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- ☐ Show data download links
- ☒ Ignore outliers in chart scaling

Tooltip sorting method: default ▾

Smoothing



Horizontal Axis

STEP

RELATIVE

WALL

Runs

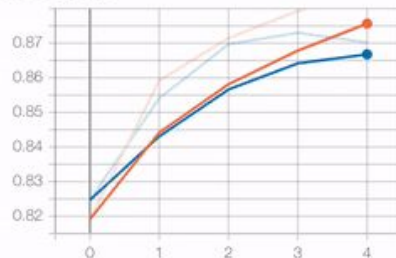
Write a regex to filter runs

- ☒ 20190225-183554/train
- ☒ 20190225-183554/validation
- ☒ 20190225-183652/data

Filter tags (regular expressions supported)

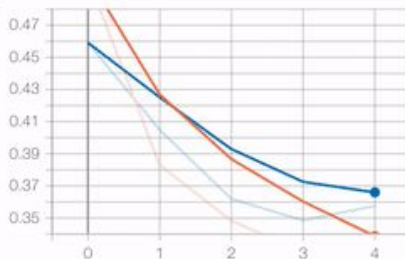
epoch_accuracy

epoch_accuracy



epoch_loss

epoch_loss



TensorBoard.dev

← → ↻ 🔒 tensorboard.dev

☆ 🌐 📄 📁 📂 📅 📆 📇 📈 📉 📊 📋 📌 📍 📎 📏 📐 📑 📒 📓 📔 📕 📖 📗 📙 📚 📛 📜 📝 📞 📟 📠 📡 📢 📣 📤 📥 📦 📧 📨 📩 📪 📫 📬 📭 📮 📯 📰 📱 📲 📳 📴 📵 📶 📷 📸 📹 📺 📻 📼 📽 📾 📿 📰 📱 📲 📳 📴 📵 📶 📷 📸 📹 📺 📻 📼 📽 📾 📿

TensorBoard.dev

TensorBoard TensorFlow

TensorBoard.dev

PREVIEW

Easily host, track, and share your ML experiments for free.

A managed TensorBoard experience that lets you upload and share your ML experiment results with anyone.

Get started

Example Colab

TensorBoard.dev

SCALARS

☐ Show data download links

☒ Ignore outliers in chart scaling

Tool tip sorting method: default

Smoothing

0.8

Horizontal Axis

STEP REL. ACTIVE WALL

Filter

Write a regex to filter runs

☒ Run1_units_16_dropout_0.1

☐ Run1_units_16_dropout_0.2

☒ Run2_units_32_dropout_0.1

☐ Run2_units_32_dropout_0.2

☒ Run3_units_64_dropout_0.1

☐ Run3_units_64_dropout_0.2

☒ Run4_units_128_dropout_0.1

☐ Run4_units_128_dropout_0.2

epoch_acc

epoch_acc

epoch_loss

epoch_loss

Why TensorBoard.dev?

Zero setup, free storage
Get started easily with no deployment. Free storage up to 10 million data points.

Familiar TensorBoard experience
The TensorFlow visualization toolkit you know and love.

Public, easy sharing
Instantly share your TensorBoard ML experiment results with anyone, for publications, troubleshooting, and team collaboration.

What is TensorBoard?

```
model = create_model()

model.compile(optimizer='adam',
              loss='sparse_categorical_crossentropy',
              metrics=['accuracy'])

log_dir="logs/fit/" + datetime.datetime.now().strftime("%Y%m%d-%H%M%S")

tensorboard_callback =
    tf.keras.callbacks.TensorBoard(log_dir=log_dir, histogram_freq=1)

model.fit(x=x_train,
          y=y_train,
          epochs=5,
          validation_data=(x_test, y_test),
          callbacks=[tensorboard_callback])
```

```
model = create_model()

model.compile(optimizer='adam',
              loss='sparse_categorical_crossentropy',
              metrics=['accuracy'])

log_dir="logs/fit/" + datetime.datetime.now().strftime("%Y%m%d-%H%M%S")

tensorboard_callback =
    tf.keras.callbacks.TensorBoard(log_dir=log_dir, histogram_freq=1)

model.fit(x=x_train,
          y=y_train,
          epochs=5,
          validation_data=(x_test, y_test),
          callbacks=[tensorboard_callback])
```

```
model = create_model()

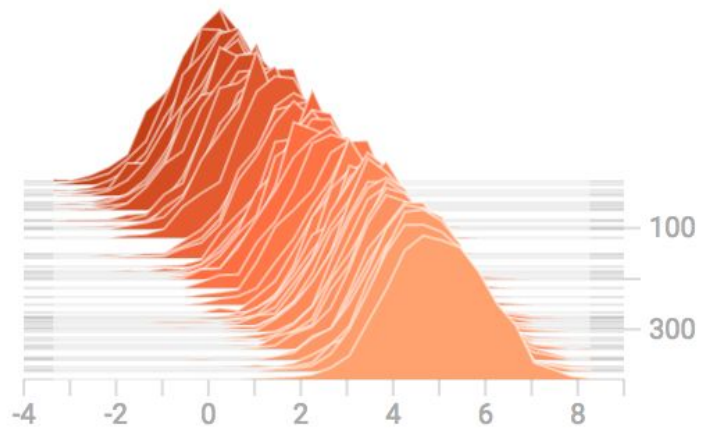
model.compile(optimizer='adam',
              loss='sparse_categorical_crossentropy',
              metrics=['accuracy'])

log_dir="logs/fit/" + datetime.datetime.now().strftime("%Y%m%d-%H%M%S")

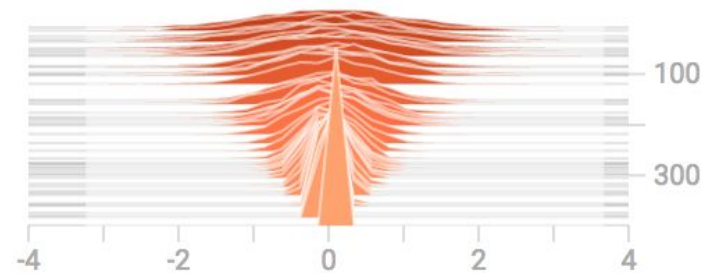
tensorboard_callback =
    tf.keras.callbacks.TensorBoard(log_dir=log_dir, histogram_freq=1)

model.fit(x=x_train,
          y=y_train,
          epochs=5,
          validation_data=(x_test, y_test),
          callbacks=[tensorboard_callback])
```

