

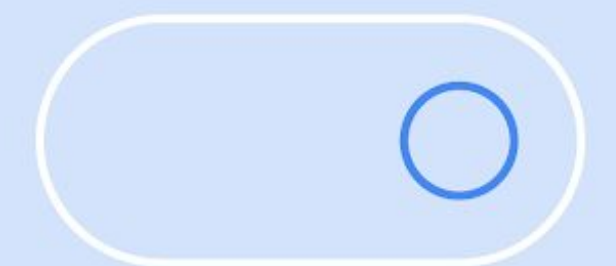
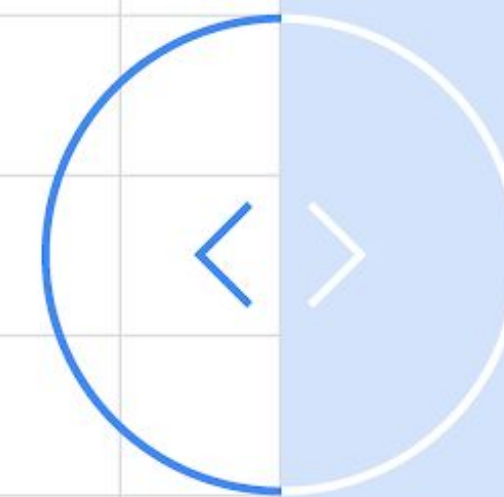


TensorFlow Hub: Models, models, and models



Sayak Paul
PyImageSearch
[@RisingSayak](#)

Google Developers



Ideal audience

- ML Developers that have worked with TensorFlow and Keras

Agenda

- What is TensorFlow Hub?
- Why it might be useful?
- A closer look at tfhub.dev
- Ease of using TensorFlow Hub
- QA

What is TensorFlow Hub?



A collection of SoTA* pre-trained models published by different teams as well community contributors.

tfhub.dev

*State of The Art

Why it might be useful?



Why it might be useful?

- Making SoTA machine learning models more and more accessible.

Why it might be useful?

