



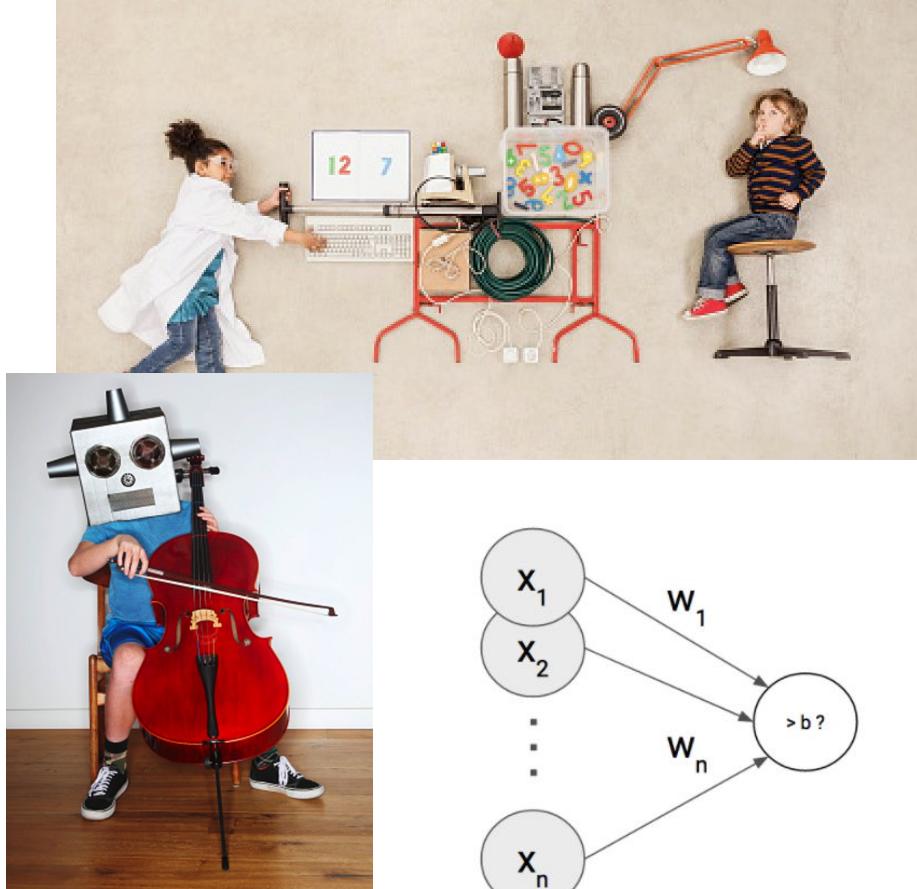
Summit

Real-world Machine Learning with TensorFlow and Cloud ML

Cloud-based ML solutions in Action

The Buzz Words

AI, ML and Neural Network



Artificial Intelligence

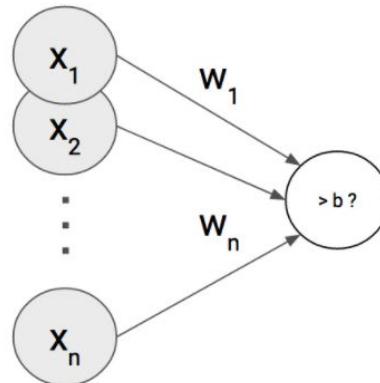
The science of making things smart

Machine Learning

Building machines that can learn

Neural Network

A type of algorithm in machine learning

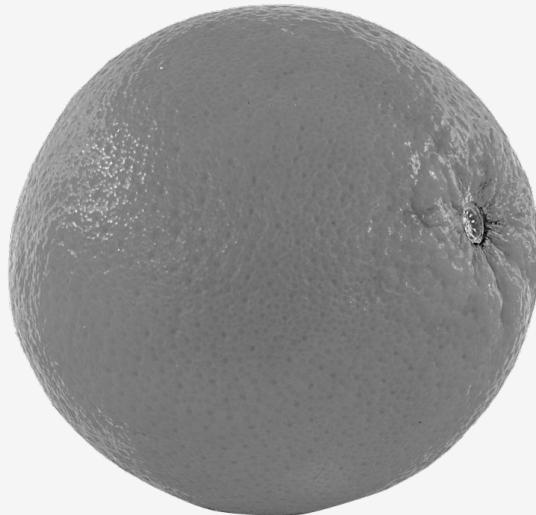


How do you classify this with your code?



CC-BY-SA 2.0 Wikimedia Commons
https://commons.wikimedia.org/wiki/File:Apple_in_lightbox.png

How do you classify this with your code?



CC-BY-SA 2.0 Wikimedia Commons
https://commons.wikimedia.org/wiki/File:Apple_in_lightbox.png

Activity Detection



```
if(speed<4){  
    status=WALKING;  
}
```

```
if(speed<4){  
    status=WALKING;  
} else {  
    status=RUNNING;  
}
```

```
if(speed<4){  
    status=WALKING;  
} else if(speed<12){  
    status=RUNNING;  
} else {  
    status=BIKING;  
}
```

// Oh crap

Activity Detection



0101001010100101010
1001010101001011101
0100101010010101001
0101001010100101010

1010100101001010101
0101010010010010001
001001111010101111
1010100100111101011

1001010011111010101
1101010111010101110
1010101111010101011
1111110001111010101

111111111010011101
0011111010111110101
0101110101010101110
1010101010100111110

Label = WALKING

Label = RUNNING

Label = BIKING

Label = GOLFING

How about these?



CC-BY-SA-2.5 Wikimedia Commons https://commons.wikimedia.org/wiki/File:Komondor_Westminster_Dog_Show_crop.jpg

CC-BY-2.0 Wikimedia Commons [https://commons.wikimedia.org/wiki/File:2014_Westminster_Kennel_Club_Dog_Show_\(12487315865\).jpg](https://commons.wikimedia.org/wiki/File:2014_Westminster_Kennel_Club_Dog_Show_(12487315865).jpg)

CC-BY-2.0 Petful <https://www.flickr.com/photos/petsadviser-pix/16395099127>

CC-BY-SA-2.0 Jeffrey Beall <https://www.flickr.com/photos/denverjeffrey/6903790333>

With Cloud Vision API...



CC-BY-SA-2.5 Wikimedia Commons https://commons.wikimedia.org/wiki/File:Komondor_Westminster_Dog_Show_crop.jpg

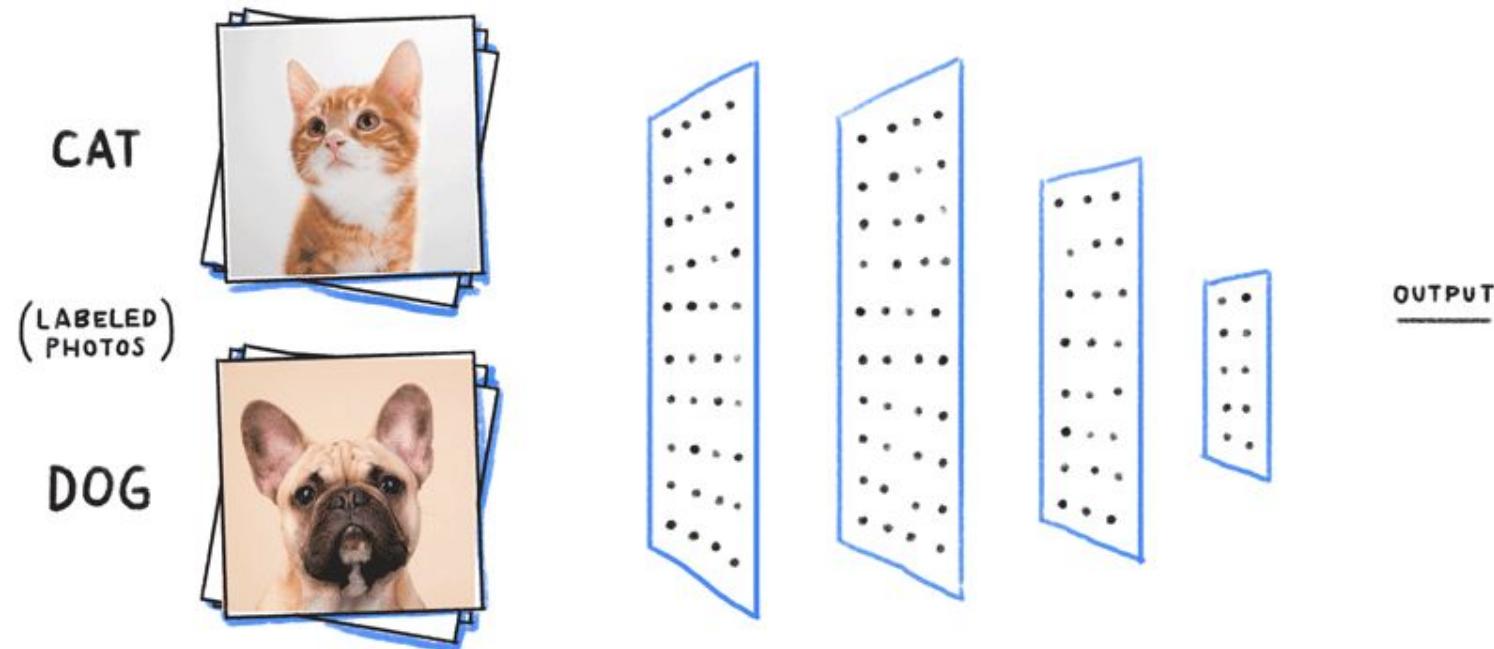
CC-BY-2.0 Wikimedia Commons [https://commons.wikimedia.org/wiki/File:2014_Westminster_Kennel_Club_Dog_Show_\(12487315865\).jpg](https://commons.wikimedia.org/wiki/File:2014_Westminster_Kennel_Club_Dog_Show_(12487315865).jpg)

CC-BY-2.0 Petful <https://www.flickr.com/photos/petsadviser-pix/16395099127>

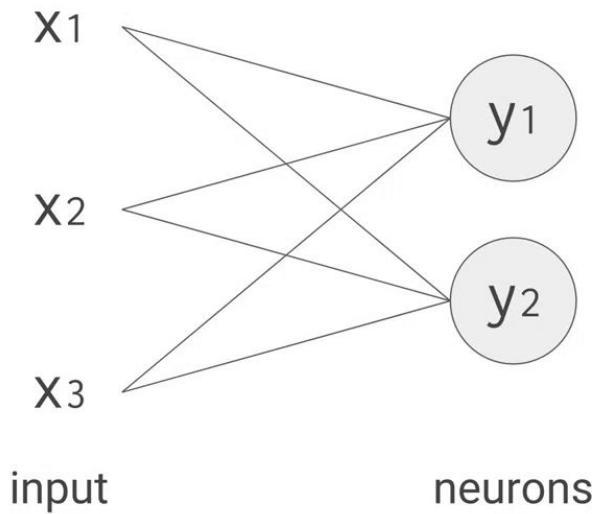
CC-BY-SA-2.0 Jeffrey Beall <https://www.flickr.com/photos/denverjeffrey/6903790333>

The mechanics of Neural Network

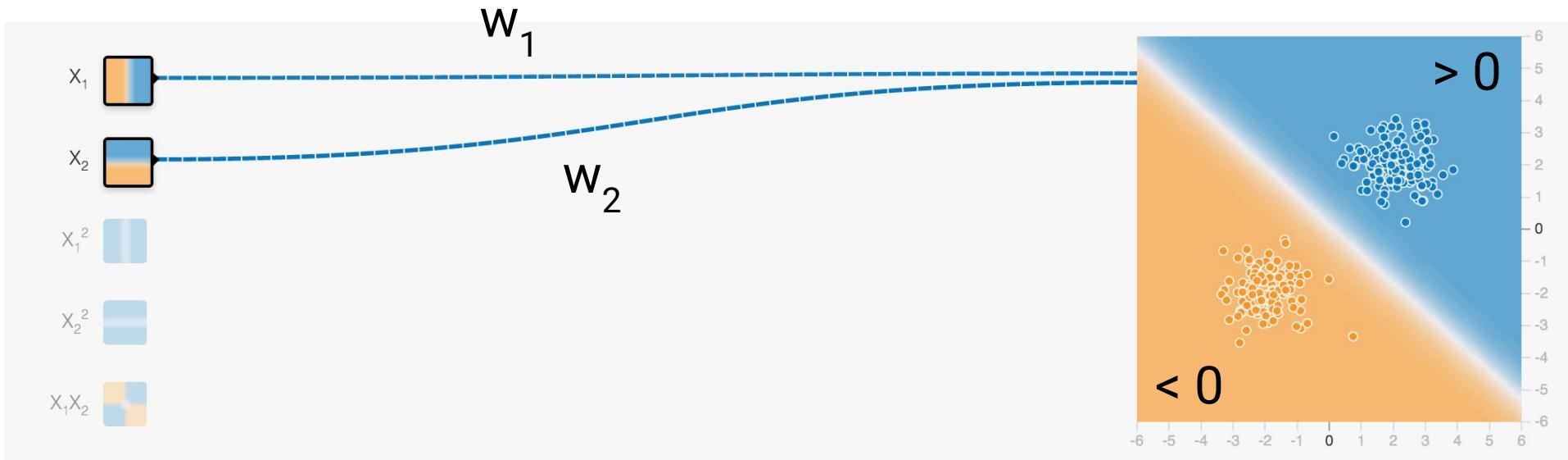
Neural Network is a **function** that can **learn**



