting And Ranging

What is Machine Learning? . . .



Machine Learning Applications

- Virtual Personal Assistants – Siri, Alex, and Google Now are trained based on questions being asked. Obtains data from storage clouds.
- Predictions while commuting – GPS navigation apps build maps using data. Example: Traffic predictions.
- Videos Surveillance – Possible to detect a crime before it happens using deviant behavior data patterns.
- Product Recommendations – Online stores capable of suggesting products based on shopping patterns data.
- Autonomous Vehicles – With the use of electronic sensors, and GPS navigation data, self driving cars can transverse roads from cities and highways without human drivers.

What is Classification?



Classification Models – Predicts the object membership based on characteristics grouping.

FAQs:

- The focus is on binary decision making.
- Prediction based on a true or false, yes or no 1 or 0 hierarchical format.
- Assigning a task of assigned objects from several predefined categories (Tan, Steinbach et al., 2016).
- Classifications uses Decision Trees to aid in attribute or event predictions.

Source:

Tan, P.N., Steinbach, M., & Kumar, V. (2016). Introduction to data mining. Retrieved from <https://www-users.cs.umn.edu/~kumar001/dmbook/ch4.pdf>

Question 2:



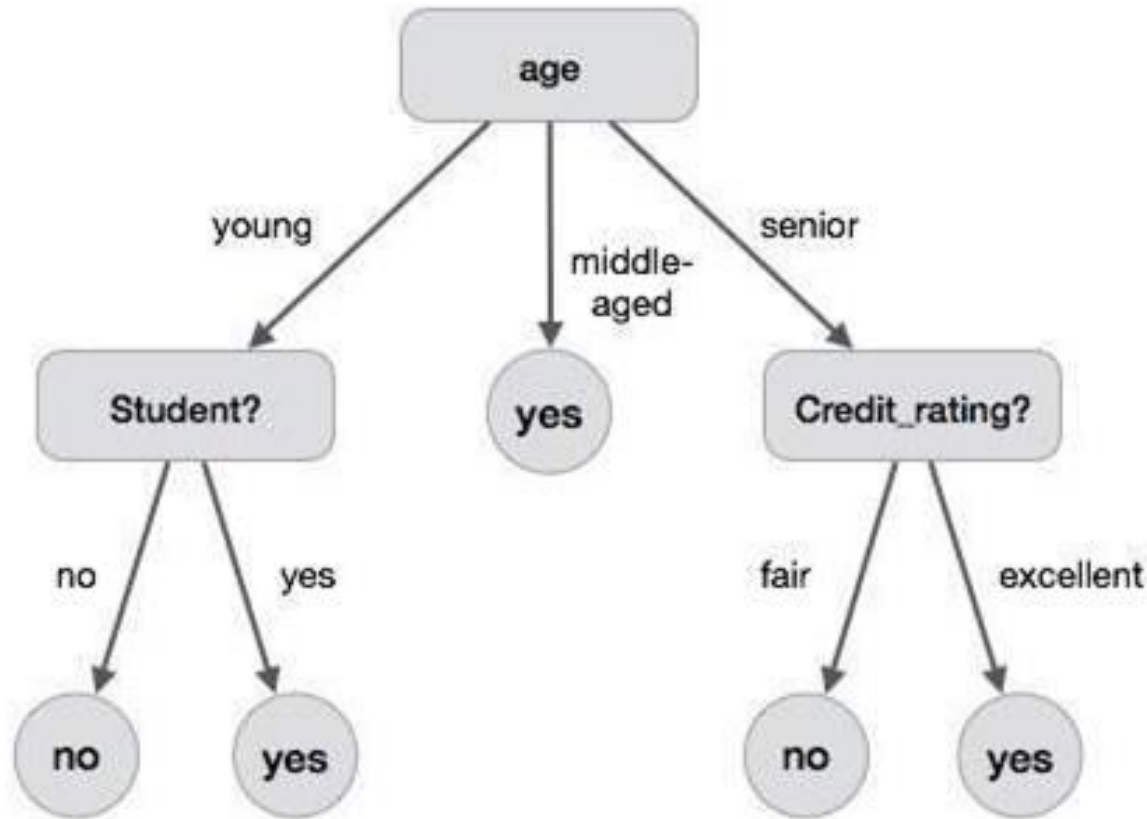
What are the five steps for the Machine Learning Workflow process?

What is Classification? . . .



Decision Tree Problem:

Determining the student's age and credit rating.



What is Classification? . . .



Decision Trees:

Decision trees used in [data mining](#) are of two main types:

- **[Classification tree](#)** analysis is when the predicted outcome is the class to which the data belongs.
- **Regression tree** analysis is when the predicted outcome can be considered a real number (e.g. the price of a house, or a patient's length of stay in a hospital).
- **Data mining** is the process of discovering patterns in large [data sets](#) involving methods at the intersection of [machine learning](#), [statistics](#), and [database systems](#).

Source:

https://en.wikipedia.org/wiki/Decision_tree_learning#Decision_tree_types

What is Classification? . . .