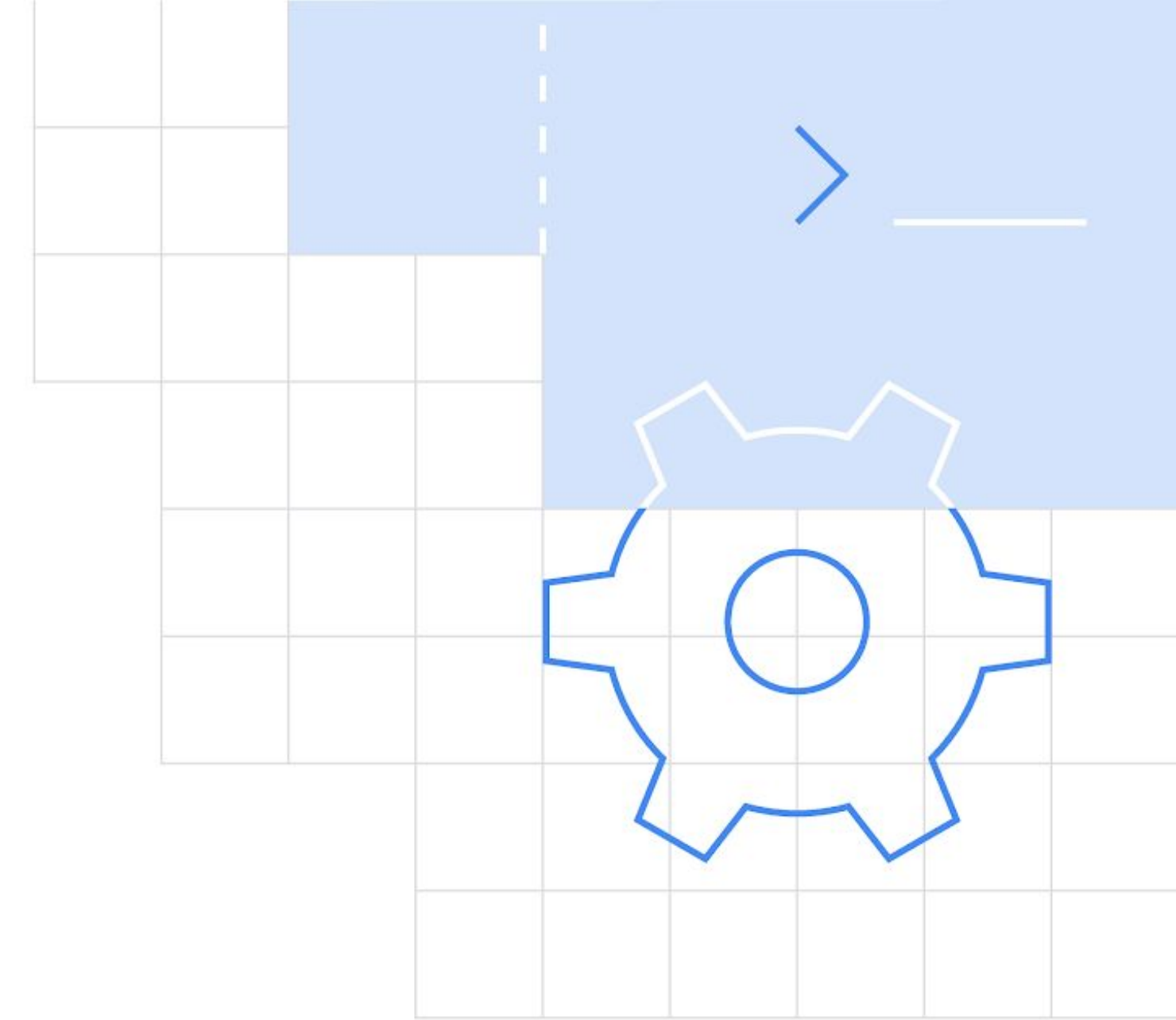
- Making SoTA machine learning models more and more accessible.
- Making it easier for people to take advantage of SoTA models without expertise.

Why it might be useful?

- Making SoTA machine learning models more and more accessible.
- Making it easier for people to take advantage of SoTA models without expertise.
- Transfer learning for different domains including image, text.

Why it might be useful?

- Making SoTA machine learning models more and more accessible.
- Making it easier for people to take advantage of SoTA models without expertise.
- Transfer learning for different domains including image, text.
- Providing a platform for the developers to give back :)



tfhub.dev 🙌



☰ Text embedding

nnlm-en-dim128-with-normalization

Published by: **Google** Updated: 10/24/2019

Token based text embedding trained on English Google News 200B corpus.

NNLM | **Google News**

 Image classification .JS

imagenet/mobilenet_v1_025_128...

Published by: **Google** Updated: 10/24/2019

Imagenet (ILSVRC-2012-CLS) classification with
MobileNet V1 (depth multiplier 0.25).

MobileNet V1 ImageNet (ILSVRC-201...

☰ Text embedding

universal-sentence-encoder-xling/en-fr

Published by: **Google** Updated: 10/24/2019

English and French language-agnostic text encoder.

Transformer

Image pose detection .JS

posenet/mobilenet/float/050

Published by: TensorFlow Updated: 10/24/2019

PoseNet model for pose estimation.

 Image feature vector ..JS

imagenet/mobilenet_v2_100_160...


Published by: **Google** Updated: 10/24/2019

Feature vectors of images with MobileNet V2 (depth multiplier 1.00) trained on ImageNet (ILSVRC-2012-

MobileNet V2 | **ImageNet (ILSVRC-201...**

 Image generator

biggan-deep-512
Published by: DeepMind Updated: 10/24/2019

 **Collection**

universal-sentence-encoder

Published by: **Google** Updated: 10/24/2019

Collection of universal sentence encoders trained on variety of data.

DAN,Transformer


 Image segmentation .JS

bodypix_050

Published by: **TensorFlow** Updated: 10/24/2019

A person segmentation model.

