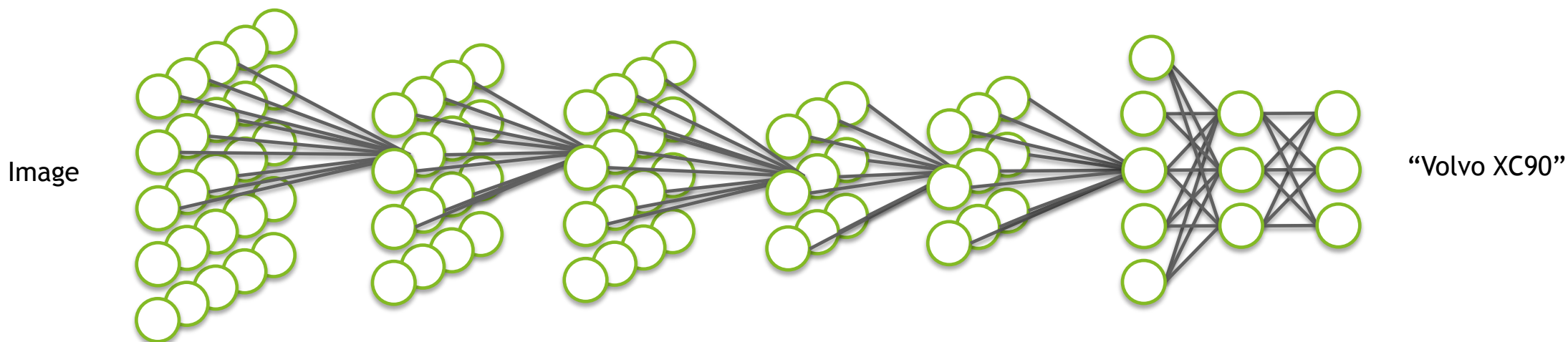
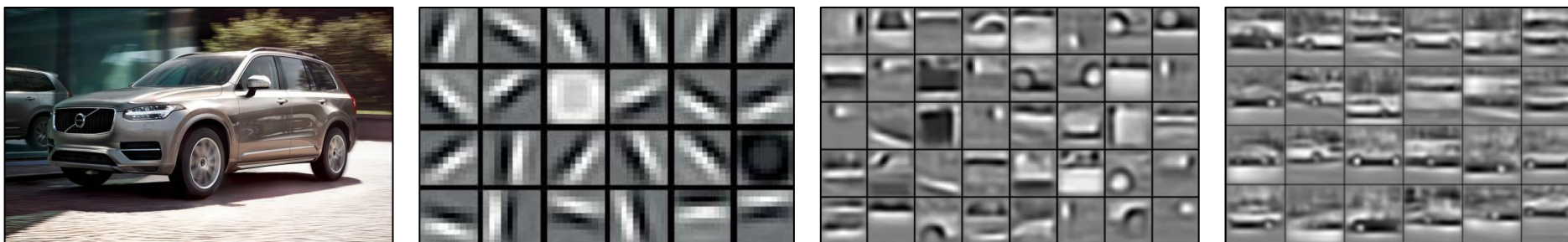


GPU TECHNOLOGY
CONFERENCE

DEEP LEARNING WITH NVIDIA GPUS

JONATHAN COHEN, DIRECTOR OF ENGINEERING
DEEP LEARNING SOFTWARE, NVIDIA

What is Deep Learning?



Machine Learning Software



Tree
Training

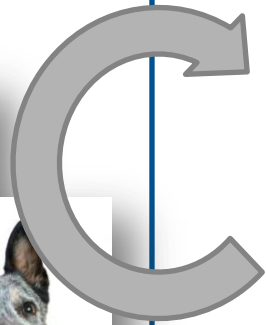


Cat

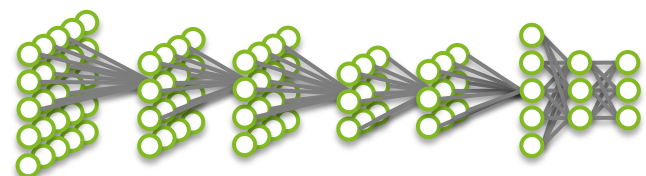


Dog

Repeat



Forward Propagation
→

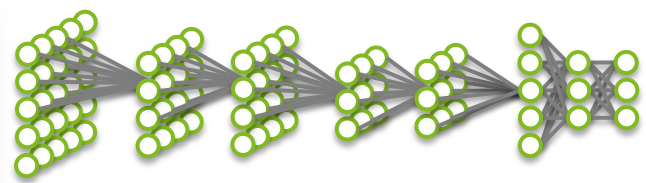
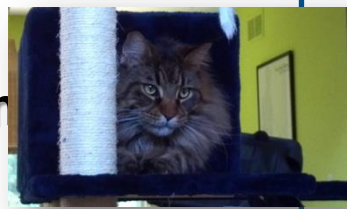


“turtle”

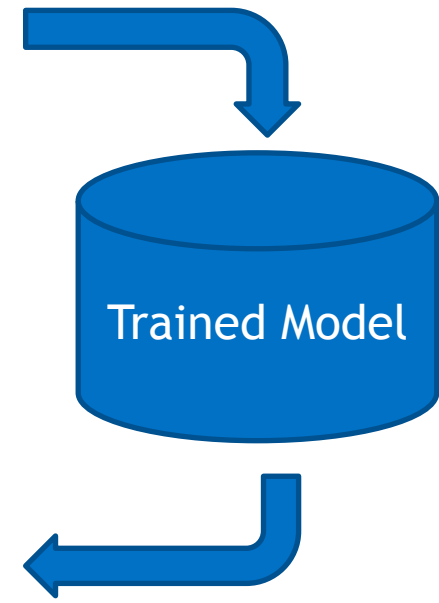
←
Backward Propagation

Compute weight update to nudge from “turtle” towards “dog”

Classification



“cat”



Why is Deep Learning Hot **Now**?

