



Parallelized Training of Deep NN

Comparison of Current Concepts and Frameworks

Sebastian Jäger, Hans-Peter Zorn,
Stefan Igel, Christian Zirpins

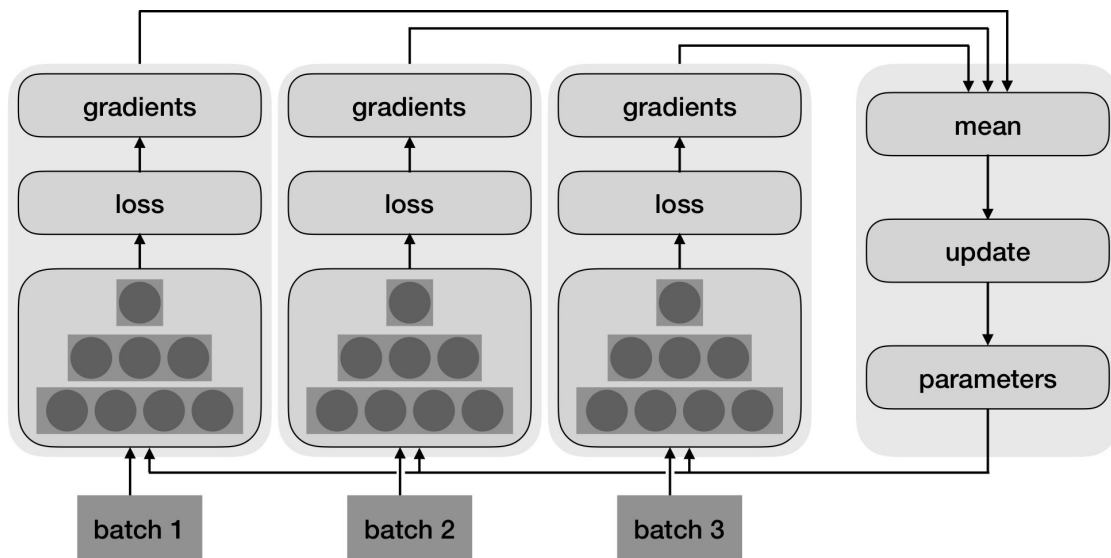
Rennes, Dec 10, 2018

Motivation

- › Need to scale the training of neural networks horizontally
- › Kubernetes based technology stack
- › Scalability of concepts and frameworks

