

深度学习应用开发

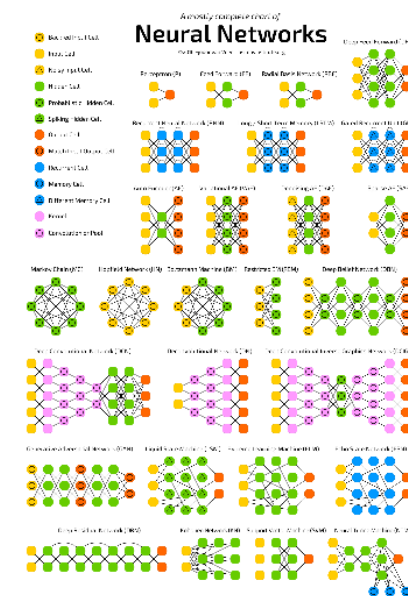
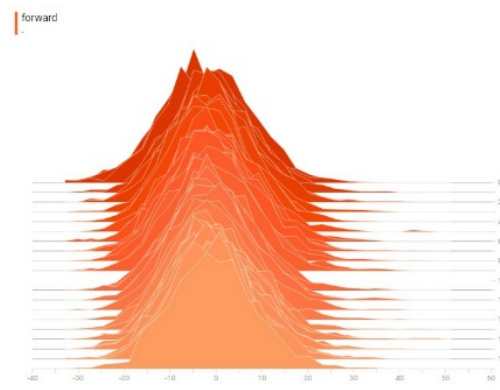
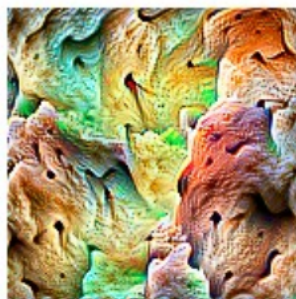
基于TensorFlow的实践

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运行第一个TensorFlow.js



通过标签运行tfjs

```
<head>
  <!-- Load TensorFlow.js -->
  <script src="https://cdn.jsdelivr.net/npm/@tensorflow/tfjs@0.14.1/dist/tf.min.js"> </script>

  <!-- Place your code in the script tag below. You can also use an external .js file -->
  <script>
    // Define a model for linear regression.
    const model = tf.sequential();
    model.add(tf.layers.dense({units: 1, inputShape: [1]}));

    // Prepare the model for training: Specify the loss and the optimizer.
    model.compile({loss: 'meanSquaredError', optimizer: 'sgd'});

    // Generate some synthetic data for training.
    const xs = tf.tensor2d([1, 2, 3, 4], [4, 1]);
    const ys = tf.tensor2d([1, 3, 5, 7], [4, 1]);

    // Train the model using the data.
    model.fit(xs, ys, {epochs: 10}).then(() => {
      // Use the model to do inference on a data point the model hasn't seen before:
      // Open the browser devtools to see the output
      model.predict(tf.tensor2d([5], [1, 1])).print();
    });
  </script>
</head>

<body>
</body>
</html>
```





通过yarn运行tfjs

```
<!DOCTYPE html>
<html lang="en">
<head>
  <meta charset="UTF-8">
  <title>Title</title>
  <script src="../../js/main.js"></script>
</head>
<body>

</body>
</html>
```



通过yarn运行tfjs

```
1
2  import * as tf from '@tensorflow/tfjs';
3
4  // Define a model for linear regression.
5  const model = tf.sequential();
6  model.add(tf.layers.dense({units: 1, inputShape: [1]}));
7
8  // Prepare the model for training: Specify the loss and the optimizer.
9  model.compile({loss: 'meanSquaredError', optimizer: 'sgd'});
10
11 // Generate some synthetic data for training.
12 const xs = tf.tensor2d([1, 2, 3, 4], [4, 1]);
13 const ys = tf.tensor2d([1, 3, 5, 7], [4, 1]);
14
15 // Train the model using the data.
16 model.fit(xs, ys, {epochs: 10}).then(() => {
17   // Use the model to do inference on a data point the model hasn't seen before:
18   model.predict(tf.tensor2d([5], [1, 1])).print();
19 });
20
```

TensorFlow.js 核心概念

张量和变量



张量 (Tensor)

TensorFlow.js 中数据的中心单位是张量：一组数值形成一个或多个维度的数组。张量实例具有定义数组形状的形状属性。在 TensorFlow.js 中，张量是不变的，一旦创建你就不能改变它们的值。

tf.tensor (values, shape?, dtype?) function

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







```
<html lang="en">
<head>
  <meta charset="UTF-8">
  <title>tensors</title>
  <!-- Load TensorFlow.js -->
  <script src="https://cdn.jsdelivr.net/npm/@tensorflow/tfjs@0.13.3/dist/tf.min.js">
  <script>
    const shape = [2,3]; // 可以看做是两行三列组成
    const a = tf.tensor([1.0,2.0,3.0,10.0,20.0,30.0], shape)
    a.print()
```




0阶、1阶和高阶张量

// 0阶张量, 即标量

```
tf.scalar(3.14).print(); // 3.140000104904175, 默认dtype 是 float32
tf.scalar(3.14, 'float32').print(); // 3.140000104904175
tf.scalar(3.14, 'int32').print(); // 3
tf.scalar(3.14, 'bool').print(); // 1
```

  top   Filter	Default levels 	
Tensor 3.140000104904175	array_ops.ts:1136	
Tensor 3.140000104904175	array_ops.ts:1136	
Tensor 3	array_ops.ts:1136	
Tensor 1	array_ops.ts:1136	