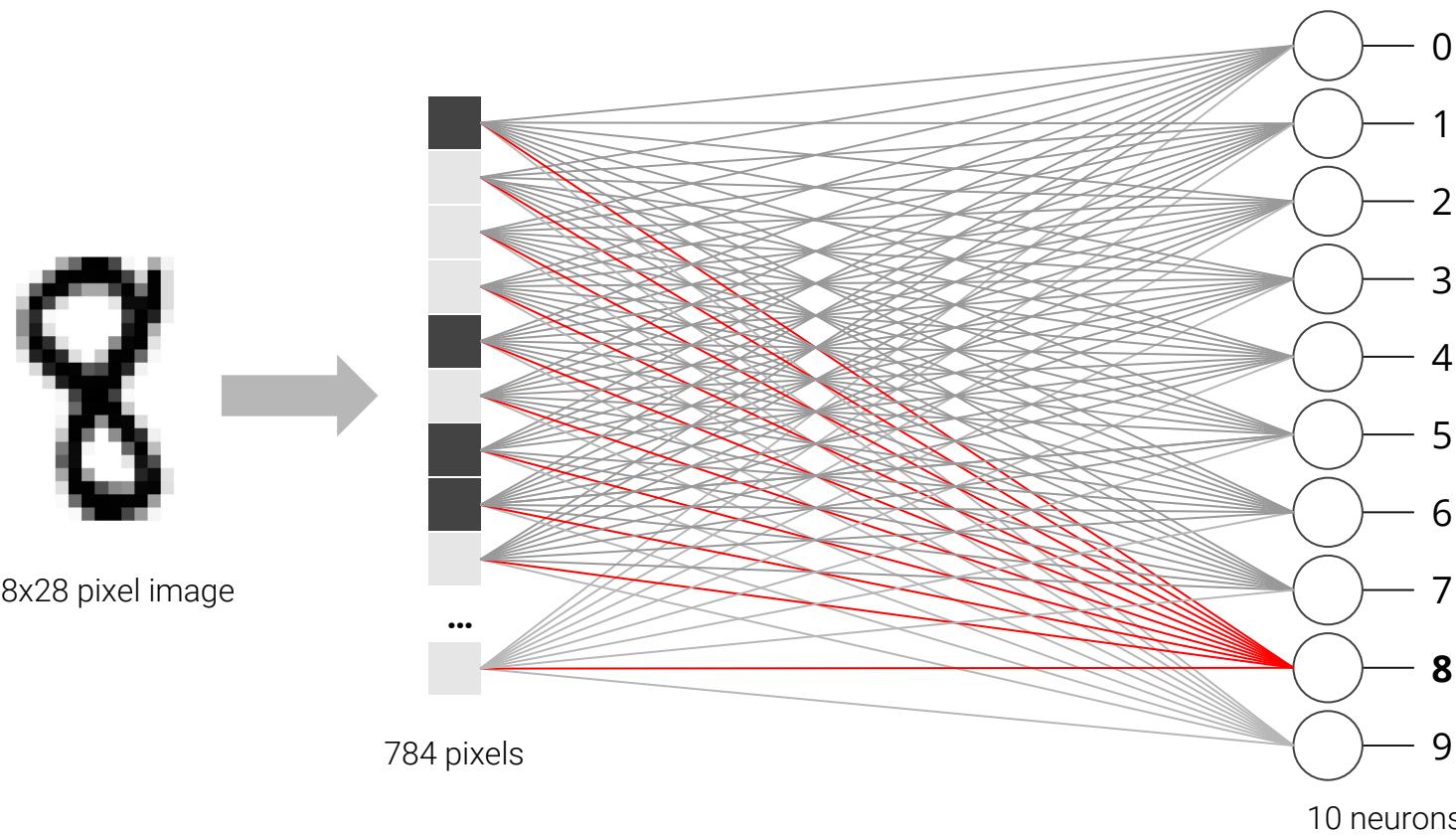
Mimic the behavior of human neurons with simple math



Let's see how the neuron solves the problem



Even from hundreds or thousands of features in big data

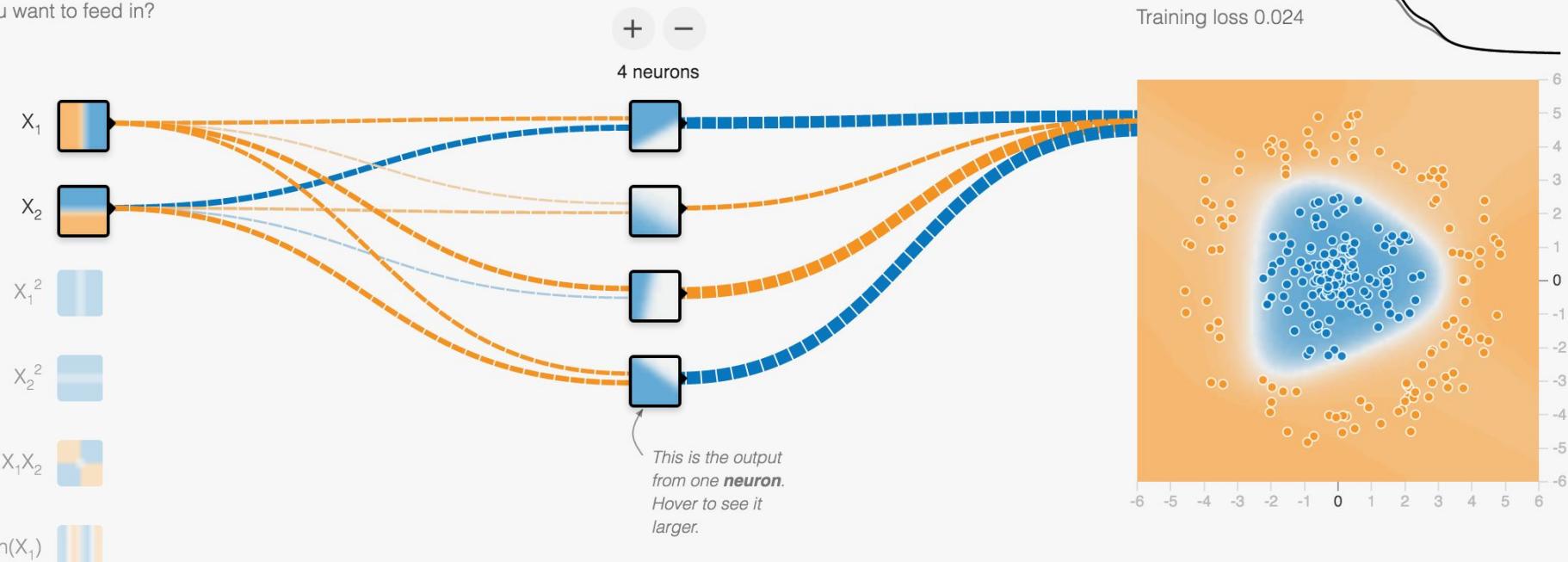


What is Deep Learning

INPUT

Which properties do you want to feed in?

