



Criando Androids mais inteligentes



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Perguntas:

www.slido.com

Code: #88857



TensorFlow

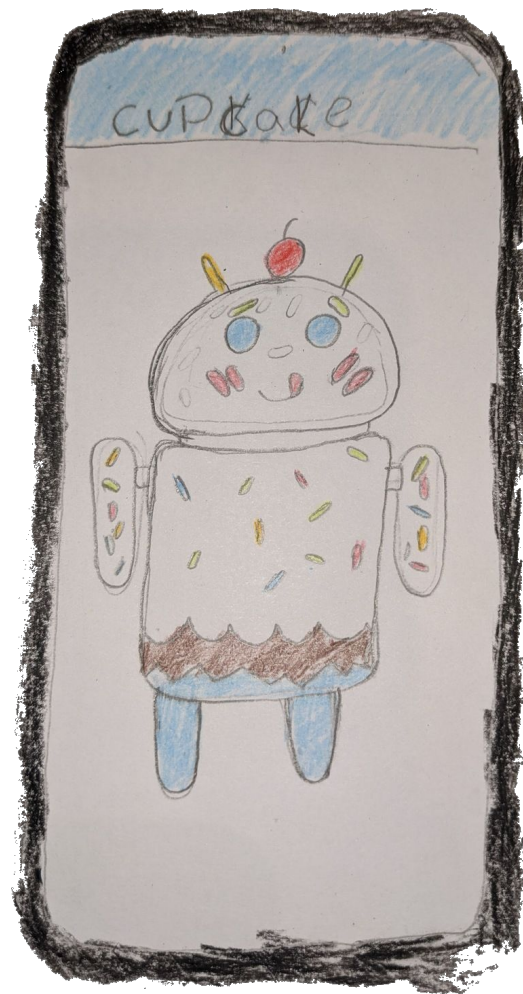
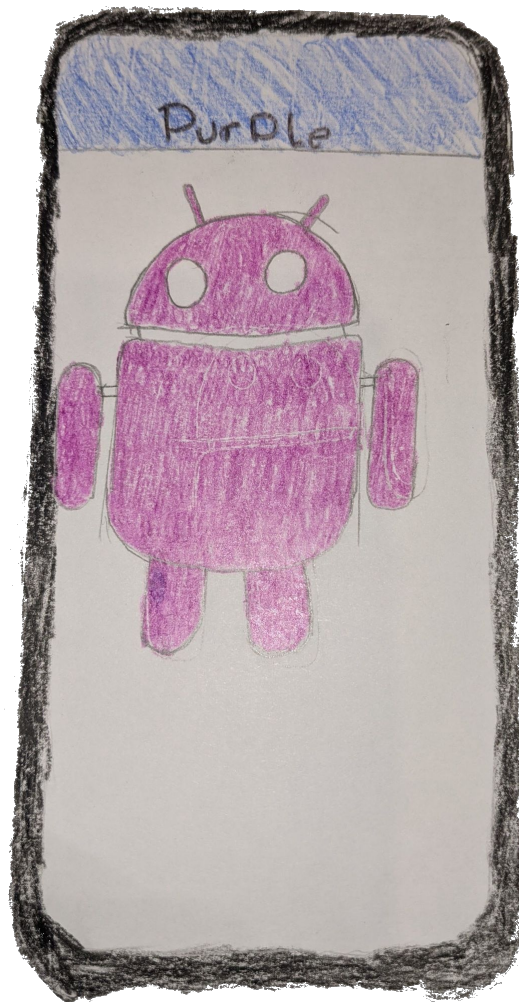


...for Science!
an Android™ mini collectible special edition series



...for Science²!
an Android™ mini collectible special edition series

Meu Sonho:

