



Machine Learning For The Web : An Introduction to Tensorflow.JS



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Machine Learning in JavaScript

Why?

What is Tensorflow :

TensorFlow is a free and open-source software math library, and is used for machine learning applications such as neural networks.

Use ML anywhere JavaScript can run



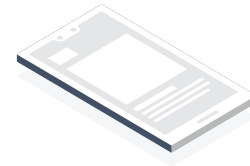
Browser



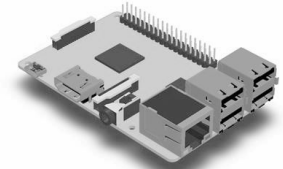
Server



Desktop



Mobile



IoT



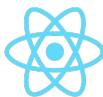
Browser



Server



Mobile



React Native



WeChat

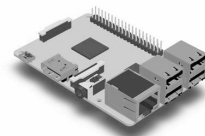
PWA



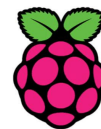
Desktop



Electron



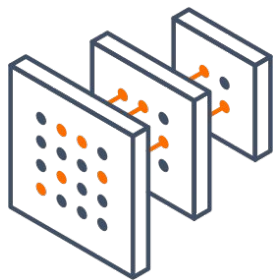
IoT



RaspberryPi
(via Node)

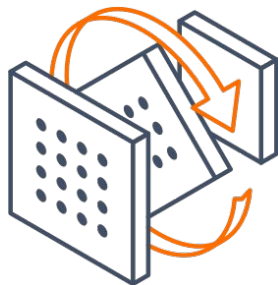
Run, Retrain, Write

Reuse existing models, or create your own



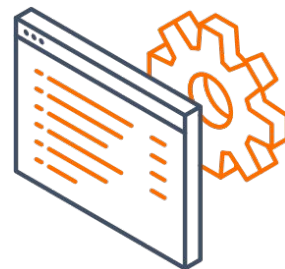
Run existing models

Pre-packaged JavaScript or
Converted from Python



Retrain existing models

With transfer learning



Write models in JS

Train from scratch

For anything you may dream up

Augmented Reality

Gesture-based interaction

Sound recognition

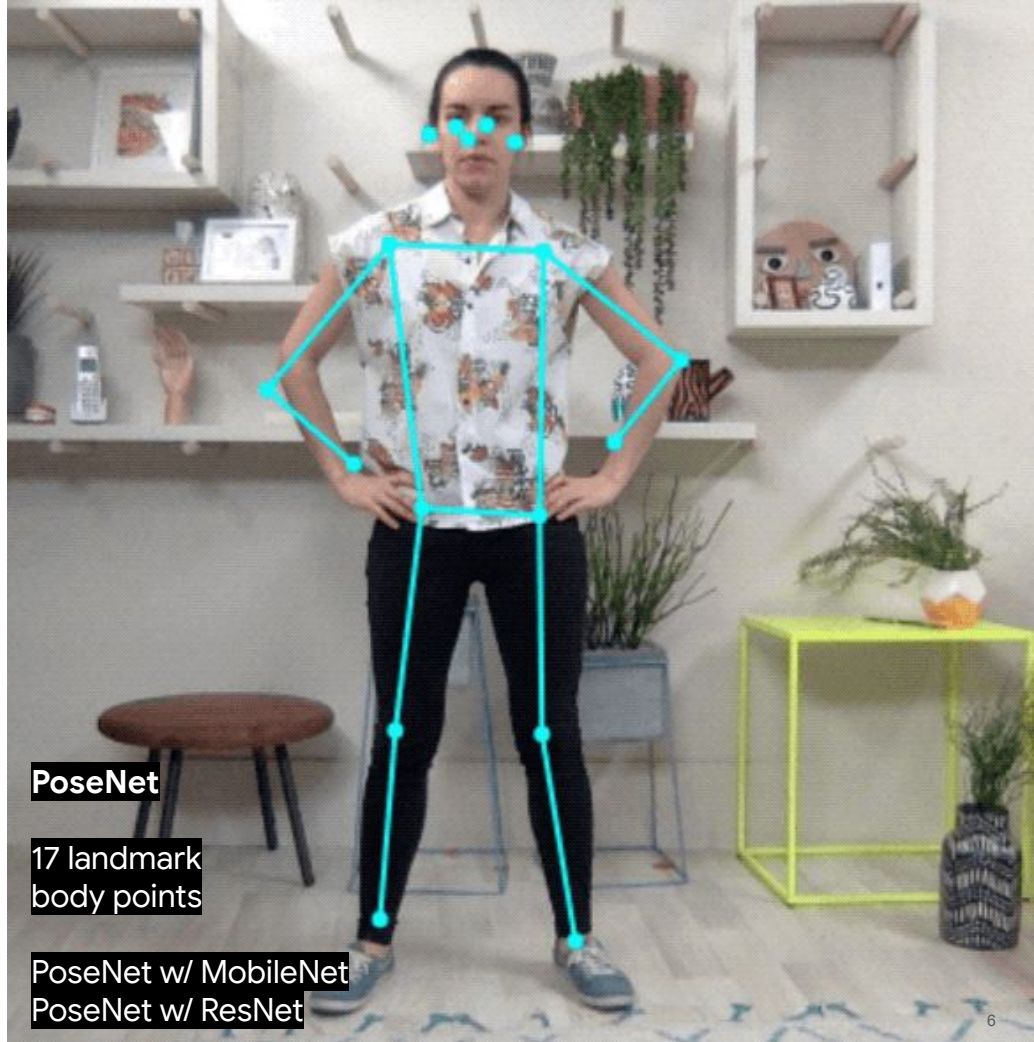
Accessible web apps

Sentiment analysis, abuse detection, NLP

Conversational AI

Web-page optimization

And much more...



Pre trained models

Easy to use JavaScript classes for common use cases

We have several...

And continually expanding our collection.

+ Image classification



+ Object detection



+ Body Segmentation



+ Pose Estimation



New models added:

- + Face Mesh