0阶、1阶和高阶张量





// 1阶张量

```
tf.tensor1d([1, 2, 3]).print(); // [1, 2, 3]
```

// 2阶张量

```
tf.tensor2d([[1, 2], [3, 4]]).print();
```

```
tf.tensor2d([1.1, 2.1, 3.1, 4.1], [2, 2], 'int32').print();
```

  top	▼	 Filter	Default levels ▼	
Tensor [1, 2, 3]			array_ops.ts:1136	
Tensor [[1, 2], [3, 4]]			array_ops.ts:1136	
Tensor [[1, 2], [3, 4]]			array_ops.ts:1136	







变量 (Variable)

变量是通过张量进行初始化得到的。不像Tensor的值不可变，变量的值是可变的。使用变量的assign方法分配一个新的tensor到这个变量上，变量就会改变：

```
const initialValues = tf.zeros([5]);  
const biases = tf.variable(initialValues); //初始化biases  
biases.print(); // 输出: [0, 0, 0, 0, 0]
```

```
const updatedValues = tf.tensor1d([0, 1, 0, 1, 0]);  
biases.assign(updatedValues); //更新biases的值  
biases.print(); // 输出: [0, 1, 0, 1, 0]
```

  top	 Filter	Default levels ▼	
Tensor [0, 0, 0, 0, 0]		array_ops.ts:1136	
Tensor [0, 1, 0, 1, 0]		array_ops.ts:1136	

模型设计



人工构建模型

- 通过操作 (ops) 来直接完成模型本身所做的工作

```
function predict(input) {  
  //  $y = a * x + b$   
  return tf.tidy(() => {  
    const x = tf.scalar(input);  
    const y = a.mul(x).add(b);  
  
    return y;  
  });  
}
```

```
const a = tf.scalar(2);  
const b = tf.scalar(5);
```

```
const result = predict(2);  
result.print()
```



使用tf.model构建模型

There are two primary ways of creating models.

- Sequential — Easiest, works if the models is a simple stack of each layer's input resting on the top of the previous layer's output.
- Model — Offers more control if the layers need to be wired together in graph-like ways — multiple 'towers', layers that skip a layer, etc.

```
const model = tf.sequential();  
model.add(tf.layers.dense({units: 32, inputShape: [50]}));  
model.add(tf.layers.dense({units: 4}));  
console.log(JSON.stringify(model.outputs[0].shape));
```

内存管理



内存管理

- TensorFlow.js计算过程中使用了显存，因此当tensorflow处理张量和变量时就有必要来管理显存。在TensorFlow.js中，可以通过dispose 和 tf.tidy这两种方法来管理内存。

tf.dispose (container)

function

[source](#)

Disposes any [tf.Tensors](#) found within the provided object.

dispose

```
const x = tf.tensor2d([[0.0, 2.0], [4.0, 6.0]]);  
const x_squared = x.square();  
x_squared.print();  
x.dispose();  
x_squared.dispose();  
x_squared.print();
```

```
Tensor  
  [[0 , 4 ],  
   [16, 36]]
```

✖ ▶ Uncaught Error: Tensor is disposed.
at e.throwIfDisposed (tensor.ts:584)
at e.dataSync (tensor.ts:561)
at e.toString (tensor.ts:692)
at Object.print (array_ops.ts:1136)
at e.print (tensor.ts:614)
at tensors.html? ijt=52...touhjaoden5v64kn:71



- 调用`dispose`来清除张量并释放其内存有时候可能会很麻烦。TensorFlow.js提供了另一个函数`tf.tidy`，它对JavaScript中的常规范围起到类似的作用，清除所有创建的中间张量，释放它们的内存。它不清除内部函数的返回值。
- 使用`tf.tidy`将有助于防止应用程序中的内存泄漏。它也可以用来更谨慎地控制内存何时回收。

tf.tidy、箭头函数

```
const average = tf.tidy(() => {  
  const y = tf.tensor1d([1.0, 2.0, 3.0, 4.0]);  
  const z = tf.ones([4]);  
  
  return y.sub(z).square().mean();  
});
```

```
average.print()
```

```
var func = p => p
```

等于

```
var func = function(p) {  
  return p  
}
```

完整实例展示

```
1 import * as tf from '@tensorflow/tfjs';
2
3 // 定义一个线性回归模型
4 const model = tf.sequential();
5 model.add(tf.layers.dense({units: 1, inputShape: [1]}));
6
7 // 模型训练所需要的损失函数和优化器
8 model.compile({loss: 'meanSquaredError', optimizer: 'sgd'});
9
10 // 生成训练数据集
11 const xs = tf.tensor2d([1, 2, 3, 4], [4, 1]);
12 const ys = tf.tensor2d([1, 3, 5, 7], [4, 1]);
```

```
15 model.fit(xs, ys, {epochs: 10}).then(() => {  
16     // 输出预测结果  
17     model.predict(tf.tensor2d([5], [1, 1])).print();  
18 });
```

  top ▼  Filter Default levels ▼

Tensor array_ops.ts:120
[[5.9986029],]