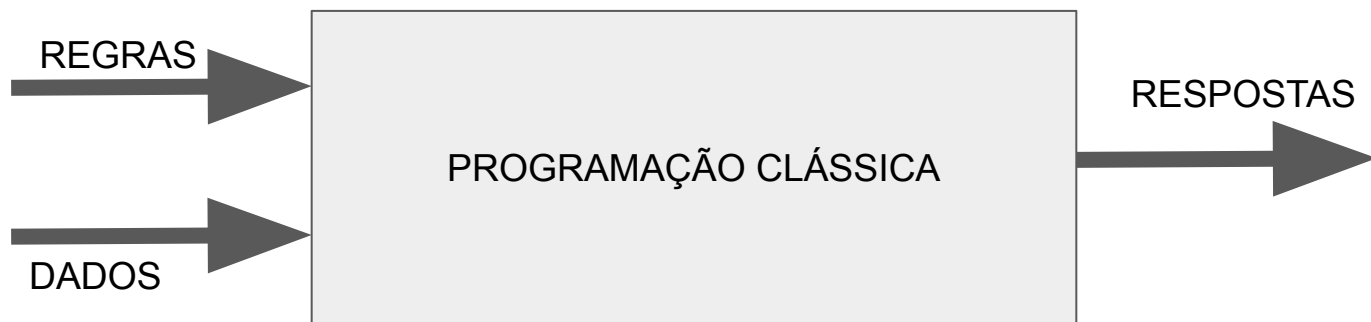


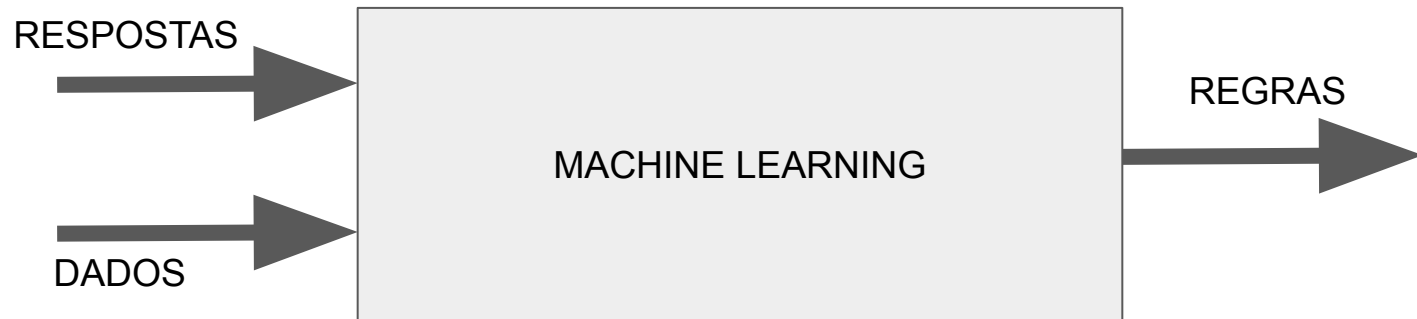
by n7



Machine Learning

1. O que é?
2. Quanto eu preciso aprender para conseguir resolver meu problema?
3. Quais recursos estão disponíveis?







Queen





Usuário

Pesquisador

Especialista



O que é TensorFlow

Uma plataforma de aprendizado de máquina **para todos** usarem e resolver problemas reais.

- Open source
- Free
- end-to-end





O que é TensorFlow Lite?

TensorFlow Lite é um framework para distribuir ML em **dispositivos móveis** ou **sistemas embarcados**



TensorFlow Lite





Explosão ML on-device

- Menor Latencia
- Sem necessidade de conexão de rede
- Privacidade preservada





On device ML permite uma
nova geração de produtos



1000s de apps em produção



Photos



GBoard



Cloud



YouTube



Assistant



Uber



Hike



mercari

Mercari



Viber



Airbnb



Text

Classification
Prediction



Speech

Recognition
Text to Speech
Speech to Text



Image

Object detection
Object location
OCR
Gesture recognition
Facial modelling
Segmentation
Clustering
Compression
Super resolution



Audio

Translation
Voice synthesis



Content

Video generation
Text generation
Audio generation



Modelos pre treinados



TensorFlow Lite

tensorflow.org/lite/models



TensorFlow Hub

tfhub.dev



Filters

Clear all

Problem domain



Model format

TF.js

TFLite

Coral

TF Version



TF1

TF2

Fine tunable



Architecture



Publisher



Dataset



Language



Audio pitch extraction

.JS

TFLite

spice

Published by: **Google** Updated: 08/14/2020

A mobile-compatible pitch extraction model to recognize the dominant pitch in sung audio. Trained (in a self-supervised way) on the MIR-1k dataset.



Image classification

TFLite

aiy/vision/classifier/plants_V1

Published by: **Google** Updated: 08/14/2020

Mobile plants classification model.

MobileNet V2 | iNaturalist



Image object detection

TFLite

object_detection...

Published by: **Google** Updated: 08/14/2020

A class-agnostic mobile object detector.

MobileNet V2



Image classification

TFLite

aiy/vision/classifier/birds_V1

Published by: **Google** Updated: 08/14/2020

Mobile bird classification model.

MobileNet V2 | iNaturalist



Text embedding

TFLite

albert_lite_base

Published by: **TensorFlow** Updated: 08/14/2020

ALBERT is "A Lite" version of BERT with greatly reduced number of parameters. This is a TFLite compatible version. It can be fine-tuned for downstream tasks and converted to TFLite models.