- + Hand Pose
- + BERT Q&A

+ Text Toxicity



+ Sentence encoding



+ Speech Commands



+ KNN Classifier



Let's check some out...

tensorflow.org/js/models

Object Recognition

Using COCO-SSD

Trained on 90 object classes

[Demo](#)



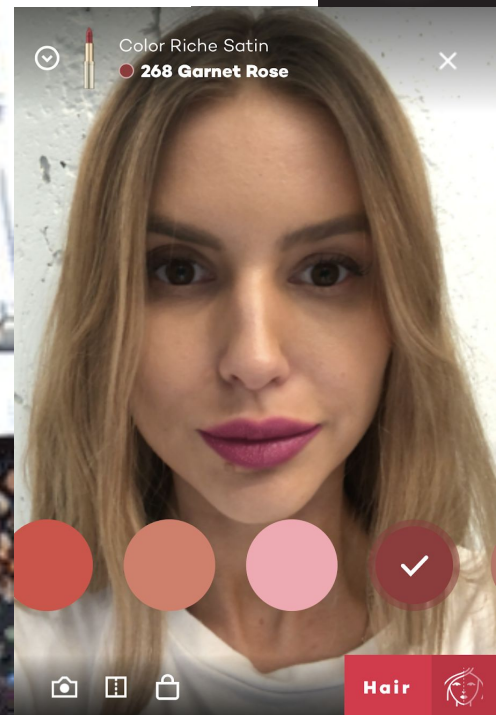
Face Mesh

Just **3MB** in size

Recognize **468**
facial landmarks

L'ORÉAL

MODI
FACE



[Demo](#)

Body Segmentation

Distinguish **24** body areas, across multiple bodies, real time.



With a little bit of creativity...

We can emulate the superpowers we were promised
in the movies which we should have by now!

Lasers

WebGL Shaders
+ TensorFlow.js



Teleportation

WebRTC + AFrame +
Three.js + TensorFlow.js

Created by Jason Mayes (@jason_mayes)



Or other delightful creations

Such as clothing size estimation

The screenshot shows a product page for a 'TensorFlow T-Shirt'. The main image displays a man wearing the shirt and a flat-lay of the shirt with the TensorFlow logo and the text 'TensorFlow.js What will your model?'.

TensorFlow T-Shirt
Look the business of your next machine learning conference with this super exclusive TensorFlow.js t-shirt Limited Edition.
~~\$59.00~~ \$41.93

TensorFlow Grey
Color selection: Grey Black

Find your size! Powered by TensorFlow
Discover your perfect fit using our algorithm in seconds.

Size selection: XS, S, M, L, XL, XXL

ADD TO BAG

Product Details
Shipping and Returns

What others are wearing

- Kind is the new cool
- NASA T-Shirt
- Plain black T-Shirt
- Nomadic purple T-Shirt
- Floralized T-Shirt

Created by [Jason Mayes \(@jason_mayes\)](#)