Supervised learning: The output datasets are provided which are used to train the machine. **Classification Decision Trees** use supervised learning to predict outcomes of events or attributes. The key elements to classification is the training and prediction capabilities of the machine.



Data is the key



Source:

Guo, Y. (2017). What is machine learning?. Retrieved from <https://towardsdatascience.com/what-is-machine-learning-8c6871016736>

What is Classification? . . .



```
male_female_classifier.ipynb ☆
File Edit View Insert Runtime Tools Help
+ CODE + TEXT ↑ CELL ↓ CELL
▶
▶ from sklearn import tree
  clf = tree.DecisionTreeClassifier()

  # [height, weight, shoe_size]
  X = [[181, 80, 44], [177, 70, 43], [160, 60, 38], [154, 54, 37], [166, 65, 40],
       [190, 90, 47], [175, 64, 39],
       [177, 70, 40], [159, 55, 37], [171, 75, 42], [181, 85, 43]]

  Y = ['male', 'male', 'female', 'female', 'male', 'male', 'female', 'female',
       'female', 'male', 'male']

  # train model with male and female data
  clf = clf.fit(X, Y)

  # make prediction with new data
  prediction = clf.predict([[190, 70, 48]])

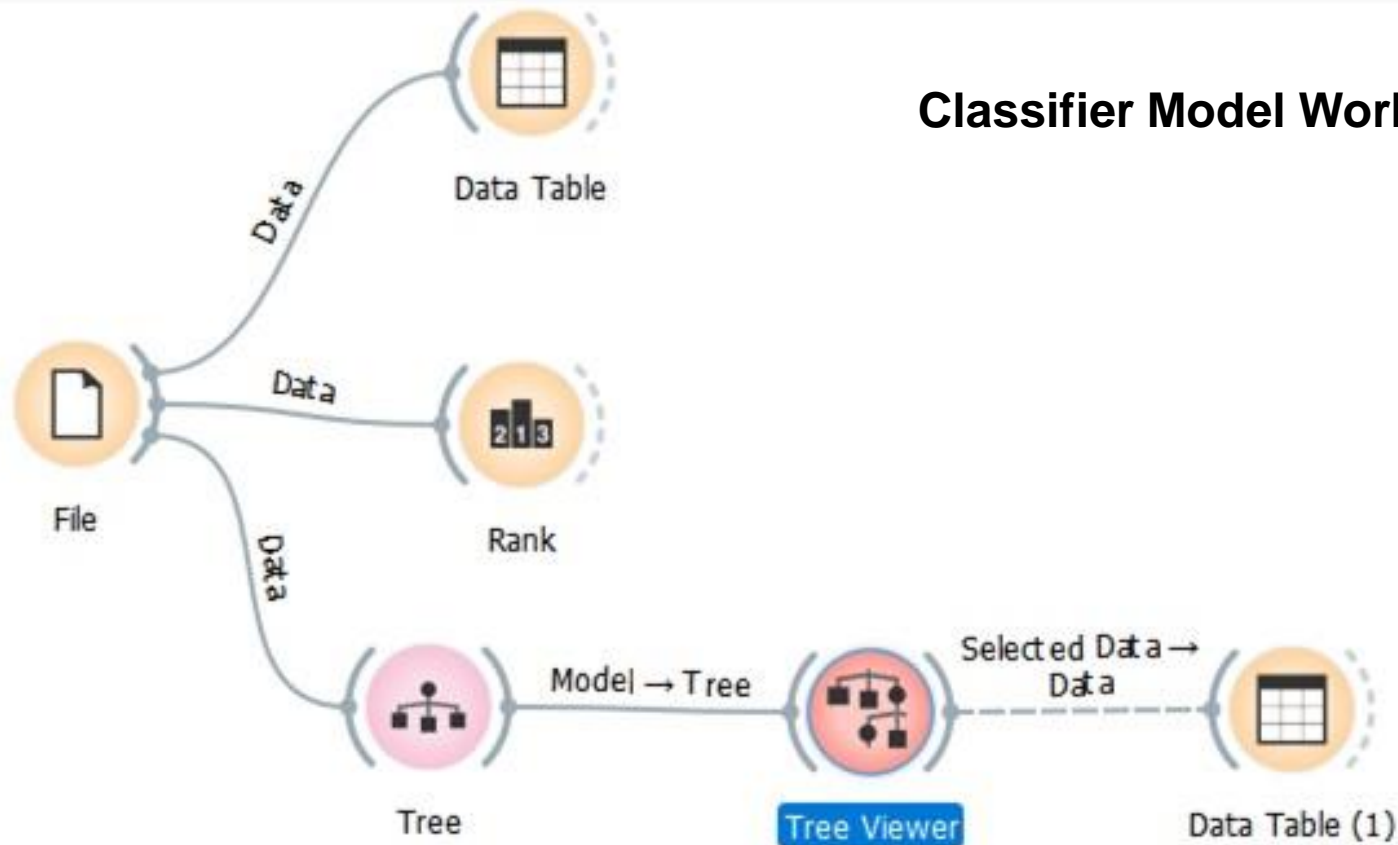
  # print prediction
  print(prediction)
↳ ['male']
```


Question 3:



What is a Classification Model?