Transformer | SQuAD



Image classification

TFLite

disease-classification

Published by: **AgriPredict** Updated: 06/24/2020

Fine-grained image classification model for crop disease classification.

MobileNet | Internal AgriPredict Dataset



Image classification

TFLite

aiy/vision/classifier/insects_V1

Published by: **Google** Updated: 08/14/2020

Mobile insect classification model.

MobileNet V2 | iNaturalist



Image classification

TFLite

efficientnet/lite4/classification

Published by: **TensorFlow** Updated: 08/14/2020

EfficientNet-Lite models, trained on ImageNet (ILSVRC-2012-CLS), optimized for TFLite, designed for performance on mobile CPU, GPU, and EdgeTPU.

EfficientNet-B4 | ImageNet (ILSVRC-2012-CLS)



Image classification

TFLite

efficientnet/lite0/classification

Published by: **TensorFlow** Updated: 08/14/2020

EfficientNet-Lite models, trained on ImageNet (ILSVRC-2012-CLS), optimized for TFLite, designed for performance on mobile CPU, GPU, and EdgeTPU.

EfficientNet-B0 | ImageNet (ILSVRC-2012-CLS)



Image classification

TFLite

aiy/vision/classifier/food_V1

Published by: **Google** Updated: 08/14/2020

Food classification model.

MobileNet V1



Image classification

TFLite

cropnet/classifier/cassava_disease_V1

Published by: **Google** Updated: 08/14/2020

Cassava disease classification model

MobileNet V3



Image classification

TFLite

efficientnet/lite2/classification

Published by: **TensorFlow** Updated: 08/14/2020

EfficientNet-Lite models, trained on ImageNet (ILSVRC-2012-CLS), optimized for TFLite, designed for performance on mobile CPU, GPU, and EdgeTPU.

EfficientNet-B2 | ImageNet (ILSVRC-2012-CLS)



Image classification

TFLite

on_device_vision/classifier...

Published by: **Google** Updated: 08/14/2020

Mobile classification model for popular US products.



Image classification

TFLite

object_detection...

Published by: **Google** Updated: 08/14/2020

A mobile object labeler.

MobileNet V2



Image classification

TFLite

on_device_vision/classifier...

Published by: **Google** Updated: 08/14/2020

Landmark recognition model. Tuned for Asia.



Image classification

TFLite

vision/classifier/fungi_mobile_V1

Published by: **Danish Mycological Society** Updated: 08/14/2020

Mobile-compatible image classification model trained on Fungi dataset provided by the Danish Mycological Society

MobileNet V2

Collection ml-model-binding

Published by: **Android Studio**

Last update: 2020/06/11

Collection of TFLite models that can be used with Android Studio ML Model Binding.

Overview

Use TensorFlow Lite models from TF-Hub with ML Model Binding in Android Studio version 4.1 or later. ML Model Binding makes it easy for you to directly import `.tflite` model files and use them in your projects. Learn more about how to [import TFLite models in Android Studio](#).

Follow these steps to use a model in your Android Studio project:

1. Install [Android Studio 4.1 Beta 1 or later](#)
2. Download the `.tflite` model file from the model details page. Pick a model with metadata if one is available.
3. In Android Studio, open the TensorFlow Lite model import dialog in the File menu at **File > New > Other > TensorFlow Lite Model**. Select the `.tflite` model file that you downloaded.
4. Click Finish.

This imports the model file into your project and places it in the `ml/` folder. Clicking on the model file in your project will open the model viewer, which provides shows the following:

- **Model:** High-level description of the model
- **Tensors:** Description of input and output tensors
- **Sample code:** Example of how to interface with the model in your app