The image shows the TensorFlow logo, which consists of the word "tensorflow" in a stylized, lowercase font. Above the logo is the word "Publisher" next to a small icon of a graduation cap. To the right of the logo is a circular icon containing an orange upward-pointing arrow.

 Image feature vector

vae

Published by: **Vtab** Updated: 10/24/2019

Visual representation obtained by training a VAE on ImageNet.

Other ImageNet (ILSVRC-201...

☰ Text embedding

nnlm-ja-dim128-with-normalization

Published by: **Google** Updated: 10/24/2019


Token based text embedding trained on Japanese Google News 6B corpus.

NNLM | **Google News**

 Image feature vector

rotation

Published by: **Vtab** Updated: 10/24/2019

 Image pose detection .JS

posenet/mobilenet/quantized/1/100

Published by: **TensorFlow** Updated: 10/24/2019

PoseNet model for pose estimation.

Other

llr-pretrain-adv/latents

Published by: **DeepMind** Updated: 10/24/2019

LLR-pretrained ResNet-152 on ImageNet then adversarially trained for the unrestricted adversarial

Other | Other


 Image classification

[imagenet/pnasnet_large/classification](#)

Published by: **Google** Updated: 10/24/2019

Imagenet (ILSVRC-2012-CLS) classification with
PNASNet-5 (large).

PNASNet-5 (large) | **ImageNet (ILSVRC-201...**

 Image generator

[compare_gan...](#)

Published by: **Google** Updated: 10/24/2019

ResNet19 trained on CelebA HQ (128x128) (FID: 35.85).

Other | **CelebA HQ**

 Image classification .JS

imagenet/mobilenet_v2_100_224...

Published by: **Google** Updated: 10/24/2019

Imagenet (ILSVRC-2012-CLS) classification with MobileNet V2 (depth multiplier 1.00).

MobileNet V2 | ImageNet (ILSVRC-201...

 Image feature vector

imagenet/mobilenet_v1_100_128...
Published by: **Google** Updated: 10/24/2019

 Image classification

imagenet/mobilenet_v1_025_224...

Published by: **Google** Updated: 10/24/2019

Imagenet (ILSVRC-2012-CLS) classification with
MobileNet V1 (depth multiplier 0.25).

MobileNet V1 | **ImageNet (ILSVRC-201...**

 Image generator

compare_gan/s3gan_20_128x128

Published by: **Google** Updated: 10/24/2019

S3GAN trainend on ImageNet with 20% labels.

Other | ImageNet (ILSVRC-201...

 Image feature vector .JS

[imagenet/mobilenet_v1_025_192...](#)

Published by: **Google** Updated: 10/24/2019

Feature vectors of images with MobileNet V1 (depth multiplier 0.25) trained on ImageNet (ILSVRC-2012-

MobileNet V1 | **ImageNet (ILSVRC-201...**


Text embedding

`bert_en_cased_L-24_H-1024_A-16`

Published by: **TensorFlow** Updated: 10/24/2019

Bidirectional Encoder Representations from Transformers (BERT).

Transformer | Wikipedia and BooksC...

 Image classification

unsupervised-adversarial-training...

Published by: **DeepMind** Updated: 10/24/2019

UAT++ adversarially trained WRN-106 (wide residual network) model using 80m@200K unlabeled data and

Other | **CIFAR-10**

 Image classification TFLite
mobilenet_v1_0.25_224
Published by: TensorFlow Updated: 10/24/2019


 **Image classification** .JS

imagenet/mobilenet_v2_075_224...

Published by: **Google** Updated: 10/24/2019

Imagenet (ILSVRC-2012-CLS) classification with MobileNet V2 (depth multiplier 0.75).

MobileNet V2 | **ImageNet (ILSVRC-201...**

 Image pose detection .JS

posenet/mobilenet/quantized/2/050

Published by: **TensorFlow** Updated: 10/24/2019

PoseNet model for pose estimation.