normal/moving_mean



normal/shrinking_variance



```
model = create_model()

model.compile(optimizer='adam',
              loss='sparse_categorical_crossentropy',
              metrics=['accuracy'])

log_dir="logs/fit/" + datetime.datetime.now().strftime("%Y%m%d-%H%M%S")

tensorboard_callback =
    tf.keras.callbacks.TensorBoard(log_dir=log_dir, histogram_freq=1)

model.fit(x=x_train,
          y=y_train,
          epochs=5,
          validation_data=(x_test, y_test),
          callbacks=[tensorboard_callback])
```



```
model = create_model()

model.compile(optimizer='adam',
              loss='sparse_categorical_crossentropy',
              metrics=[ 'accuracy' ])

log_dir="logs/fit/" + datetime.datetime.now().strftime("%Y%m%d-%H%M%S")

tensorboard_callback =
    tf.keras.callbacks.TensorBoard(log_dir=log_dir, histogram_freq=1)

model.fit(x=x_train,
          y=y_train,
          epochs=5,
          validation_data=(x_test, y_test),
          callbacks=[tensorboard_callback])
```



```
!tensorboard dev upload --logdir ./logs
```

***** TensorBoard Uploader *****

This will upload your TensorBoard logs to <https://tensorboard.dev/> from the following directory:

./logs

This TensorBoard will be visible to everyone. Do not upload sensitive data.

Your use of this service is subject to Google's Terms of Service <<https://policies.google.com/terms>> and Privacy Policy <<https://policies.google.com/privacy>>, and TensorBoard.dev's Terms of Service <<https://tensorboard.dev/policy/terms/>>.

This notice will not be shown again while you are logged into the uploader. To log out, run `tensorboard dev auth revoke`.

Continue? (yes/NO)

Please visit this URL to authorize this application: https://accounts.google.com/o/oauth2/auth?response_type=code&client

Enter the authorization code:



Sign in

Please copy this code, switch to your application and paste it there:

4/tQGjxD0nqWvvj6-L5hNGA-
L8zorPiNRdYFUfVFYHDwa-jaSVQVNRGYE



Upload started and will continue reading any new data as it's added to the logdir. To stop uploading, press Ctrl-C.

View your TensorBoard live at: <https://tensorboard.dev/experiment/so8bu67kRLm3CMa0LKM0Xg>

- ☐ Show data download links
- ☒ Ignore outliers in chart scaling

Tooltip sorting method: **default**

Smoothing



0

Horizontal Axis

STEP

RELATIVE

WALL

Runs

Write a regex to filter runs

- ☒ ☐ fit/20191114-214911/train
- ☒ ☐ fit/20191114-214911/validation

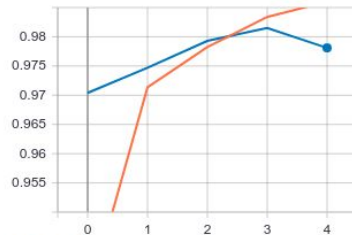
TOGGLE ALL RUNS

experiment so8bu67kRLm3CMa0LKMOXg

Filter tags (regular expressions supported)