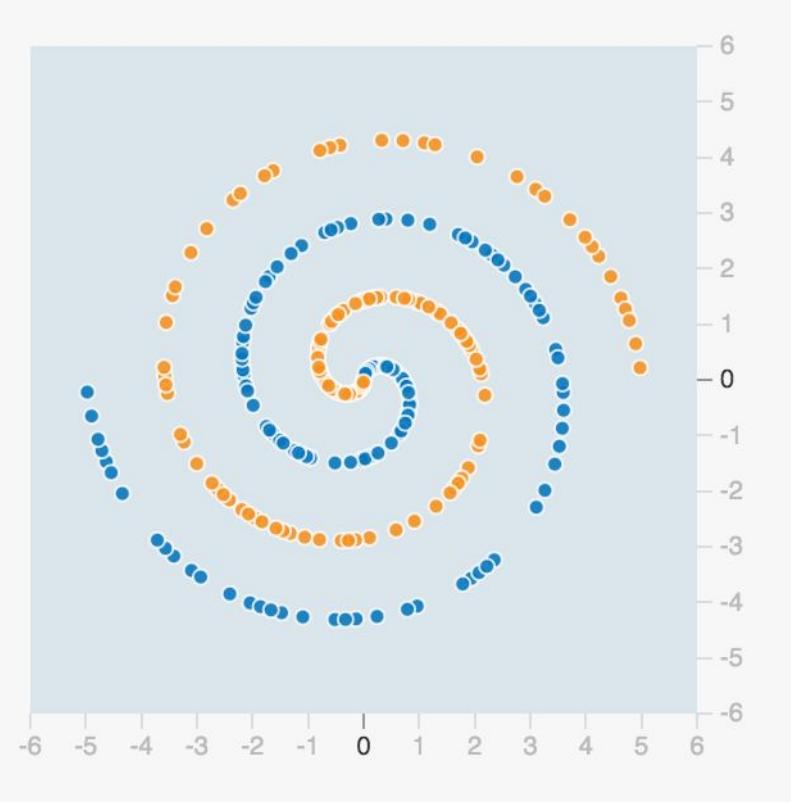
+ - 1 HIDDEN LAYER



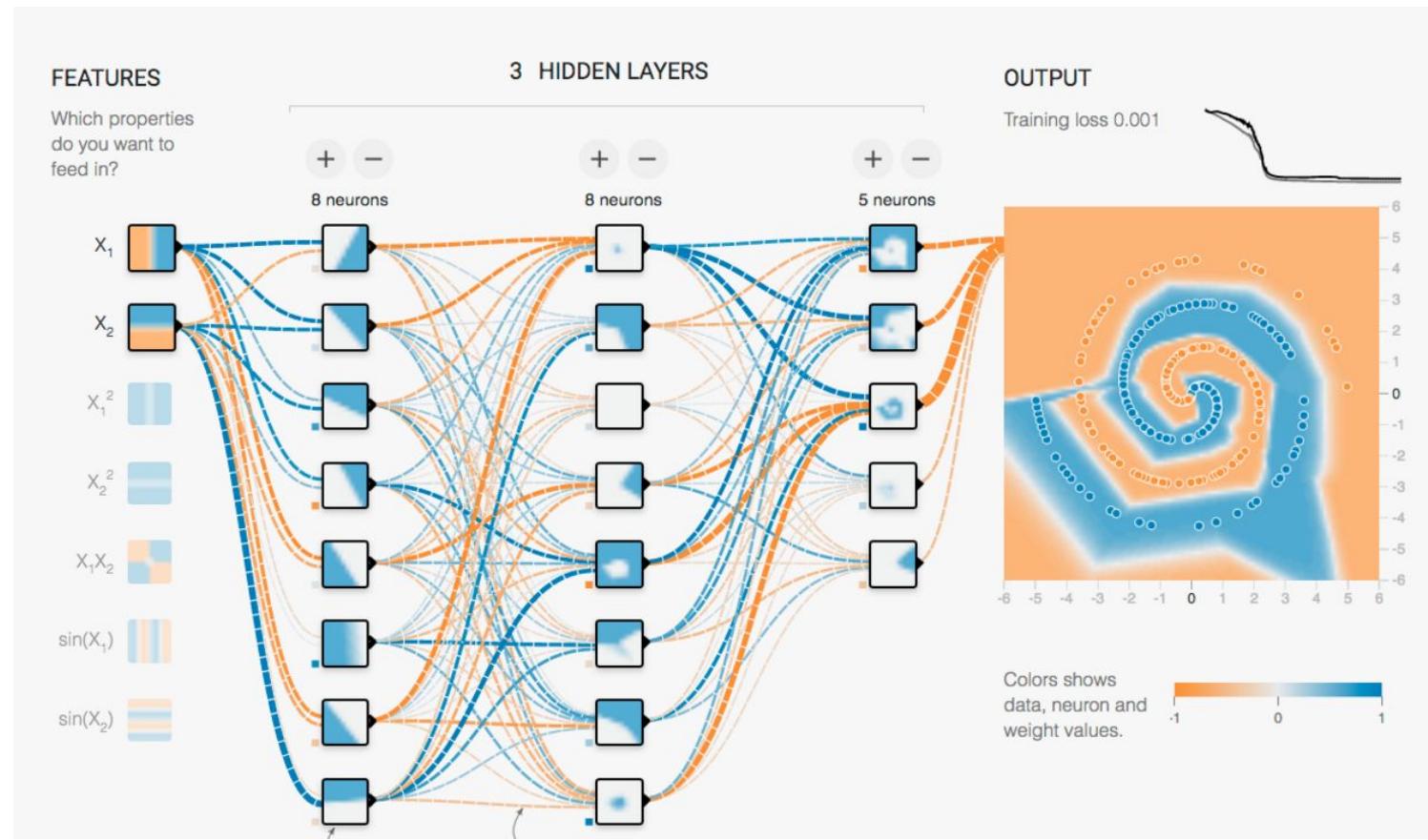
OUTPUT

Test loss 0.026
Training loss 0.024

More neurons = More features to extract

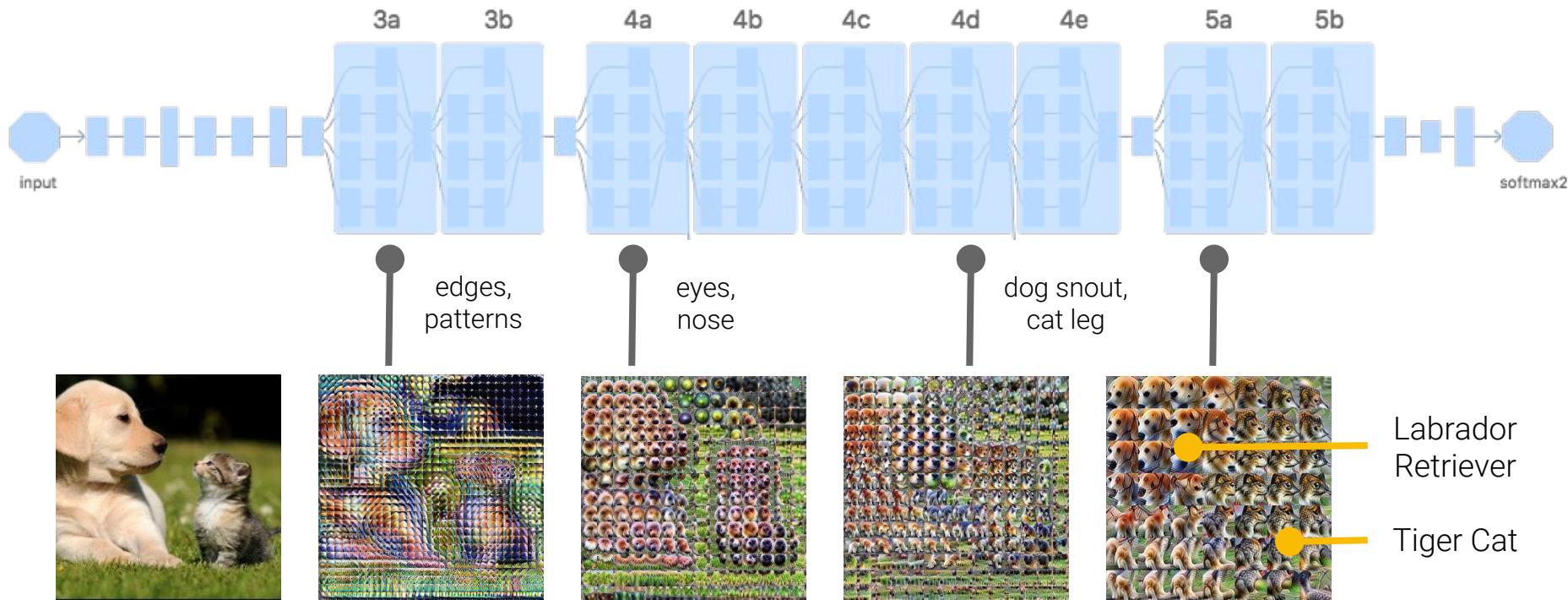


How about this?



More hidden layers = More hierarchies of features

More layers for deeper insights = Deep Learning



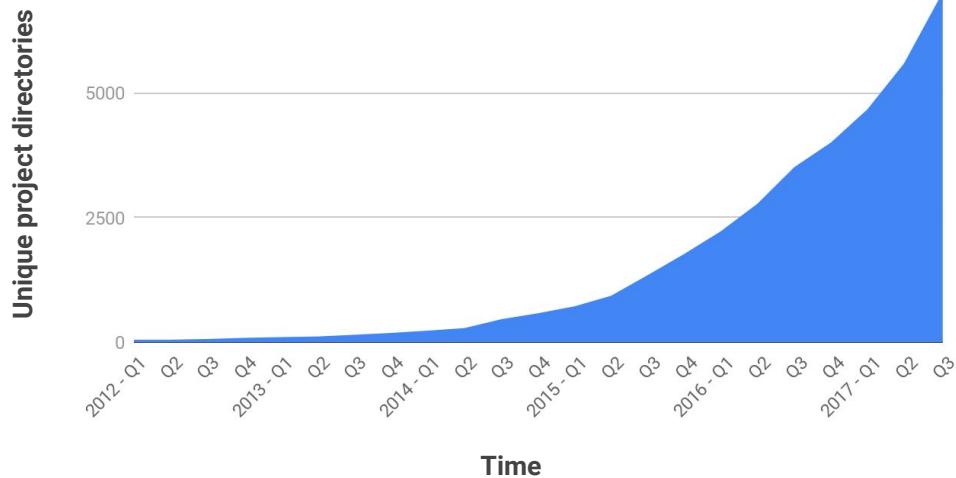
Source: [The Building Blocks of Interpretability](#), Chris Olah et. al.

ML use cases in Google services

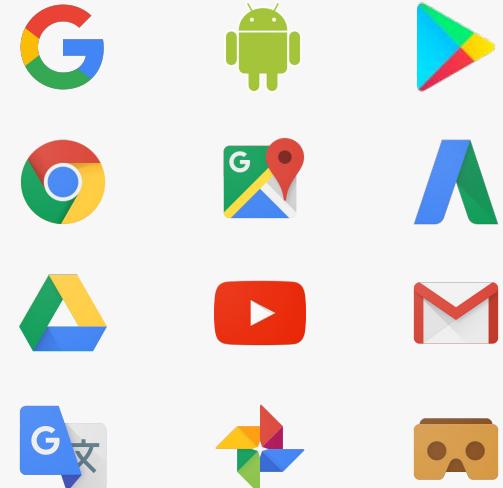


Google is an AI company

Google 3 directories containing Brain Model



Used across products:





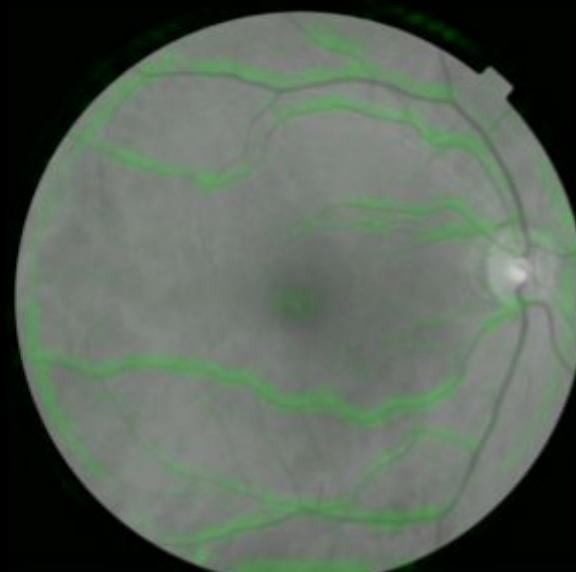
Google Photos



“boats”



Image of retina



Blood pressure predictions
focus on blood vessels



1 Second

Output



Hidden Layer



Hidden Layer



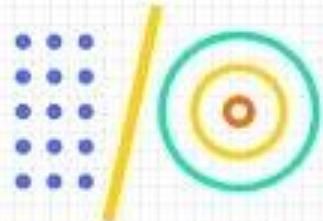
Hidden Layer



Input



WaveNet by
DeepMind



2018 Google I/O Keynote



Gmail

Compose

Inbox

Primary

Social

Promotions

Updates

1-11 of 11

Trip to Cairngorms National Park – Planning for a trip in July. Are you interested in...
Surf Sunday? – Great. Let's meet at Jack's at 8am, then?
Best Japan
Book Club – Jacqueline Bruzek
Work – Pres
Taco Tuesday
Jacqueline Bruzek
Taco Tuesday
Work – Bus
Hiking this weekend
Mike's surprise
Cooking class
Pictures from
IMG_0001.jpg
My roadtrip

Salit Kulla

Brianna, John

Luis, me, Anastasia

Daniel Vickery

Nick Kortendick

Tim Greer

Karen, Meredith, James

Anissa, Meredith, James

Song Chi

Cameron, Tyler, Dylan

Mizra Sato

0.33 GB (2%) of 15 GB used
Manage

Taco Tuesday

Send

Smart Compose in Gmail

The image shows a screenshot of the Gmail web interface. On the left, there's a sidebar with links like 'Compose', 'Inbox' (which is selected and highlighted in red), 'Starred', 'Snoozed', 'Important', 'Sent', 'Work', and 'More'. The main area shows a list of 11 emails under the 'Primary' tab. One email from Jacqueline Bruzek is selected, and a context menu is open over it, displaying suggestions such as 'Taco Tuesday', 'Jacqueline Bruzek', and 'Taco Tuesday'. At the bottom of the screen, there's a large watermark or overlay text that reads 'Smart Compose in Gmail' next to a blue envelope icon with a white checkmark inside.



Google Translate



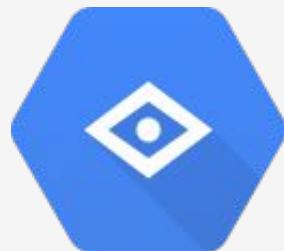
ML services from Google Cloud

Sharing the power of ML

ML services from Google Cloud

AI Building blocks

Pre-trained,
easy to use



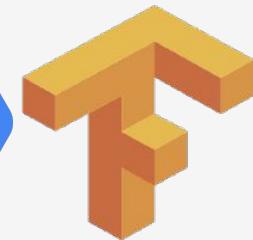
Cloud AutoML

Customizable,
easy to use



Cloud ML Engine /TensorFlow

Scalable and flexible ML
for data scientists



Cloud AI building blocks

SIGHT



Cloud Vision API

Image recognition and classification.



Cloud Video Intelligence API

Scene-level video annotation.



AutoML Vision^{BETA}

Custom image classification models.

LANGUAGE



Cloud Translation API

Language detection and translation.



Cloud Natural Language API

Text parsing and analysis.



AutoML Translation^{BETA}

Custom domain-specific translation.



AutoML Natural Language^{BETA}

Custom text classification models.

CONVERSATION



Dialogflow Enterprise Edition

Build conversational interfaces.



Cloud Text-to-Speech API

Convert text to speech.



Cloud Speech-to-Text API

Convert speech to text.



