

HUGE

Holi MDE.

Image recognition in the browser using Tensorflow.js

Aug 13, 2019

Agenda.

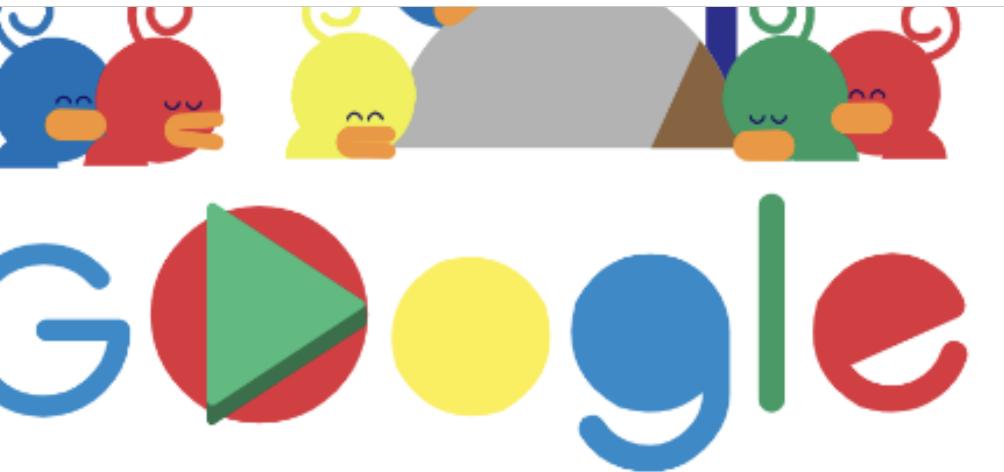
1. Motivation.
2. Neural Networks.
3. Convolutional Neural Networks.
4. Tensorflow.
5. Tensorflow.js.
6. Examples:
 - From scratch
 - Pre-trained models.
 - API

Motivation



Motivation

Social Networks



learn machine learning with |



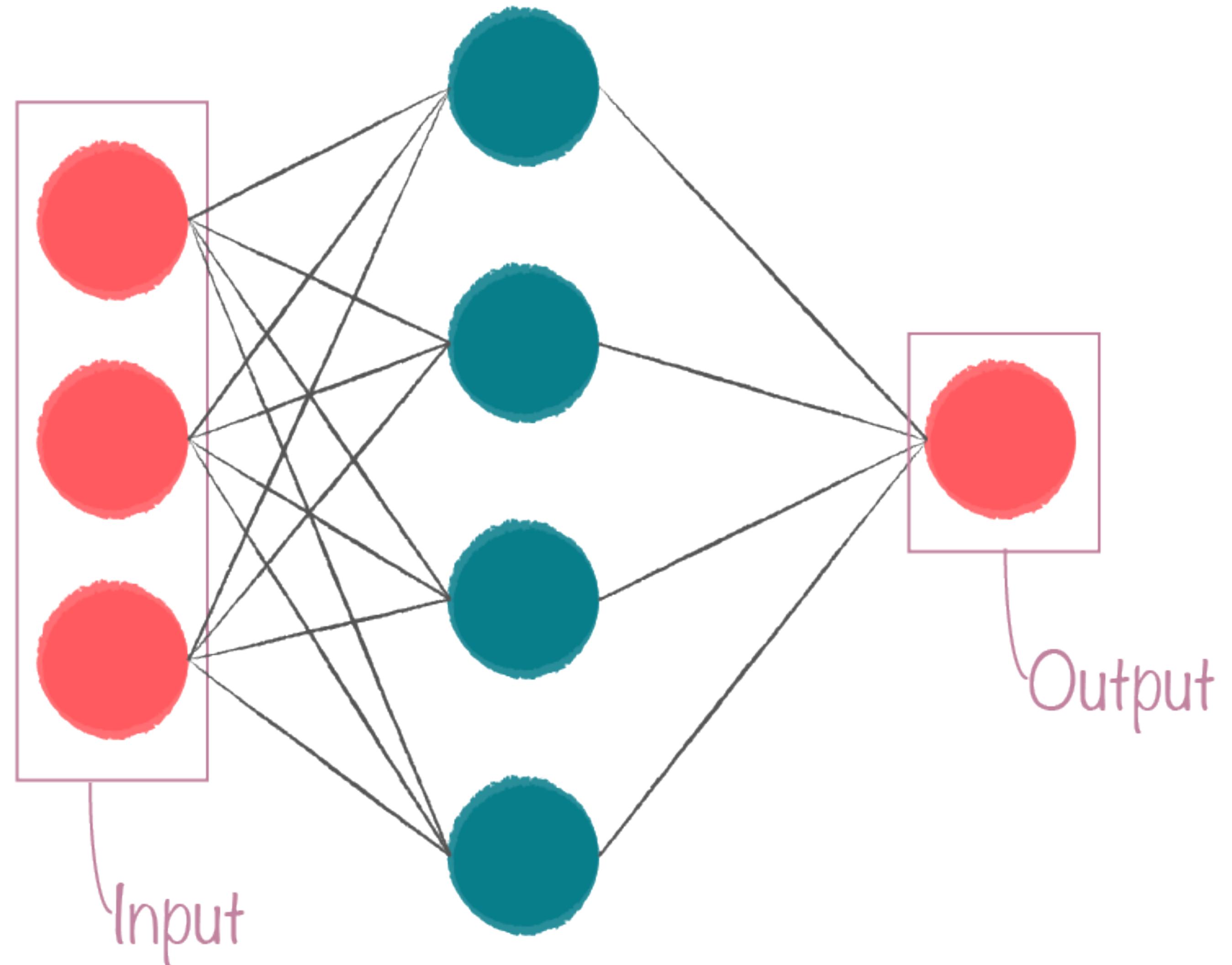
learn machine learning with **python**
learn machine learning with **python free**
learn machine learning with **tensorflow**
learn machine learning with **python from scratch**
learn machine learning with **google**
learn machine learning with **java**
learn machine learning with **real world examples**
learn machine learning with **python online**
learn machine learning with **r**
~~learn machine learning with **javascipt**~~



Neural Networks.

Neural Networks.

**Computational
models that emulate
the behavior of the
human brain.**

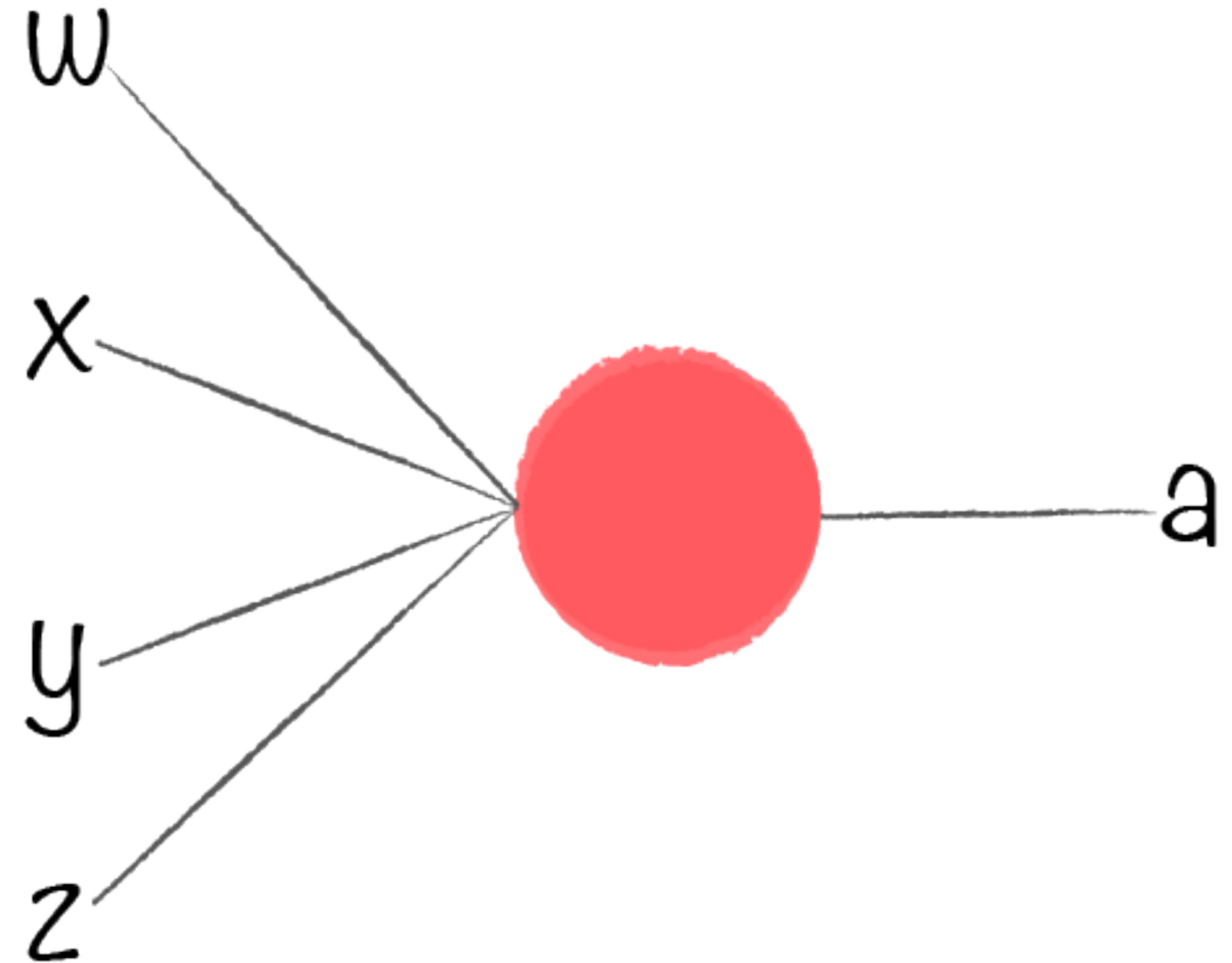


Neural Networks

Neuron

Building blocks.