What is Classification? . . .



What is Classification? . . .



File: male_female_data.csv

URL:

Info

11 instance(s), 4 feature(s), 0 meta attribute(s)
Data has no target variable.

Columns (Double click to edit)

	Name	Type	Role	Values
1	height	N numeric	feature	
2	weight	N numeric	feature	
3	shoe size	N numeric	feature	
4	gender	C categorical	target	female, male

Browse documentation datasets

Apply

Formatting data file

What is Classification? . . .



Data Table

Info

- 11 instances (no missing values)
- 3 features (no missing values)
- Discrete class with 2 values (no missing values)
- No meta attributes

Variables

- Show variable labels (if present)
- Visualize numeric values
- Color by instance classes

Selection

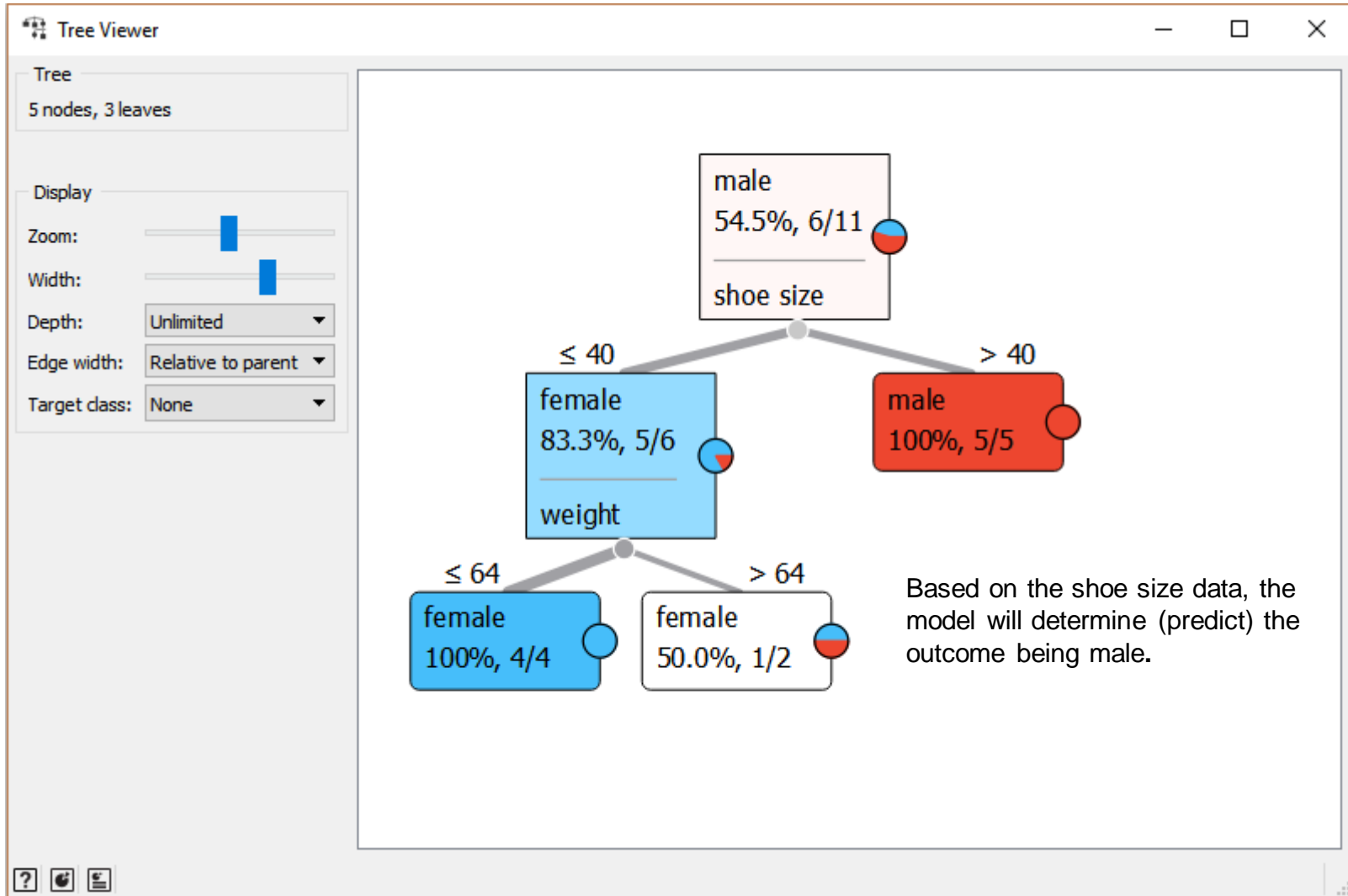
- Select full rows

Restore Original Order

Send Automatically

	gender	height	weight	shoe size
1	male	181	80	44
2	male	177	70	43
3	female	160	60	38
4	female	154	54	37
5	male	166	65	40
6	male	190	90	47
7	female	175	64	39
8	female	171	70	40
9	female	159	55	37
10	male	171	75	42
11	male	181	85	43

What is Classification? . . .