<https://tfhub.dev/android-studio/collections/ml-model-binding/1>

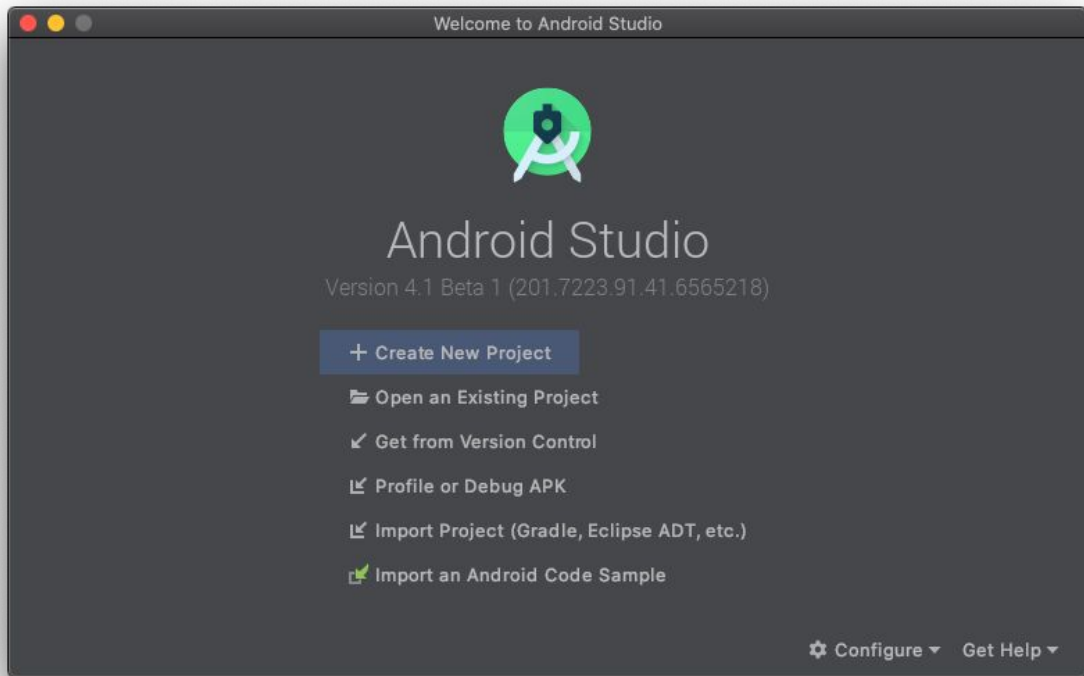


+



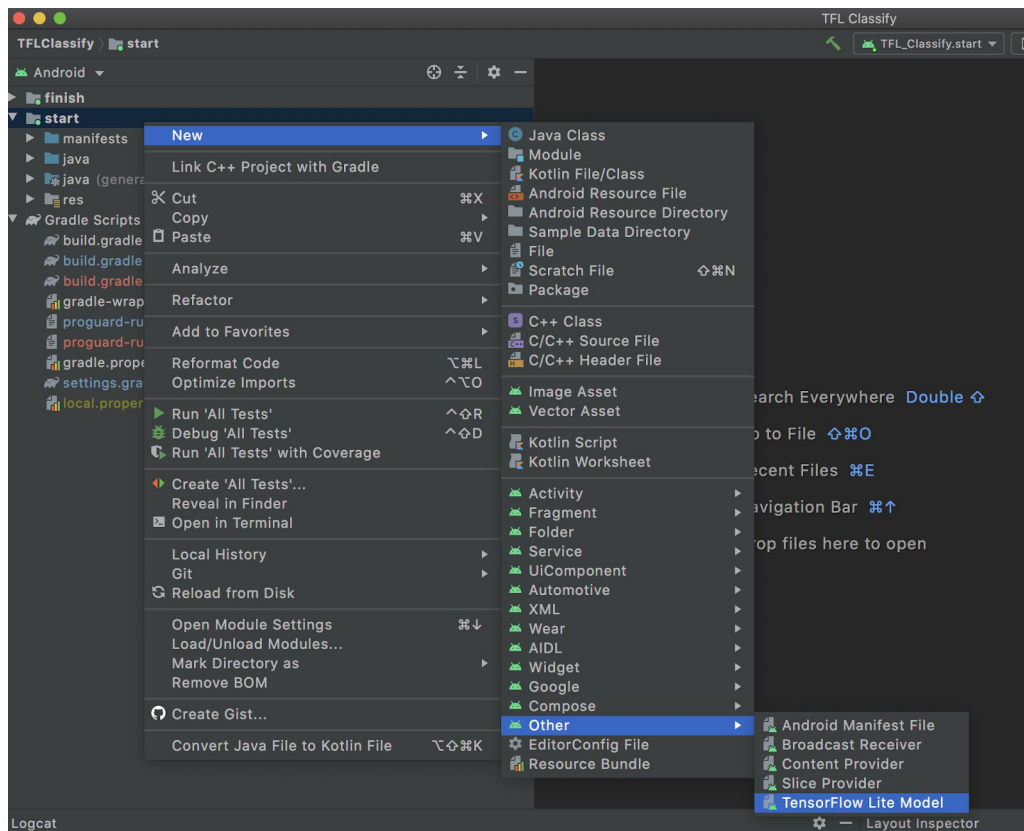


Vamos começar com algo que conhecemos



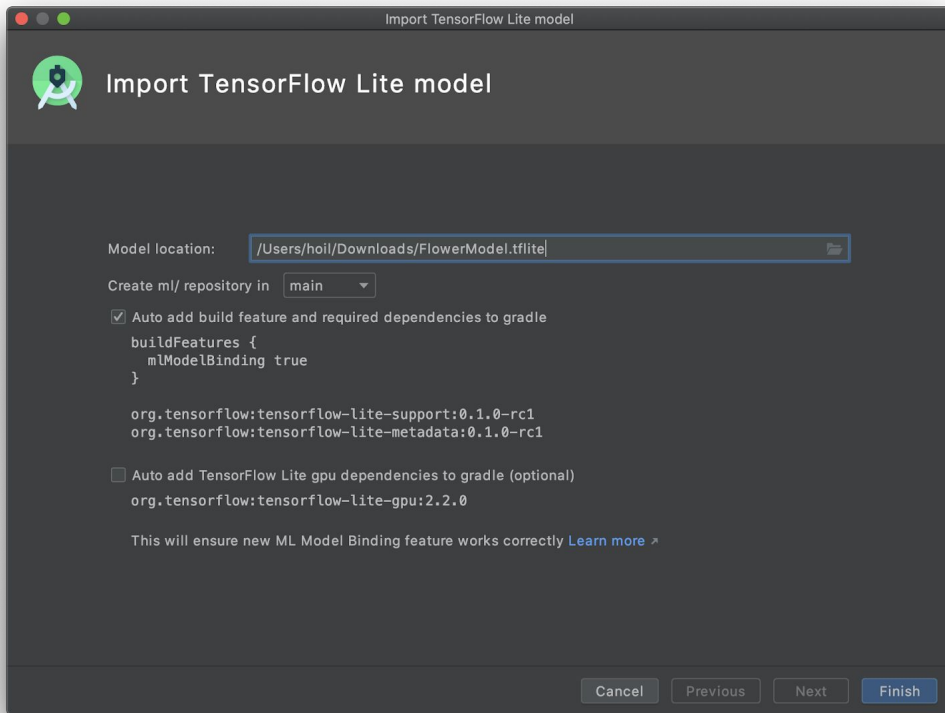


Adicionando um modelo





Adicionando um modelo





Adicionando um modelo

FlowerModel.tflite

Model

Name	efficientnet_lite0
Description	Identify the most prominent object in the image from a set of 5 categories.
Version	v1
Author	TensorFlow
License	Apache License. Version 2.0 http://www.apache.org/licenses/LICENSE-2.0 .

Tensors

Inputs

Name	Type	Description	Shape	Mean / S...	Min / ...
image	Image <float32>	Input image to be classified. The expected image is 224 x 224, with three channels (red, blue, and green) per pixel. Each value in the tensor is a single byte between 0 and 1.	[1, 224, 224, 3]	[0] / [255]	[0] / [1]

Outputs

Name	Type	Description	Shape	Mean / S...	Min / ...
probability	Feature <float32>	Probabilities of the 5 labels respectively.	[1, 5]	[0] / [1]	[0] / [1]

Sample Code

KotlinJava

```
val model = FlowerModel.newInstance(context)

// Creates inputs for reference.
val image = TensorImage.fromBitmap(bitmap)

// Runs model inference and gets result.
val outputs = model.process(image)
val probability = outputs.probabilityAsCategoryList

// Releases model resources if no longer used.
model.close()
```



```
val model = MobilenetV210224Quantized1Metadata1.newInstance(context)

// Creates inputs for reference.
val image = TensorImage.fromBitmap(bitmap)

// Runs model inference and gets result.
val outputs = model.process(image)
val probability = outputs.probabilityAsCategoryList

// Releases model resources if no longer used.
model.close()
```



Próximo passo

- Infelizmente o modelo escolhido não sabe o que é um Android :(
- Será que existe algum modelo já pronto?
- Mas se não tem, vou precisar criar um modelo do zero?