Takes inputs, does some math with them, and produces one output.

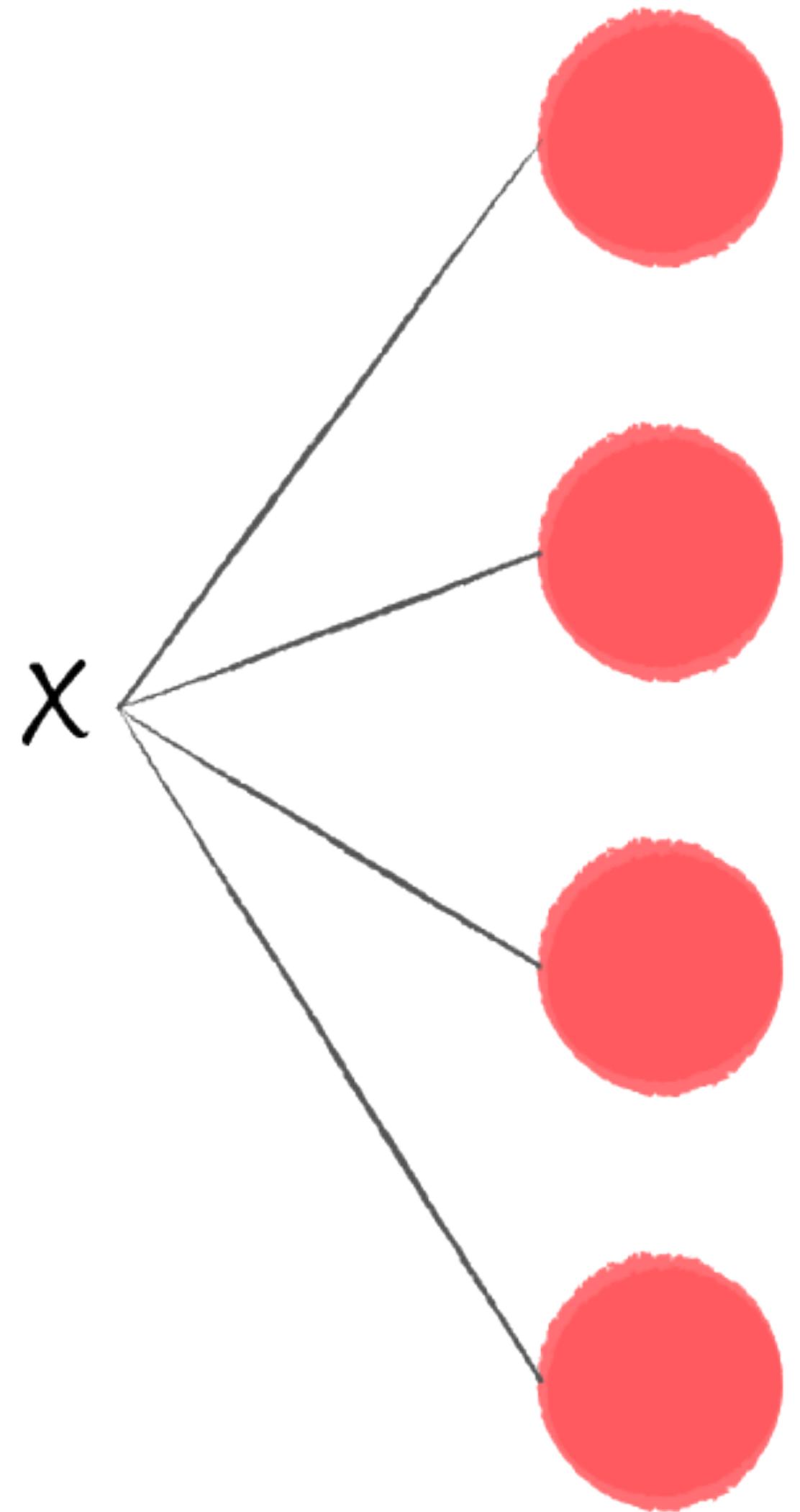


Neural Networks.

Layer

A bunch of neurons connected.

Can recognize simple patterns.

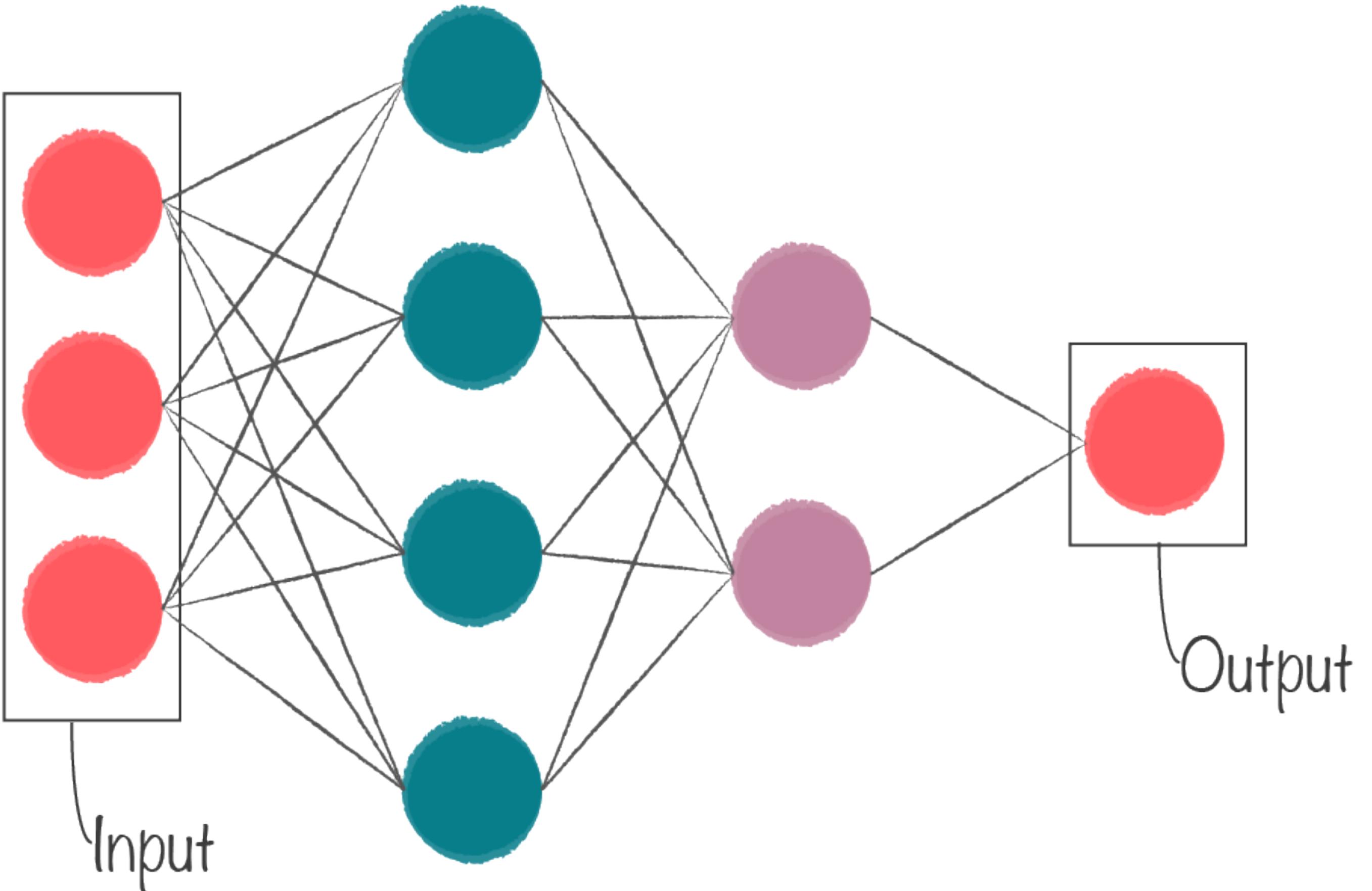


Neural Networks.