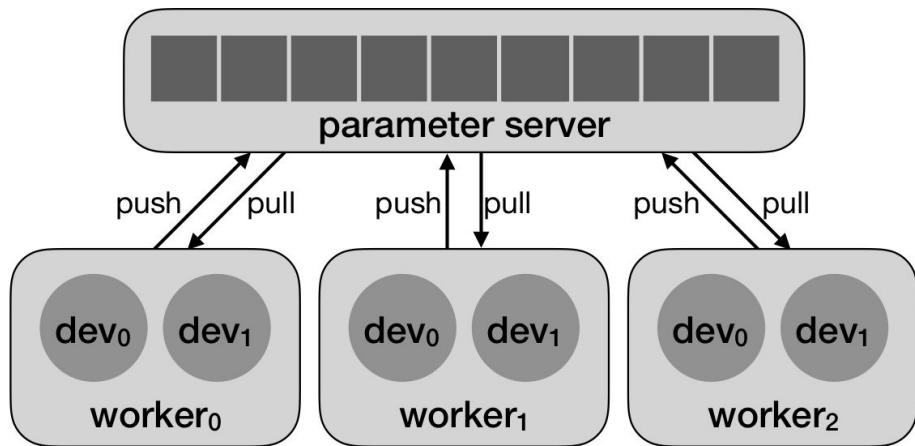
Distributed Training Methods

Data Parallelism



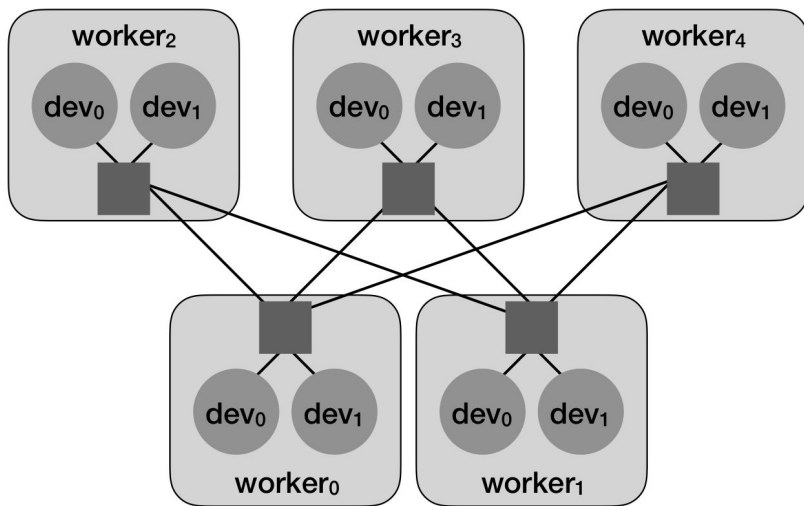
Data Parallelism

Centralized Parameter Server



Data Parallelism

Decentralized Parameter Server



Experimental Setup

Environment

- › Google Kubernetes Engine
- › CPU: 2.6 GHz
- › Ubuntu 16.04
- › TensorFlow 1.8.0
- › MXNet 1.3.0

Experimental Setup

Networks

Convolutional NN

- › LeNet-5
 - › 5 layer
 - › 10 classes
- › Fashion MNIST
 - › 28x28 gray-scale

Recurrent NN

- › LSTM
 - › 2 layer
 - › 200 units
- › Penn Tree Bank
 - › 1.000.000 words

Experimental Setup

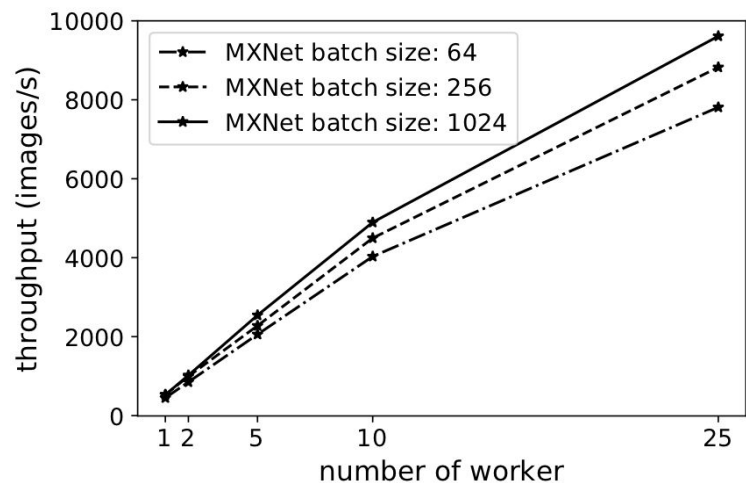
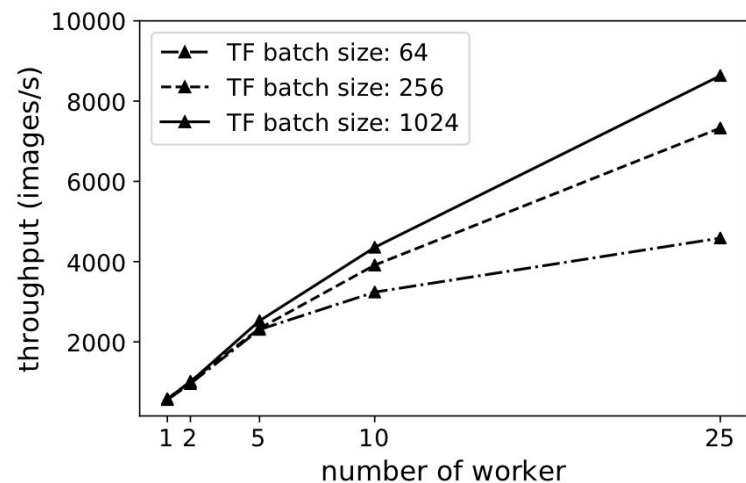
Metrics

$$\text{throughput}_n = \frac{\text{no. examples} * \text{epochs} * \text{no. workers}}{\text{training time}_n}$$