Combine
with other
web tech

Web XR + WebGL
+ TensorFlow.js

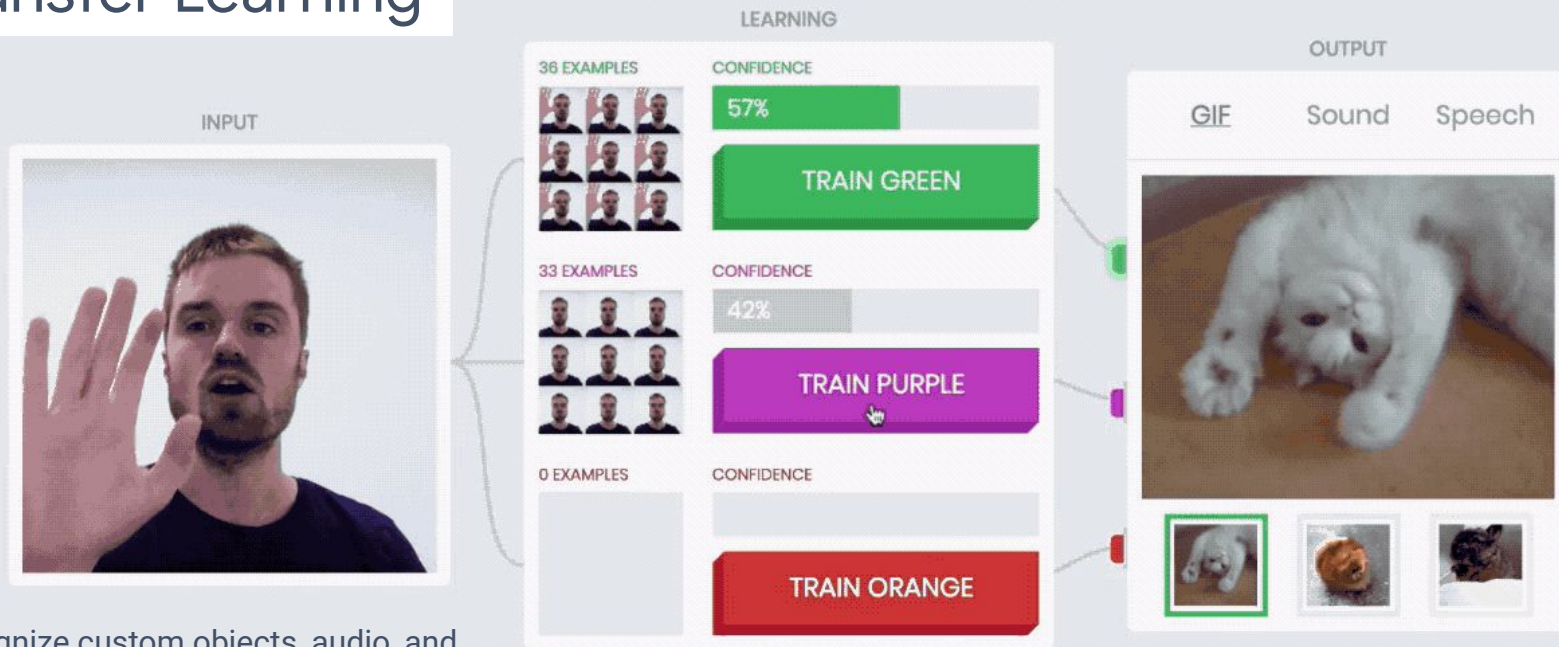
Created by [Alexandre Devaux](#) (@AlexandreDevaux), France

Transfer Learning

Retrain existing models to work with your own data

Teachable Machine

Transfer Learning



Recognize custom objects, audio, and poses in the browser in minutes. [Demo](#).

Cloud Auto ML

Train custom vision models in the cloud + deploy to TF.js

← flowers **BETA** LABEL STATS EXPORT DATA


IMPORT IMAGES TRAIN EVALUATE TEST & USE Single-Label Classification

Filter images

All images	3,667
Labeled	3,667
Unlabeled	0

Filter labels

daisy	633
dandelion	898
roses	640
sunflowers	697
tulips	799



tulips(1) dandelion(1) sunflowers(1) dandelion(1) dandelion(1)

tulips(1) dandelion(1) tulips(1) daisy(1) sunflowers(1)

Code

```
<script src="//cdn.jsdelivr.net/npm/@tensorflow/tfjs/dist/tf.min.js"></script>
<script src="//cdn.jsdelivr.net/npm/@tensorflow/tfjs-automl/dist/tf-automl.min.js"></script>



<script>
  async function run() {
    const model = await tf.automl.loadImageClassification('model.json');
    const image = document.getElementById('daisy');
    const predictions = await model.classify(image);
  }
  run();
</script>
```

TensorFlow.js: Write your own code

Super powers and performance

TensorFlow.js APIs

Create your own models with our APIs

Pick your flavour:

- High level **Layers API** (like Keras)
- Low level **Ops API** (mathematical)

LAYERS

Advanced Activation

tf.layers.elu
tf.layers.leakyReLU
tf.layers.prelu
tf.layers.relu
tf.layers.softmax
tf.layers.thresholdedReLU

Basic

tf.layers.activation
tf.layers.dense
tf.layers.dropout
tf.layers.embedding
tf.layers.flatten
tf.layers.permute
tf.layers.repeatVector
tf.layers.reshape
tf.layers.spatialDropout1d

Convolutional

tf.layers.conv1d
tf.layers.conv2d
tf.layers.conv2dTranspose
tf.layers.conv3d
tf.layers.cropping2D
tf.layers.depthwiseConv2d
tf.layers.separableConv2d
tf.layers.upSampling2d

Merge

tf.layers.add
tf.layers.average
tf.layers.concatenate
tf.layers.dot
tf.layers.maximum
tf.layers.minimum
tf.layers.multiply

Normalization

tf.layers.batchNormalization
tf.layers.layerNormalization

Pooling

tf.layers.averagePooling1d
tf.layers.averagePooling2d
tf.layers.averagePooling3d
tf.layers.globalAveragePooling1d
tf.layers.globalAveragePooling2d
tf.layers.globalMaxPooling1d
tf.layers.globalMaxPooling2d

Tensors

Tensors are the core datastructure of TensorFlow.js. They are a generalization of vectors and matrices to potentially higher dimensions.