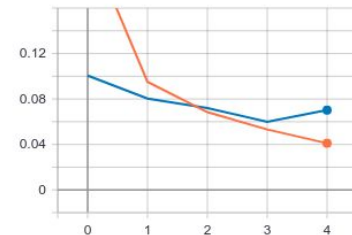
epoch_accuracy

epoch_accuracy



epoch_loss

epoch_loss




```
mnist = tf.keras.datasets.mnist
```

```
(x_train, y_train), (x_test, y_test) = mnist.load_data()  
x_train, x_test = x_train / 255.0, x_test / 255.0
```

```
def create_model():  
    return tf.keras.models.Sequential([  
        tf.keras.layers.Flatten(input_shape=(28, 28)),  
        tf.keras.layers.Dense(512, activation='relu'),  
        tf.keras.layers.Dropout(0.2),  
        tf.keras.layers.Dense(10, activation='softmax')  
    ])
```

```
mnist = tf.keras.datasets.mnist

(x_train, y_train), (x_test, y_test) = mnist.load_data()
x_train, x_test = x_train / 255.0, x_test / 255.0

def create_model():
    return tf.keras.models.Sequential([
        tf.keras.layers.Flatten(input_shape=(28, 28)),
        tf.keras.layers.Dense(512, activation='relu'),
        tf.keras.layers.Dropout(0.2),
        tf.keras.layers.Dense(10, activation='softmax')
    ])
```

```
mnist = tf.keras.datasets.mnist
```

```
(x_train, y_train), (x_test, y_test) = mnist.load_data()  
x_train, x_test = x_train / 255.0, x_test / 255.0
```

```
def create_model():  
    return tf.keras.models.Sequential([  
        tf.keras.layers.Flatten(input_shape=(28, 28)),  
        tf.keras.layers.Dense(512, activation='relu'),  
        tf.keras.layers.Dropout(0.2),  
        tf.keras.layers.Dense(10, activation='softmax')  
    ])
```

```
log_dir="logs/fit/" + datetime.datetime.now().strftime("%Y%m%d-%H%M%S")

tensorboard_callback =
    tf.keras.callbacks.TensorBoard(log_dir=log_dir, histogram_freq=1)

model.fit(x=x_train,
          y=y_train,
          epochs=5,
          validation_data=(x_test, y_test),
          callbacks=[tensorboard_callback])
```

```
log_dir="logs/fit/" + datetime.datetime.now().strftime("%Y%m%d-%H%M%S")
```

```
tensorboard_callback =  
    tf.keras.callbacks.TensorBoard(log_dir=log_dir, histogram_freq=1)
```

```
model.fit(x=x_train,  
          y=y_train,  
          epochs=5,  
          validation_data=(x_test, y_test),  
          callbacks=[tensorboard_callback])
```

```
log_dir="logs/fit/" + datetime.datetime.now().strftime("%Y%m%d-%H%M%S")
```

```
tensorboard_callback =  
    tf.keras.callbacks.TensorBoard(log_dir=log_dir, histogram_freq=1)
```

```
model.fit(x=x_train,  
          y=y_train,  
          epochs=5,  
          validation_data=(x_test, y_test),  
          callbacks=[tensorboard_callback])
```

```
%tensorboard --logdir logs/fit
```

- ☐ Show data download links
- ☒ Ignore outliers in chart scaling

Tooltip sorting method: **default**

Smoothing



0

Horizontal Axis

STEP

RELATIVE

WALL

Runs

Write a regex to filter runs



20191114-221042/train



20191114-221042/validation

TOGGLE ALL RUNS

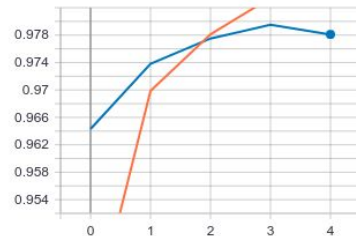
logs/fit

🔍 Filter tags (regular expressions supported)

epoch_accuracy

1

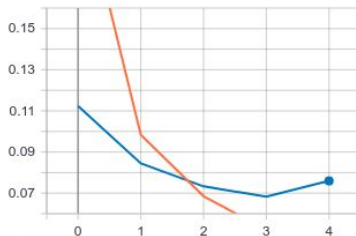
epoch_accuracy



epoch_loss

1

epoch_loss



%tensorboard --logdir logs/fit



TensorBoard

SCALARS

GRAPHS

DISTRIBUTIONS

HISTOGRAMS

PROFILE

INACTIVE



Search nodes. Regexes supported.



Fit to Screen



Download PNG

Run
(1)

20191114-221042/train

Tag (3)

Default

Upload

Choose File



Graph



Conceptual Graph



Profile



Trace inputs



Show health pills

Color



Structure



Device



Close legend.

Graph

(* = expandable)



Namespace* 2



OpNode 2



Unconnected series* 2



Connected series* 2



Constant 2



Summary 2



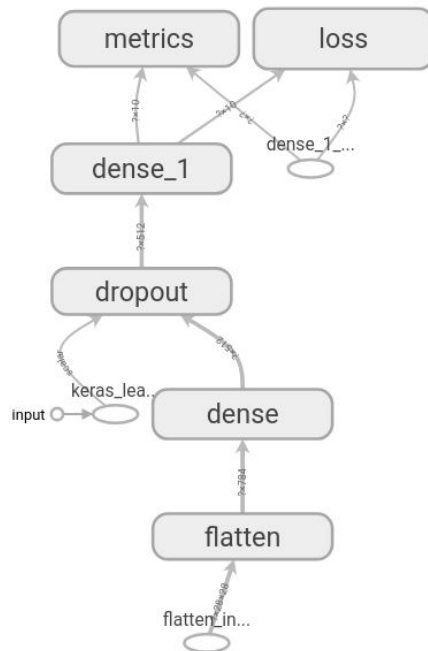
Dataflow edge 2



Control dependency edge 2



Reference edge 2



dropout_cond_fal...

dropout_cond_tru...