Label
Detection



Explicit Content
Detection



Vision API: Web annotations

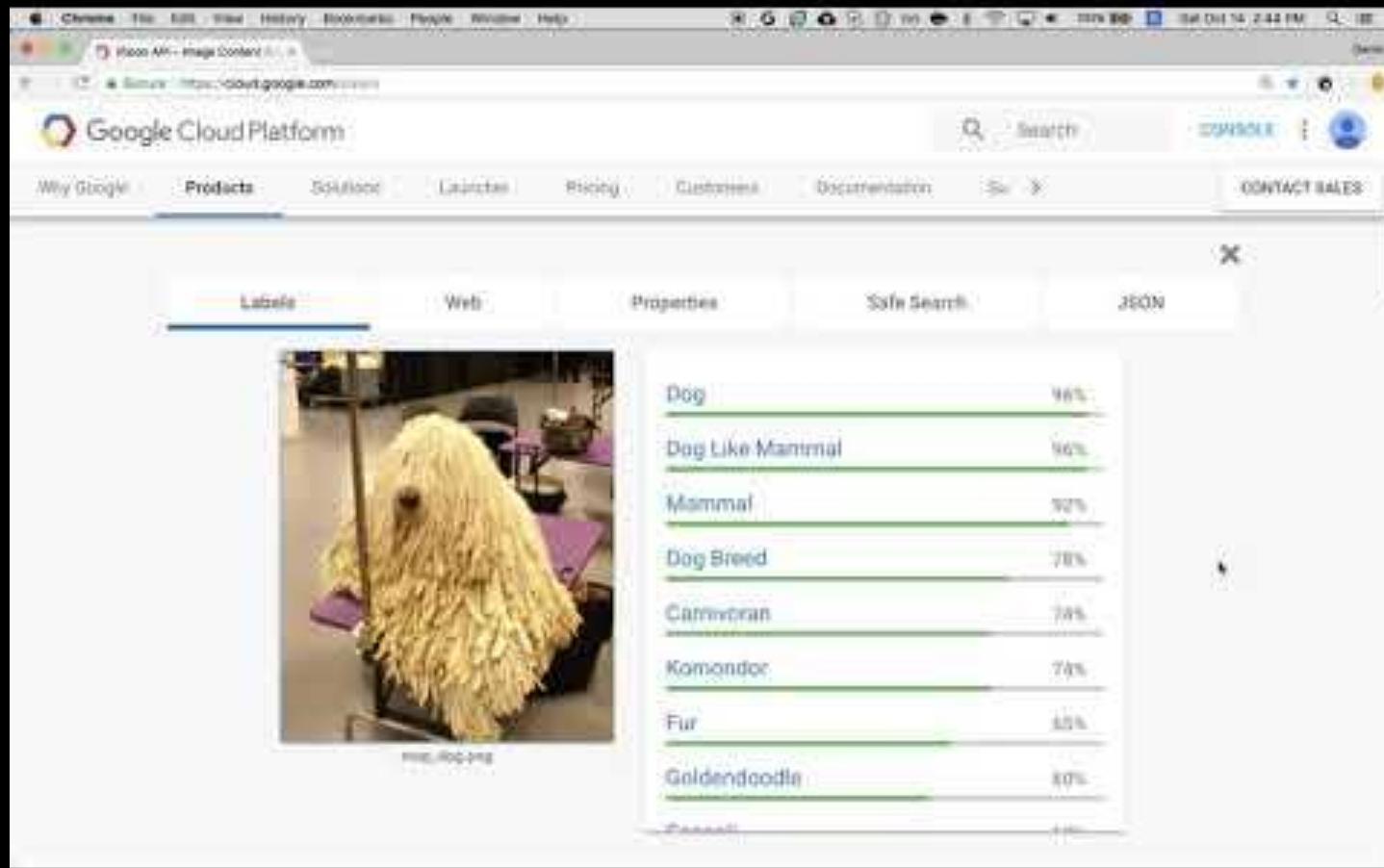
```
{  
  "entityId": "/m/016ms7",  
  "score": 1.44038,  
  "description": "Ford Anglia"  
}
```



[CC-BY 2.0 Rev Stan: <https://www.flickr.com/photos/revstan/6865880240>](https://www.flickr.com/photos/revstan/6865880240)

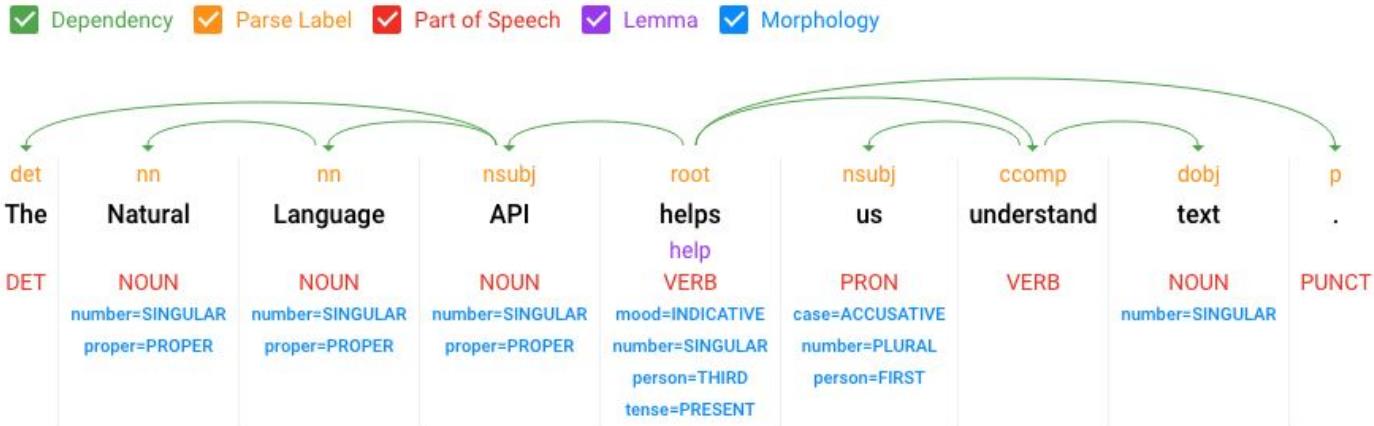
```
{  
  "entityId": "/m/0gff2yr",  
  "score": 5.92256,  
  "description": "ArtScience Museum"  
}
```

```
{  
  "entityId": "/m/0h898pd",  
  "score": 7.4162,  
  "description": "Harry Potter (Literary Series)"  
}
```



Natural Language API: Entity and Syntactic analysis

Joanne "Jo" Rowling, pen names **J. K. Rowling** and **Robert Galbraith**, is a **British** novelist, screenwriter and film producer best known as the author of the **Harry Potter** fantasy series



● Chrome File Edit View History Documents People Photos Help

Spotify API - Google Search Cloud Natural Language API

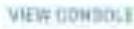
https://cloud.google.com/natural-language/

Google Cloud Platform Search CHANGER

Why Google Products Solutions Launchers Pricing Customers Documentation Go > CONTACT SALES

CLOUD NATURAL LANGUAGE API

Derive insights from unstructured text using Google machine learning

 VIEW DOCUMENTATION  VIEW CONSOLE

Powerful Text Analysis

Google Cloud Natural Language API reveals the structure and meaning of text by offering powerful machine learning models in an easy to use REST API. You can use it to extract information about people, places, events and much more, mentioned in text documents, news articles or blog posts. You can use it to understand sentiment about your product on social media or parse intent from customer conversations.



Cloud AutoML

Automating the craft of
data science

State of the Industry: Complex & Time Intensive



Large computational resource

Machine learning expertise

Manual data labeling

Introducing Cloud AutoML

A technology that can automatically create a Machine Learning Model





Photo Dataset



Cloud AutoML Vision

Generate predictions
with a REST API

Rest API



Train

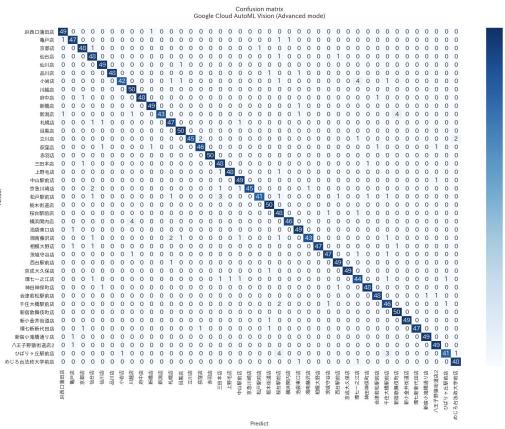


Deploy

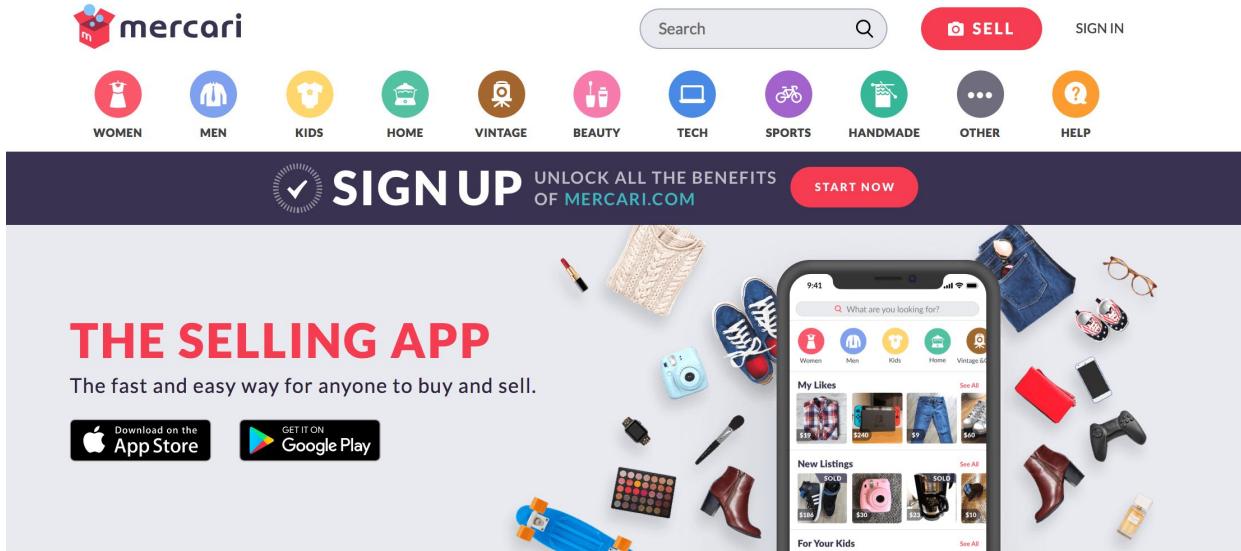


Serve

Predicting Ramen shop at 95% accuracy
from 41 Ramen Jiro branches



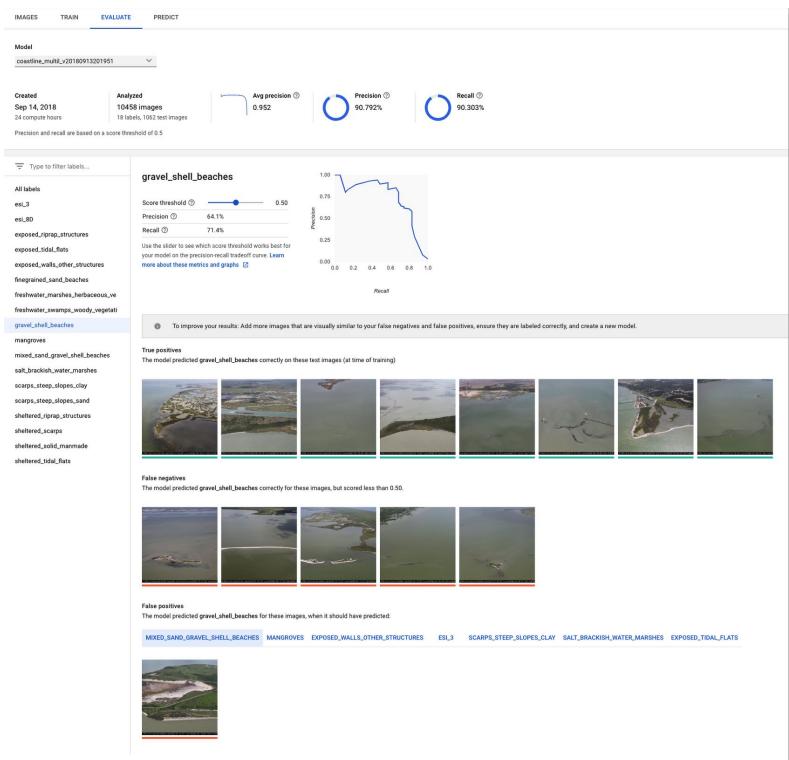
Predicting Brand names at 90% accuracy from 12 popular brands at Mercari



| | | Predicted label | | | | | | | | | | | |
|------------|--------|-----------------|--------|-------|------|--------|--------|-------|-------|--------|-------|--|--|
| | | gucci | miumiu | botte | tory | hermes | chanel | coach | jimmy | celine | fendi | | |
| True Label | gucci | 87% | 4% | 0% | 1% | 0% | 1% | 1% | 1% | 1% | 0% | | |
| | miumiu | 2% | 87% | 1% | 1% | 0% | 0% | 1% | 2% | 0% | 0% | | |
| botte | 3% | 0% | 88% | 1% | 1% | 0% | 0% | 2% | 0% | 0% | 0% | | |
| tory | 1% | 0% | 0% | 90% | 1% | 1% | 1% | 1% | 0% | 0% | 0% | | |
| hermes | 1% | 0% | 0% | 0% | 83% | 0% | 0% | 0% | 1% | 0% | 0% | | |
| chanel | 2% | 1% | 0% | 0% | 0% | 1% | 0% | 1% | 0% | 0% | 0% | | |
| coach | 0% | 1% | 0% | 0% | 0% | 0% | 1% | 1% | 0% | 0% | 0% | | |
| jimmy | 0% | 1% | 1% | 0% | 0% | 0% | 0% | 91% | 0% | 0% | 0% | | |
| celine | 0% | 0% | 1% | 1% | 0% | 0% | 1% | 0% | 93% | 1% | 0% | | |
| fendi | 0% | 0% | 1% | 1% | 0% | 0% | 0% | 0% | 2% | 90% | 0% | | |

