



# TensorFlow

Курс “Практическое применение по TensorFlow”

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<https://github.com/Firyuza/TensorFlowPractice>

## Quiz. Gradient Tape

Will differentiates `loss_fn()` **AND** `other_loss_fn()`? Explain.

```
with tf.GradientTape() as t:  
    loss = loss_fn()  
with tf.GradientTape() as t:  
    loss += other_loss_fn()  
t.gradient(loss, ...)
```

# Create TensorBoard writer

```
self.valid_file_writer = tf.summary.create_file_writer(cfg.train.logs_base_dir + "/valid")  
self.train_file_writer = tf.summary.create_file_writer(cfg.train.logs_base_dir + "/train")
```

▼ logs

▶ train

▶ valid

# Log scalar

```
with self.train_file_writer.as_default():  
    tf.summary.scalar('reg_loss', reg_loss, global_step)
```

Name (tag)



Value

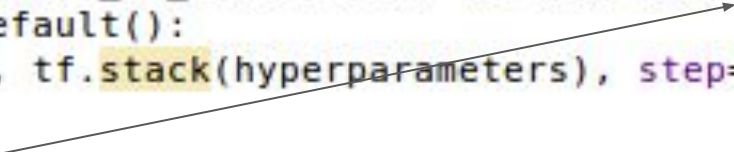
Step

# Log text (table)

```
tf.summary.text(name, text_data, step=step)
```

## Table

```
hyperparameters = [tf.convert_to_tensor(row) for row in rows]  
with summary_writer.as_default():  
    tf.summary.text(name, tf.stack(hyperparameters), step=step)
```



Create rows as in table

Each row: `rows = [['key1', 'value1'], ['key2', 'value2']]`

🔍 Filter tags (regular expressions supported)

config

config  
tag: config

step 0

dataset.nrof_classes	10
train.nrof_classes	10
train.image_size	32
train.image_channels	3
train.batch_size	32
train.epoch_size	5000

# Log hyperparameters

Adding hyperparameters of the model to the tensorboard

```
from tensorboard.plugins.hparams import api as hp
```



# Log hyperparameters

```
with self.train_file_writer.as_default():  
    hp.hparams({'image_size': cfg.train.image_size,  
               'optimizer': cfg.train.optimizer,  
               'batch_size': 32, 'lr': cfg.train.learning_rate})
```

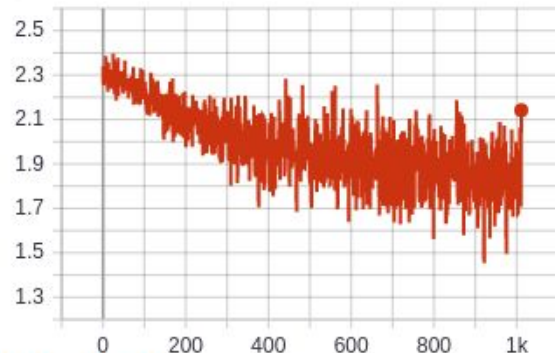
TABLE VIEW

PARALLEL COORDINATES VIEW

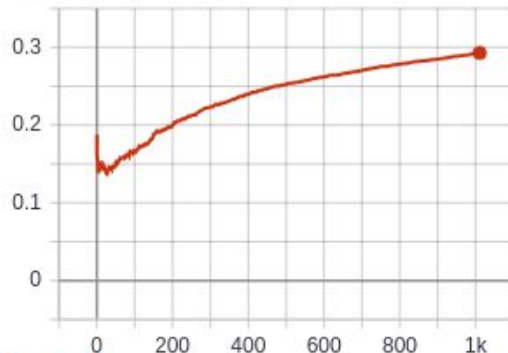
SCATTER PLOT MATRIX VIEW

Trial ID	Show Metrics	image_size	lr	optimizer	batch_size	CE_loss
15981fea47efc52...	<input checked="" type="checkbox"/>	32.000	0.000030000	ADAM	32.000	2.1418

