

Software Packages for Deep Learning

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Outline

Introduction

Python

Torch

Caffe

TensorFlow

MxNET

Comparison

Machine Learning



- ML gives computers the ability to learn without being explicitly programmed [Samuel 1959]
- ML explores the study and construction of algorithms that can learn from and make predictions on data
- Data mining, computational statistics, optimization, ...
- Fourth paradigm, big data, deep learning, artificial intelligence

General Tasks of ML

- **Classification:** Inputs are divided into two or more classes, and the learner must produce a model that assigns unseen inputs to one or more (multi-label classification) of these classes
- **Clustering:** Inputs are divided into groups. Unlike in classification, the groups are not known beforehand, making this typically an unsupervised task
- **Regression:** Similar to classification, but the outputs are continuous rather than discrete
- **Other tasks:** density estimation, dimensionality reduction, ...

Packages for General Machine Learning

What is the purpose?

- Solving problems from practical applications (user interface)
- Developing algorithms and optimizing implementation (development)
- Theoretical analysis for machine learning

What do we want for a ML package?

- Easy for new tasks and new network structures (less steep learning curve)
- Easy for debugging (with good support and large community)
- Performance and scalability



Deep Learning



Comparison

Table: Framework Comparison: Basic information

| Viewpoint | Torch | Caffe | TensorFlow | MXNet |
|---------------------|--------------------------------|----------------------|-------------------------|-----------------------------|
| Started | 2002 | 2013 | 2015 | 2015 |
| Main Developers | Facebook, Twitter, Google, ... | BVLC (Berkeley) | Google | DMLC |
| License | BSD | BSD | Apache | Apache |
| Core Languages | C/Lua | C++ | C++ Python | C++ Python |
| Supported Interface | Lua | C++/Python Matlab | C++/Python R/Java/Go | C++/Python R/Julia/Scala |

Comparison

Table: Framework Comparision: Performance

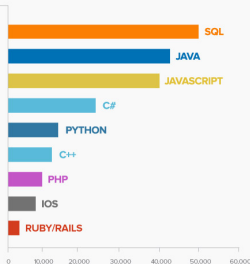
| Viewpoint | Torch | Caffe | TensorFlow | MXNet |
|---------------------|-----------|-----------|-------------|-------------|
| Pretrained Models | Yes | Yes | No | Yes |
| Low-level Operators | Good | Good | Fairly good | Very few |
| High-level Support | Good | Good | Good | Good |
| Speed One-GPU | Great | Great | Not so good | Excellent |
| Memory Management | Great | Great | Not so good | Excellent |
| Parallel Support | Multi-GPU | Multi-GPU | Multi-GPU | Distributed |

Python: A general-purpose programming language

- Created by Guido van Rossum in 1989 and first released in 1991
- Named after “the Monty Python” (British comedy group)
- An interpreted language—simple, clear, and readable
- Python has many excellent packages for machine learning
- The language of choice in introductory programming courses

Languages ranked by number of programming jobs

Data from
Indeed.com
2016



| Feb 2017 | Change | Programming language | Share | Trends |
|----------|--------|----------------------|--------|--------|
| 1 | | Java | 22.6 % | -1.3 % |
| 2 | | Python | 14.7 % | +2.8 % |
| 3 | | PHP | 9.4 % | -1.2 % |
| 4 | | C# | 8.3 % | -0.3 % |
| 5 | ↑↑ | Javascript | 7.7 % | +0.4 % |
| 6 | | C | 7.0 % | -0.2 % |
| 7 | ↓↓ | C++ | 6.9 % | -0.6 % |
| 8 | | Objective-C | 4.2 % | -0.6 % |
| 9 | ↑ | R | 3.4 % | +0.4 % |
| 10 | ↓ | Swift | 2.9 % | +0.1 % |

Python for Scientific Computing

Why Python for scientific computing?

- Strong introspection capabilities (???What does even mean???)
- Full modularity, supporting hierarchical packages
- Exception-based error handling
- Dynamic data types and automatic memory management

Why consider such a slow language for simulation?

- Good for proof-of-concept
- Implementation time versus execution time
- Code readability and maintenance — short code, fewer bugs
- Well-written Python code is “fast enough” for most computational tasks
- Time critical parts executed through compiled language or **available packages**

Built-in Data Structures

- Numeric types—int, float, complex, ex: `a=1`, `b=1.0`, `c=1L`, `d=0xf`, `e=010`, `f=1+2j`
- Sequence types—list, tuple, str, dict, ex: `g=[3.14, True, 'Yes', [1], (1L,)] + [False] + [None]*3`, `h=(3.14, True, 'Yes', [1], ())`, `i='Hello' + "," + "world!"`, `j={1: 'int', 'pi': 3.14}`

Control Flow

- If-then-else
- For loop
- While loop

Functions and Modules

- Defining functions
- Using modules

Programming interface



Example 1



Programming interface



Example 1

Computational graph



Programming interface



Visualization



Example 1



Programming interface



Example 1



Numerical tests



Thank You!