%tensorboard --logdir logs/fit



TensorBoard

SCALARS

GRAPHS

DISTRIBUTIONS

HISTOGRAMS

PROFILE

INACTIVE



Histogram mode

OVERLAY

OFFSET

Offset time axis

STEP

RELATIVE

WALL

Runs

Write a regex to filter runs

☒ 20191114-221042/train

☒ 20191114-221042/validation

TOGGLE ALL RUNS

logs/fit

Filter tags (regular expressions supported)

dense_1

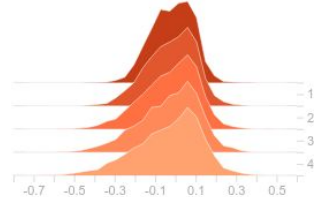
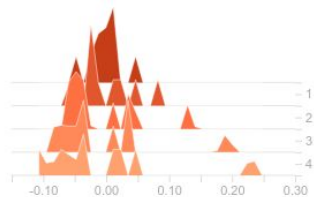
2

dense_1/bias_0

20191114-221042/train

dense_1/kernel_0

20191114-221042/train



dense

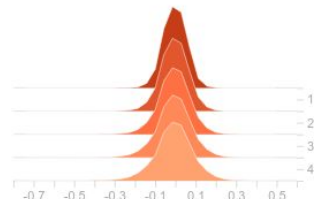
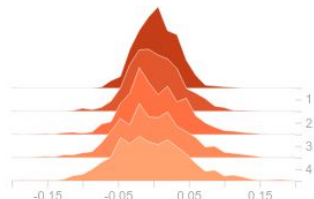
2

dense/bias_0

20191114-221042/train

dense/kernel_0

20191114-221042/train



```
fashion_mnist = keras.datasets.fashion_mnist
```

```
(train_images, train_labels), (test_images, test_labels) =  
    fashion_mnist.load_data()
```

```
img = np.reshape(train_images[0], (-1, 28, 28, 1))
```

```
fashion_mnist = keras.datasets.fashion_mnist
```

```
(train_images, train_labels), (test_images, test_labels) =  
    fashion_mnist.load_data()
```

```
img = np.reshape(train_images[0], (-1, 28, 28, 1))
```

```
# Sets up a timestamped log directory.
logdir = "logs/train_data/" +
        datetime.now().strftime("%Y%m%d-%H%M%S")

# Creates a file writer for the log directory.
file_writer = tf.summary.create_file_writer(logdir)

# Using the file writer, log the reshaped image.
with file_writer.as_default():
    tf.summary.image("Training data", img, step=0)
```

```
# Sets up a timestamped log directory.  
logdir = "logs/train_data/" +  
         datetime.now().strftime("%Y%m%d-%H%M%S")  
  
# Creates a file writer for the log directory.  
file_writer = tf.summary.create_file_writer(logdir)  
  
# Using the file writer, log the reshaped image.  
with file_writer.as_default():  
    tf.summary.image("Training data", img, step=0)
```

```
# Sets up a timestamped log directory.
logdir = "logs/train_data/" +
        datetime.now().strftime("%Y%m%d-%H%M%S")

# Creates a file writer for the log directory.
file_writer = tf.summary.create_file_writer(logdir)

# Using the file writer, log the reshaped image.
with file_writer.as_default():
    tf.summary.image("Training data", img, step=0)
```

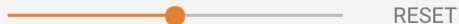
```
# Sets up a timestamped log directory.
logdir = "logs/train_data/" +
        datetime.now().strftime("%Y%m%d-%H%M%S")

# Creates a file writer for the log directory.
file_writer = tf.summary.create_file_writer(logdir)

# Using the file writer, log the reshaped image.
with file_writer.as_default():
    tf.summary.image("Training data", img, step=0)
```

☐ Show actual image size

Brightness adjustment



RESET

Contrast adjustment



RESET

Runs

Write a regex to filter runs

☒ ☐ 20191116-035119

TOGGLE ALL RUNS

logs/train_data

Training data

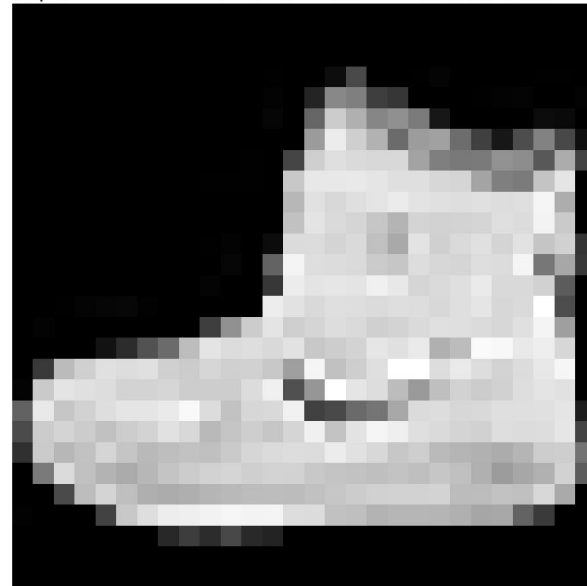
Training data

20191116-035119

tag: Training data

step 0

Fri Nov 15 2019 18:51:19 Alaska Standard Time





..