 **Image generator**
biggan-deep-256
Published by: **DeepMind** Updated: 10/24/2019
BigGAN-deep image generator trained on 256x256
ImageNet.

☰ Text embedding

tf2-preview/nnlm-de-dim50-with-...

Published by: **Google** Updated: 10/24/2019

Token based text embedding trained on German Google News 30B corpus.

NNLM | **Google News**

 Image feature vector

imagenet/resnet_v2_152/feature_vector

Published by: **Google** Updated: 10/24/2019

Feature vectors of images with ResNet V2 152 trained on ImageNet (ILSVRC-2012-CLS).

ResNet V2 152 | ImageNet (ILSVRC-201...

 Image classification TFLite
mobilenet_v1_0.75_192
Published by: TensorFlow Updated: 10/24/2019

Image classification

(Off-the-shelf inference)

Prediction: Military Uniform



[Source](#)


```
# Specify the URL
```

```
classifier_url = \
```

```
    "https://tfhub.dev/google/tf2-preview/mobilenet_v2/classification/2"
```

```
# Prepare HUB module
```

```
classifier = tf.keras.Sequential([
```

```
    hub.KerasLayer(classifier_url, input_shape=(224, 224, 3)
```

```
])
```

```
# Specify the URL
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```
classifier_url = \n    "https://tfhub.dev/google/tf2-preview/mobilenet_v2/classification/2"
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# Prepare HUB module
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```
classifier = tf.keras.Sequential([\n    hub.KerasLayer(classifier_url, input_shape=(224, 224, 3)\n])
```

```
# Pass the preprocessed image for inference
```

```
result = classifier.predict(preprocessed_image)
```

Image classification

(Transfer learning)



[Source](#)

```
# URL for the feature extractor network
```

```
feature_extractor_url = \
```

```
    "https://tfhub.dev/google/tf2-preview/mobilenet_v2/feature_vector/2"
```

```
# URL for the feature extractor network
```

```
feature_extractor_url = \
    "https://tfhub.dev/google/tf2-preview/mobilenet_v2/feature_vector/2"
```

```
# Convert to a layer
```

```
feature_extractor_layer = hub.KerasLayer(feature_extractor_url,
    input_shape=(224, 224, 3))
```



```
# URL for the feature extractor network
```

```
feature_extractor_url = \
    "https://tfhub.dev/google/tf2-preview/mobilenet_v2/feature_vector/2"
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```
# Convert to a layer
```

```
feature_extractor_layer = hub.KerasLayer(feature_extractor_url,
    input_shape=(224, 224, 3))
```

```
# Define, compile, and train a custom classification model
```