Lab Project: The MNIST Handwriting Recognition Training Model. . .



Lab Project Objectives:

- a. Learn about the MNIST dataset.
- b. Learn about tensors.
- c. Learn how to run and analyze the MNIST Handwriting Recognition Training Model Tutorial in Colaboratory.

Lab Project: The MNIST Handwriting Recognition Training Model. . .



What is the MNIST database?

- a. MNIST is the abbreviation for Modified National Institute of Standards and Technology database.
- b. A large database of handwritten digits.
- c. Commonly used for training various image processing systems.
- d. Database is used for training and testing in the field of machine learning.
- e. Database contains 60,000 training images and 10,000 testing images.

Source:

https://en.wikipedia.org/wiki/MNIST_database

Lab Project: The MNIST Handwriting Recognition Training Model. . .



What is the MNIST database?



Sample images from MNIST test dataset.

Source:

https://en.wikipedia.org/wiki/MNIST_database

Lab Project: The MNIST Handwriting Recognition Training Model...



What is the MNIST Database?

- a. A combination of two NIST's databases:
 - i. Special database 1 and Special database 3
- b. The database consists of digits written by high school students and employees of the United States Census Bureau.
- c. Special database 1 is for high school students.
- d. Special database 3 is for United States Census Bureau.
- e. A variety of classifiers were used for training methods of the machine learning model.

Lab Project: The MNIST Handwriting Recognition Training Model. . .



What is a Tensor?

- a. Are geometric objects that describes linear relations between
 - i. vectors
 - ii. scalars
 - iii. matrices
- b. Example relations include:
 - i. dot product
 - ii. cross product
 - iii. linear maps
 - iv. geometric vectors

Question 4:



What Orange widget is used to display or view a decision tree?

Lab Project: The MNIST Handwriting Recognition Training Model. . .



What is a Tensor?

- A **scalar** is a number, like 3, -5, 0.368, etc,
- A **vector** is a **list** of numbers (can be in a row or column),
- A **matrix** is an **array** of numbers (one or more rows, one or more columns).

Scalar

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Vector

$[2 \ -8 \ 7]$

row

or
column $\begin{bmatrix} 2 \\ -8 \\ 7 \end{bmatrix}$

Matrix

$\begin{bmatrix} 6 & 4 & 24 \\ 1 & -9 & 8 \end{bmatrix}$

row(s) × column(s)

Source:

<https://www.mathsisfun.com/algebra/scalar-vector-matrix.html>

Lab Project: The MNIST Handwriting Recognition Training Model. . .



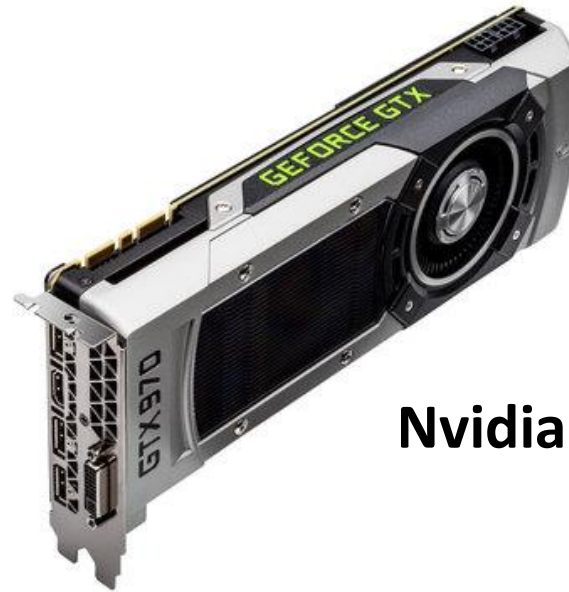
What is TensorFlow?

- a. A framework to define and run computations involving **tensors**.
- b. An open source library for high performance numerical computation.
- c. A flexible architecture that allows easy deployment of computation across a variety of hardware platforms.
 - i. Central Processing Units (CPUs)
 - ii. Graphics Processing Units (GPUs)
 - iii. Tensor Processor Units (TPUs)

Lab Project: The MNIST Handwriting Recognition Training Model. . .