Big Data Availability

facebook

350 millions
images uploaded
per day

Walmart ✱

2.5 Petabytes of
customer data
hourly

You Tube

100 hours of video
uploaded every
minute

New ML Techniques



GPU Acceleration



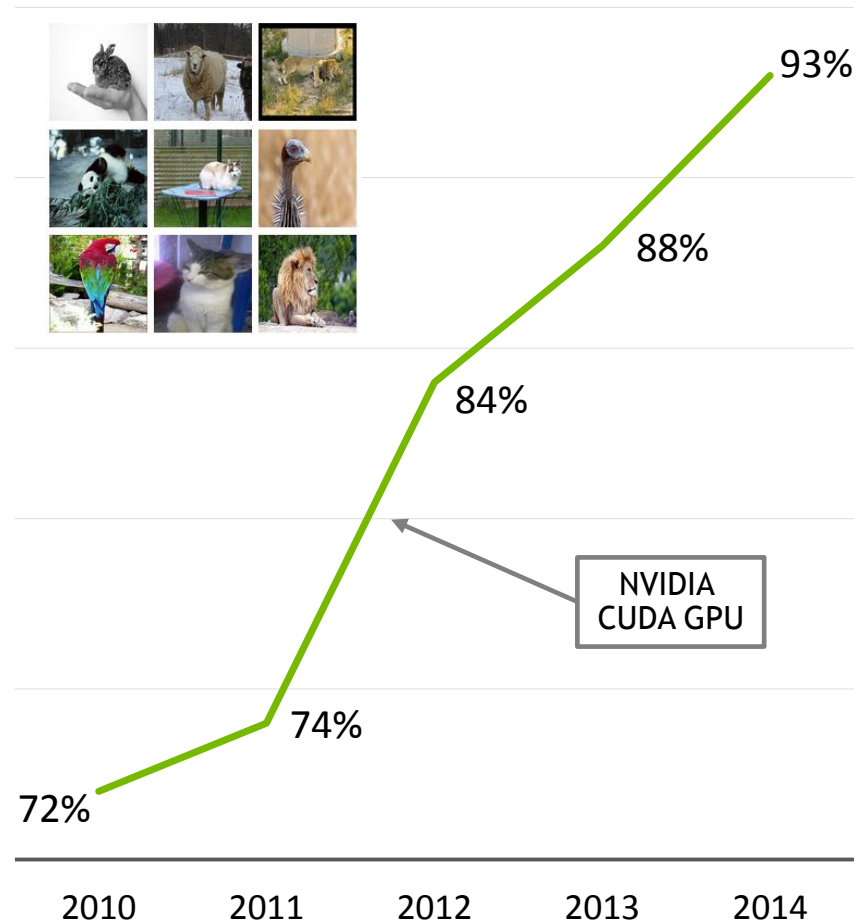
GPUs and Deep Learning

	NEURAL NETWORKS	GPUS
Inherently Parallel	✓	✓
Matrix Operations	✓	✓
FLOPS	✓	✓
Bandwidth	✓	✓

GPUs deliver --

- same or better prediction accuracy
- faster results
- smaller footprint
- lower power

ImageNet Challenge Accuracy

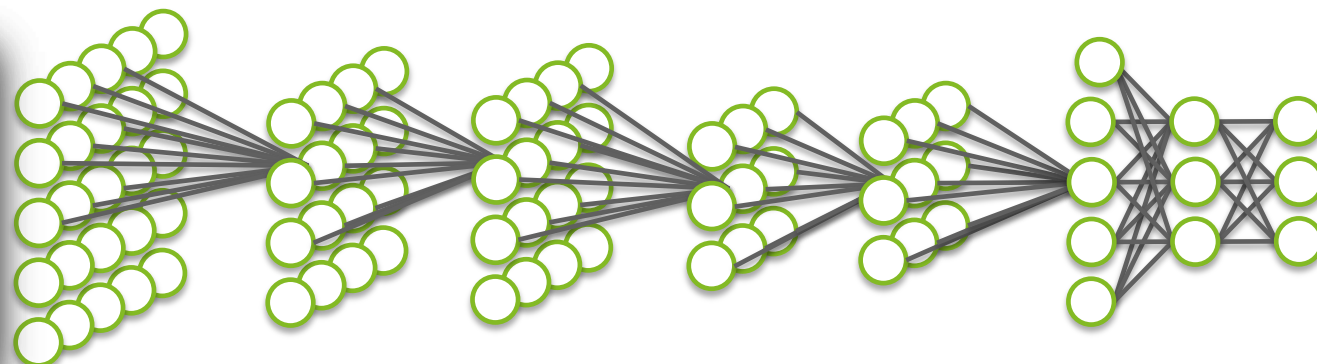


DAVE

DARPA Autonomous Vehicle (2004)

Deep Learning approach to robot navigation

Deep Neural Network “watches” human drivers , learns how to react



“Go straight”

The Theory of DAVE

Learn: Visual Input => Action



DAVE in Action



DRIVE PX

An advanced computing platform based on NVIDIA Tegra processors for autonomous driving cars

FEATURES

The ability to capture and process multiple HD camera and sensor inputs

A rich middleware for computer graphics, computer vision and deep learning

A powerful and easy to develop platform for algorithm research and rapid prototyping

Running on Drive PX
and developed in
just 3 weeks!