$$\text{speedup}_n = \frac{\text{throughput}_n}{\text{throughput}_1}$$

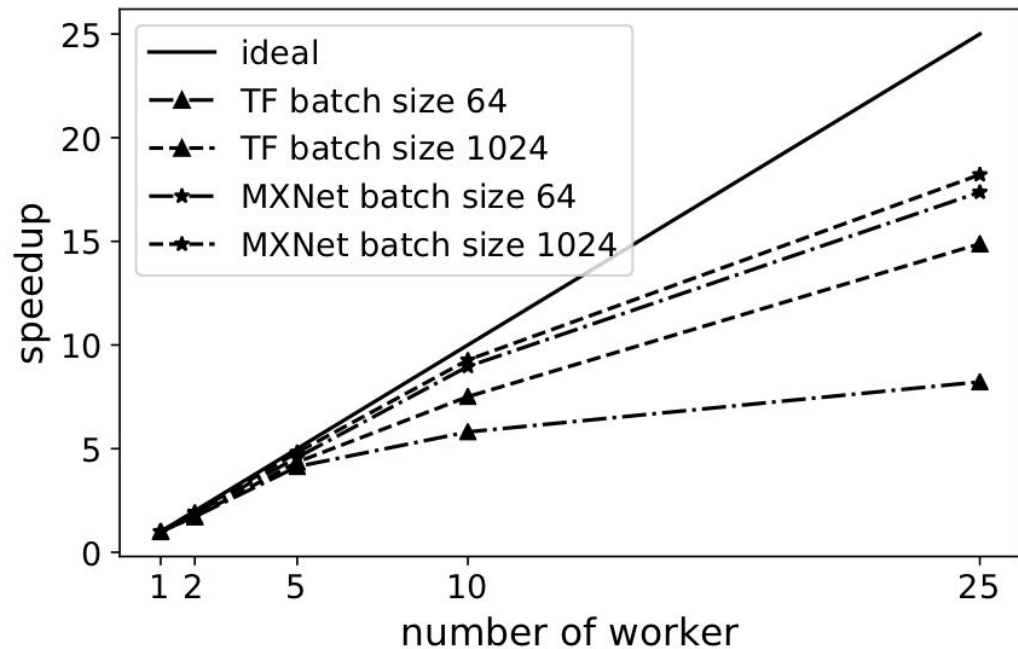
Results

Convolutional Neural Network



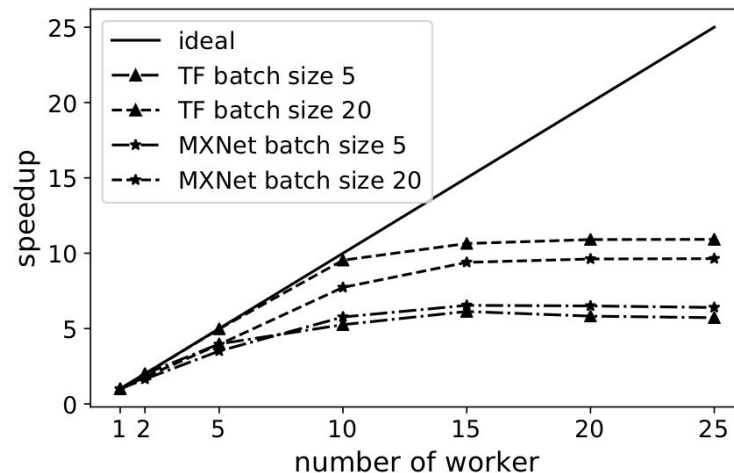
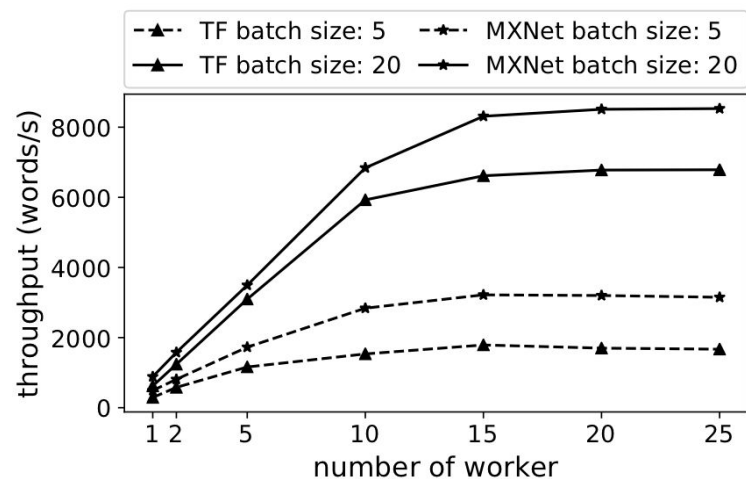
Results

Convolutional Neural Network



Results

Recurrent Neural Network



Summarizing the Experiments

Decentralized Parameter Server ...

- › more robust regarding increasing communication effort
- › scales better for small NN

For bigger/ more complex NN ...

- › no significant difference between concepts

Conclusion

MXNet ...

- › for small NN better scalability and throughput
- › for bigger NN higher throughput
- › less and less complicated code
- › easier to scale up training

A photograph of a modern building facade with a grid of windows and white panels. A blue semi-transparent rectangle is overlaid on the left side, containing text. A green horizontal bar is at the bottom left.

Thank you

Sebastian Jäger

 @se_jaeger

inovex GmbH

Ludwig-Erhard-Allee 6

76131 Karlsruhe

sebastian.jaeger@inovex.de