Transfer Learning

- Vamos especializar nosso modelo!
- Aprender outra linguagem é mais fácil quando já sabemos uma (Java -> Kotlin)
- Em muitos e muitos casos, não é necessários criar um modelo novo, apenas re-ensinar nosso modelo algumas classes novas.
- Isso vale pra Imagem, Texto, Audio e diversas outras categorias



TFLite Model Maker

Customize os modelos com seu próprio dataset,
Sem muito expertise em ML



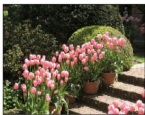
TFLite Model Maker é a lib de transfer learning para TFLite

```
# 1. Load data.  
data = ImageClassifierDataLoader.from_folder('flower_photos/')  
  
# 2. Customize the model.  
model = image_classifier.create(data) # Default model is EfficientNet-Lite0  
  
# 3. Evaluate the model.  
loss, accuracy = model.evaluate()  
  
# 4. Export to tflite.  
model.export('flower_classifier.tflite')
```



ML com seus dados

Use seus dados



Facil para trocar a arquitetura base

```
# ResNet 50.  
model = image_classifier.create(data, resnet_50_spec)  
  
# EfficinetNet-Lite4.  
model = image_classifier.create(data, efficientnet_lite4_spec)
```



Model Maker funciona com



Imagem

Classification
(MobileNet,
EfficientNet-Lite,
ResNet...)

Object detection*



Texto

Classification
(BERT
ALBERT-Lite*
MobileBERT*)

QA

https://www.tensorflow.org/lite/tutorials/model_maker_image_classification



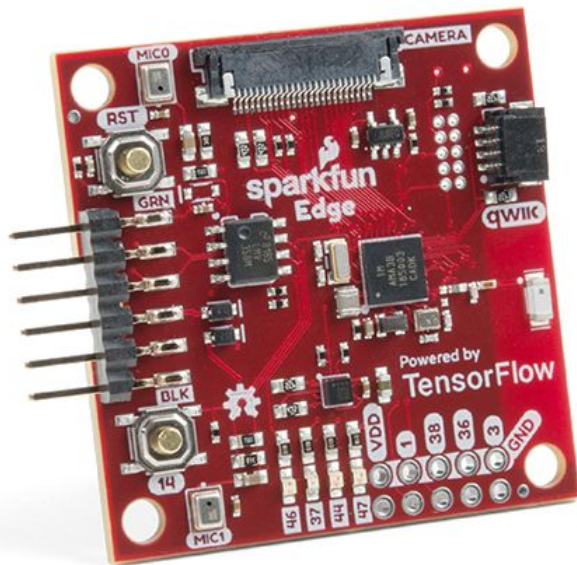
Otimizações

Fazendo modelos menores e mais rápidos



Considerações

- Processamento limitado
- Memória limitada
- Consumo de bateria
- Tamanho do App





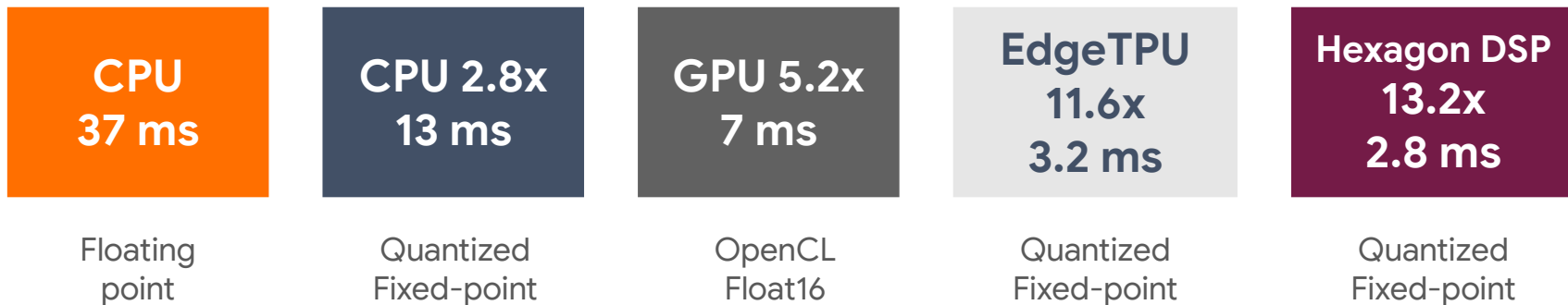
Métodos

1. Utilizar hardware específico
2. Utilizar arquiteturas otimizadas para mobile
3. Quantização (quantization)
4. Aplicar Pruning ("poda")