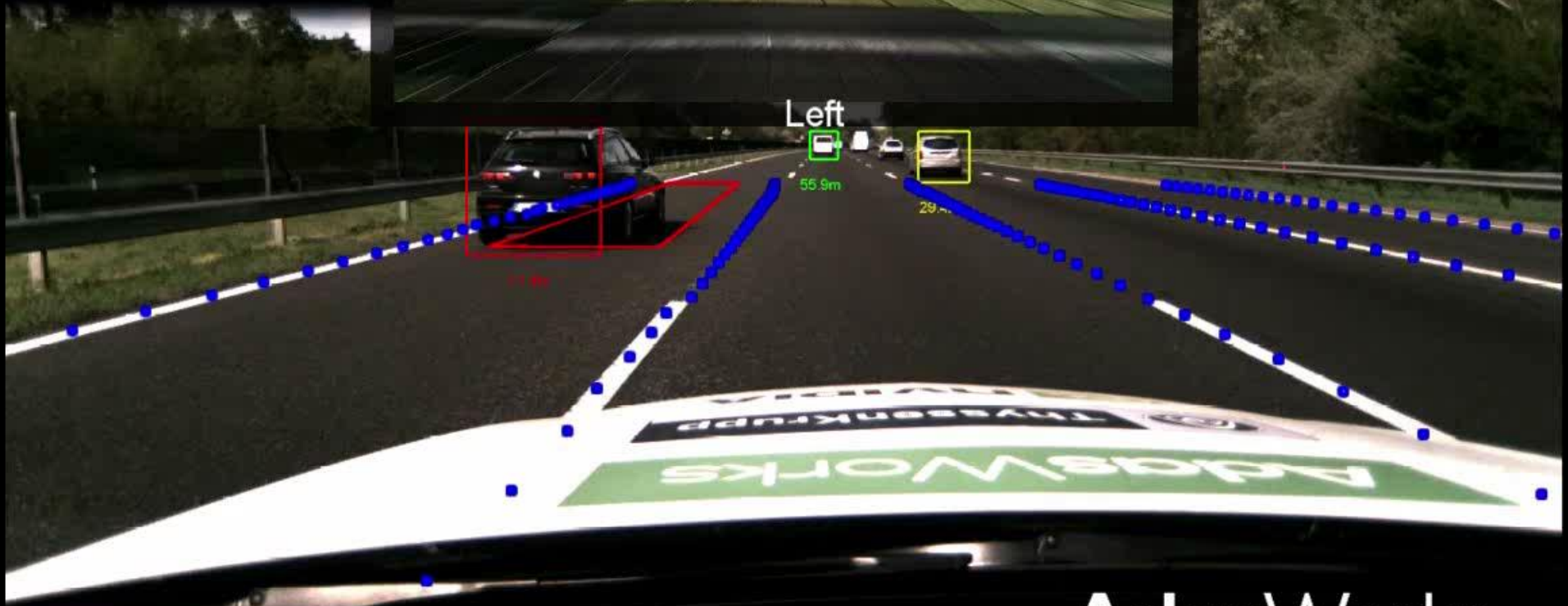
Front

360 View

Right

Rear

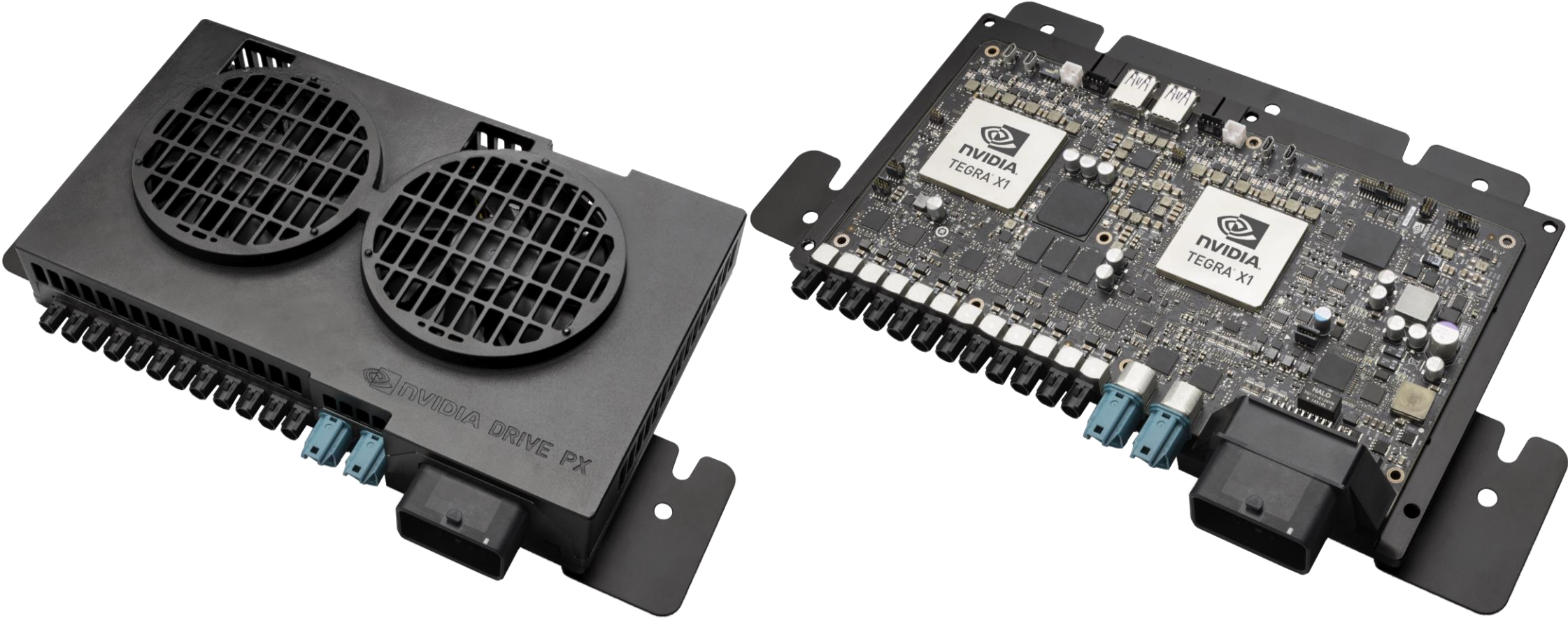
Left



ADASWORKS
THYSENKRUPP

AdasWorks

Drive PX Development Platform



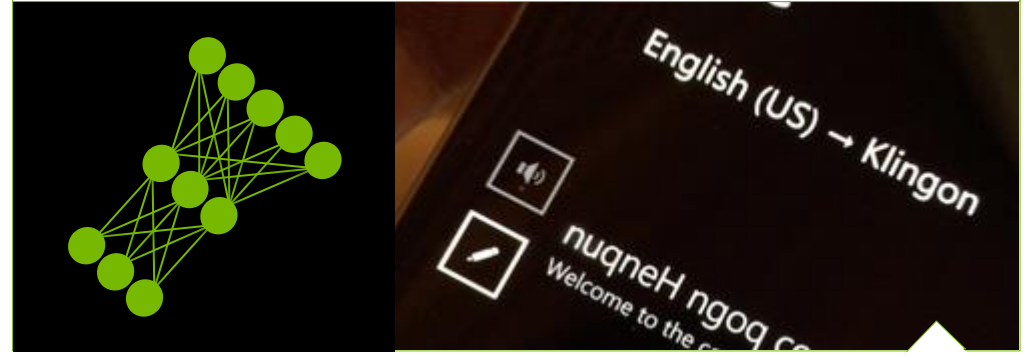
Todo: better version of this slide

