# **TensorFlow**

- Introduction -

Aug. 2019

Ando Ki, Ph.D. adki@future-ds.com

# Table of contents

- Introduction to TensorFlow
  - ▶ Deep-Learning Package Design Choices
  - ► TensorFlow architecture
  - TensorFlow configuration
  - ► TensorFlow from Google
  - ▶ Tensorflow model

(2)

# Deep-Learning Package Design Choices

- Model specification
  - Configuration file
    - e.g. Caffe, DistBelief, CNTK
  - Programmatic generation
    - Torch: Python
    - Theano: Python
    - TensorFlow: Python
    - ⇒ Tiny-Dnn: C++

- For programmatic models, choice of highlevel language:
  - ► Lua (Torch)
  - Python (Theano, TensorFlow)
    - ⇒ Theano: Academic
    - ⇒ TensorFlow: Google
  - ► C/C++
    - Caffe
    - Mxnet

(3)

### TensorFlow architecture

- Core in C++
  - ▶ Lowest level API (TensorFlow core): provide complete programming control
- Different front ends for specifying/driving the computation
  - ► Higher level API on top of the TensorFlow core
  - ▶ Python and C++



"TensorFlow: A System for Machine Learning on Heterogeneous Systems" by Jeff Dean / Google Brain team

(4)

#### TensorFlow configuration Single process configuration single process Session Run client client master master session Execute Subgraph subgraph worker worker GPU 1 GPU 0 CPU 0 GPU<sub>2</sub> Distributed configuration client: construct graph master: execute operations client (based on your code) (based on TensorFlow's code) x = tf.placeholder(tf.float32, [None W = tf.Variable(tf.zeros([784, 10])) b = tf.Variable(tf.zeros([10])) return executed result Execute worker worker worker sess.run(train\_step, feed\_dict={x: batch\_xs, y\_: batch\_ys}) process 3 process 1 process 2

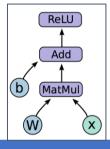
# TensorFlow from Google

- TensorFlow is not a language
  - It is a framework which has algorithms for solving machine learning and deep learning problems.
- The core of TensorFlow is the dataflow graph representing computations.
  - ► TensorFlow is an open source <u>library for numerical computation using data flow graphs</u>
  - Nodes represent operations (ops), and
  - the edges represent tensors (multi-dimensional arrays, the backbone of TensorFlow).
  - The entire dataflow graph is a complete description of computations, which occur within a session, and are executed on devices (CPUs or GPUs).
- TensorFlow provides Python front-end
  - where tensors are represented internally as familiar numpy ndarray objects.
  - ► TensorFlow relies on highly-optimized C++ for its computation at its heart, i.e., TensoFlow core.
- The algorithmic engine is build over C++, on top of which there is a Python API acting as a bridge to call the C++ engine.
  - All operations are done outside of Python.
  - In short a Python programming interface to make life simpler for a developer so that he can readily use the underlying engine without worrying much about its internal intricacies.

(6)

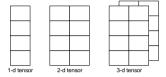
### TensorFlow model

- Big idea
  - express a numeric computation as a graph, where tensors (data) flow through the graph
  - Graph: Data (Tensors) flow through the graph
    - Nodes: mathematical operationsedges: multi-dimensional arrays



Nodes: ReLU, Add, MatMul Edges: b, W, x

- Tensor: N-dimensional array
  - 0-dimension: Scalar
  - 1-dimension: Vector (1-d tensor)2-dimension: Matrix (2-d tensor)
  - N-dimension: Tensor



- Flow: Computation based on data flow graphs
- Tensors flow through the graph
  - ► →TensorFlow
  - edges represent the tensors (data)
  - nodes represent the processing

(7

㈜퓨쳐디자인시스템 34051 대전광역시 유성구 문지로 193, KAIST 문지캠퍼스, F723호 (042) 864-0211~0212 / contact@future-ds.com / www.future-ds.com

Future Design Systems, Inc.

Faculty Wing F723, KAIST Munji Campus, 193 Munji-ro, Yuseong-gu, Daejeon 34051, Korea +82-042-864-0211~0212 / contact@future-ds.com / www.future-ds.com