CPU



Nvidia GPU



**Google
Cloud TPU**

Question 5:

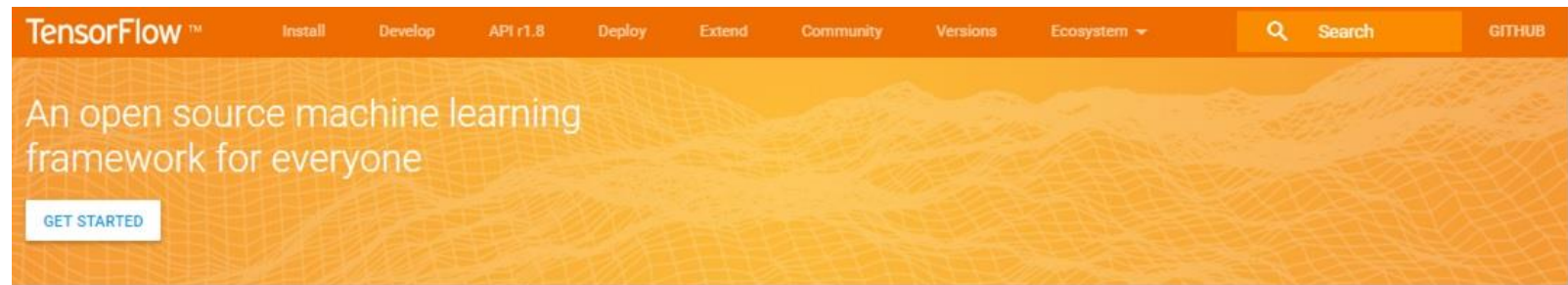


What three ways can a tensor be represented?

Lab Project: The MNIST Handwriting Recognition Training Model. . .



TensorFlow web page



TensorFlow 1.8 has arrived!

We're excited to announce the release of TensorFlow 1.8! Check out the announcement to upgrade your code with ease.

[LEARN MORE](#)



TensorFlow Dev Summit 2018

Thousands of people from the TensorFlow community participated in the second TensorFlow Dev Summit. Watch the keynote and talks now.

[WATCH NOW](#)



Announcing TensorFlow.js!

Learn more about our new library for machine learning in the browser using JavaScript.

[LEARN MORE](#)

Source:

<https://www.tensorflow.org/>

DesignNews

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Lab Project: The MNIST Handwriting Recognition Training Model. . .



Getting Started web page

TensorFlow™ Install Develop API v1.8 Deploy Extend Community Versions Ecosystem Search GITHUB

Develop

GET STARTED PROGRAMMER'S GUIDE TUTORIALS PERFORMANCE MOBILE HUB

Get Started

Beginners
Get Started with Eager Execution
Get Started with Graph Execution
Premade Estimators

Estimators
For Beginners
Premade Estimators

Checkpoints
Feature Columns
Datasets Quick Start
Creating Custom Estimators

TensorFlow Versions

Get Started with Eager Execution

☆☆☆☆☆

Run in Google Colab View source on GitHub

This tutorial describes how to use machine learning to categorize Iris flowers by species. It uses TensorFlow's eager execution to (1) build a *model*, (2) *train* the model on example data, and (3) use the model to make *predictions* on unknown data. Machine learning experience isn't required to follow this guide, but you'll need to read some Python code.

TensorFlow programming

There are many TensorFlow APIs available, but we recommend starting with these high-level TensorFlow concepts:

- Enable an [eager execution](#) development environment,
- Import data with the [Datasets API](#),
- Build models and layers with TensorFlow's [Keras API](#).

This tutorial shows these APIs and is structured like many other TensorFlow programs:

1. Import and parse the data sets.
2. Select the type of model.
3. Train the model.
4. Evaluate the model's effectiveness.

Contents

- TensorFlow programming
- Run the notebook
- Setup program
 - Install the latest version of TensorFlow
 - Configure imports and eager execution
- The Iris classification problem
- Import and parse the training dataset
 - Download the dataset
 - Inspect the data
 - Parse the dataset
 - Create the training tf.data.Dataset
- Select the type of model
 - Why model?
 - Select the model
 - Create a model using Keras
- Train the model
 - Define the loss and gradient function
 - Create an optimizer
 - Training loop

Source:

https://www.tensorflow.org/get_started/eager

Lab Project: The MNIST Handwriting Recognition Training Model. . .



Getting access to MNIST Tutorial

The screenshot shows the TensorFlow website interface. At the top, there's a navigation bar with 'TensorFlow™' logo, 'Install', 'Develop', 'API v1.8', 'Deploy', 'Extend', 'Community', 'Versions', 'Ecosystem', a search bar, and 'GITHUB'. Below this is a secondary navigation bar with 'GET STARTED', 'PROGRAMMER'S GUIDE', 'TUTORIALS', 'PERFORMANCE', 'MOBILE', and 'HUB'. The main content area features a sidebar on the left with a 'Tutorials' menu listing categories like 'Images', 'Sequences', 'Data Representation', 'Non-ML', and 'TensorFlow Versions'. The main article is titled 'A Guide to TF Layers: Building a Convolutional Neural Network' with a 5-star rating. The article text explains the TensorFlow 'layers' module and its use for building a CNN model for MNIST digit recognition. It includes a grid of handwritten digits (0-9) and a sub-heading 'Convolutional Neural Network using classification for handwriting recognition imaging.' Below this, it states that the MNIST dataset has 60,000 training and 10,000 test examples. A 'Getting Started' section begins with instructions to create a file named 'cnn_mnist.py' and includes a code block with the following Python imports:

```
from __future__ import absolute_import
from __future__ import division
from __future__ import print_function

# Imports
import numpy as np
import tensorflow as tf
```