logs



train_data



20191116-035119



events.out.tfevents.1573876279.5e80c3078fb6.124.5.v2

```
%tensorboard --logdir logs/train_data
```

```
with file_writer.as_default():  
    # Don't forget to reshape.  
    images = np.reshape(train_images[0:25], (-1, 28, 28, 1))  
    tf.summary.image("25 training data examples", images,  
                    max_outputs=25, step=0)  
  
%tensorboard --logdir logs/train_data
```

```
with file_writer.as_default():  
    # Don't forget to reshape.  
    images = np.reshape(train_images[0:25], (-1, 28, 28, 1))  
    tf.summary.image("25 training data examples", images,  
                    max_outputs=25, step=0)  
  
%tensorboard --logdir logs/train_data
```

```
with file_writer.as_default():  
    # Don't forget to reshape.  
    images = np.reshape(train_images[0:25], (-1, 28, 28, 1))  
    tf.summary.image("25 training data examples", images,  
                    max_outputs=25, step=0)  
  
%tensorboard --logdir logs/train_data
```

☒ Show actual image size

Brightness adjustment



RESET

Contrast adjustment



RESET

Runs

Write a regex to filter runs

☒ 20191116-035119

TOGGLE ALL RUNS

logs/train_data

25 training data examples

25

PREVIOUS PAGE

NEXT PAGE

| | | | | | | | | | |
|---|-----------------|---|-----------------|--|-----------------|--|-----------------|---|-----------------|
| 25 training data examples tag: 25 training data examples sample: 1 of 25 step 0 Fri Nov 15 2019 18:56:57 Alaska Standard Time | 20191116-035119 | 25 training data examples tag: 25 training data examples sample: 2 of 25 step 0 Fri Nov 15 2019 18:56:57 Alaska Standard Time | 20191116-035119 | 25 training data examples tag: 25 training data examples sample: 3 of 25 step 0 Fri Nov 15 2019 18:56:57 Alaska Standard Time | 20191116-035119 | 25 training data examples tag: 25 training data examples sample: 4 of 25 step 0 Fri Nov 15 2019 18:56:57 Alaska Standard Time | 20191116-035119 | 25 training data examples tag: 25 training data examples sample: 5 of 25 step 0 Fri Nov 15 2019 18:56:57 Alaska Standard Time | 20191116-035119 |
| 25 training data examples tag: 25 training data examples sample: 6 of 25 step 0 Fri Nov 15 2019 18:56:57 Alaska Standard Time | 20191116-035119 | 25 training data examples tag: 25 training data examples sample: 7 of 25 step 0 Fri Nov 15 2019 18:56:57 Alaska Standard Time | 20191116-035119 | 25 training data examples tag: 25 training data examples sample: 8 of 25 step 0 Fri Nov 15 2019 18:56:57 Alaska Standard Time | 20191116-035119 | 25 training data examples tag: 25 training data examples sample: 9 of 25 step 0 Fri Nov 15 2019 18:56:57 Alaska Standard Time | 20191116-035119 | 25 training data examples tag: 25 training data examples sample: 10 of 25 step 0 Fri Nov 15 2019 18:56:57 Alaska Standard Time | 20191116-035119 |
| 25 training data examples tag: 25 training data examples sample: 11 of 25 step 0 Fri Nov 15 2019 18:56:57 Alaska Standard Time | 20191116-035119 | 25 training data examples tag: 25 training data examples sample: 12 of 25 step 0 Fri Nov 15 2019 18:56:57 Alaska Standard Time | 20191116-035119 | | | | | | |