Tensors / Creation

We have utility functions for common cases like Scalar, 1D, 2D, 3D and 4D tensors, as well a number of functions to initialize tensors in ways useful for machine learning.

tf.tensor (values, shape?, dtype?) function [source](#)

Creates a [tf.Tensor](#) with the provided values, shape and dtype.

```
// Pass an array of values to create a vector.  
tf.tensor([1, 2, 3, 4]).print();
```

[Edit](#) [Run](#)

```
// Pass a nested array of values to make a matrix or a higher  
// dimensional tensor.  
tf.tensor([[1, 2], [3, 4]]).print();
```

[Edit](#) [Run](#)

```
// Pass a flat array and specify a shape yourself.  
tf.tensor([1, 2, 3, 4], [2, 2]).print();
```

[Edit](#) [Run](#)

Parameters:

values ([TypedArray](#) | [Array](#)) The values of the tensor. Can be nested array of numbers, or a flat array, or a [TypedArray](#). If the values are strings, they will be encoded as utf-8 and kept as [uint8Array](#){}.

shape ([number](#)[]) The shape of the tensor. Optional. If not provided, it is inferred from values. Optional

dtype ('float32' | 'int32' | 'bool' | 'complex64' | 'string') The data type. Optional

Returns: [tf.Tensor](#)

tf.scalar (value, dtype?) function [source](#)

Creates rank-0 [tf.Tensor](#) (scalar) with the provided value and dtype.

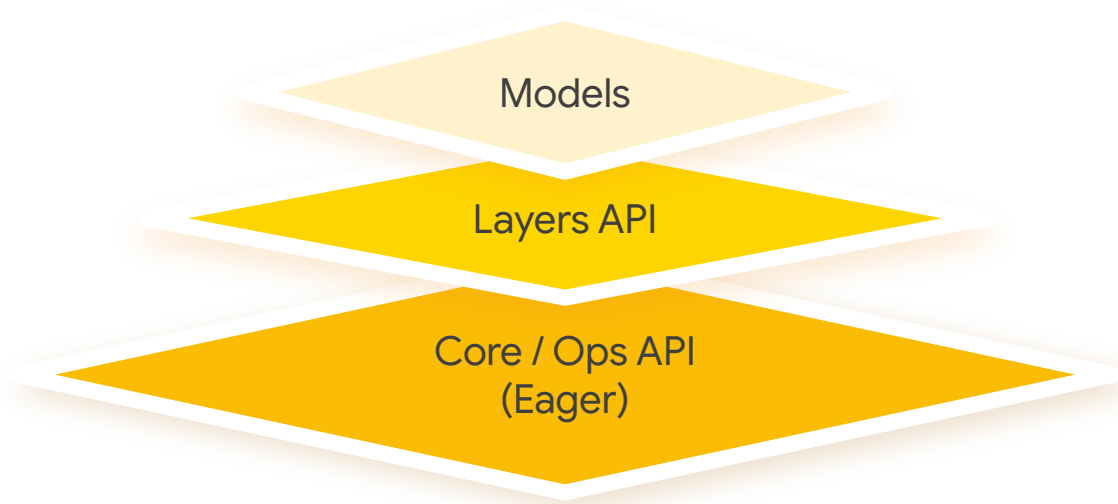
The same functionality can be achieved with [tf.tensor\(\)](#), but in general we recommend using [tf.scalar\(\)](#) as it makes the code more readable.