Practical Examples of Deep Learning

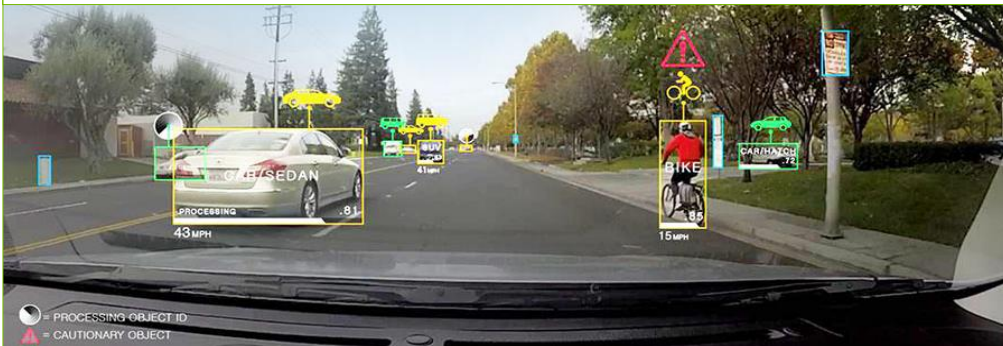
Image Classification, Object Detection, Localization, Action Recognition



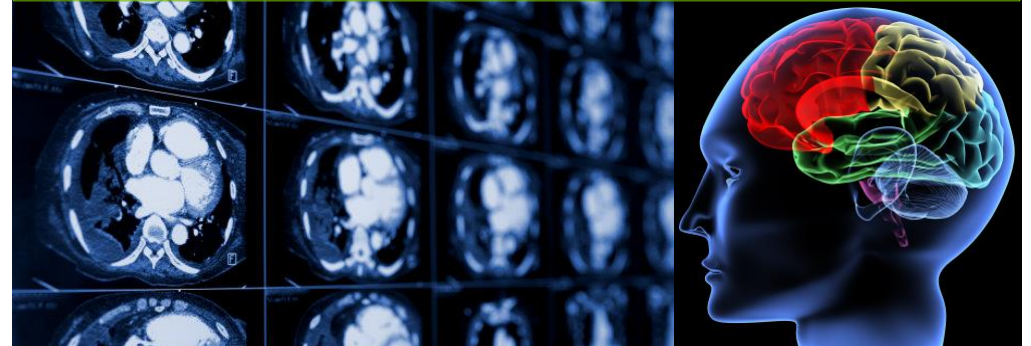
Speech Recognition, Speech Translation, Natural Language Processing