On the right side of the article, there is a 'Contents' sidebar listing the tutorial's sections: 'Getting Started', 'Intro to Convolutional Neural Networks', 'Building the CNN MNIST Classifier' (with sub-sections for 'Input Layer', 'Convolutional Layer #1', 'Pooling Layer #1', 'Convolutional Layer #2 and Pooling Layer #2', 'Dense Layer', 'Logits Layer', 'Generate Predictions', 'Calculate Loss', 'Configure the Training Op', 'Add evaluation metrics'), and 'Training and Evaluating the CNN MNIST Classifier' (with sub-sections for 'Load Training and Test Data', 'Create the Estimator', 'Set Up a Logging Hook').

Source:

<https://www.tensorflow.org/tutorials/layers>

Lab Project: The MNIST Handwriting Recognition Training Model. . .



“Convolutional Neural Networks (ConvNets or CNNs) are a category of Neural Networks that have proven very effective in areas such as image recognition and classification. ConvNets have been successful in identifying faces, objects and traffic signs apart from powering vision in robots and self driving cars” (ujjwalkarn, 2017).

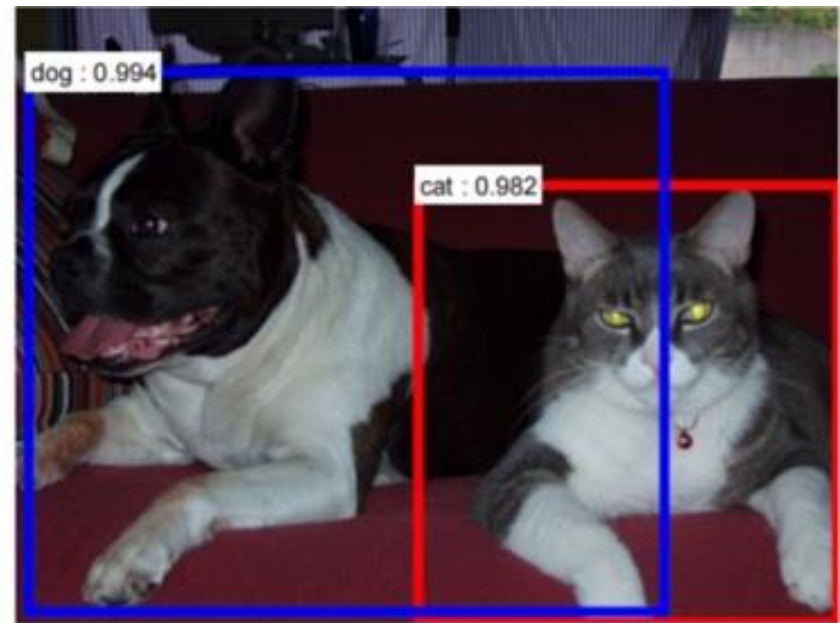
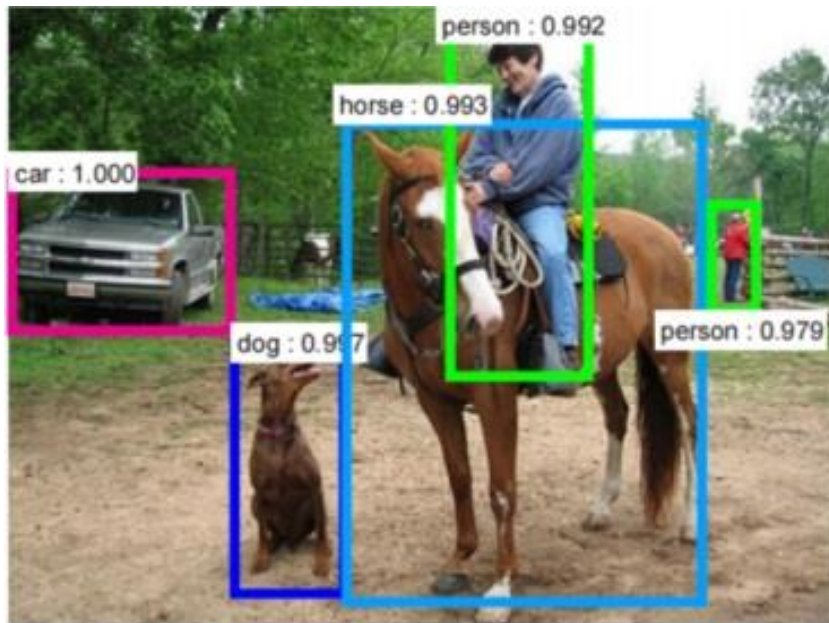
Source:

ujjwalkarn.(2017). What are convolutional neural networks and why are they important?
Retrieved from <https://ujjwalkarn.me/2016/08/11/intuitive-explanation-convnets/>

Lab Project: The MNIST Handwriting Recognition Training Model. . .