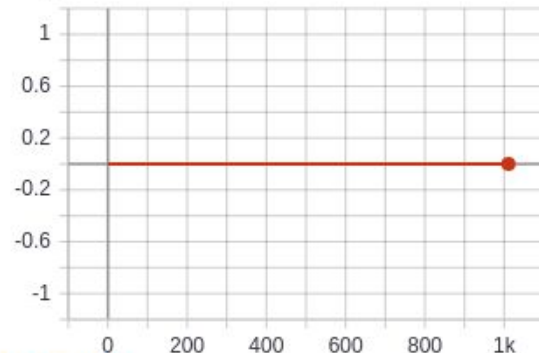
CE\_loss



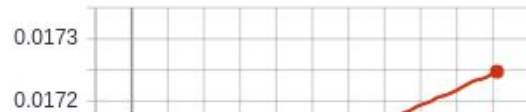
category\_accuracy



learning\_rate



reg\_loss



total\_loss



# Log image

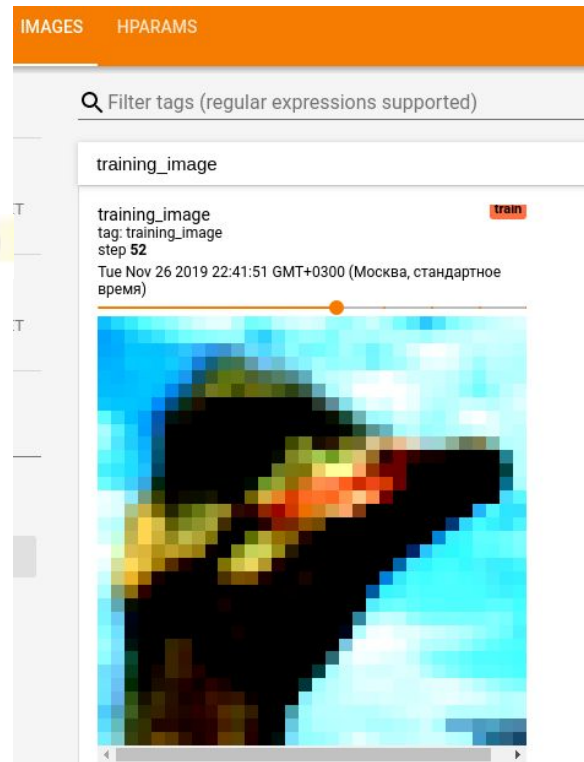
```
tf.summary.image('training_image', [images[0]], step=global_step)
```

One image tensor

```
tf.summary.image('training_images', images[:4], step=global_step)
```

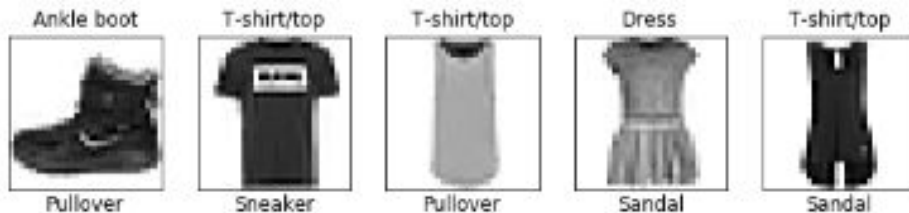
Multiple image tensors

```
self.custom_category_metric = CustomSparseCategoricalAccuracy('custom_category_metric')
```



- Log Confusion Matrix
- Log plots

- [illegible]



# Log image. Plot

## Create figure

```
def image_grid(images, class_labels, predicted_class_labels, class_name_map):  
    # Create a figure to contain the plot.  
    figure = plt.figure(figsize=(10, 10))  
    for i in range(len(images)):  
        # Start next subplot.  
        plt.subplot(5, 5, i + 1, title='%s %s' %  
                                (class_name_map[class_labels[i]],  
                                 class_name_map[predicted_class_labels[i]]))  
        plt.xticks([])  
        plt.yticks([])  
        plt.grid(False)  
        plt.imshow(images[i], cmap=plt.cm.binary)  
  
    return figure
```

# Log image. Plot

Convert figure into PNG image and save in memory

```
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
```



valid\_images  
tag: valid\_images  
step 12 504

valid

Wed Dec 04 2019 00:12:53 GMT+0300 (Москва, стандартное время)