Pedestrian Detection, Lane Detection, Traffic Sign Recognition



Breast Cancer Cell Mitosis Detection, Volumetric Brain Image Segmentation





The Deep Learning Community: Detecting Diabetic Retinopathy

kaggle

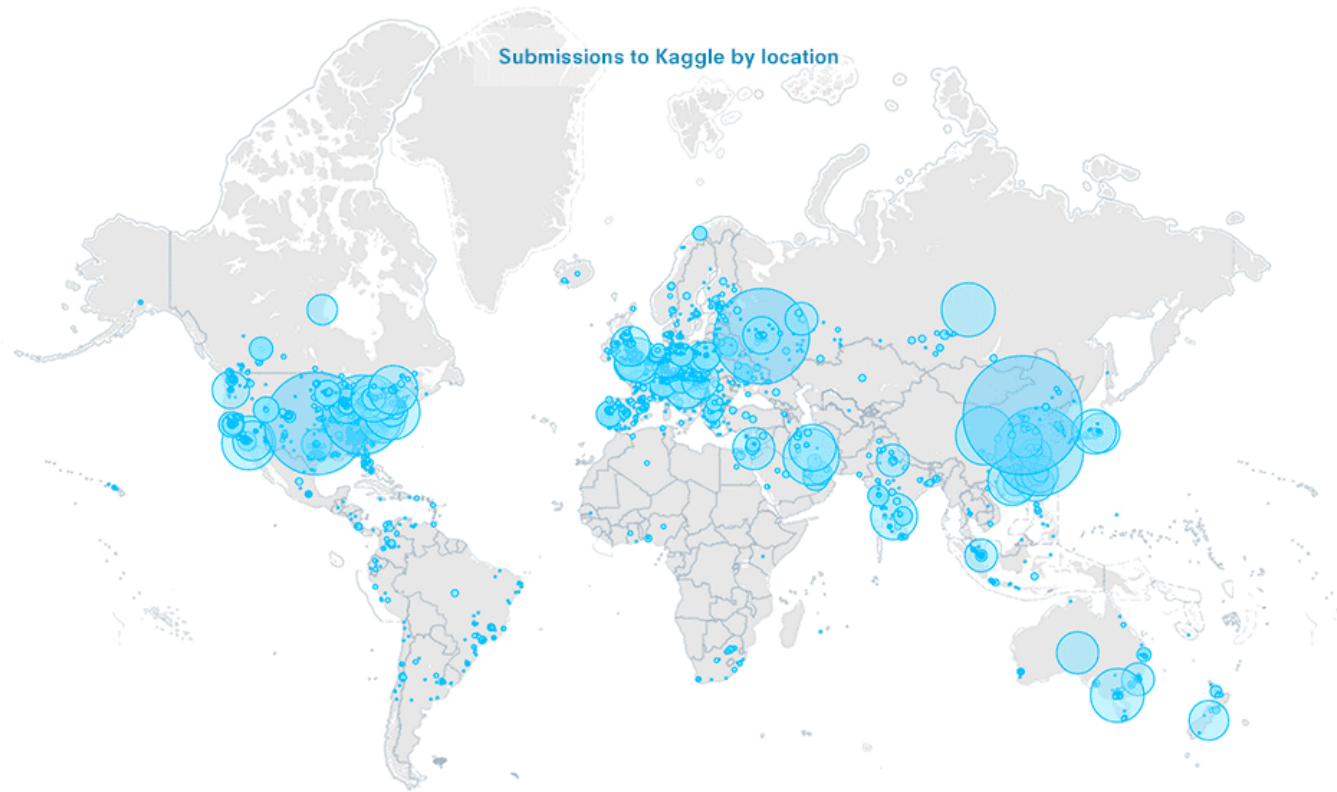
Data Scientist Community

Founded in 2010

Sponsor contests to spur collaborative problem solving

354K data scientists in Kaggle community

92K machine learning models submitted to Kaggle competitions each month



Diabetic Retinopathy

Affects 347 million people worldwide

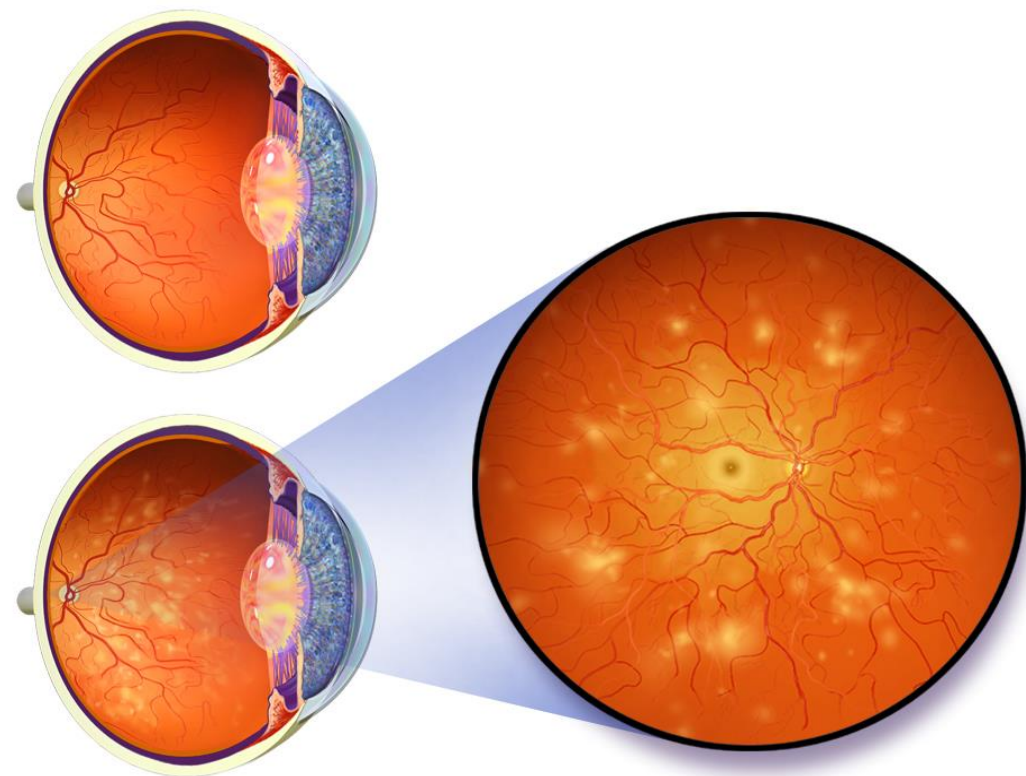
Leading cause of blindness among working age population in developed world

Changes to blood vessels in the retina lead to aneurisms and fluid leaks

If no treated early, can cause blindness

Requires regular screenings

Fundus photography with interpretation by trained physician



Kaggle Diabetic Retinopathy Contest

\$100,000 award sponsored by the California Healthcare Foundation

Contestants provided 17,000 left/right images with score: 0 (healthy) to 4 (diseased)

Typical clinician scores 0.83 (1.0 = perfect agreement with another clinician)