Page 1 of 3

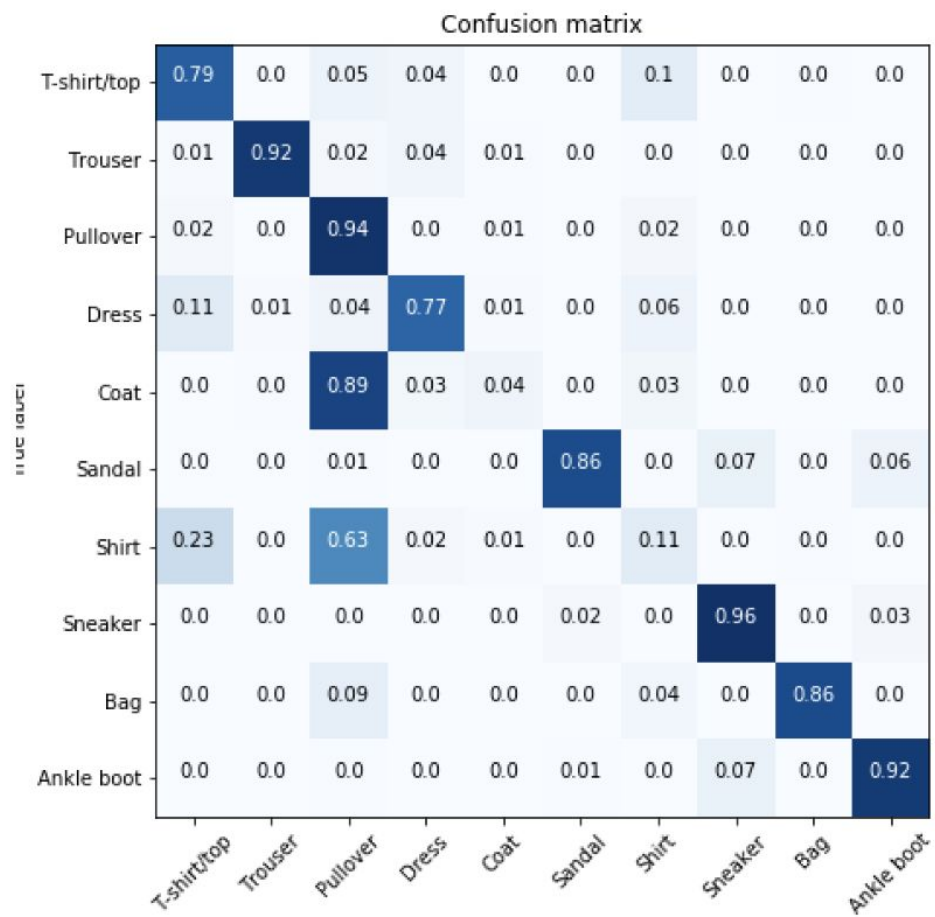
PREVIOUS PAGE

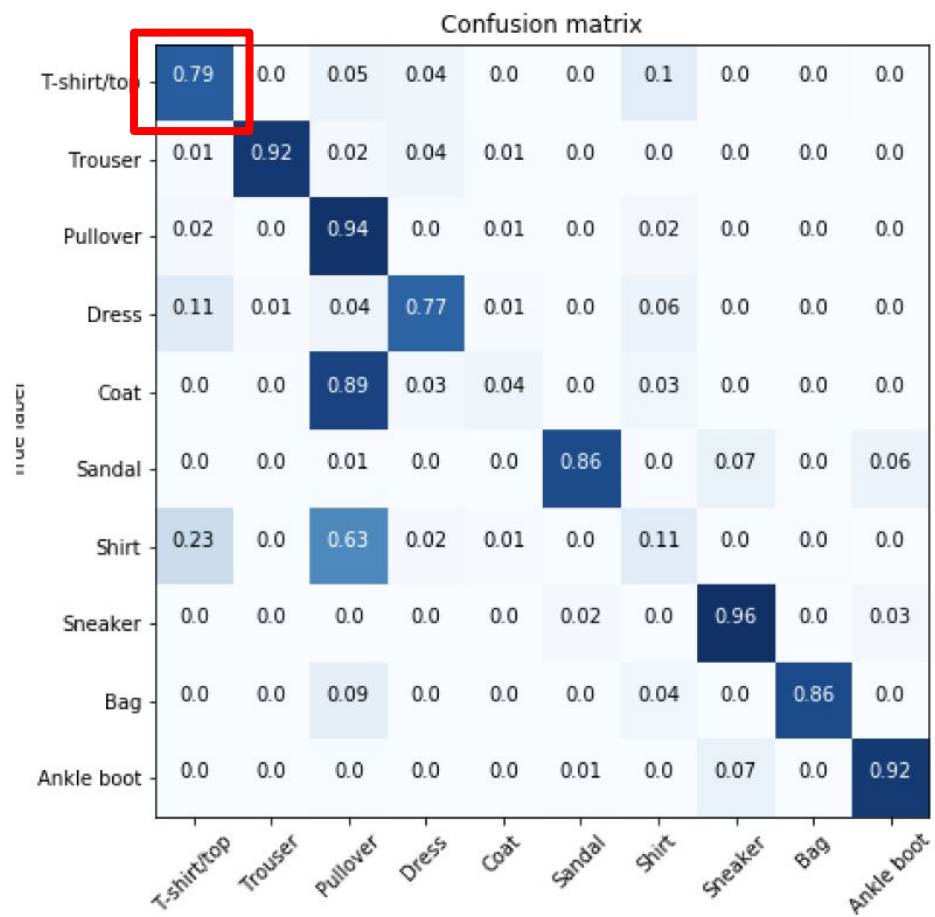
NEXT PAGE

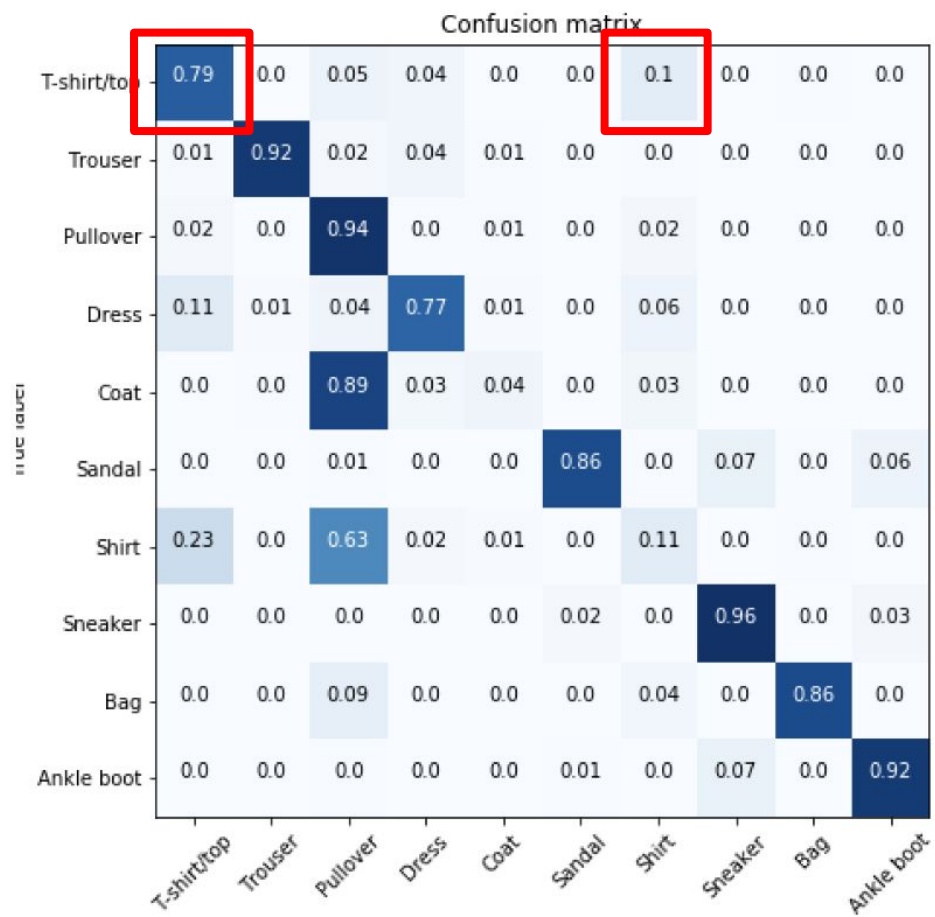
Training data

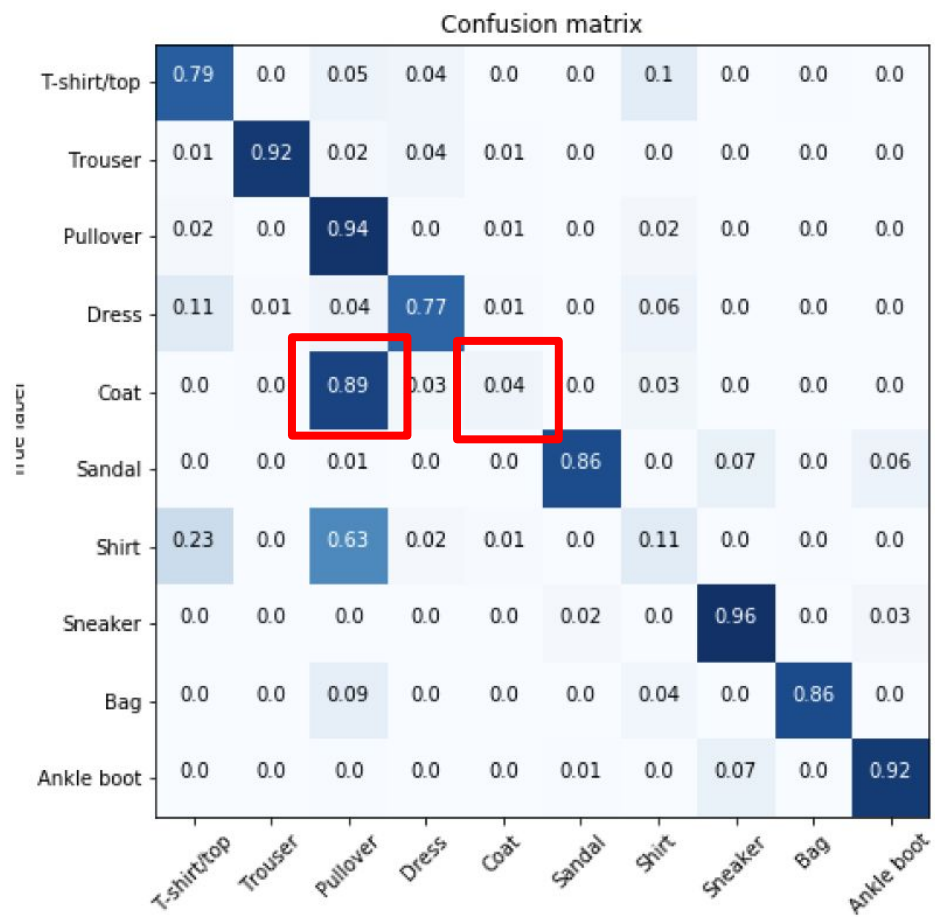
1

Training data
 tag: Training data
 step 0 Fri Nov 15 2019 18:51:19 Alaska Standard Time









```
def plot_to_image(figure):  
    """Converts the matplotlib plot specified by 'figure' to a PNG image and  
    returns it. The supplied figure is closed and inaccessible after this call."""  
    # Save the plot to a PNG in memory.  
    buf = io.BytesIO()  
    plt.savefig(buf, format='png')  
    # Closing the figure prevents it from being displayed directly inside  
    # the notebook.  
    plt.close(figure)  
    buf.seek(0)  
    # Convert PNG buffer to TF image  
    image = tf.image.decode_png(buf.getvalue(), channels=4)  
    # Add the batch dimension  
    image = tf.expand_dims(image, 0)  
    return image
```

```
def plot_to_image(figure):  