Network

A bunch layers connected.

Can recognize complex patterns.



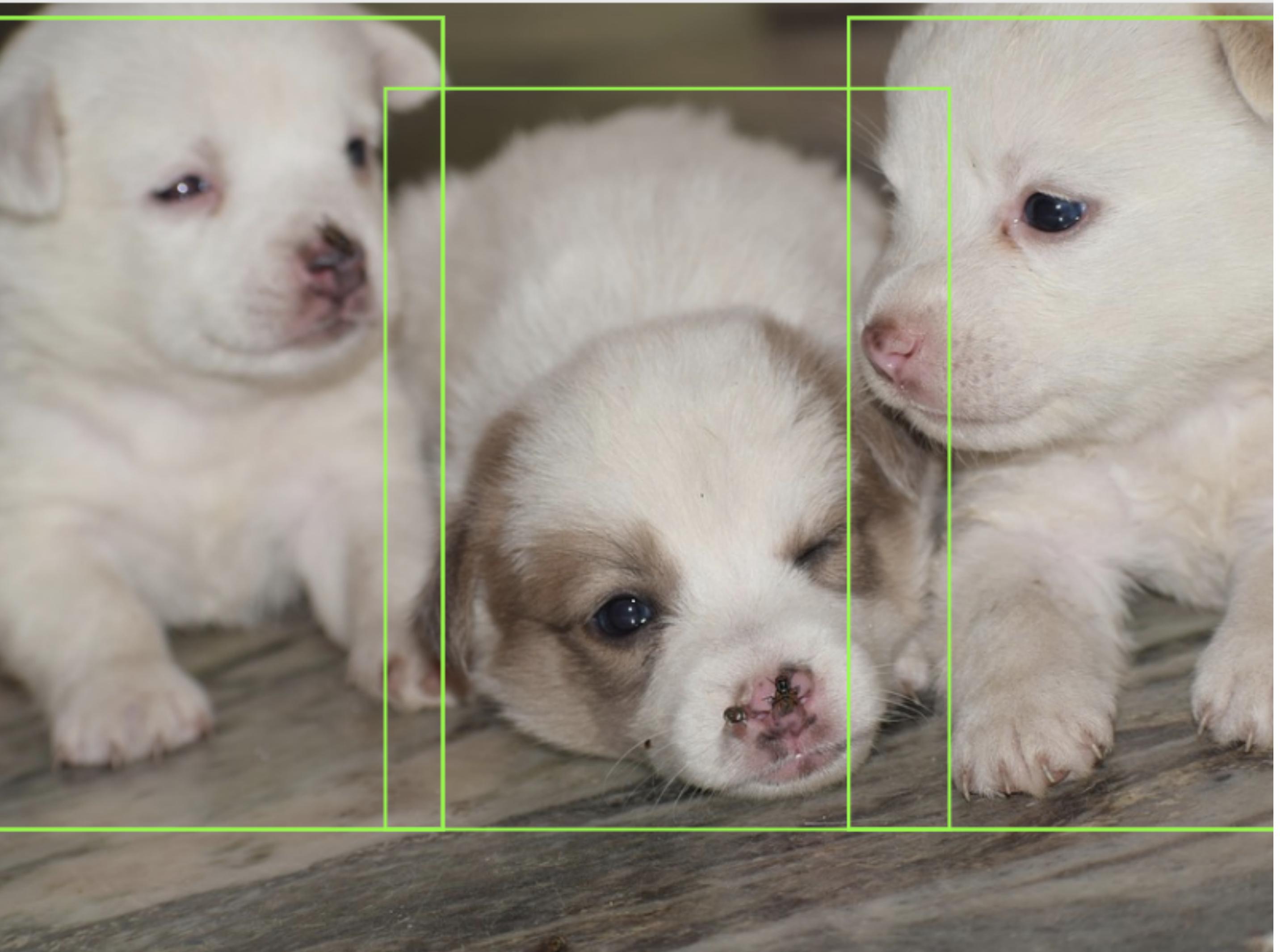
Convolutional Neural Networks

3

Convolutional Neural Networks.

**They are used for
image detection and
recognition.**

The CNN assume that the inputs
are images, in this way, they can
optimize the calculations.



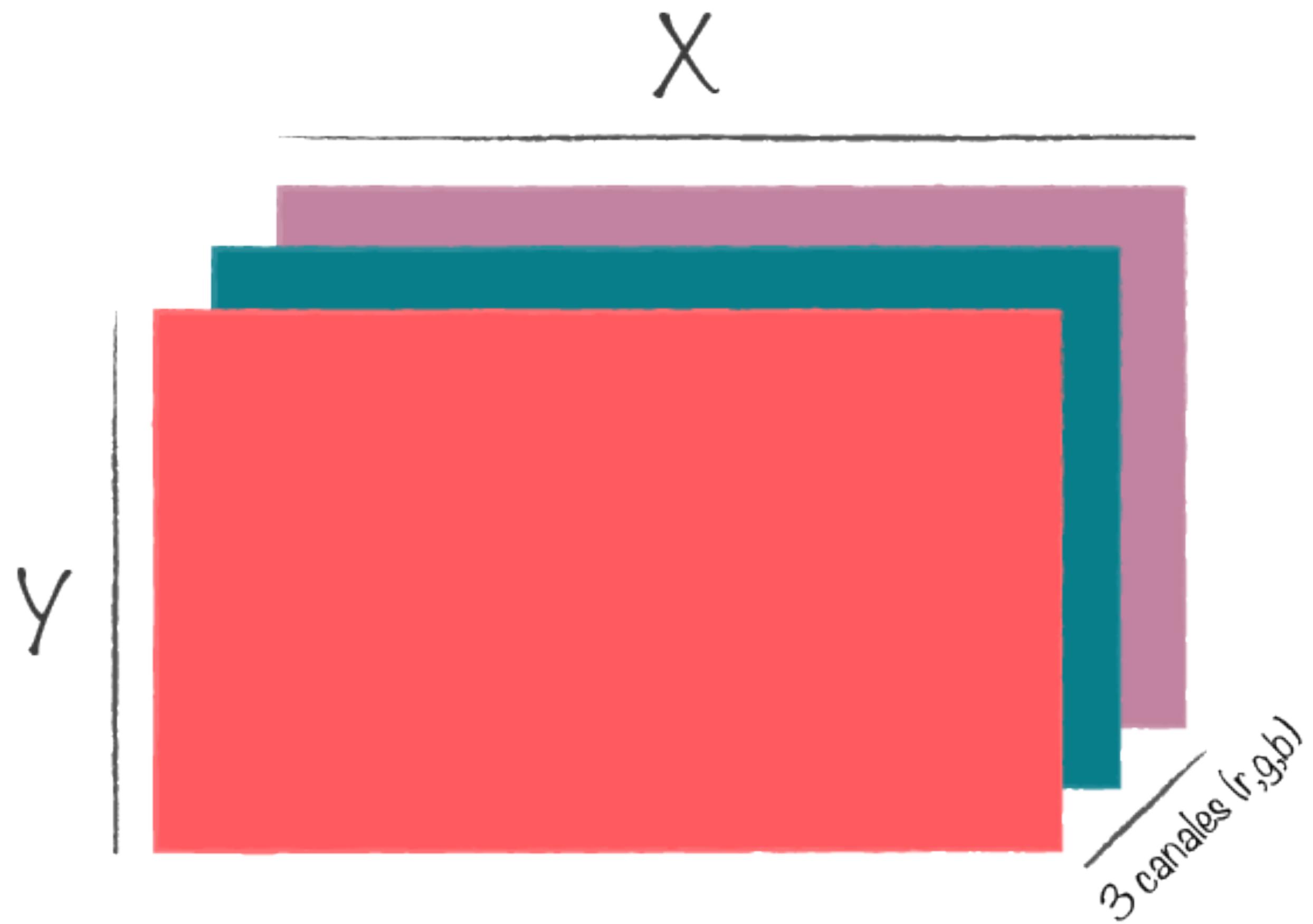
Convolutional Neural Networks.

Why is this necessary?