True label: hermes
Predicted: hermes
Correct: 93%
371 out of 396

Tracking environmental changes at the Gulf of Mexico



TensorFlow

The open source software
for ML development

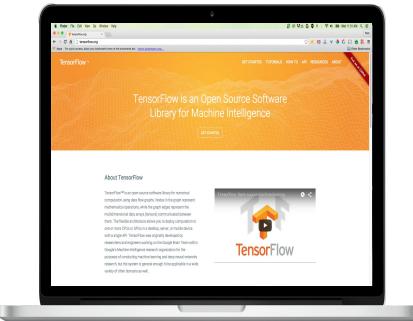
What is TensorFlow?

Open source software for ML development

tensorflow.org launched in Nov 2015

Created by Google Brain team

The standard tool for ML and AI development
at Google



A comprehensive ML toolkit

Neural Nets

K-Means

Loss Functions,
Metrics

Probabilistic
Methods

Linear Algebra

Decision Trees

SVM

Signal
Processing

Regression

Random Forests

Gaussian
Mixture Models

Lattice

Python

C++

Java

...

TensorFlow Distributed Execution Engine

CPU

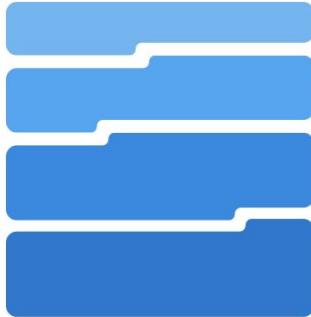
GPU

TPU

Mobile

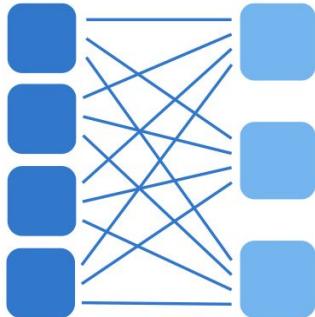
...

Bucketing



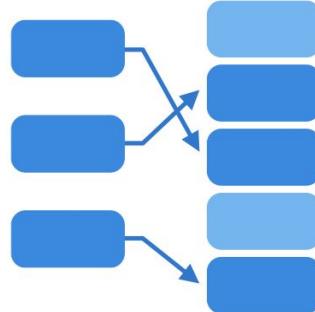
Partition by range

Crossing



Create new
combinations

Hashing



Limit size

Embedding



Learn a new
representation

https://www.youtube.com/watch?v=d12ra3b_M-0

https://www.tensorflow.org/get_started/feature_columns



Scalable and portable training and prediction

Training model on:

Mac/Windows

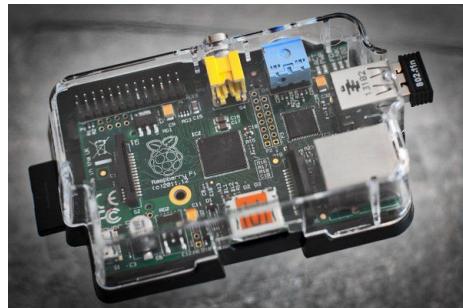
Single GPU

Multiple GPUs and TPUs

Use (prediction) model on:

Android and iOS

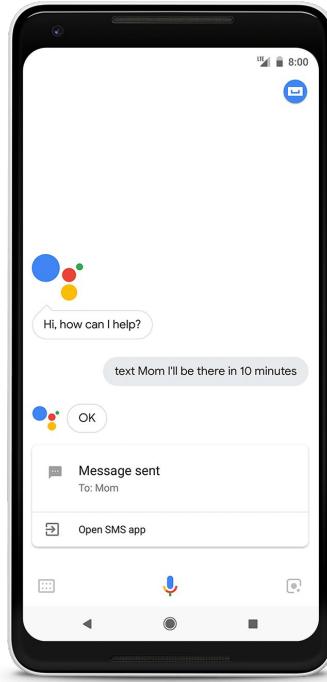
RasPi and TPU



Google apps using TensorFlow Lite



Portrait Mode on Android Camera



'Hey Google' in
Google Assistant



SmartReply on
Google WearOS



- Our pleasure
- No problem at all
- You're welcome anytime
- No problem mate

Using TensorFlow Lite

Convert to TensorFlow Lite Format

```
$ toco --savedmodel_directory=awesome_model/  
--output_file=awesome_model.tflite
```

```
import org.tensorflow.lite.Interpreter;  
try (Interpreter tflite = new Interpreter("awesome_model.tflite")) {  
    // Create inputs and outputs.  
    ...  
    // Invoke the interpreter.  
    tflite.run(inputs, outputs);  
}
```