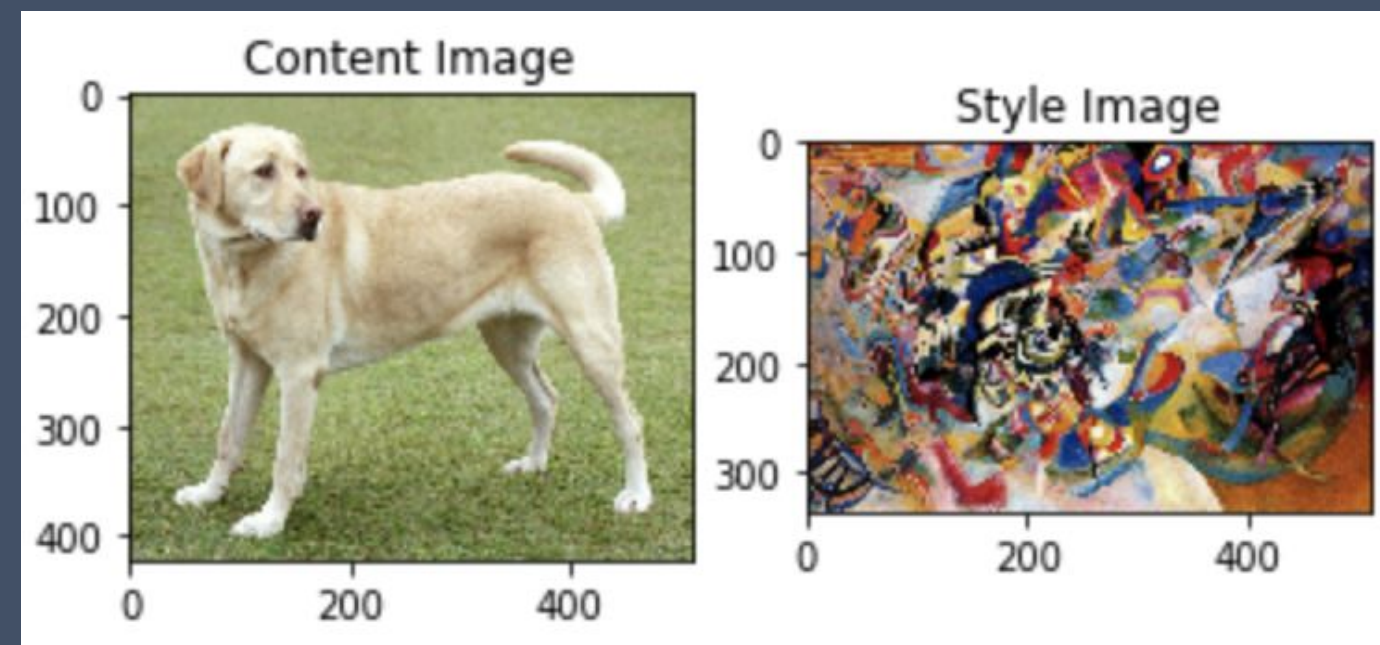
```
model = tf.keras.Sequential([
    feature_extractor_layer, ← trainable = True/False
    tf.keras.layers.Dense(len(CLASSES))
])
model.compile(...)
model.fit(...)
```

tensorflow.org/tutorials/images/transfer_learning_with_hub

Style transfer

(Off-the-shelf inference)





```
hub_handle = 'https://tfhub.dev/google/magenta/arbitrary-image-stylization-v1-256/1'  
hub_module = hub.load(hub_handle)  
stylized_image = hub_module(tf.constant(content_image), tf.constant(style_image))[0]  
tensor_to_image(stylized_image)
```

tensorflow.org/tutorials/generative/style_transfer

Generating novel faces

(Off-the-shelf inference)



```
# Load the ProGAN module and generate faces like that!
```

```
progan = hub.load("https://tfhub.dev/google/progan-128/1").signatures['default']
```

```
vectors = tf.random.normal([20, 512])
```

```
images = progan(vectors)['default']
```



```
# Load the ProGAN module and generate faces like that!
```

```
progan = hub.load("https://tfhub.dev/google/progan-128/1").signatures['default']
```

```
vectors = tf.random.normal([20, 512])
```

```
images = progan(vectors)['default']
```

```
# Visualize
```

```
idx = np.random.choice(len(images.numpy()))
```

```
plt.imshow(images.numpy()[idx])
```

```
plt.show()
```

```
# Load the ProGAN module and generate faces like that!
```

```
progan = hub.load("https://tfhub.dev/google/progan-128/1").signatures['default']
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```
vectors = tf.random.normal([20, 512])
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```
plt.imshow(images.numpy()[idx])
```