661 teams entered

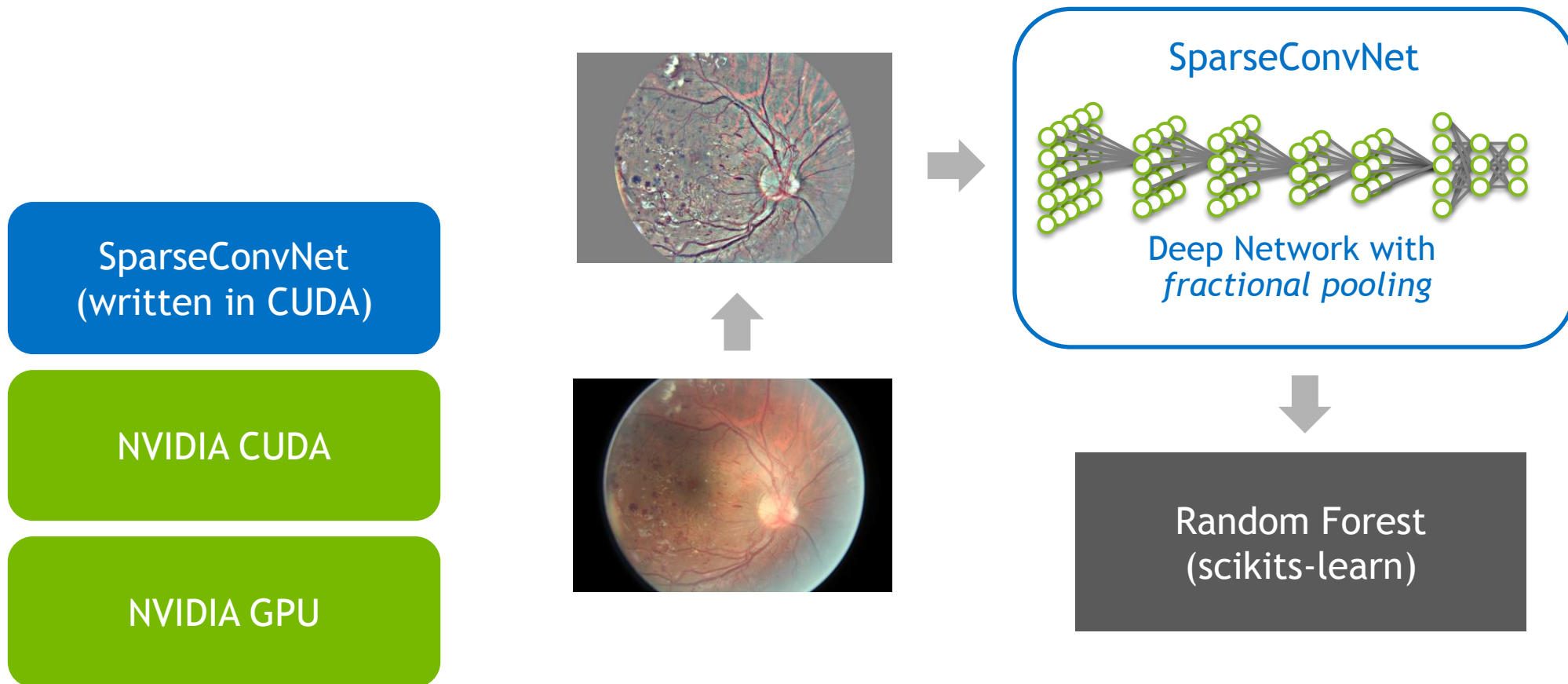
Winning score 0.84958

4 teams above 0.83



Benjamin Graham - Finished #1!

Assistant Professor in Stats and Complexity, University of Warwick



Antreas Antoniou - Finished in top 3rd

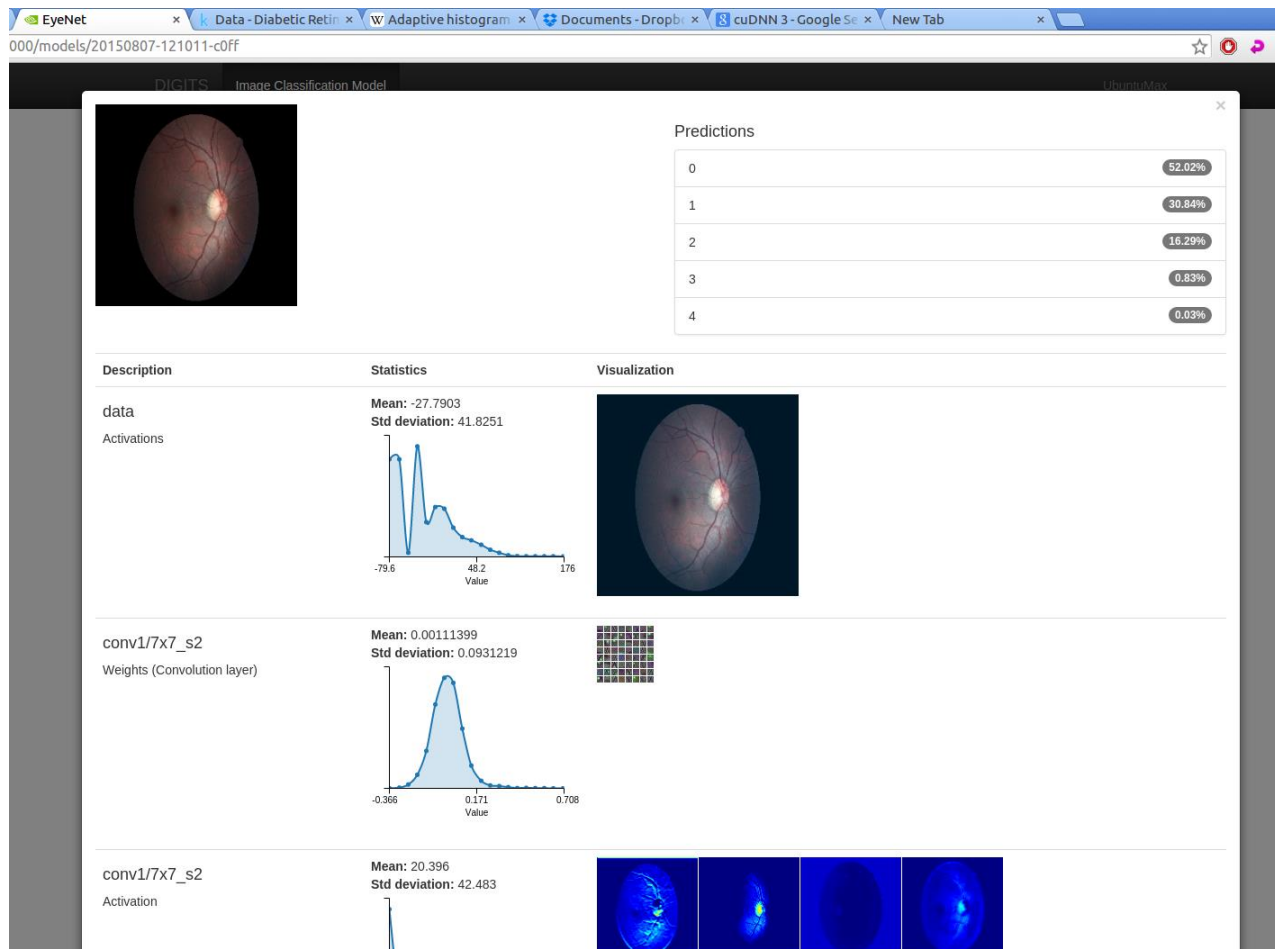
Master's Data Science student, University of Lancaster