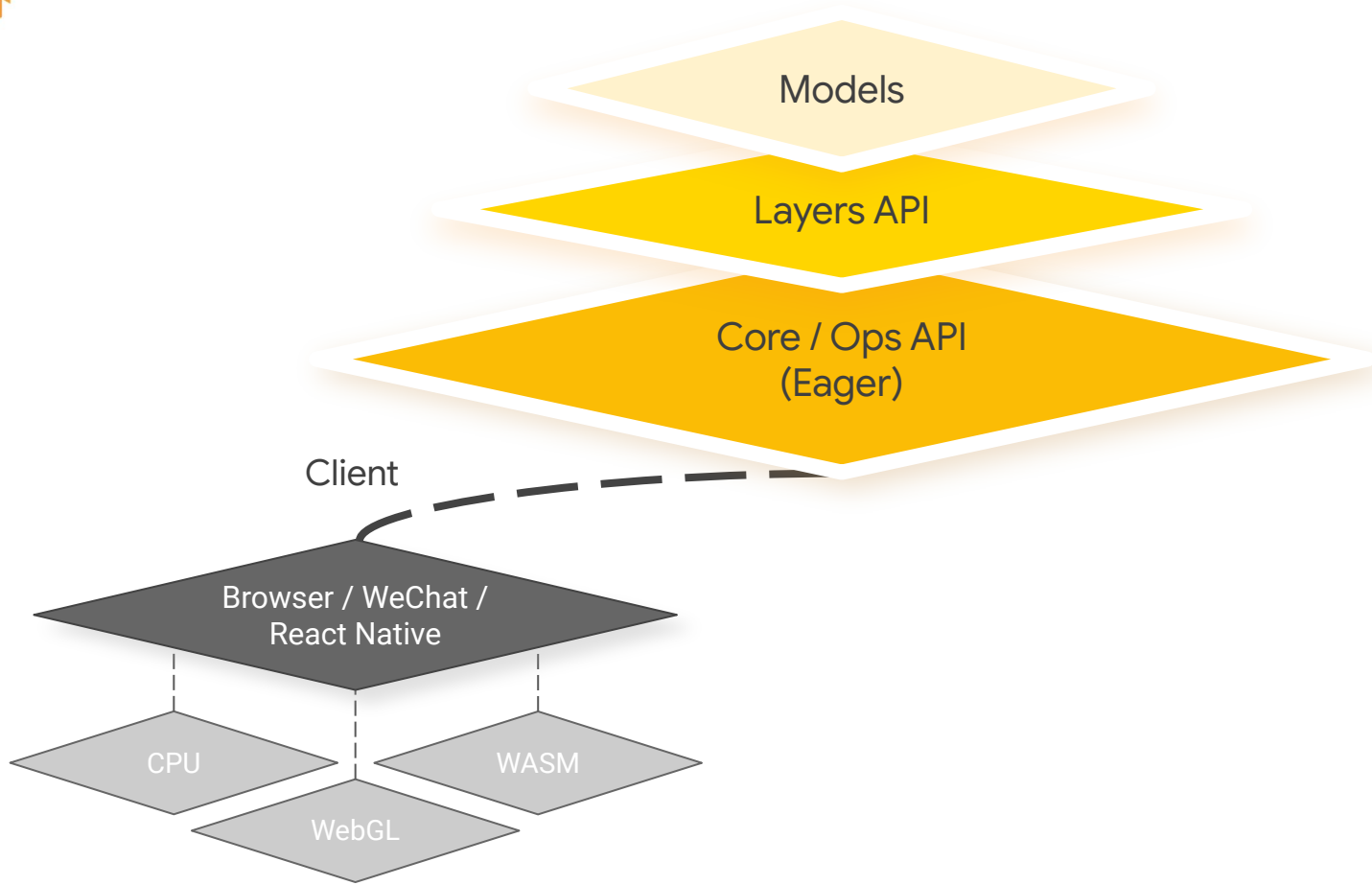
```
tf.scalar(3.14).print();
```

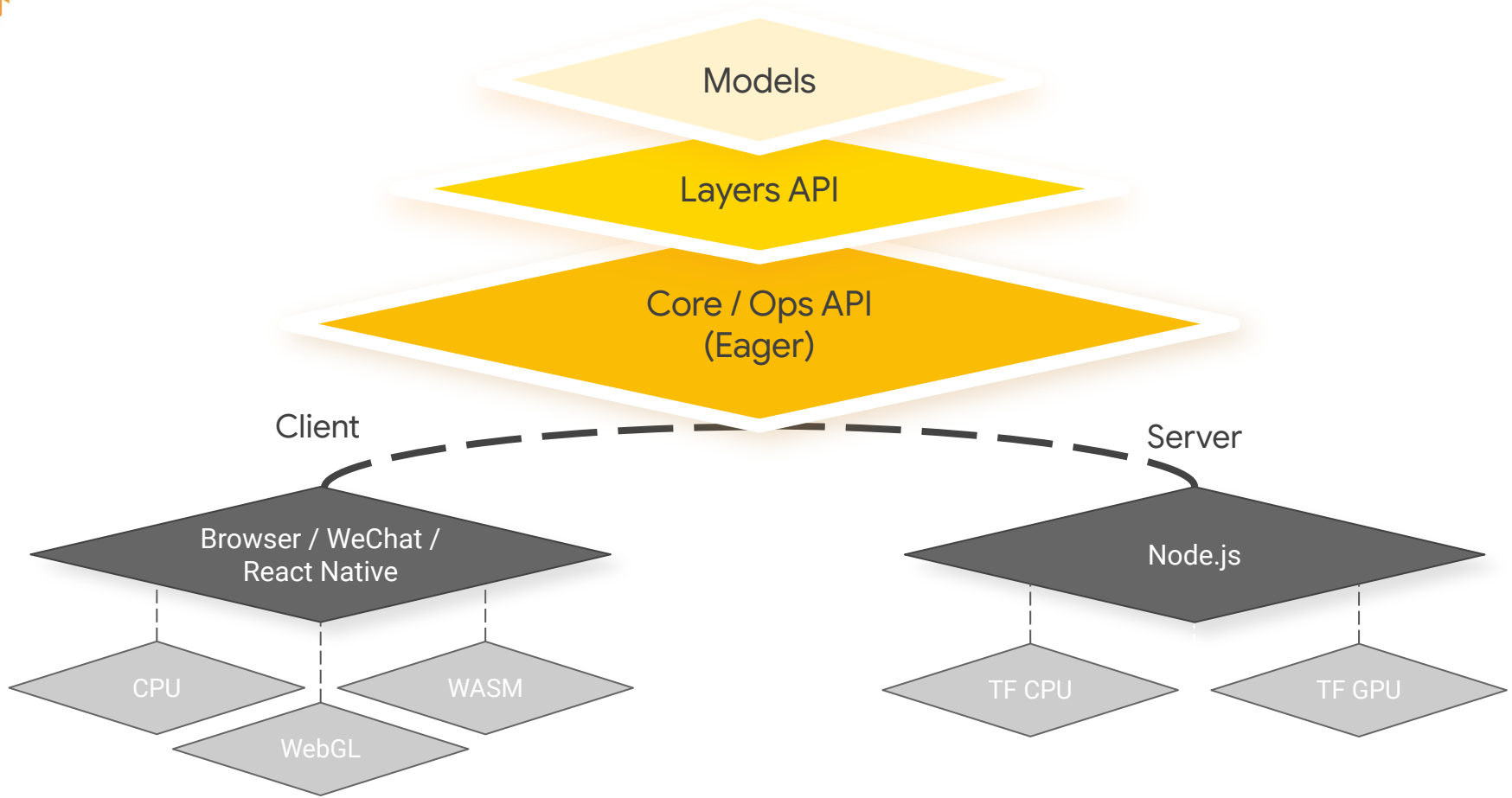
[Edit](#) [Run](#)