Image = Pixel matrix

$$32 \times 32 \times 3 = 3072$$

$$2048 \times 1536 \times 3 = 9,437,814$$



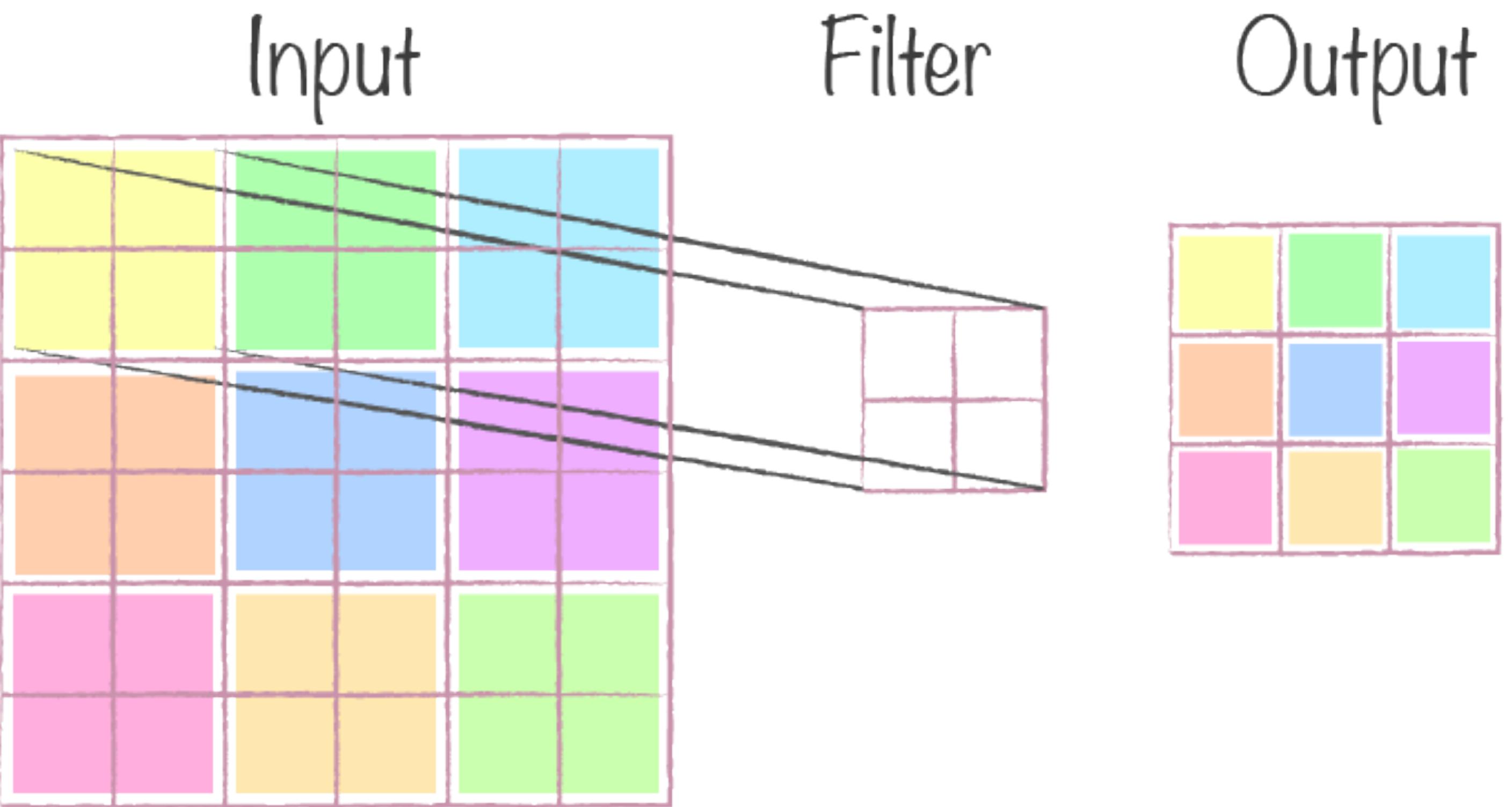
$$X * Y * 3 = \# \text{params}$$

Convolutional Neural Networks.

Layers

Convolutional Neural Networks - Layers.

Convolution



Convolutional Neural Networks - Layers.

Convolution



Convolutional Neural Networks - Layers.

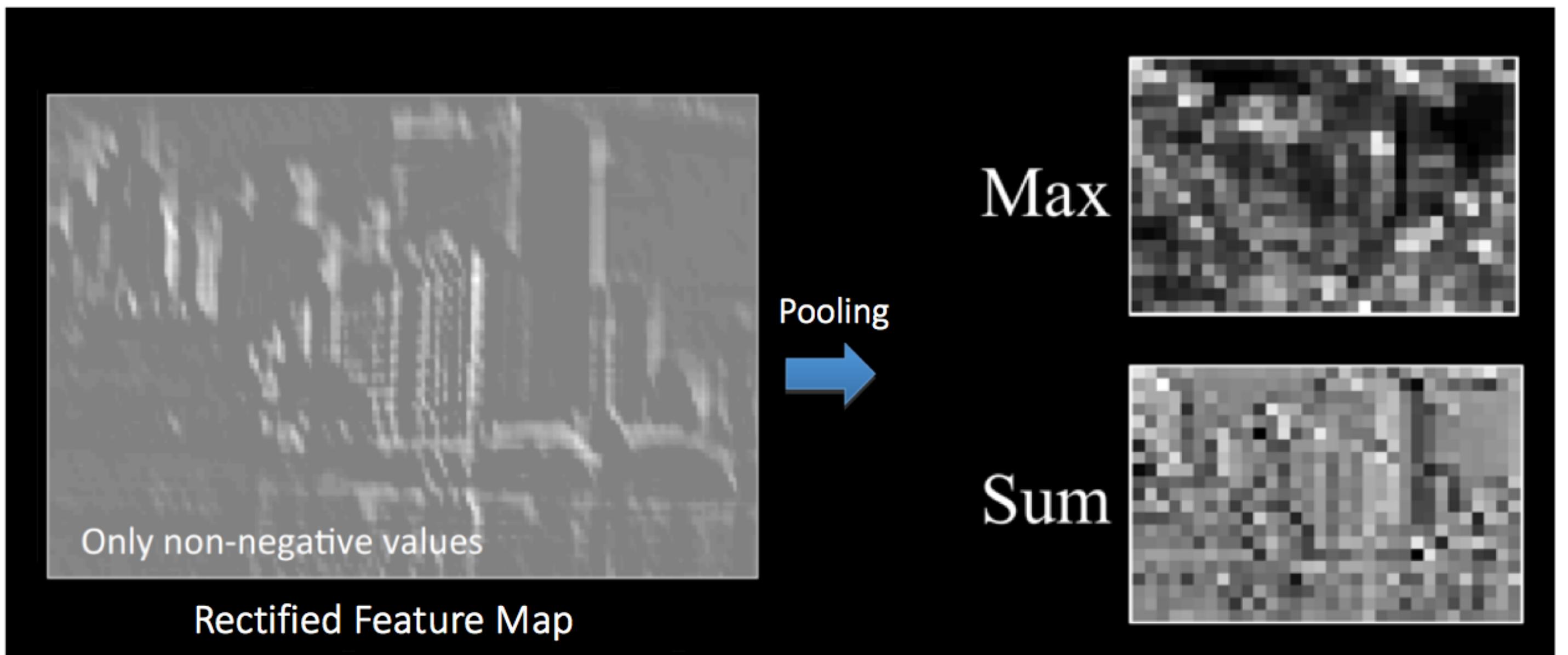
Pooling

1	2	3	1	2	3
0	1	4	1	0	3
1	3	0	3	2	2
2	0	3	3	0	3
1	1	2	4	0	3
0	4	3	1	5	3

4	3
4	5

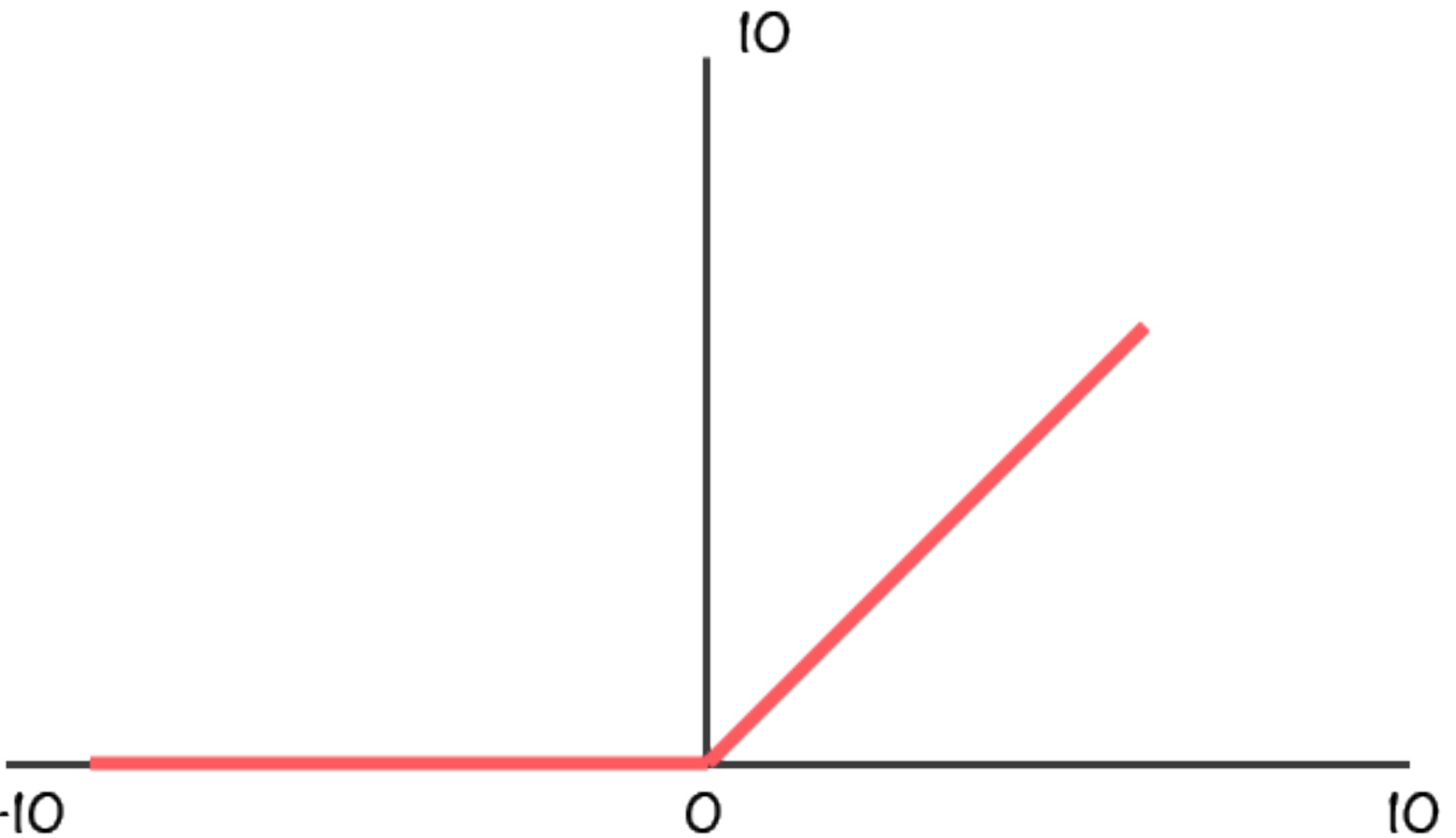
Convolutional Neural Networks - Layers.