NVIDIA DIGITS

NVIDIA cuDNN

NVIDIA CUDA

NVIDIA GPU



Deep Learning Platform



DEVELOPMENT

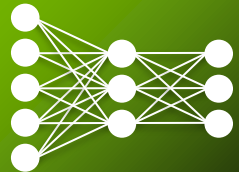
DEPLOYMENT

Applications

DIGITS Tools

Deep Learning Frameworks

Software



cuDNN

Systems



DIGITS DevBox

Hardware



Titan X

Software

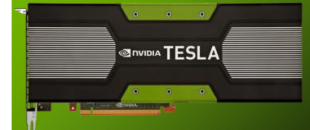


System
Management

Systems



Hardware



Tesla

NVIDIA DEEP LEARNING PLATFORM

NVIDIA cuDNN

GPU Acceleration for Deep Learning Frameworks



High performance neural network training

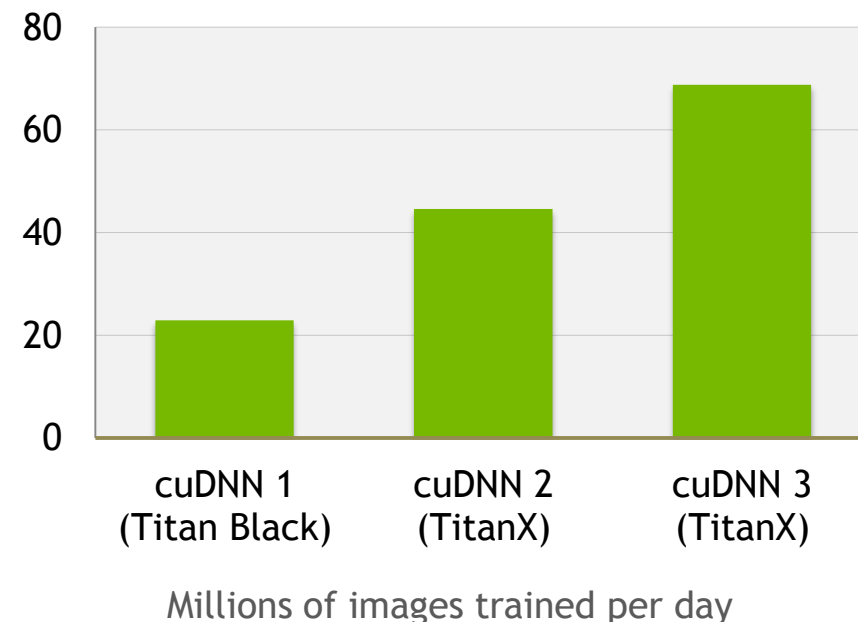
GPU acceleration for Caffe, Theano, Torch and other deep learning frameworks

Support for widely-used layer types, including pooling, ReLU, sigmoid, softmax and TANH

Performance optimized for the latest NVIDIA GPU architectures

Linux, Windows, OSX and Linux for Tegra (ARM)

Performance continues to improve



<http://developer.nvidia.com/cuDNN>

NVIDIA DIGITS

Interactive Deep Learning GPU Training System

Process Data

Image Classification Dataset

voc_cropped@256x256
Image Classification Dataset

Job Information

Job Directory
/home/michaelo/digits
/jobs/20150311-171431-e0d8

Image Type
Color

Image Dimensions
256x256

Resize Mode
half_crop

Parse Folder (train/val)

Folder
http://sql/data/images/voc_cropped/

Number of categories
20

Training images
26759

Validation images
8917 (25.0%)

Create DB (train)

Input file
train.txt

DB Entries
26759

12,000
9,000
6,000
3,000
0

Configure DNN

Select Dataset

PASCAL VOC ILSVRC 2012
MNIST Dataset

Solver Options

Training epochs
30

Validation interval (in epochs)
1

(neat progress bar)

Batch size
100

Base Learning Rate
0.01

Show advanced learning rate options

Standard Networks **Previous Networks**

Custom Network

```
{  
  "layer": {  
    "name": "conv1"  
    "type": "Convolution"  
    "bottom": "data"  
    "top": "conv1"  
    "param": {  
      "lr_mult": 1  
      "decay_mult": 1  
    }  
  }  
}
```

Pretrained model

Model Name
ImageNet

Create

Monitor Progress

Image Classification Model

Solver
solver.prototxt
Network (train/val)
train_val.prototxt
Network (deploy)
deploy.prototxt