Invoke TensorFlow Lite Interpreter

TensorFlowLite

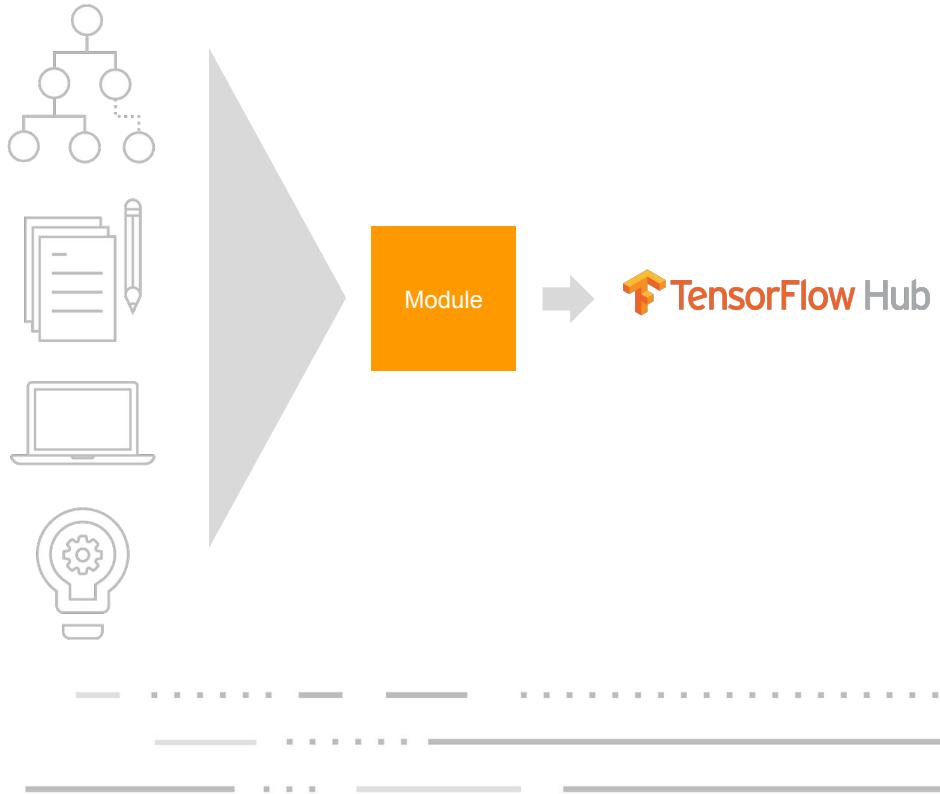


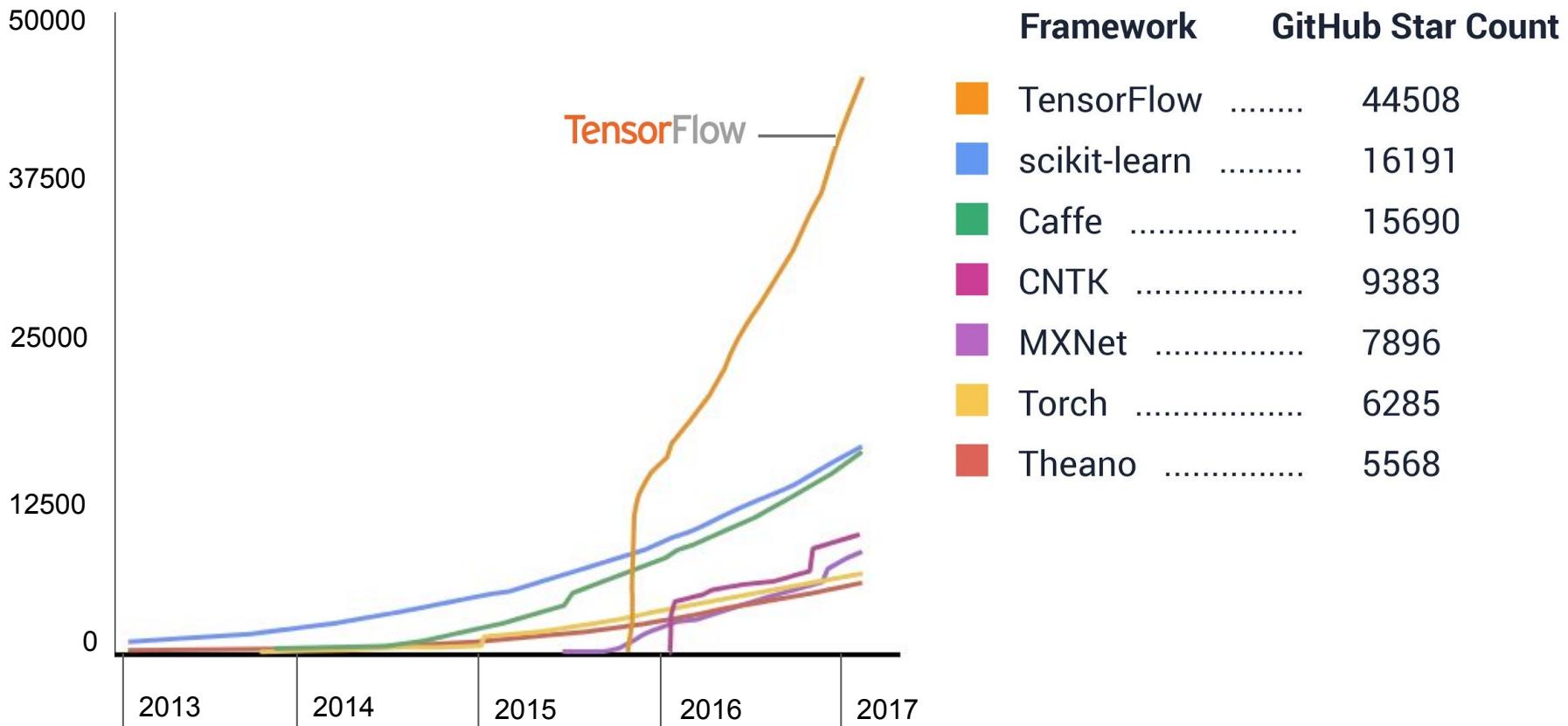


A repository of pre-trained
model components, packaged
for one-line reuse

Easiest way to share and use
best approaches for your task

tensorflow.org/hub





Companies using TensorFlow



kakao



ebay

Google



Coca-Cola



ZTE

QUALCOMM

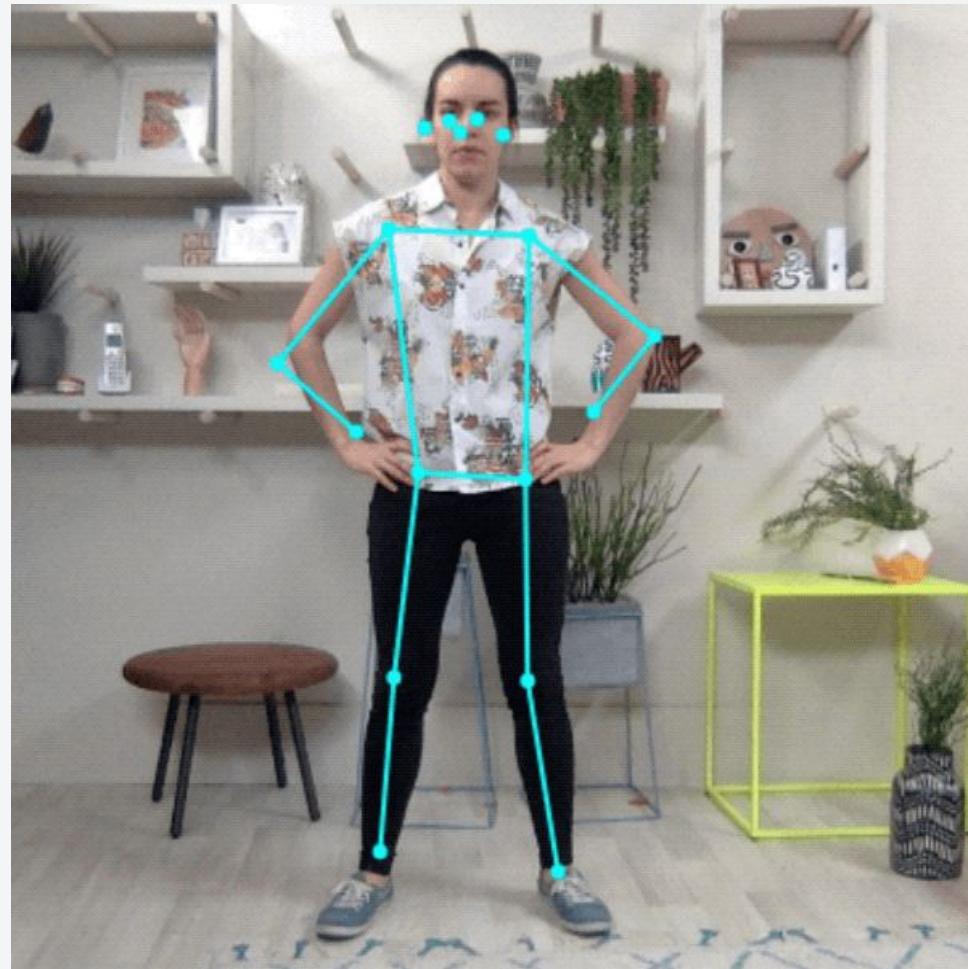


Use Cases: Image Recognition



Real Time Pose Estimation

In-the-Browser with JavaScript





きゅうり農家

+ AI = ?

AUCNET: Real-time car auction

5M cars, 30K car dealers

20 images per each car

Labeling takes **15 mins**

- Identifying parts and car make



Car Image Classifier with TensorFlow/ML Engine

Inception v3 + Transfer Learning

200 images per car model, 150K images total

ML Engine: increased training performance for **86X** faster

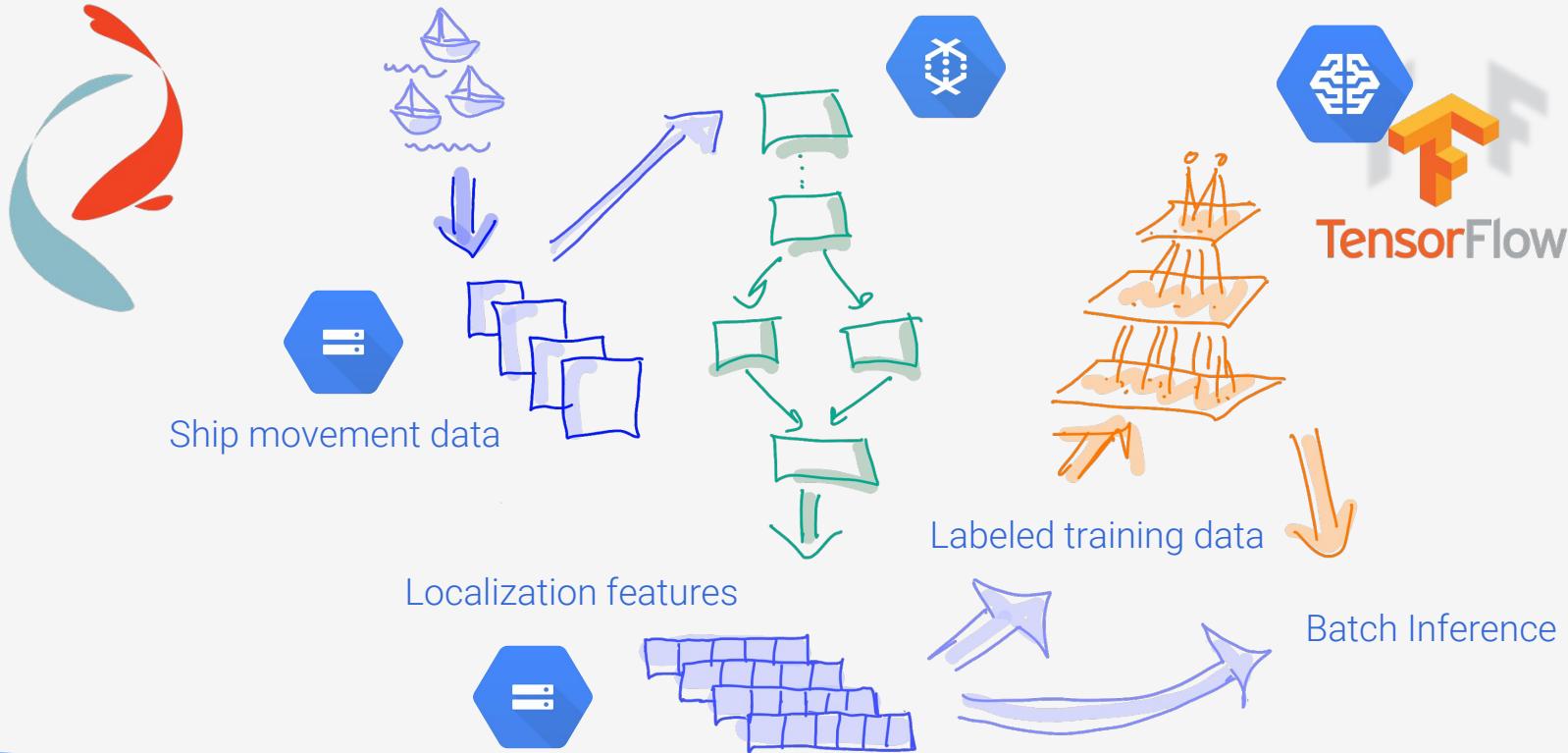
Operation time reduced from **15 min to 3 min**



Use Cases: Internet of Things (IoT)



Global Fishing Watch: preventing overfishing



Trawl



Longline



Purse Seine



Ivonne Pellworm Marinephotobank



Chris Howell, Shipspotter



Ulrich Karlowski 2008_Marine Photobank

Google DC Ops

Applying ML lead to **40% reduction in cooling energy** in Google datacenters.



"Find Your Candy" Demo

Robot arm picks a candy

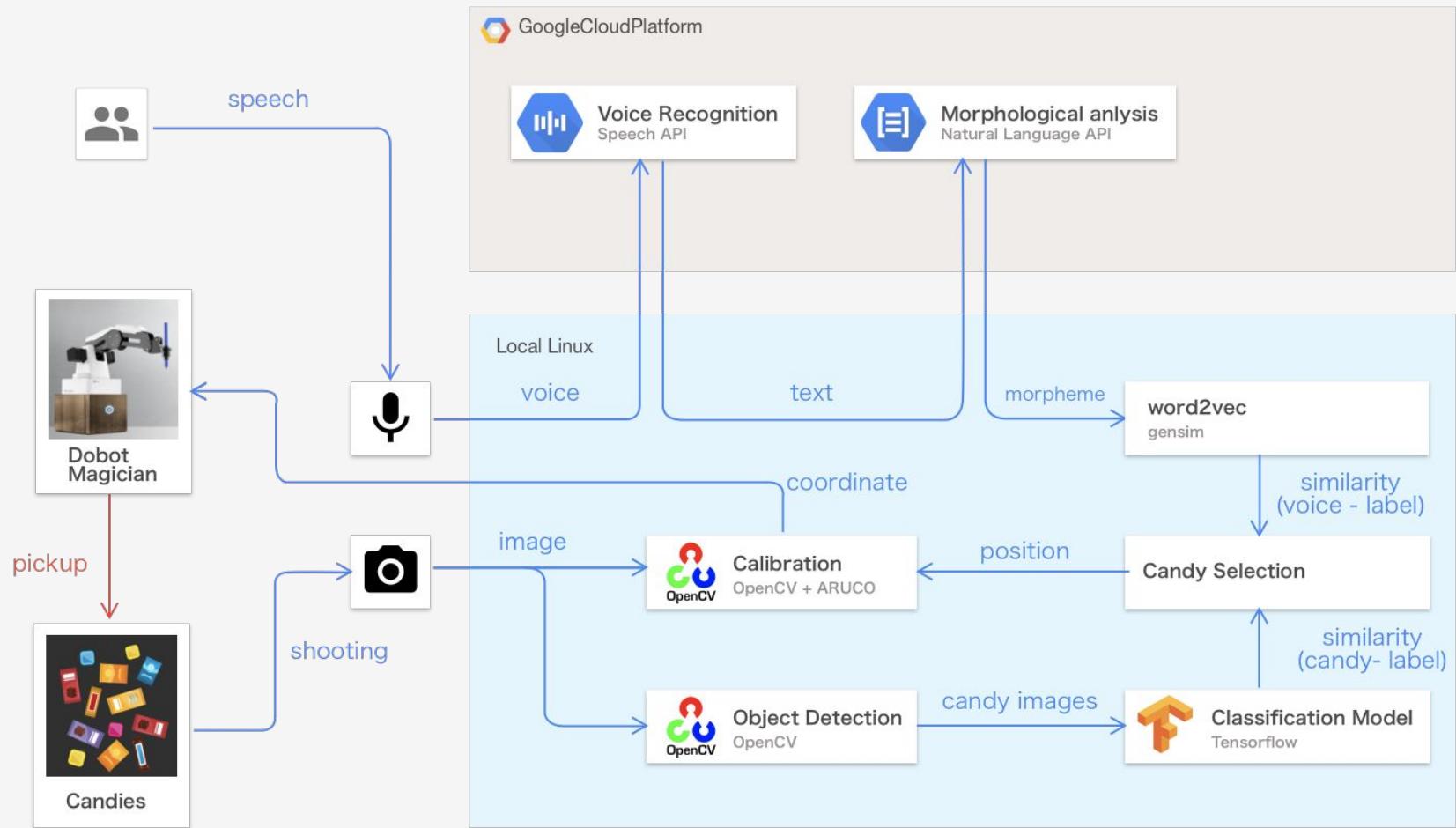
Speech API and **NL API** for
voice command control