Pooling



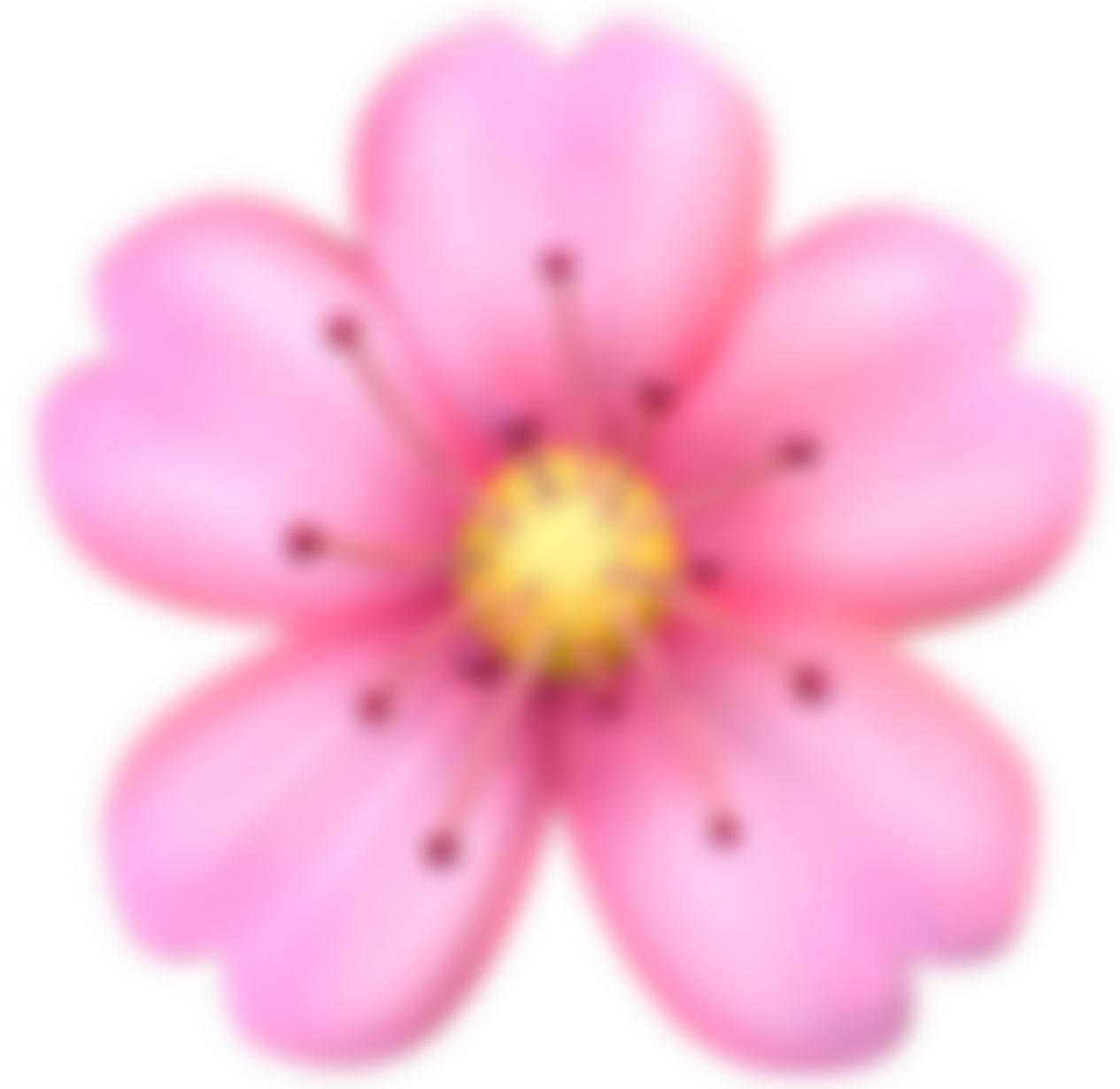
Convolutional Neural Networks - Layers.

Activation



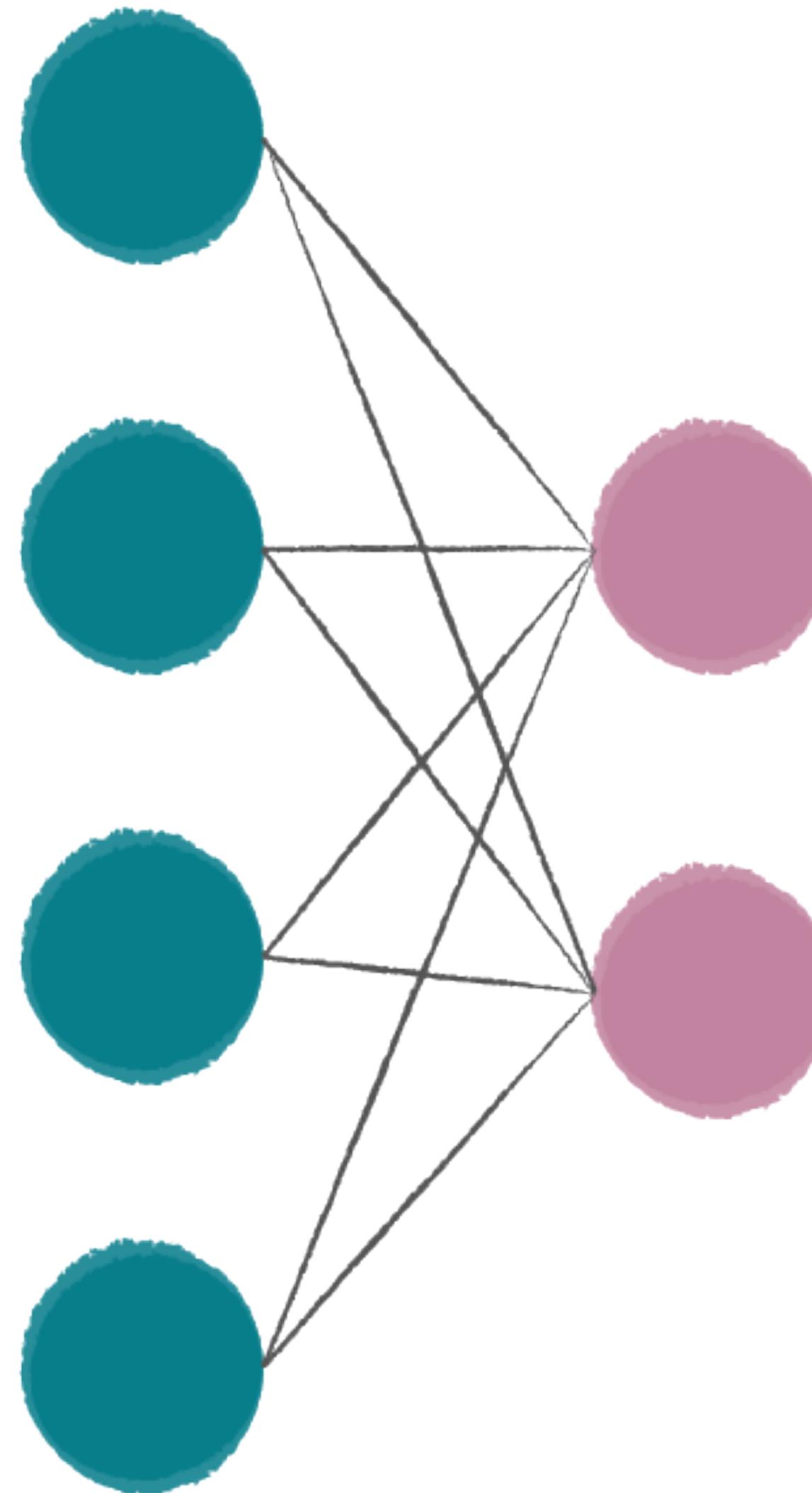
Convolutional Neural Networks - Layers.