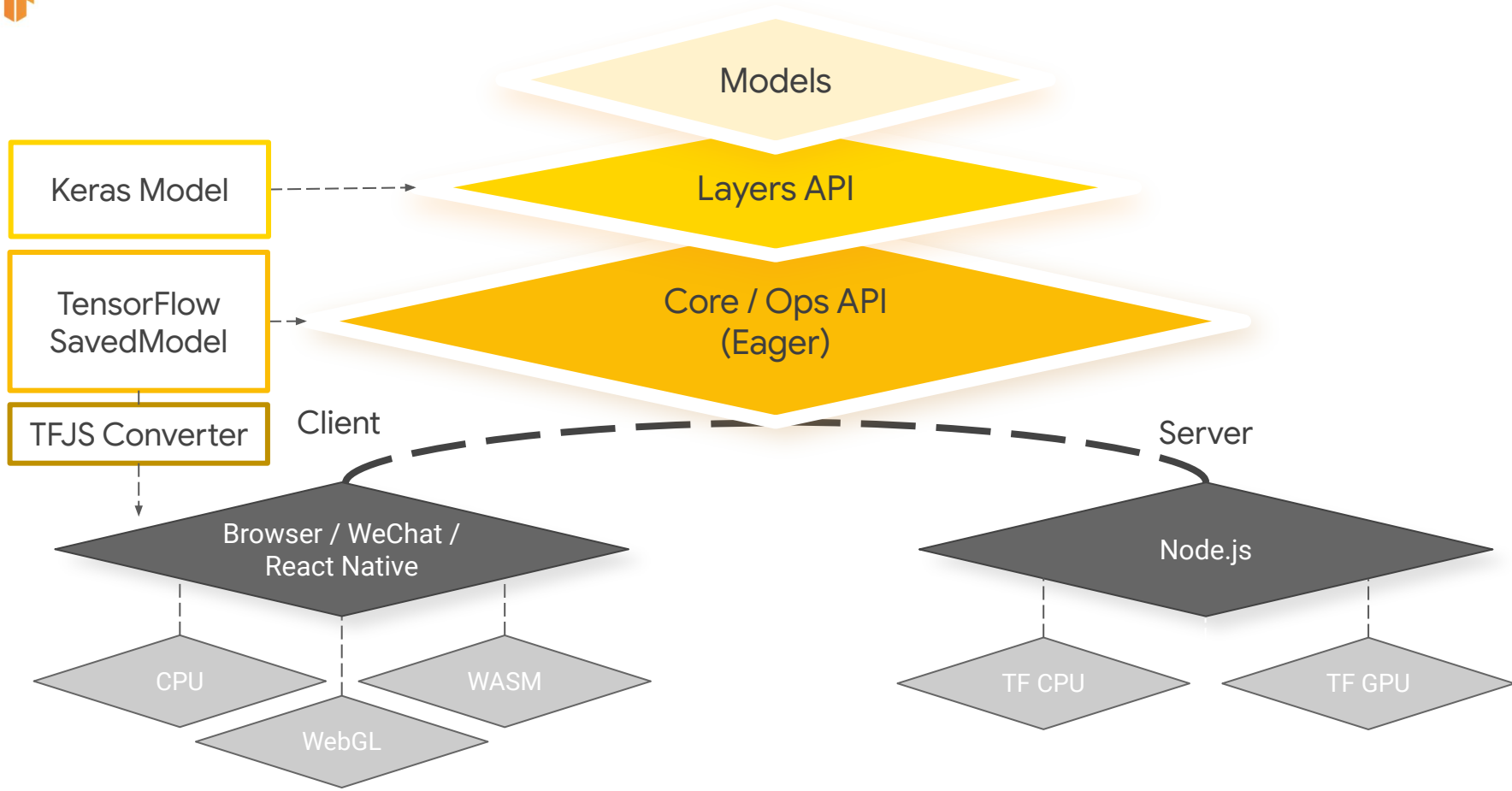
Parameters:

