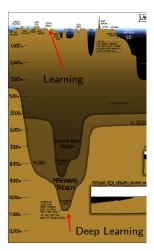
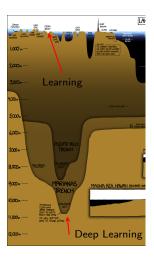
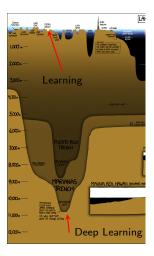


Peter Goldsborough

May 31, 2016

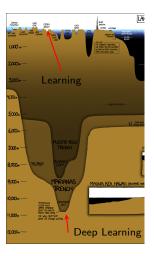




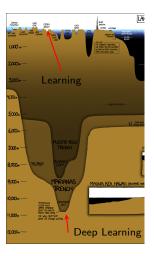


TensorFlow is

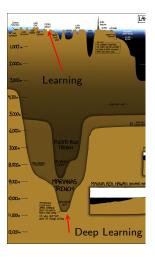
► An open source deep learning library



- ► An open source deep learning library
- ► Released by Google in November 2015



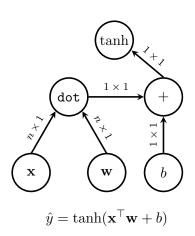
- An open source deep learning library
- Released by Google in November 2015
- Especially suited to:

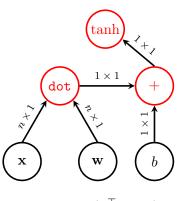


- An open source deep learning library
- ► Released by Google in November 2015
- ► Especially suited to:
 - "Large-scale machine learning on
 - heterogenous distributed systems"

Contents

- 1. Computational Paradigms
- 2. Execution Model
- 3. Back-Propagation in TensorFlow
- 4. Visualization Tools
- 5. Use Cases
- 6. Walkthrough

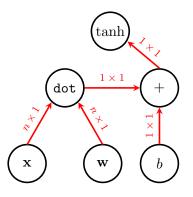




$\hat{y} = \tanh(\mathbf{x}^{\top}\mathbf{w} + b)$

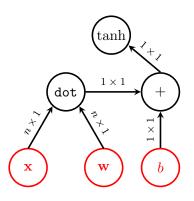
Computational Graphs

1. Operations



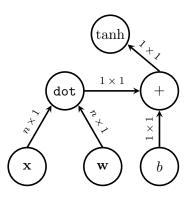
 $\hat{y} = \tanh(\mathbf{x}^{\top}\mathbf{w} + b)$

- 1. Operations
- 2. Tensors



 $\hat{y} = \tanh(\mathbf{x}^{\top}\mathbf{w} + b)$

- 1. Operations
- 2. Tensors
- 3. Variables



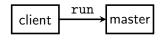
 $\hat{y} = \tanh(\mathbf{x}^{\top}\mathbf{w} + b)$

- 1. Operations
- 2. Tensors
- 3. Variables
- 4. Sessions

client

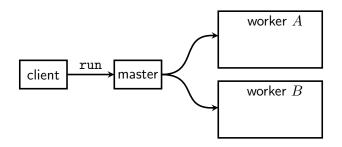
Actors

1. Client

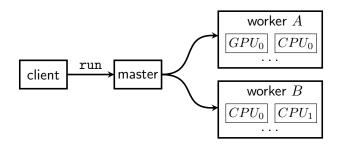


Actors

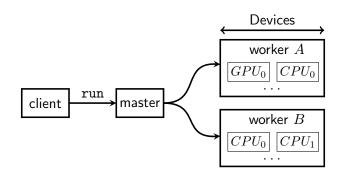
1. Client 2. Master



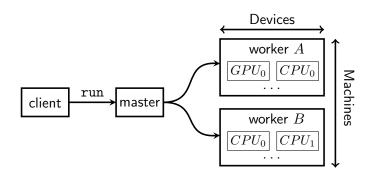
- 1. Client Master
- Workers



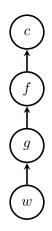
- 1. Client 2. Master
 - 3. Workers
- Devices

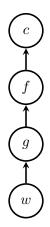


- 1. Client 2. Master
 - 3. Workers
- Devices

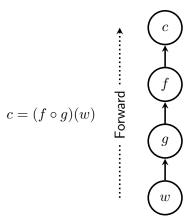


- 1. Client 2. Master
- 3. Workers
- 4. Devices

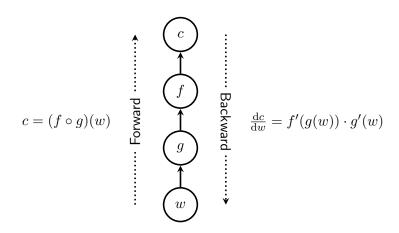




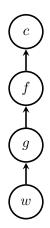
Symbol to Number Differentiation



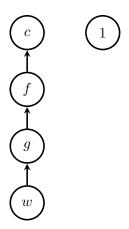
Symbol to Number Differentiation



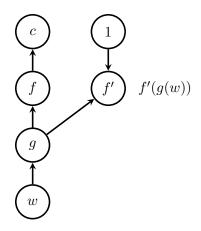
Symbol to Number Differentiation



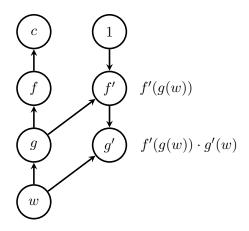
Symbol to Symbol Differentiation



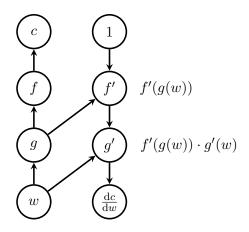
Symbol to Symbol Differentiation



Symbol to Symbol Differentiation



Symbol to Symbol Differentiation



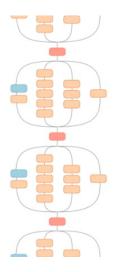
Symbol to Symbol Differentiation

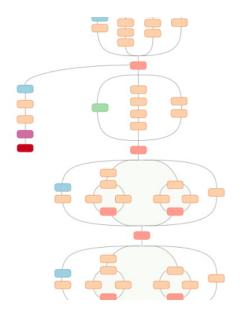
Visualization Tools

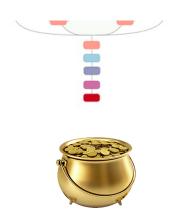
- Deep Neural Networks have the tendency of being . . . deep
- Easy to drown in the complexity of an architecture
- > 36,000 nodes for Google's *Inception* model











 $Source: \ http://googleresearch.blogspot.de/2016/03/train-your-own-image-classifier-with.html \\$

Visualization Tools

TensorBoard to the Rescue

Use Cases

- ► Smart email replies in Google *Inbox*
- Emails mapped to "thought vectors"
- LSTMs synthesize valid replies



 $Source: \ http://googleresearch.blogspot.de/2015/11/computer-respond-to-this-email.html \\$

Use Cases of TensorFlow

- Google DeepMind now using TensorFlow
- Already for AlphaGo
- According to a DeepMind SWE reasons are:
 - ▶ Integration with Google Cloud Platform,
 - Python,
 - Support for TPUs,
 - Ability to run on many GPUs.



Source: https://deepmind.com/css/images/opengraph/alphago-logo.png

Walkthrough

Thank You