Activation



Convolutional Neural Networks - Layers.

Fully connected



Convolutional Neural Networks.

Architectures

ImageNet

- ~14 million of labeled images.
- 20 thousand classes.
- ImageNet Challenge on Kaggle

Architectures

- AlexNet (2012)
- Inception - GoogLeNet (2014)
- VGG (2014)
- ResNet (2015)

TensorFlow



Tensorflow.

TensorFlow.

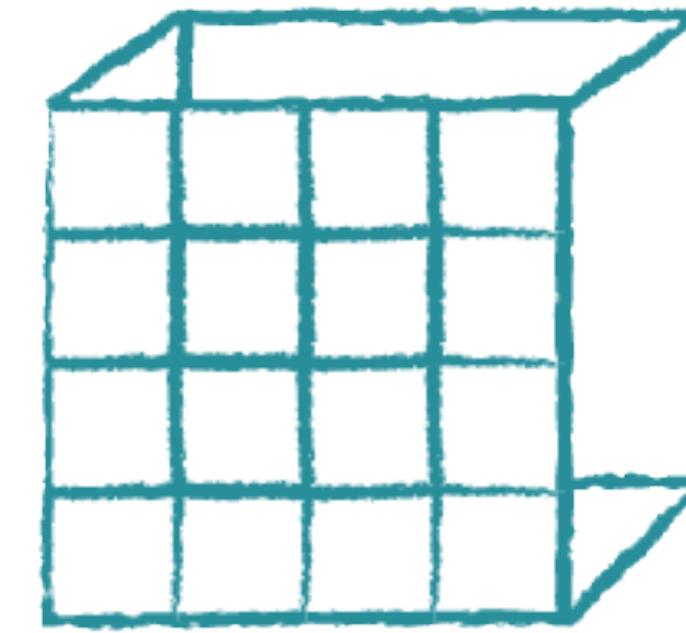
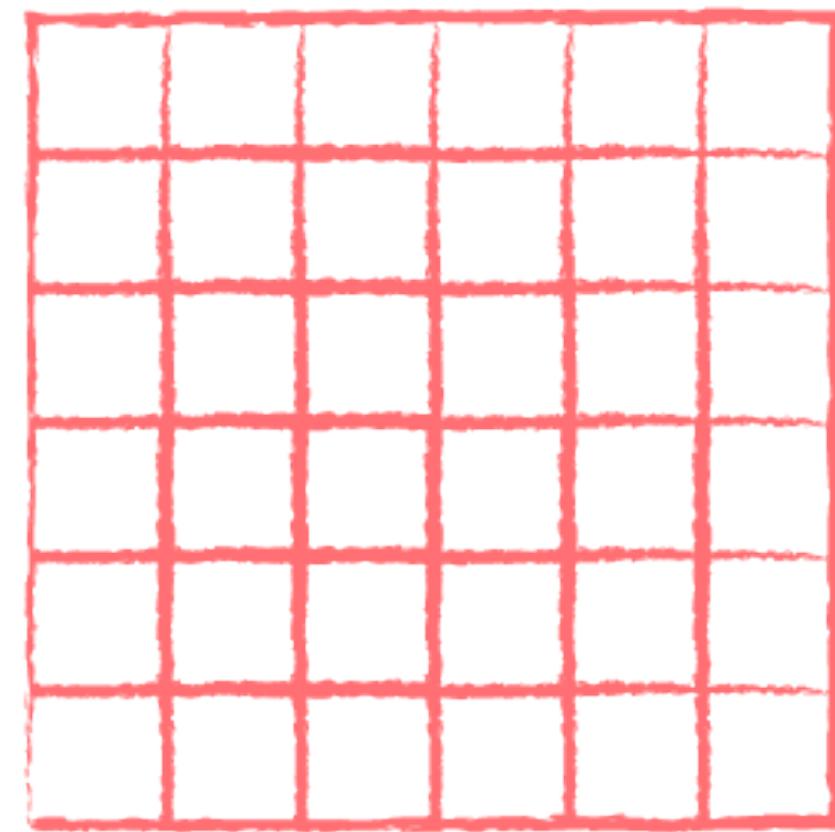
An open source machine learning library for research and production.

Tensorflow.

Tensors

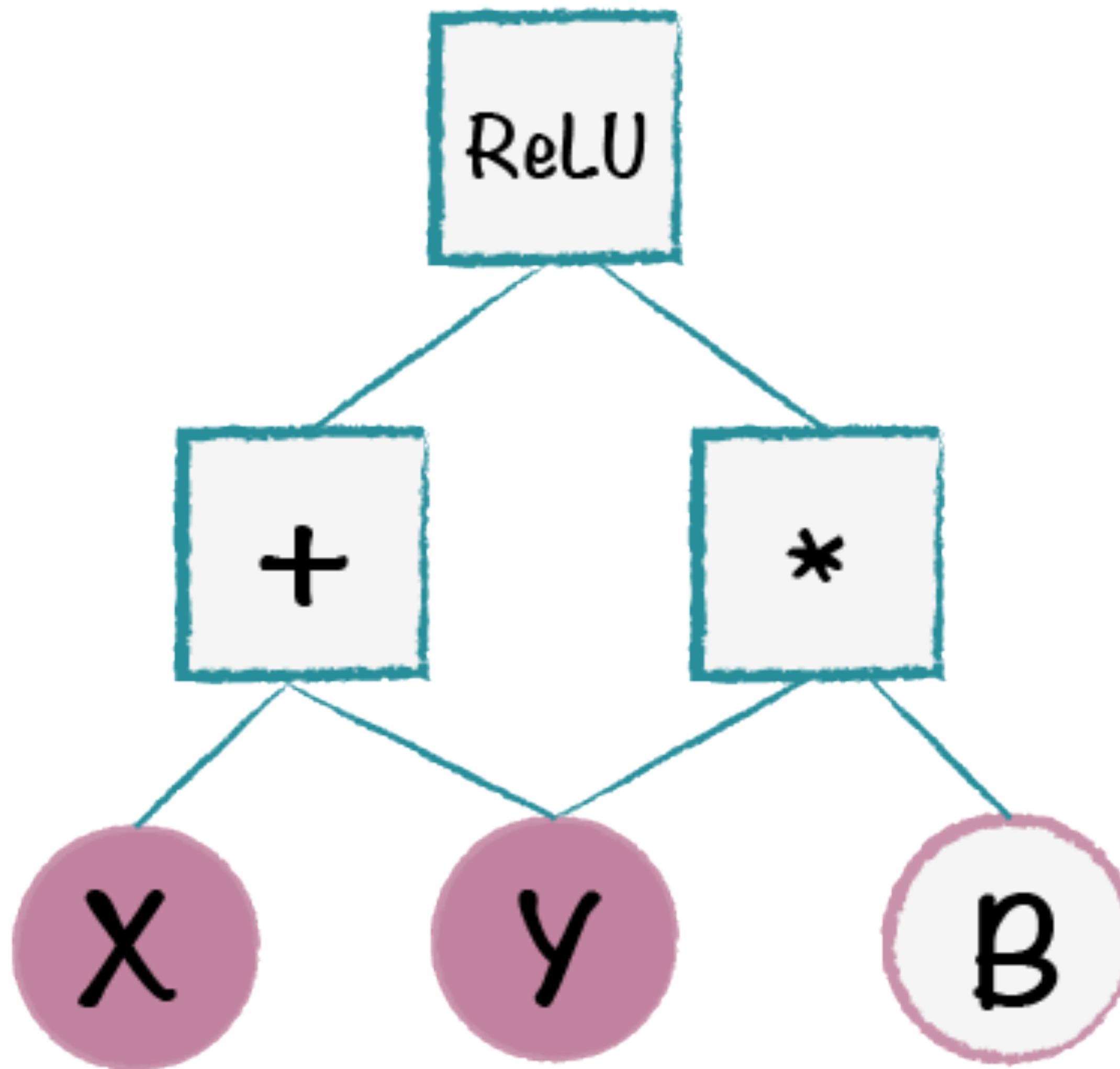
Tensor

Mathematical object more general
than a vector or matrix.



Tensorflow.