Hardware accelerator



Mobilenet V1-1.0-224

Pixel 4 - Single Threaded CPU, June 2020

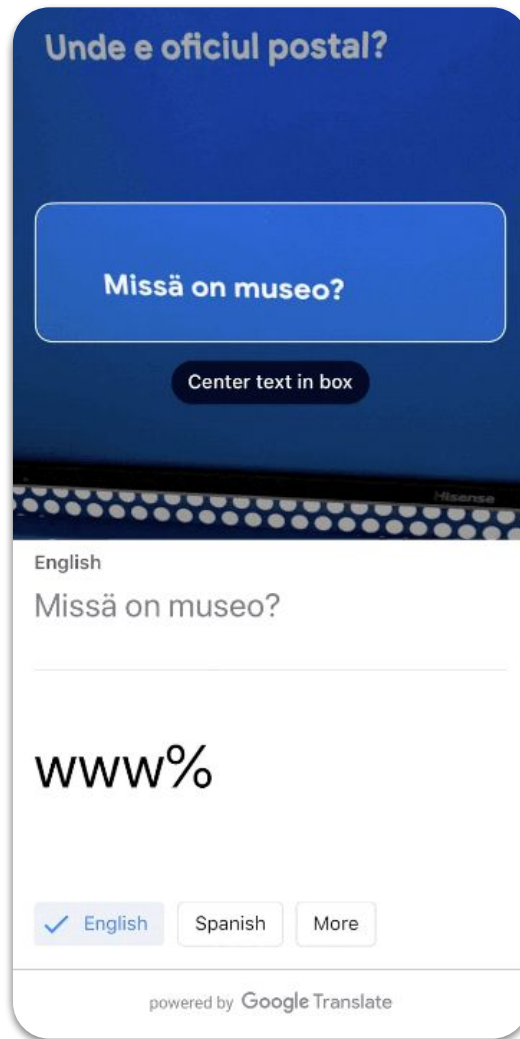


Outros recursos

—

ML Kit

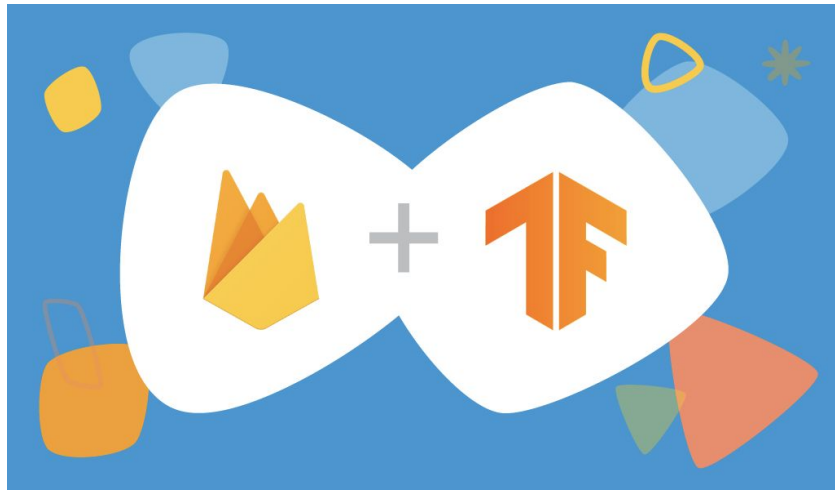
- API simples para casos de uso específicos
 - Image Labeling
 - Text Recognition
 - Object Detection and Tracking
 - Digital Ink
 - Language ID
 - Translation
 - Smart Reply
 - etc