ConvNets Examples



Source:

ujjwalkarn.(2017). What are convolutional neural networks and why are they important?

Retrieved from <https://ujjwalkarn.me/2016/08/11/intuitive-explanation-convnets/>

Lab Project: The MNIST Handwriting Recognition Training Model. . .



Getting access to code

TensorFlow™ Install **Develop** API r1.8 Deploy Extend Community Versions Ecosystem Search GITHUB

GET STARTED PROGRAMMER'S GUIDE **TUTORIALS** PERFORMANCE MOBILE HUB

Getting Started

Let's set up the skeleton for our TensorFlow program. Create a file called `cnn_mnist.py`, and add the following code:

```
from __future__ import absolute_import
from __future__ import division
from __future__ import print_function

# Imports
import numpy as np
import tensorflow as tf

tf.logging.set_verbosity(tf.logging.INFO)

# Our application logic will be added here

if __name__ == "__main__":
    tf.app.run()
```

As you work through the tutorial, you'll add code to construct, train, and evaluate the convolutional neural network. The complete final code can be found here.

[Click here](#)

Intro to Convolutional Neural Networks

Convolutional neural networks (CNNs) are the current state-of-the-art model architecture for image classification tasks.

Contents

- Getting Started
- Intro to Convolutional Neural Networks
- Building the CNN MNIST Classifier
 - Input Layer
 - Convolutional Layer #1
 - Pooling Layer #1
 - Convolutional Layer #2 and Pooling Layer #2
 - Dense Layer
 - Logits Layer
 - Generate Predictions
 - Calculate Loss
 - Configure the Training Op
 - Add evaluation metrics
- Training and Evaluating the CNN MNIST Classifier
 - Load Training and Test Data
 - Create the Estimator

Source:

<https://www.tensorflow.org/tutorials/layers>

DesignNews

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Lab Project: The MNIST Handwriting Recognition Training Model. . .

Getting access to `cnn_mnist.py` code



tensorflow / tensorflow

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Code Issues 1,482 Pull requests 228 Projects 0 Insights

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Dismiss

Branch: r1.8 tensorflow / tensorflow / examples / tutorials / layers / `cnn_mnist.py` Find file Copy path

MarkDaoust Use sparse loss to avoid the warning being thrown by `tf.nn.softmax_cr...` b1c3222 on Dec 7, 2017

5 contributors

160 lines (134 sloc) | 5.58 KB

Raw Blame History

```
1 # Copyright 2016 The TensorFlow Authors. All Rights Reserved.
2 #
3 # Licensed under the Apache License, Version 2.0 (the "License");
4 # you may not use this file except in compliance with the License.
5 # You may obtain a copy of the license at
6 #
7 # http://www.apache.org/licenses/LICENSE-2.0
```

Source:

https://github.com/tensorflow/tensorflow/blob/r1.8/tensorflow/examples/tutorials/layers/cnn_mnist.py

Lab Project: The MNIST Handwriting Recognition Training Model. . .



Past `cnn_mnist.py` code to Colaboratory Python 3 Notebook

```
co cnn_mnist.ipynb ☆
File Edit View Insert Runtime Tools Help
+ CODE + TEXT ↑ CELL ↓ CELL
▶
▶
▶ # Copyright 2016 The TensorFlow Authors. All Rights Reserved.
▶ #
▶ # Licensed under the Apache License, Version 2.0 (the "License");
▶ # you may not use this file except in compliance with the License.
▶ # You may obtain a copy of the License at
▶ #
▶ # http://www.apache.org/licenses/LICENSE-2.0
▶ #
▶ # Unless required by applicable law or agreed to in writing, software
▶ # distributed under the License is distributed on an "AS IS" BASIS,
▶ # WITHOUT WARRANTIES OR CONDITIONS OF ANY KIND, either express or implied.
▶ # See the License for the specific language governing permissions and
▶ # limitations under the License.
▶ """Convolutional Neural Network Estimator for MNIST, built with tf.layers."""
▶
▶ from __future__ import absolute_import
▶ from __future__ import division
▶ from __future__ import print_function
▶
▶ import numpy as np
▶ import tensorflow as tf
▶
▶ tf.logging.set_verbosity(tf.logging.INFO)
▶
▶ def cnn_model_fn(features, labels, mode):
▶     """Model function for CNN."""
▶     # Input Layer
▶     # Reshape X to 4-D tensor: [batch_size, width, height, channels]
▶     # MNIST images are 28x28 pixels, and have one color channel
▶     input_layer = tf.reshape(features["x"], [-1, 28, 28, 1])
▶
▶     # Convolutional Layer #1
▶     # Computes 32 features using a 5x5 filter with ReLU activation.
▶     # Padding is added to preserve width and height.
▶     # Input Tensor Shape: [batch_size, 28, 28, 1]
```

Lab Project: The MNIST Handwriting Recognition Training Model. . .