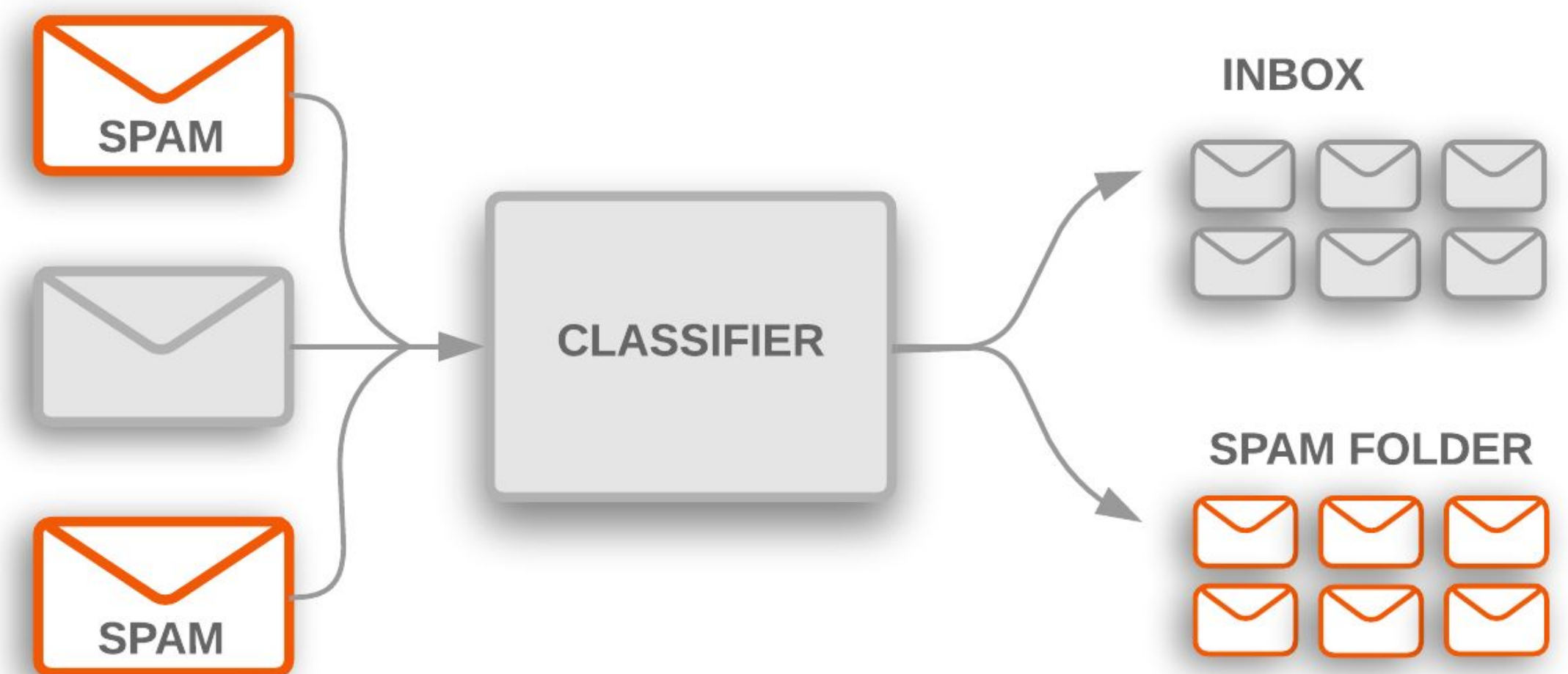
```
plt.show()
```



<https://tfhub.dev/google/progan-128/1>

Text Classification

(Transfer learning)



Source

```
# Specify the URL and prepare HUB module
```

```
embedding = "https://tfhub.dev/google/tf2-preview/gnews-swivel-20dim/1"
```

```
hub_layer = hub.KerasLayer(  
    embedding, input_shape=[], dtype=tf.string, trainable=True  
)
```

```
# Specify the URL and prepare HUB module
```

```
embedding = "https://tfhub.dev/google/tf2-preview/gnews-swivel-20dim/1"
```

```
hub_layer = hub.KerasLayer(  
    embedding, input_shape=[], dtype=tf.string, trainable=True  
)
```

```
# Define, compile, and train the model
```

```
model = keras.Sequential([  
    hub_layer,  
    tf.keras.layers.Dense(16, activation="relu"),  
    tf.keras.layers.Dense(1, activation="sigmoid")  
)
```

```
model.compile(...)
```