TF Lite + Firebase

1. Atualizar seu modelo on-demand
2. Medir a latência da inferência em produção
3. Teste A/B de versões do seu modelo





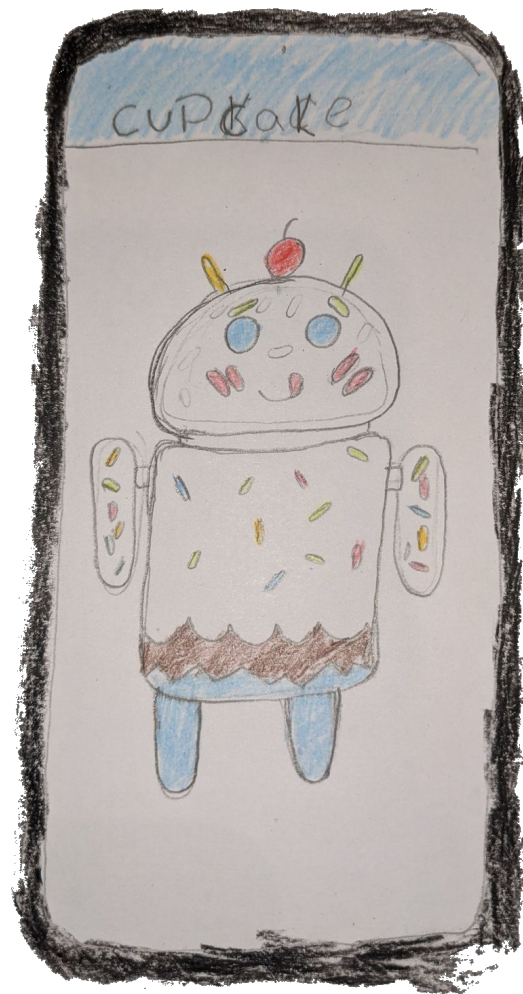
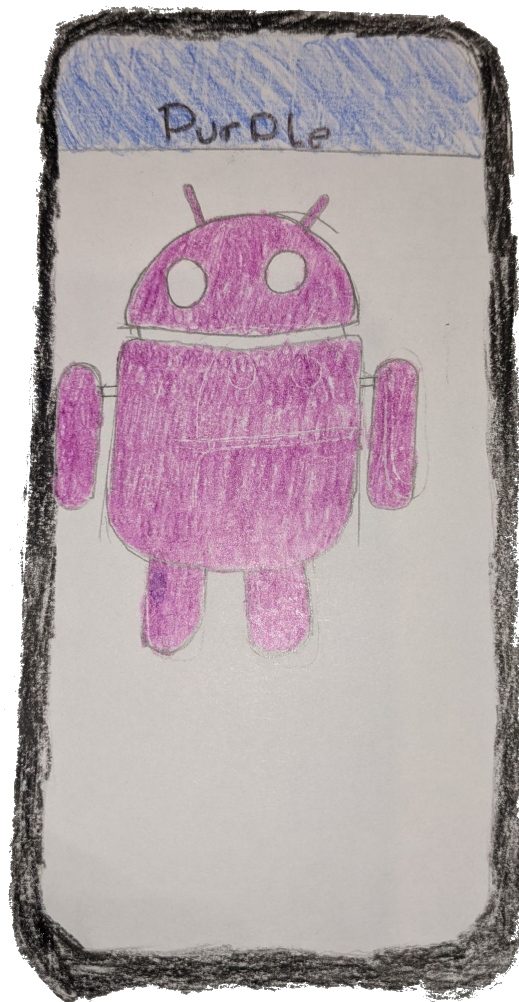
Resumo





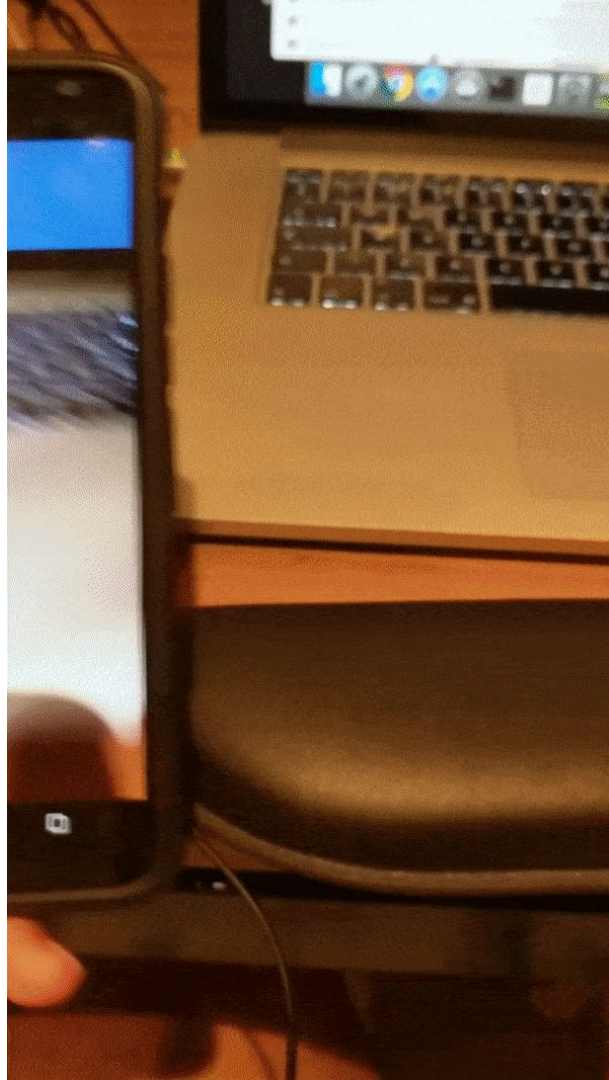
1. Por que on-device ML é importante?
2. Como usar TF Lite & Android Studio plugin
3. TF Hub é sua fonte para modelos
4. Customizando modelos com seus dados com Model Maker
5. Optimizando modelos para dispositivos móveis

Meu Sonho:



by n7

Realidade:





Muito Obrigado

Pra saber mais

<https://www.tensorflow.org/lite>



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Achando os Androids