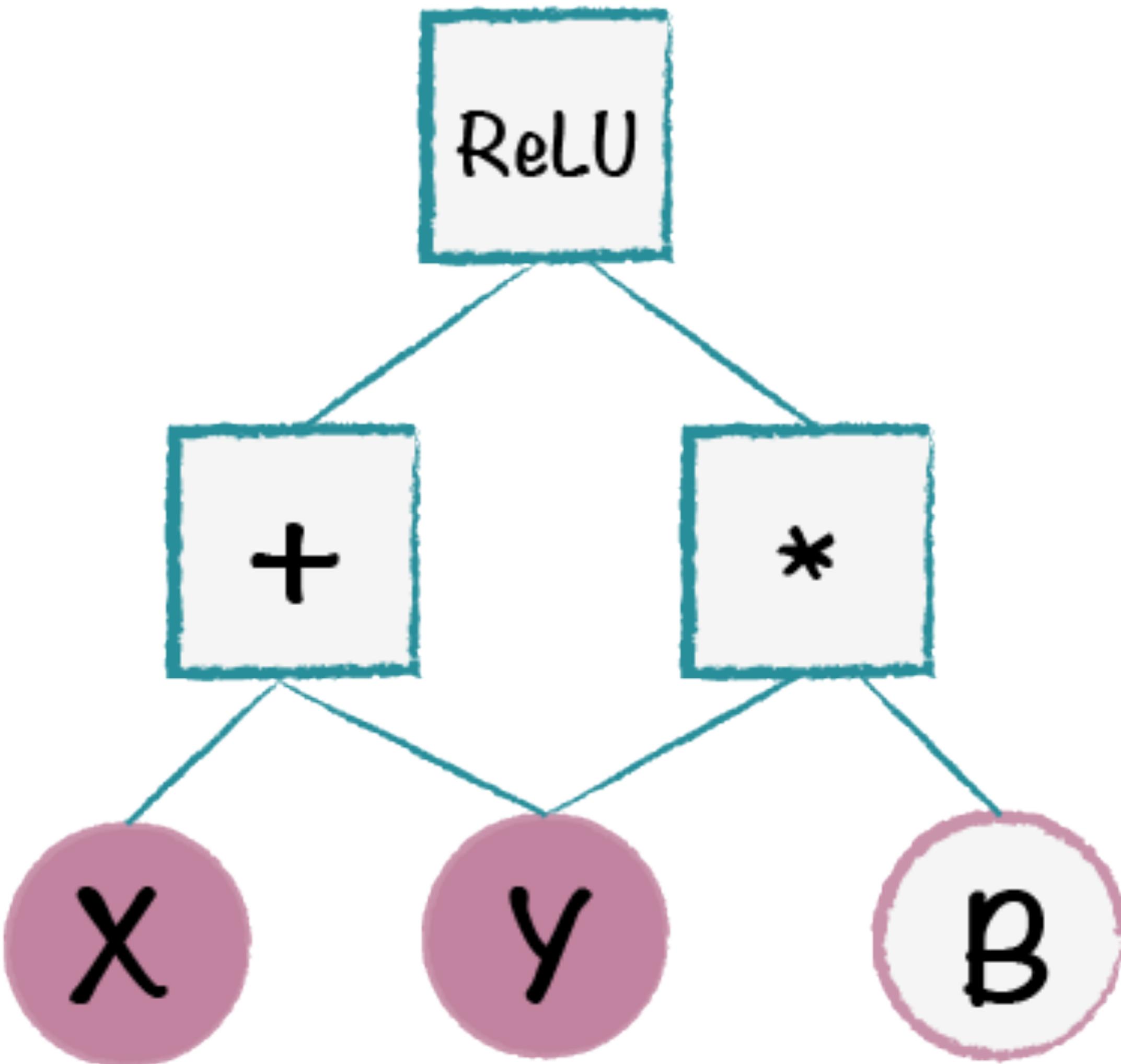
Data Flow Graph



Tensorflow.

Data Flow Graph

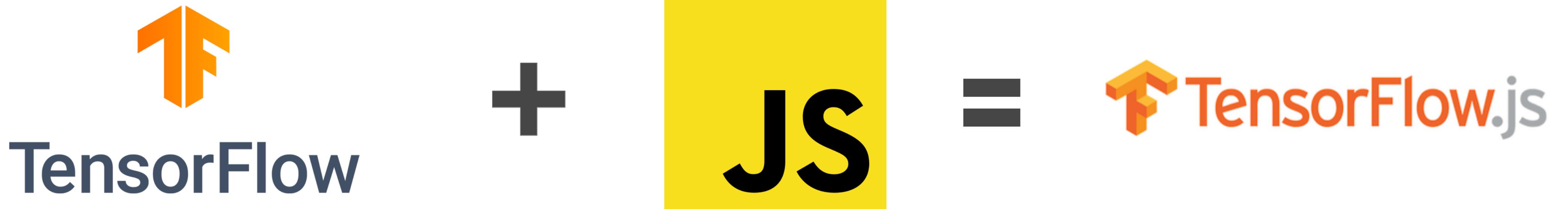
- Parallelism
- Distributed execution
- Compilation
- Portability



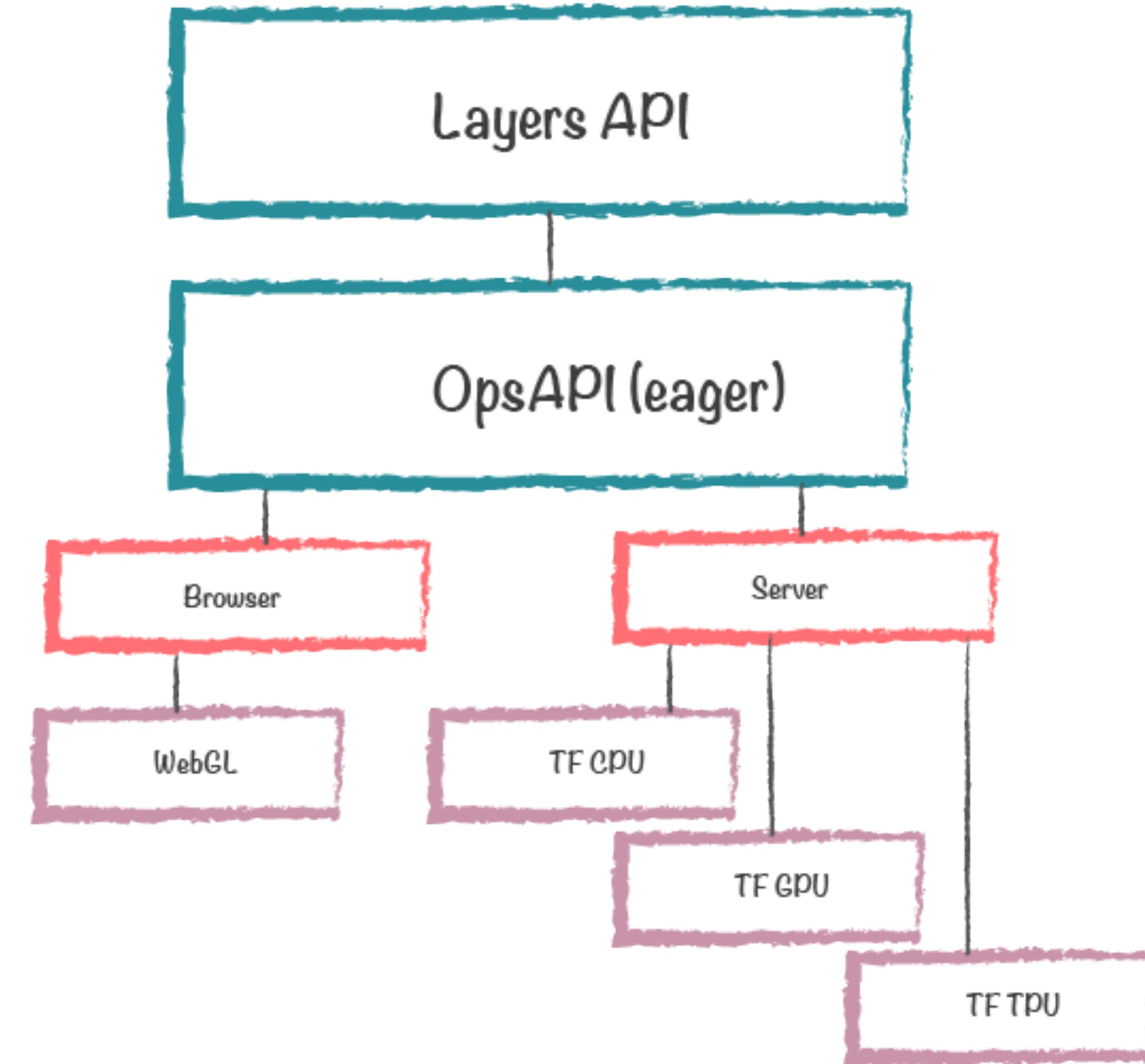
5

TensorFlow.js

Tensorflow.js



Tensorflow.js



Required eyebrow.