Dataset
voc_cropped@256x256
Done Wed Mar 11, 05:16:57 PM

Image Size
256x256

Image Type
COLOR

Create DB (train)
26759 images

Create DB (val)
8917 images

Loss (train) **Loss (val)** **Accuracy (val)**

4
3
2
1
0

0.0 2.5 5.0 7.5 10.0

80
60
40
20
0

Visualize Layers

Test Image

Predictions

8
3
0
6
4

Layer Activations

conv1

pool1

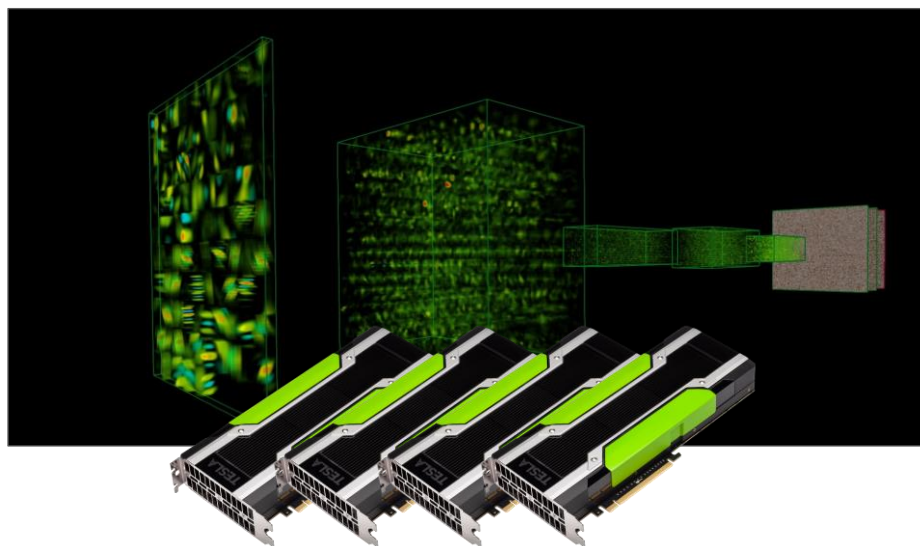
<http://developer.nvidia.com/digits>

Automatic Multi-GPU Training

DIGITS 2 interactive deep learning training system

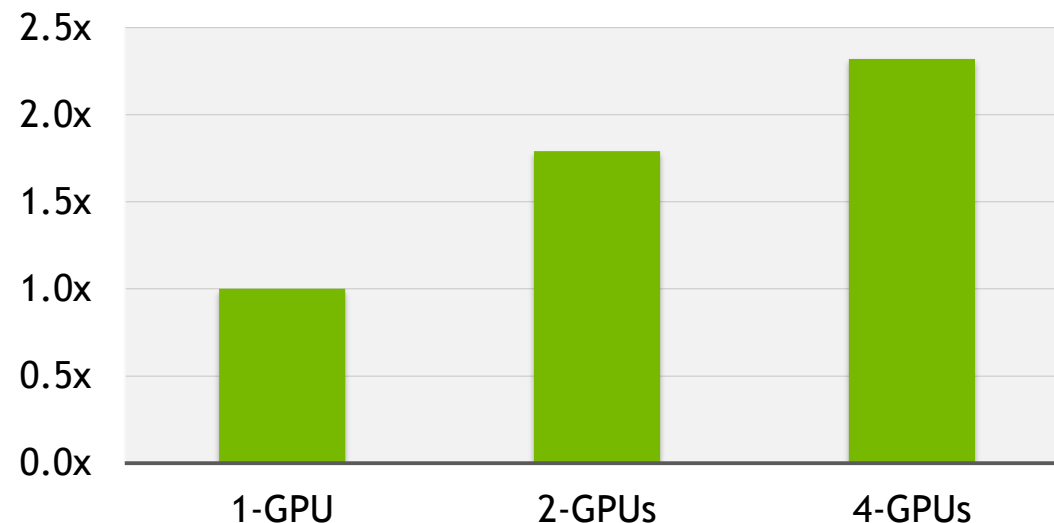
Automatic multi-GPU scaling

Up to 4 GPUs



developer.nvidia.com/digits

DIGITS 2 trains models up to 2x faster with Multi-GPU Scaling



DIGITS 2 performance vs. previous version on an NVIDIA DIGITS DevBox system

Learn More: Introduction to Deep Learning

Free 10-week Online Course

Get Started with Deep Learning

DIGITS, Caffe, Theano, Torch

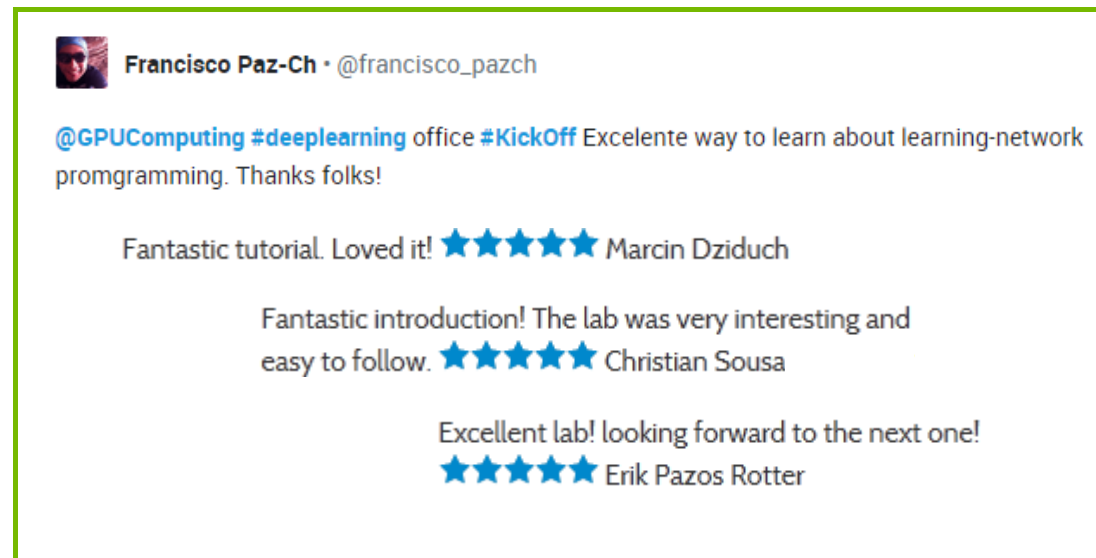
5 units - available worldwide

Live classes (recordings available)

Hands-on labs (no GPU required)

Office hours with NVIDIA experts

Wednesdays, 9-10am Pacific Time



Francisco Paz-Ch • @francisco_pazch

@GPUComputing #deeplearning office #KickOff Excelente way to learn about learning-network programming. Thanks folks!

Fantastic tutorial. Loved it! ★★★★★ Marcin Dziduch

Fantastic introduction! The lab was very interesting and easy to follow. ★★★★★ Christian Sousa

Excellent lab! looking forward to the next one! ★★★★★ Erik Pazos Rotter

developer.nvidia.com/deep-learning-courses

GPU TECHNOLOGY
CONFERENCE

THANK YOU

JOIN THE CONVERSATION

#GTC15   