TensorFlow and **ML Engine** for
object recognition



17

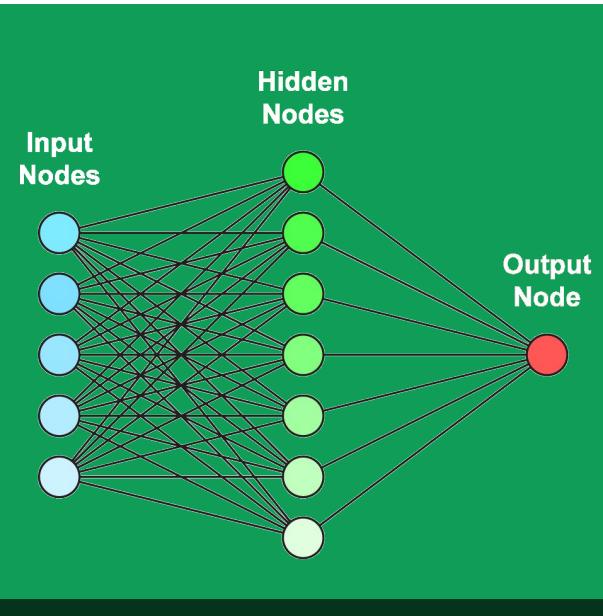
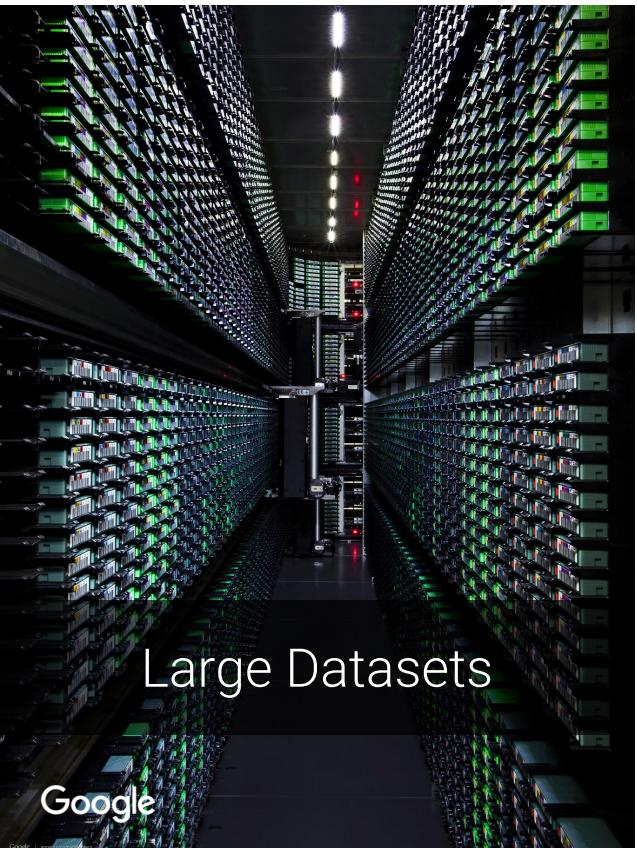
Cloud TPU



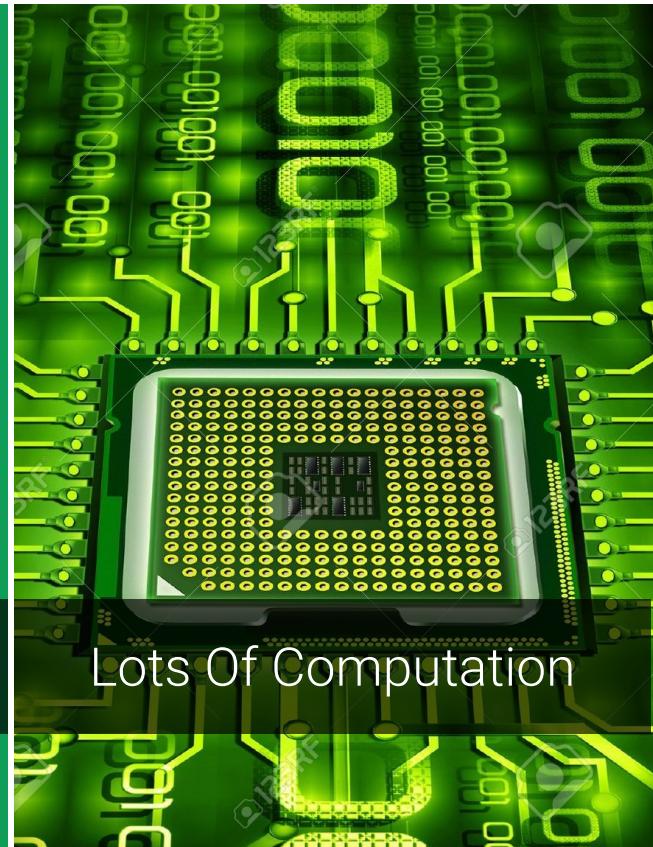


ML dev tools

The Challenges of ML

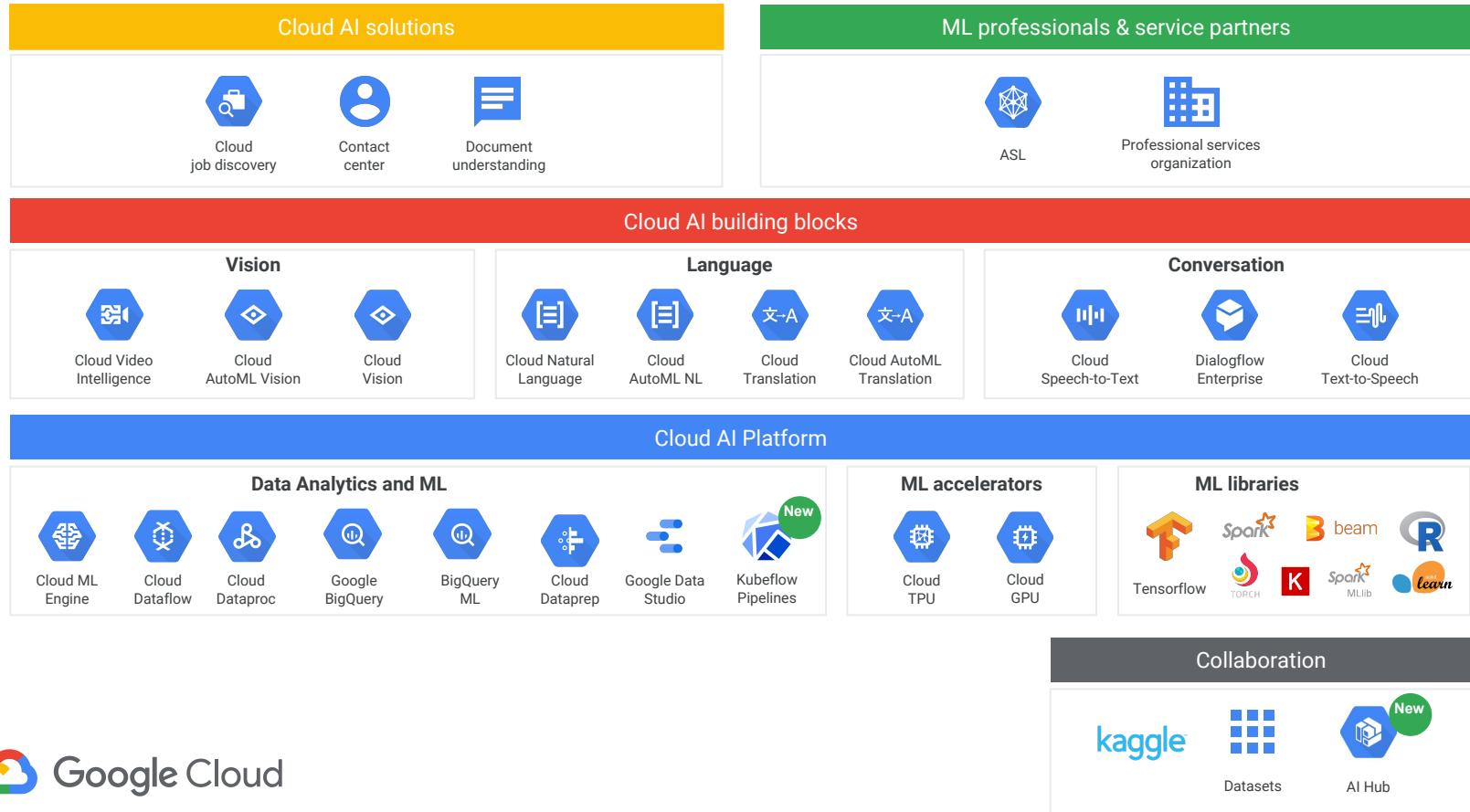


Good Models



A photograph of a person working in a server room. The person is wearing a dark t-shirt with "Google" and "Software" printed on it. They are standing in front of a row of server racks, looking down at a laptop. A red solo cup sits on a small table next to them. The server racks are filled with glowing blue lights from the internal components. The overall atmosphere is dark and technical.

Solution: The Datacenter as a Computer



Serverless data analytics and AI



Data ingestion
at any scale



Cloud Pub/Sub



Data Transfer service



Cloud IoT Core



Storage Transfer
service



Reliable streaming
data pipeline



Cloud Dataflow



Cloud Dataproc



Cloud Dataprep



Apache Beam



Data warehousing
and data lake



BigQuery



Cloud Storage



Advanced analytics



Cloud AI
services



Google Data
Studio



Tensorflow



Sheets



Cloud Composer

Colaboratory

Run pre-built ML models and check its behavior for free



1. Free of charge

Check and validate model behavior for free

2. Interactive experiments

Various ML codes are shared in colab format. So you can quickly check how it works.

3. Access to GPU and Cloud TPU

Can access to GPU and Cloud TPU for FREE!

Colaboratory is being developed in Google Research Project

Cloud Deep Learning VM Image ^{beta}

VM Images works with your [GCE instances](#)



Fast prototyping

Popular ML frameworks are pre-installed, and you can quickly start prototyping your custom models.

Train your models faster

Leverage multi-GPUs and Cloud TPU to make your training faster.



You can quickly use above frameworks by specifying
VM images that is prepared for each framework.



Interactive experiments

Pre-installed JupyterLab enables you to experiment ML models interactively. In addition you can see how many GPUs are utilized using web based console.

Fast Prototyping

Pre-installed ML packages make you start prototyping immediately

- Python 2.7 and 3.5
- [Deep Learning Frameworks](#) (TensorFlow, PyTorch, Chainer and XGBoost)
- [GPU / DNN Libraries](#) (CUDA / CuDNN / NCCL)
- [Development environment for ML models](#) (JupyterLab)
- Scientific Libraries (numpy / scipy)
- Data Analysis Libraries (pandas / matplotlib)
- Machine Learning Library (sklearn)
- Natural Language Processing Library (nltk)
- Image Processing Libraries (Pillow / scikit-image / Opencv-python)

Train your model faster

You can leverage GPU and Cloud TPU



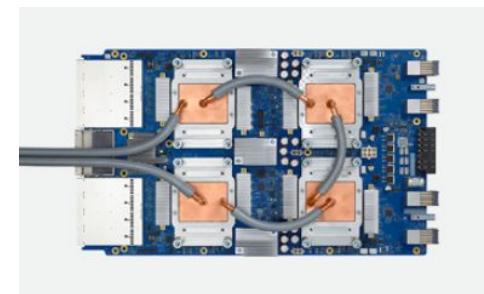
NVIDIA TESLA
V100 for NVLINK

125 TFlops / 16 GB HBM2
\$2.48 USD per GPU (US)



Cloud TPU v2

180 TFlops / 64 GB HBM
\$4.50 USD per TPU v2
\$1.35 USD per preemptible TPU v2



Cloud TPU v3 ^{beta}

420 TFlops / 128 GB HBM
\$8.00 USD per TPU v3
\$2.40 USD per preemptible TPU v3

Prices are based on US region



AI Hub ALPHA

1. One stop AI catalog

Easily discover plug & play pipelines & other content built by Google AI and partners.

2. Enterprise-grade sharing controls

Host pipelines and ML content with private sharing controls within an enterprise to foster reuse within organizations.

3. Easy deployment on GCP and hybrid

Deploy pipelines via Kubeflow on GCP and on premise.

The screenshot shows the AI Hub ALPHA web interface. At the top, there's a navigation bar with the AI Hub logo, the organization name "Acme Corporation", and a search bar. The main area is titled "Welcome to AI Hub" with the sub-instruction "Explore machine learning examples and services. Publish your own and share with others." On the left, a sidebar has a "Publish" button and a "My assets" section. Below that are categories: Product type (ML Pipeline, Notebook, TensorFlow module, Service, Tutorial, VM image, Other), and Data type (not visible in the screenshot). In the center, there's a "Recently published" section with three items:

- TensorFlow module > Universal Sentence Encoder**
By Google
Encoder of greater-than-word length text trained on a variety of data.
encoder | sentence | deep learning
- Notebook > Classifying Handwritten Digits**
By Google
Train both a linear model and a neural network to classify handwritten digits from the classic MNIST dataset.
MLCC | classification | mlbasics | image | mnist
- ML Pipeline > Custom Object Detection with TensorFlow**
By Google

AI Hub alpha

Enables ML model discovery and reuse for everyone

AI Hub

Public Contents

By Google

Unique AI assets
by Google

 AutoML, TPUs, [kaggle](#)
Cloud AI Platform, etc.