Tensorflow.js

WebGL.

is a JavaScript API for rendering interactive 2D and 3D graphics

Advantages

- Data privacy.
- Low latency.

Examples



Examples.

CNN From Scratch Iris Dataset

CNN from scratch - Iris Dataset.



Setosa



Versicolor



Virginica

CNN from scratch - Iris Dataset.



```
import * as tf from "@tensorflow/tfjs"
import "@tensorflow/tfjs-node"
import iris from "./iris.json"
import irisTesting from "./iris-testing.json"
```

CNN from scratch - Iris Dataset.



```
const trainingData = tf.tensor2d(iris.map(item => [
    item.sepal_length, item.sepal_width, item.petal_length, item.petal_width,
]))  
  
const testingData = tf.tensor2d(irisTesting.map(item => [
    item.sepal_length, item.sepal_width, item.petal_length, item.petal_width,
]))  
  
const outputData = tf.tensor2d(iris.map(item => [
    item.species === "setosa" ? 1 : 0,
    item.species === "virginica" ? 1 : 0,
    item.species === "versicolor" ? 1 : 0,
]))
```

CNN from scratch - Iris Dataset.



```
const trainingData = tf.tensor2d(iris.map(item => [
    item.sepal_length, item.sepal_width, item.petal_length, item.petal_width,
]))  
  
const testingData = tf.tensor2d(irisTesting.map(item => [
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]))  
  
const outputData = tf.tensor2d(iris.map(item => [
    item.species === "setosa" ? 1 : 0,
    item.species === "virginica" ? 1 : 0,
    item.species === "versicolor" ? 1 : 0,
]))
```

CNN from scratch - Iris Dataset.



```
model.fit(trainingData, outputData, {epochs: 100})  
  .then((history) => {  
    model.predict(testingData).print()  
  })
```



Tensor

```
[ [ 0.9829643, 0.0000683, 0.0263934], //setosa  
  [ 0.0032604, 0.9411913, 0.0756058], //versicolor  
  [ 0.0151716, 0.0281591, 0.9535264] ] //virginica
```

Examples.

Pre-trained models

MobileNet

Pre-trained models

- PoseNet: Human pose estimation.
- BodyPix: Body part segmentation.
- Toxicity: Score the perceived impact of a comment.
- Universal sentence encoder: Natural language processing.
- Coco SSD: Object detection
- Speech commands: Classify 1 second audio snippets.
- KNN Classifier: K-Nearest Neighbors algorithm.
- MobileNet: Classify images with labels from ImageNet.

Pre-trained models.



```
const classifier = knnClassifier.create();

async function app() {
    net = await mobilenet.load();
    await setupWebcam();

    document.getElementById('class-1').addEventListener('click', () => addExample(0));
    document.getElementById('class-2').addEventListener('click', () => addExample(1));
    document.getElementById('class-3').addEventListener('click', () => addExample(2));

    const addExample = classId => {
        const activation = net.infer(webcamElement, 'conv_preds');
        classifier.addExample(activation, classId);
    };
}
```

Pre-trained models.



prediction: B

probability: 0.6666666666666666

[Add 1](#) [Add 2](#) [Add 3](#)

A screenshot of the Chrome DevTools interface, specifically the Elements tab. At the top, there are icons for Selection, Element, and Copy. Below the tabs, the word "Elements" is underlined, indicating it is active. Other tabs include Console, Sources, Network, Performance, Memory, Application, Security, and Audits. In the main content area, the text "<!doctype html>" is displayed. The browser's address bar and other parts of the interface are visible at the very bottom.

Examples.

APIs

FaceAPI

FaceAPI



```
<script defer src="face-api.min.js"></script>
```



```
Promise.all([
    faceapi.nets.tinyFaceDetector.loadFromUri(MODEL_URL),
    faceapi.nets.faceLandmark68Net.loadFromUri(MODEL_URL),
    faceapi.nets.faceRecognitionNet.loadFromUri(MODEL_URL),
    faceapi.nets.faceExpressionNet.loadFromUri(MODEL_URL),
]).then(startVideo);
```

FaceAPI



```
function onPlay(el) {
  const displaySize = faceapi.matchDimensions(canvas, videoInput, true);

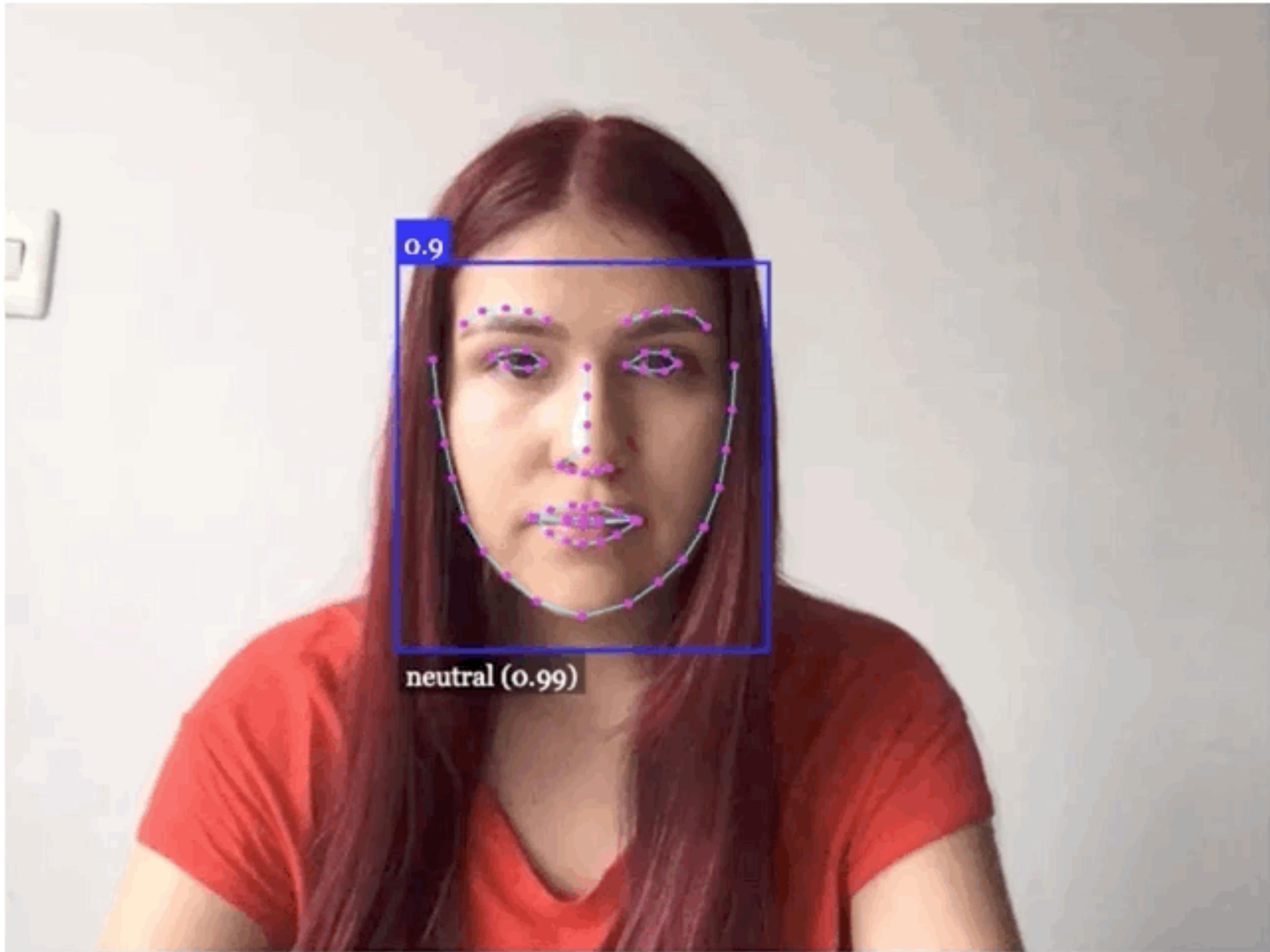
  setInterval(async () => {
    const detections = await faceapi
      .detectAllFaces(videoInput, new faceapi.TinyFaceDetectorOptions())
      .withFaceLandmarks()
      .withFaceExpressions();

    const resizedDetections = faceapi.resizeResults(detections, displaySize);

    canvas.getContext('2d').clearRect(0, 0, canvas.width, canvas.height);

    faceapi.draw.drawFaceExpressions(canvas, resizedDetections);
    faceapi.draw.drawFaceLandmarks(canvas, detections);
    faceapi.draw.drawDetections(canvas, detections);
  }, 100);
}
```

FaceAPI





Repo:
[http://github.com/
ManuCastrillonM/cnn-in-the-browser](http://github.com/ManuCastrillonM/cnn-in-the-browser)

HUGE

Done.

Image recognition in the browser using Tensorflow.js

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