value ([number](#) | [boolean](#) | [string](#) | [uint8Array](#)) The value of the scalar.



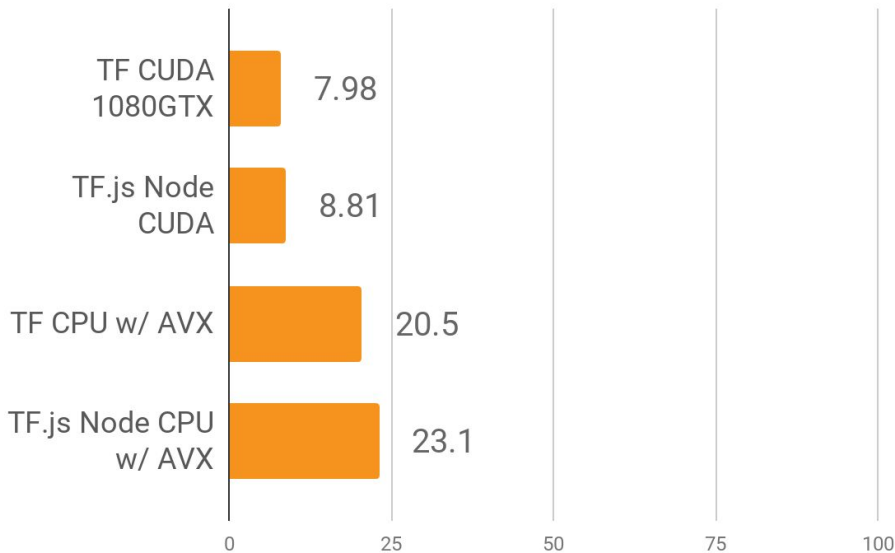






Model Inference Performance Only

Server

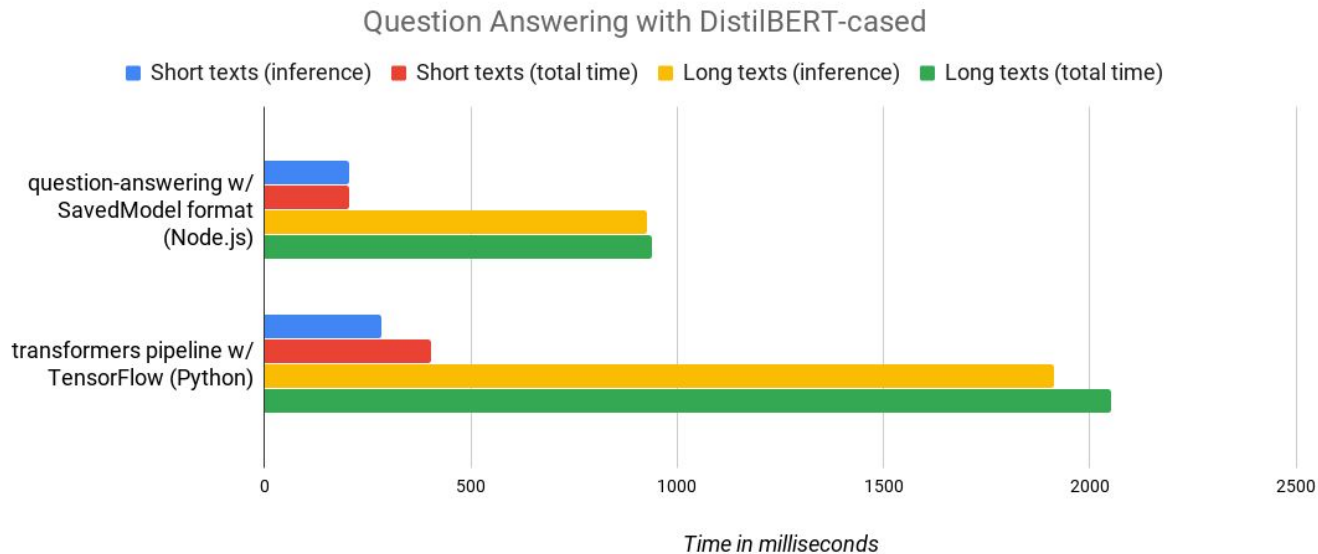


MobileNetV2 1.0_224 model inference time (ms)

Note: If you have a lot of pre / post processing written in Node.js, you will get the benefits of the JIT at runtime, which can be significant outside of inference alone.