    """Converts the matplotlib plot specified by 'figure' to a PNG image and  
    returns it. The supplied figure is closed and inaccessible after this call."""  
    # Save the plot to a PNG in memory.  
    buf = io.BytesIO()  
    plt.savefig(buf, format='png')  
    # Closing the figure prevents it from being displayed directly inside  
    # the notebook.  
    plt.close(figure)  
    buf.seek(0)  
    # Convert PNG buffer to TF image  
    image = tf.image.decode_png(buf.getvalue(), channels=4)  
    # Add the batch dimension  
    image = tf.expand_dims(image, 0)  
    return image
```

```
# Train the classifier.  
model.fit(  
    train_images,  
    train_labels,  
    epochs=5,  
    verbose=0, # Suppress chatty output  
    callbacks=[tensorboard_callback, cm_callback],  
    validation_data=(test_images, test_labels),  
)
```

```
# Train the classifier.  
model.fit(  
    train_images,  
    train_labels,  
    epochs=5,  
    verbose=0, # Suppress chatty output  
    callbacks=[tensorboard_callback, cm_callback],  
    validation_data=(test_images, test_labels),  
)
```

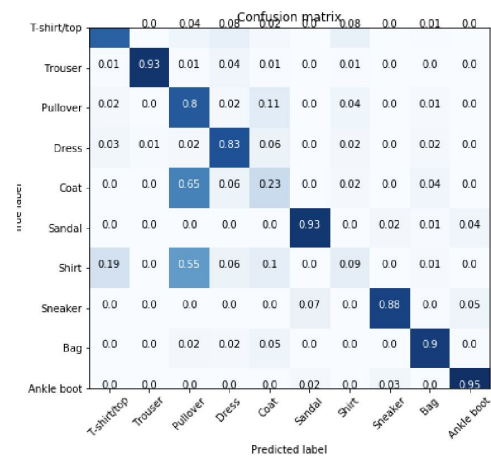
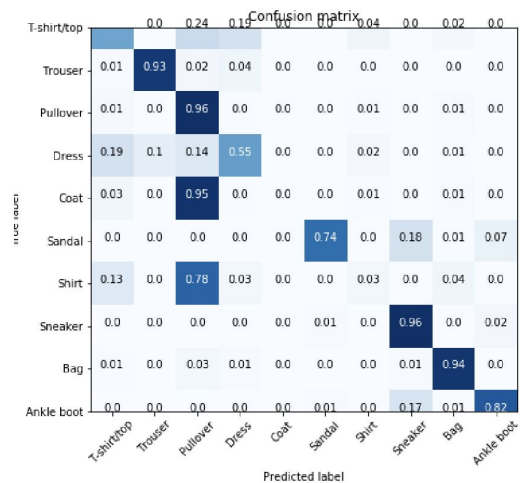
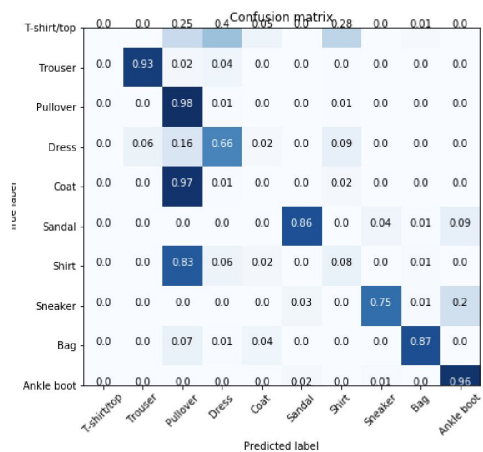
```
def log_confusion_matrix(epoch, logs):  
    # Use the model to predict the values from the validation dataset.  
    test_pred_raw = model.predict(test_images)  
    test_pred = np.argmax(test_pred_raw, axis=1)  
  
    # Calculate the confusion matrix.  
    cm = sklearn.metrics.confusion_matrix(test_labels, test_pred)  
    # Log the confusion matrix as an image summary.  
    figure = plot_confusion_matrix(cm, class_names=class_names)  
    cm_image = plot_to_image(figure)  
  
    # Log the confusion matrix as an image summary.  
    with file_writer_cm.as_default():  
        tf.summary.image("Confusion Matrix", cm_image, step=epoch)  
  
# Define the per-epoch callback.  
cm_callback = keras.callbacks.LambdaCallback(on_epoch_end=log_confusion_matrix)
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EPOCHS

bit.ly/tensorboard-graphics