Setting up GPU accelerator in Colaboratory

```
cnm_mnist.ipynb ☆
File Edit View Insert Runtime Tools Help
+ CODE + TEXT
# Copyright 2016
# Licensed under t
# you may not use
# You may obtain a
# http://www.apac
# Unless required
# distributed unde
# WITHOUT WARRANTI
# See the License
# limitations unde
"""Convolutional Neural Network Estimator for MNIST, built with tf.layers."""

from __future__ import absolute_import
from __future__ import division
from __future__ import print_function

import numpy as np
import tensorflow as tf

tf.logging.set_verbosity(tf.logging.INFO)

def cnn_model_fn(features, labels, mode):
    """Model function for CNN."""
    # Input Layer
    # Reshape X to 4-D tensor: [batch_size, width, height, channels]
    # MNIST images are 28x28 pixels, and have one color channel
    input_layer = tf.reshape(features["x"], [-1, 28, 28, 1])

    # Convolutional Layer #1
    # Computes 32 features using a 5x5 filter with ReLU activation.
    # Padding is added to preserve width and height.
    # Input Tensor Shape: [batch_size, 28, 28, 1]
```

Notebook settings

Runtime type

Python 3

Hardware accelerator

GPU

Omit code cell output when saving this notebook

CANCEL

SAVE

Question 6:



CNN is the abbreviation for what learning network?

Lab Project: The MNIST Handwriting Recognition Training Model. . .



cnn_mnist.py model execution in Colaboratory

```
INFO:tensorflow:Done running local_init_op.  
INFO:tensorflow:Saving checkpoints for 0 into /tmp/mnist_convnet_model/model.ckpt.  
INFO:tensorflow:probabilities = [[0.1066287 0.10955735 0.09914126 0.10538703 0.08441452 0.09878851  
0.0944709 0.10377745 0.09739114 0.10044319]  
[0.11355278 0.10299338 0.11910446 0.10840292 0.09291752 0.08555775  
0.11543529 0.09210476 0.08986214 0.08004922]  
[0.09947766 0.09893823 0.12037378 0.09706676 0.10363767 0.09726461  
0.09274231 0.10032655 0.09706403 0.09310838]  
[0.12500279 0.10411903 0.10272648 0.10499132 0.10068256 0.09808046  
0.08558096 0.09765555 0.1043196 0.0768412 ]  
[0.11293398 0.09791699 0.11018691 0.09524927 0.10356317 0.09494274  
0.08893099 0.1107319 0.11459736 0.0709467 ]  
[0.12435988 0.10938187 0.10139114 0.09177393 0.10370795 0.0925597  
0.10942268 0.09591921 0.08574504 0.08573865]  
[0.10126554 0.10472395 0.11853604 0.10667873 0.08183863 0.09357594  
0.09324469 0.10908972 0.10281905 0.0882277 ]  
[0.10049719 0.09330981 0.11088657 0.08444994 0.10008729 0.11757817  
0.09940719 0.10303698 0.09652874 0.09421811]  
[0.08898854 0.09988593 0.12268388 0.10059009 0.1065332 0.09633774  
0.08931969 0.10550156 0.10997788 0.08018147]  
[0.10256396 0.10188145 0.10524397 0.10076568 0.09899912 0.08570551  
0.10031036 0.10967723 0.10784163 0.0870111 ]  
[0.10486739 0.10353167 0.11136277 0.09224382 0.10399847 0.09699368  
0.0929009 0.10217349 0.09773475 0.09419312]  
[0.09833891 0.10148518 0.11815596 0.1029433 0.09473046 0.09467994  
0.09519491 0.10257208 0.09606482 0.09583447]  
[0.11254442 0.10387653 0.11105592 0.09954738 0.093248 0.11201217  
0.09125062 0.09444547 0.09863495 0.08338456]  
[0.09822995 0.10594261 0.11880096 0.09246188 0.08720967 0.0920168  
0.11006038 0.10693932 0.08384804 0.10449035]  
[0.09782036 0.10665842 0.11286556 0.10899431 0.09256672 0.09355388  
0.09687366 0.10113562 0.10588426 0.08364727]
```

Lab Project: The MNIST Handwriting Recognition Training Model. . .



cnn_mnist.py model final results in Colaboratory

As the model trains, you'll see log output like the following:

```
INFO:tensorflow:loss = 2.36026, step = 1
INFO:tensorflow:probabilities = [[ 0.07722801  0.08618255  0.09256398, ...]]
...
INFO:tensorflow:loss = 2.13119, step = 101
INFO:tensorflow:global_step/sec: 5.44132
...
INFO:tensorflow:Loss for final step: 0.553216.

INFO:tensorflow:Restored model from /tmp/mnist_convnet_model
INFO:tensorflow:Eval steps [0,inf) for training step 20000.
INFO:tensorflow:Input iterator is exhausted.
INFO:tensorflow:Saving evaluation summary for step 20000: accuracy = 0.9733, loss = 0.0902271
{'loss': 0.090227105, 'global_step': 20000, 'accuracy': 0.97329998}
```

Here, we've achieved an accuracy of 97.3% on our test data set.

Note:

Depending on machine processor, final training and prediction results may take up to an hour.