Hugging Face DistilBERT

2x Perf boost using Node.js

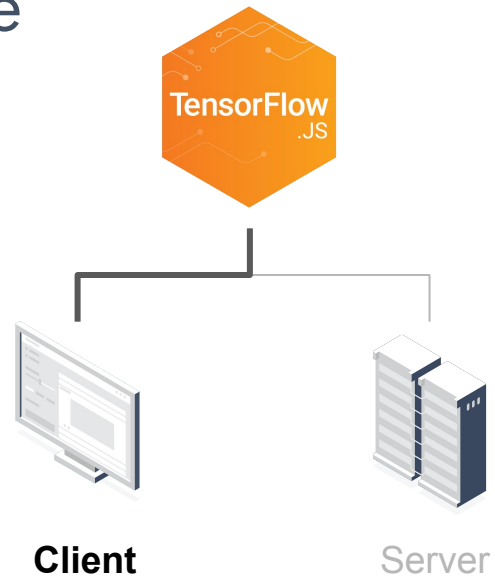


5 client side super powers

Harder / impossible to achieve server side

1. Privacy
2. Lower Latency
3. Lower Cost
4. Interactivity
5. Reach and Scale

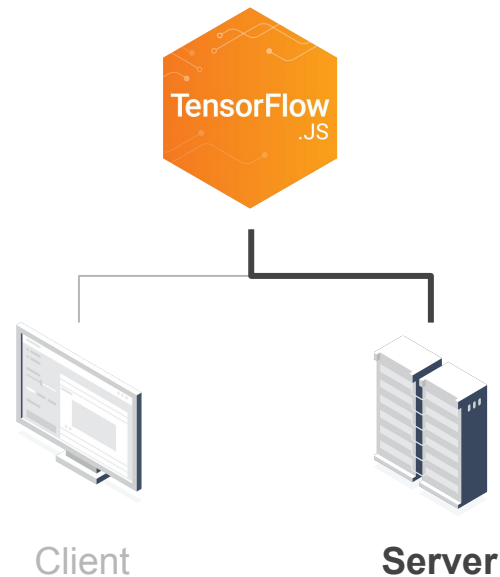
(GPU support on **84%** of devices via WebGL)



Server side / Node.js benefits

That make TensorFlow.js easy to use

1. Use TensorFlow SavedModel without conversion
2. Run larger models than client side (GPU memory limits)
3. Code in 1 language - if you already use JS
(**67.8%** of people use JS in development already)
4. Performance - C bindings / JIT boost for pre/post processing



Resources

Learn more and get inspired

Learn more

Get started fast!

Website / API: tensorflow.org/js

Models: tensorflow.org/js/models

Github Code: github.com/tensorflow/tfjs

Google Group: tfjs@tensorflow.org

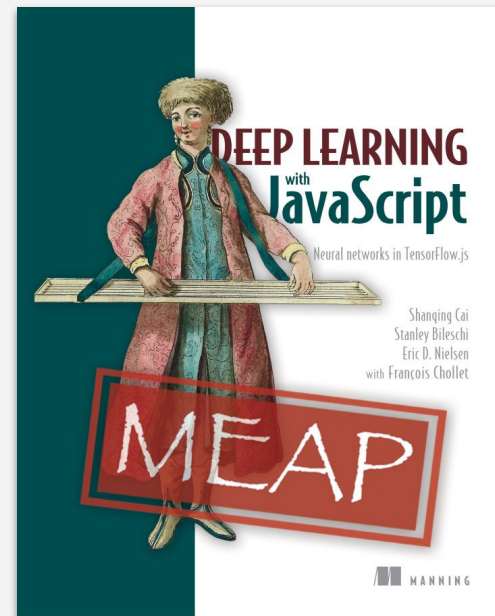
Codepen: codepen.io/topic/tensorflow

Glitch: glitch.com/@TensorFlowJS

Recommended Reading

Deep Learning with JavaScript

manning.com/books/deep-learning-with-javascript



Join the community

#MadeWithTFJS



Thanks to the global community for use of videos shown on this slide: Jimmy (@MLBlock3), Manish Raj (@manishr41883690), Ben Farrell (@bfarrellforever), Wen (@yiwen_lin), Junya Ishihara (@jishiha), Rogerio Chaves (@_rchaves_), Amruta (@prenalys), FollowTheDarkside (@eatora22), and Alexandre Devaux (@AlexandreDevaux).

What will you make?



Machine Learning
for everyone.

#MadeWithTFJS

Video by [FollowTheDarkside](#), (@eatora22), Japan

Stay in touch



@howdevelop



[linkedin.com/in/shivaylamba](https://www.linkedin.com/in/shivaylamba)

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TensorFlow