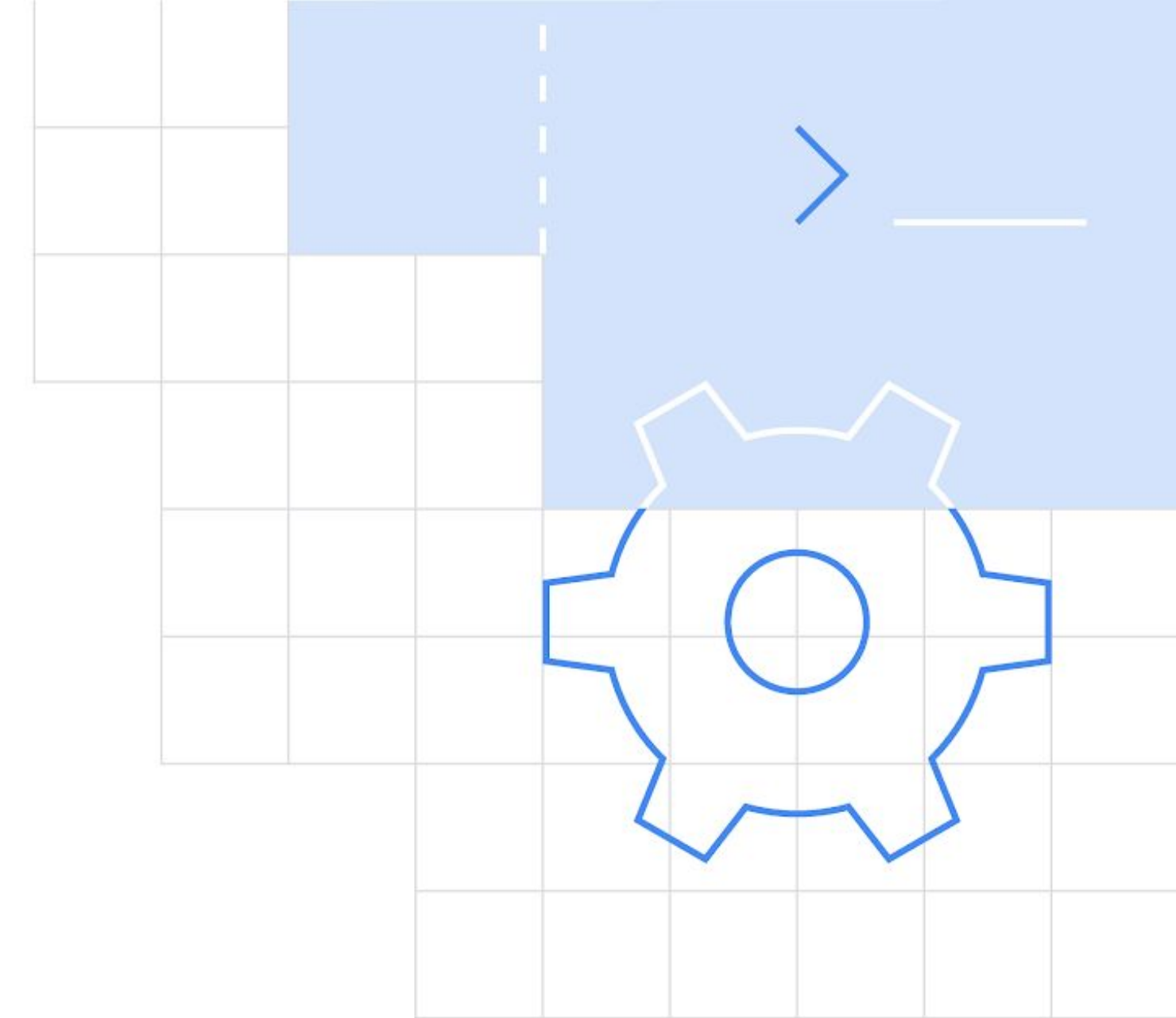
```
model.fit(...)
```


tfhub for other tasks

- [Enhanced Super Resolution GANs.](#)
- [Object detection.](#)
- [Question-answering.](#)
- and more (explore on [tfhub.dev](#)).