 Research at Google

 DeepMind

+ Private Contents

By partners

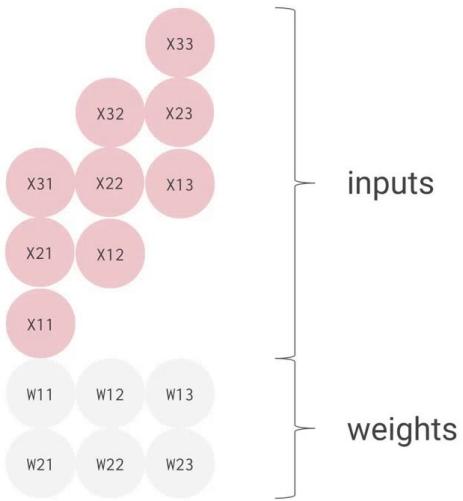
Created, shared &
monetized by anyone.

By customers

Content shared
Securely within and
with other organizations.

ML at Google scale

Large scale training and prediction
with Cloud ML Engine



TPU v2



ASIC for TensorFlow

Designed by Google

180 Tflops / chip



TPU v2 Pod: 11.6 PFLOPS

Cloud TPU Performance

ResNet-50 on TPU v2 half-pod

Real data:

77,392
images/sec

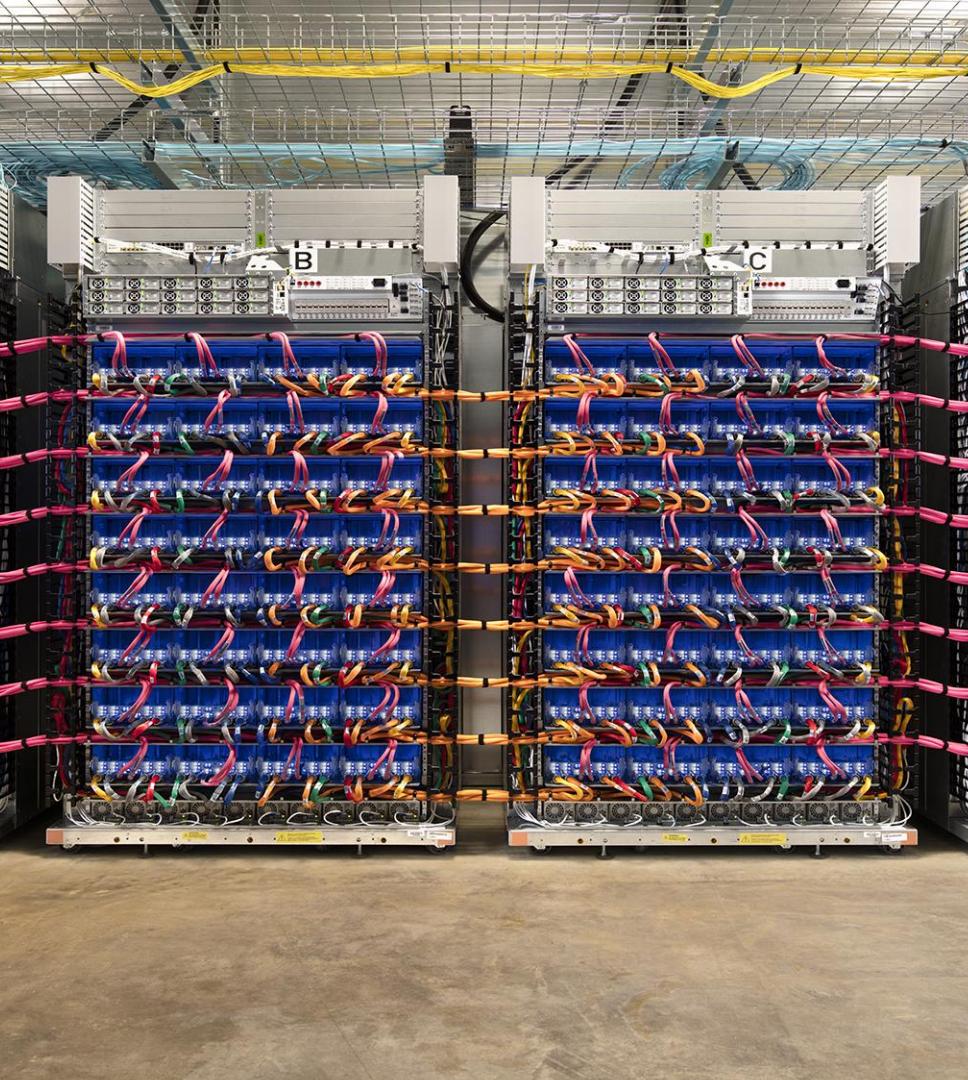
Final accuracy:

93%

Training time:

30 min

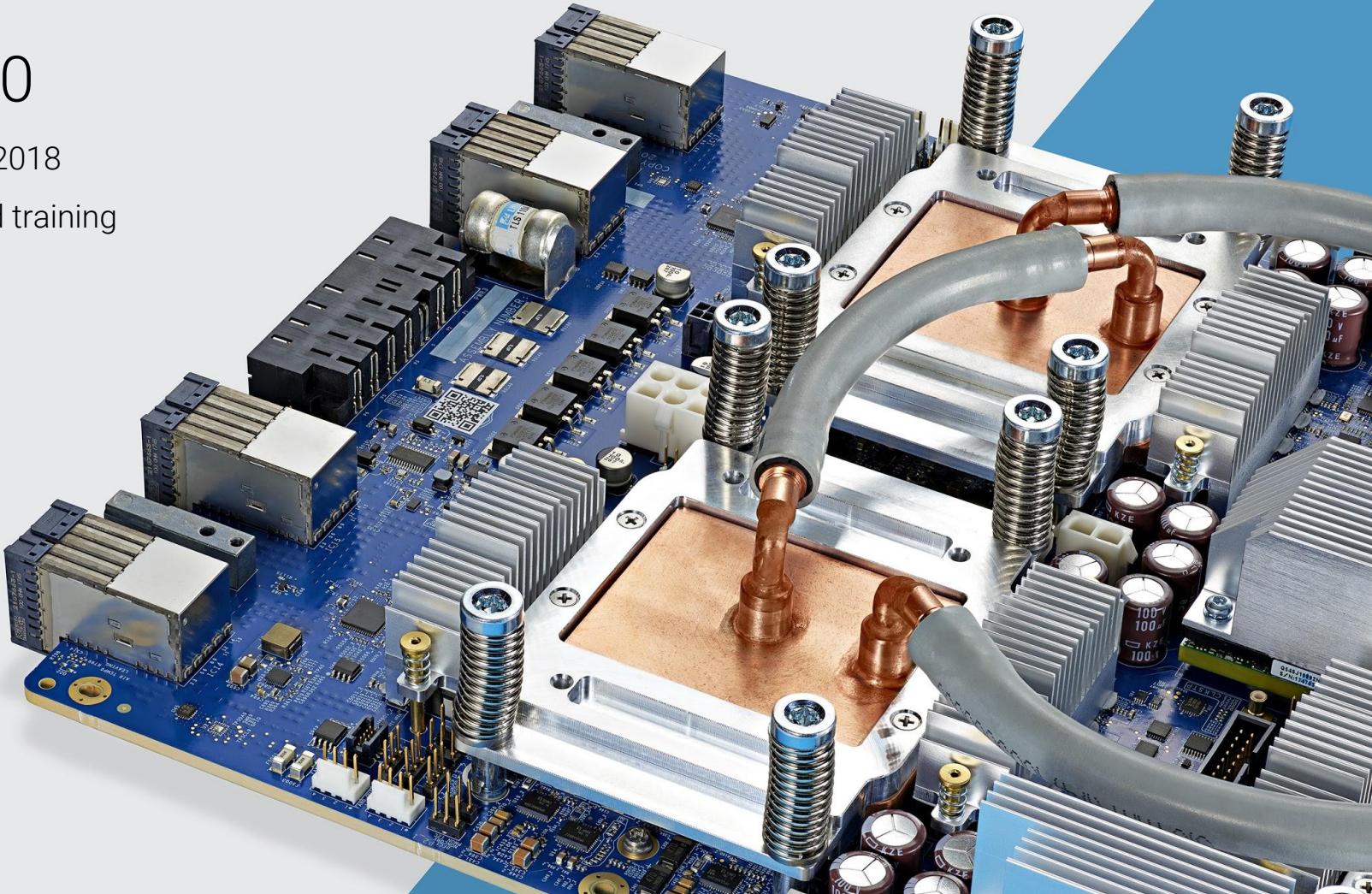
#1 training time on DAWNBench

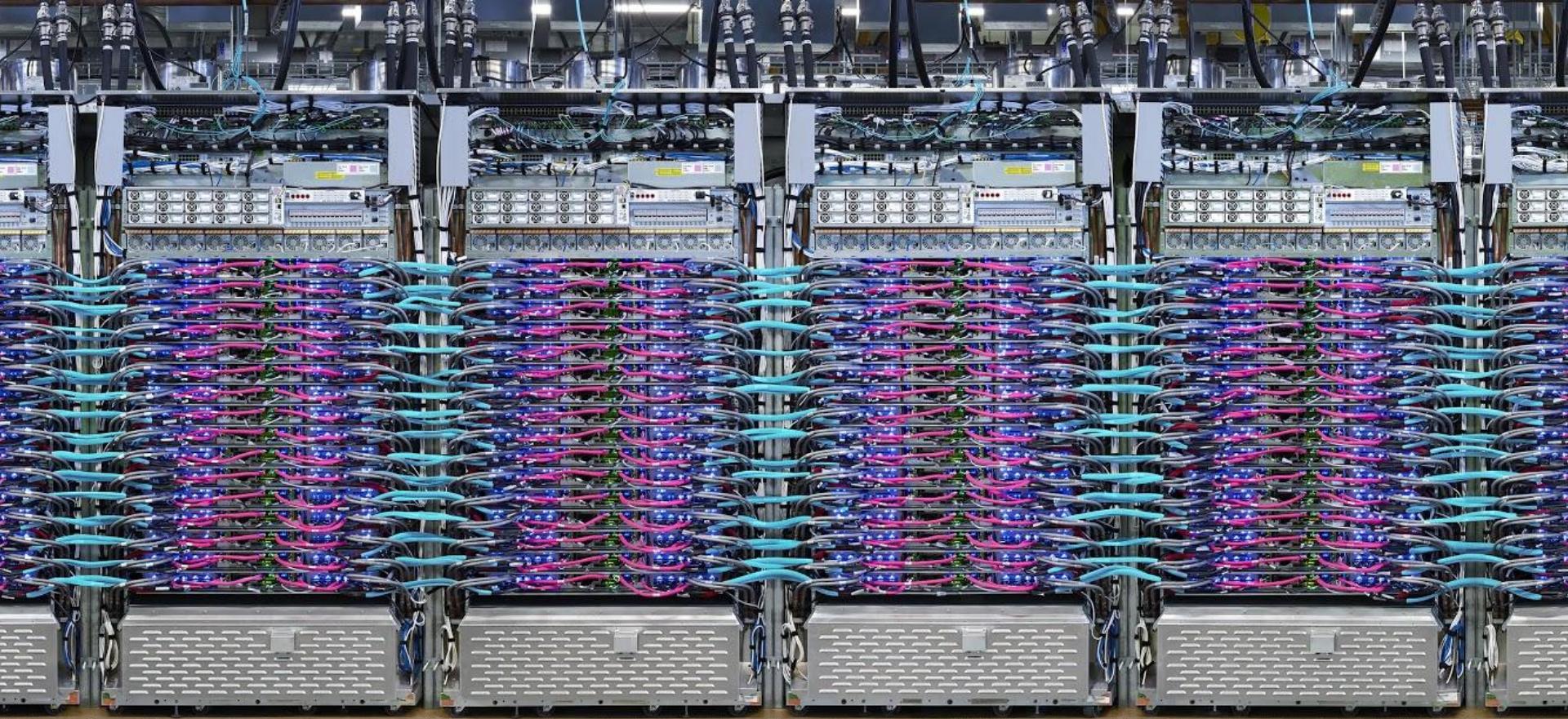


TPU 3.0

Launched in 2018

Inference and training





TPU 3.0 Pod: 100 PFLOPS (8X faster than v2)



cloud.google.com
for more info and demo

Thank You!