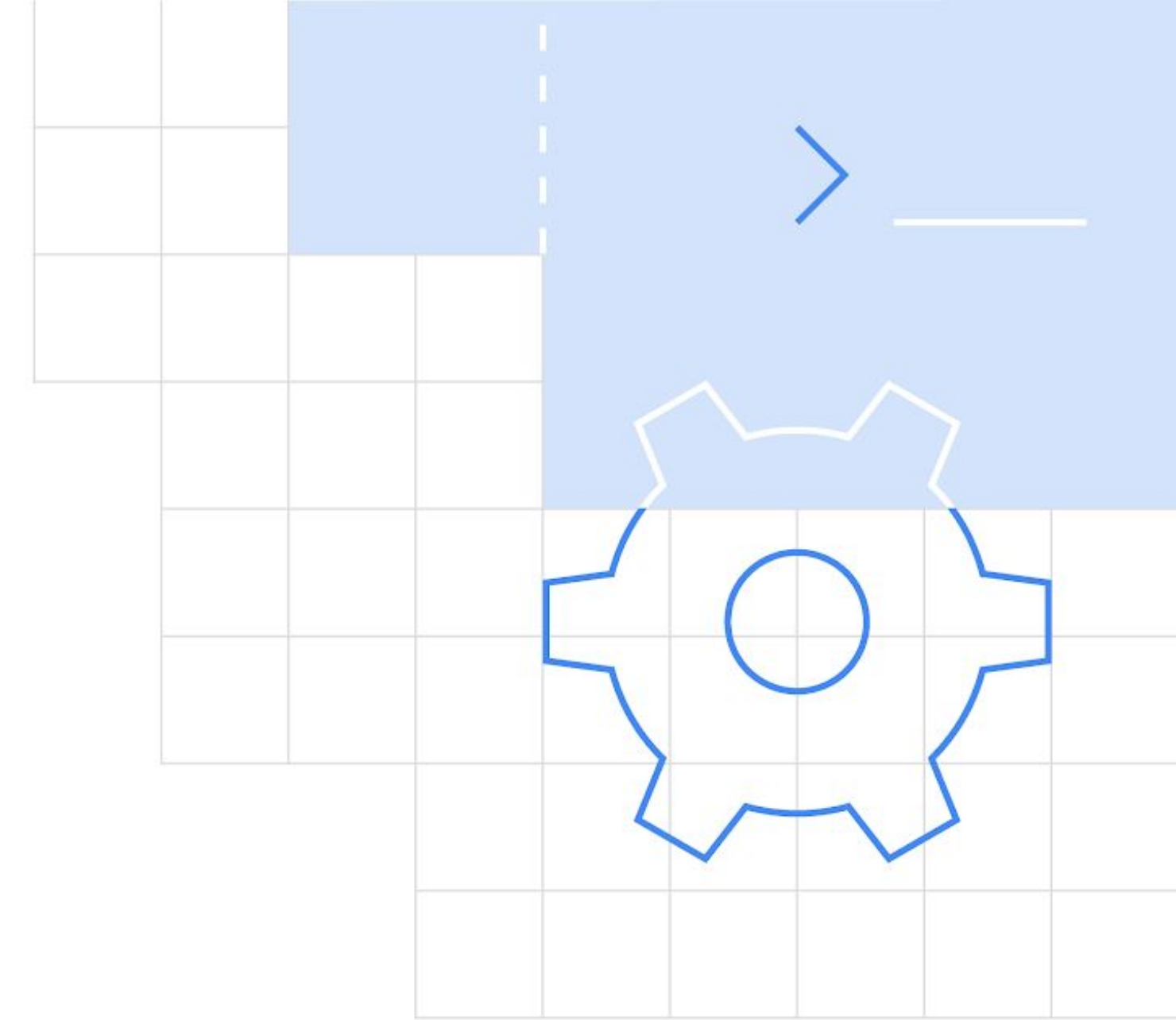
Publish your own models -

<https://bit.ly/tfhub-publish>



Slides available here -

<https://bit.ly/tf-hub>



Thank You!



Sayak Paul
PyImageSearch
[@RisingSayak](#)