valid\_images  
tag: valid\_images  
step 12 504

Wed Dec



ship\_automobile



dog\_cat



deer\_frog

airplane\_ship



horse\_cat

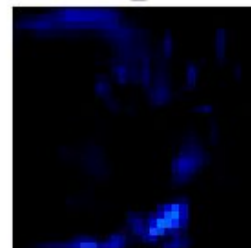


airplane deer

automobile\_dog

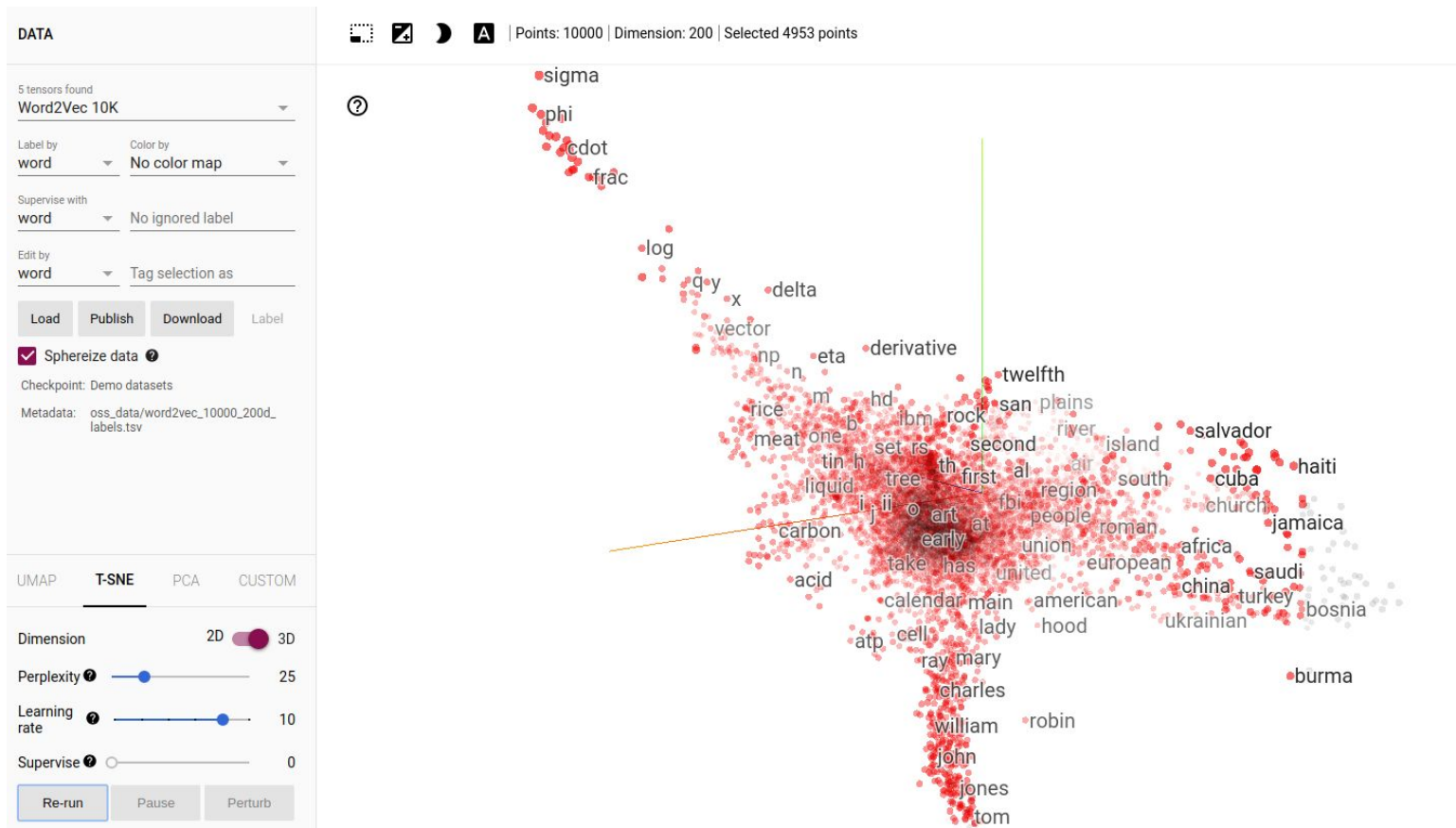


deer\_bird



deer bird

# Visualize embeddings





# TensorBoard.dev

TensorBoard.dev

[TensorBoard](#)

[TensorFlow](#)

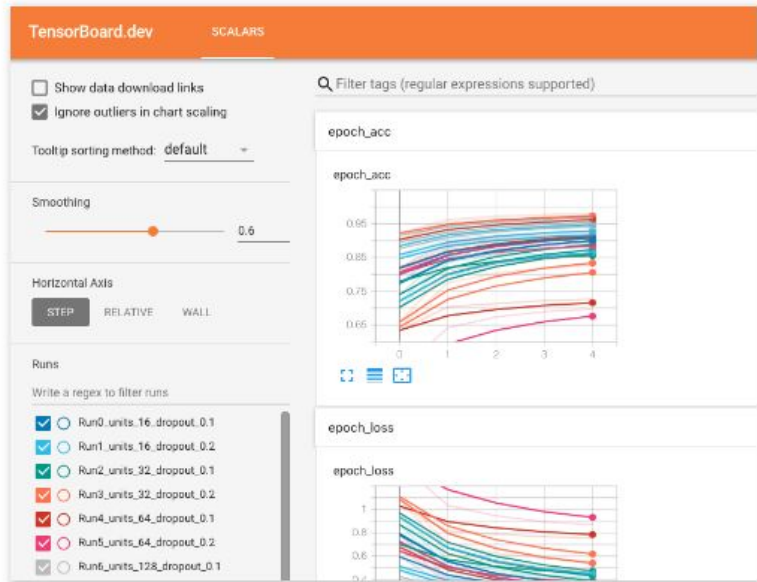
## TensorBoard.dev PREVIEW

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



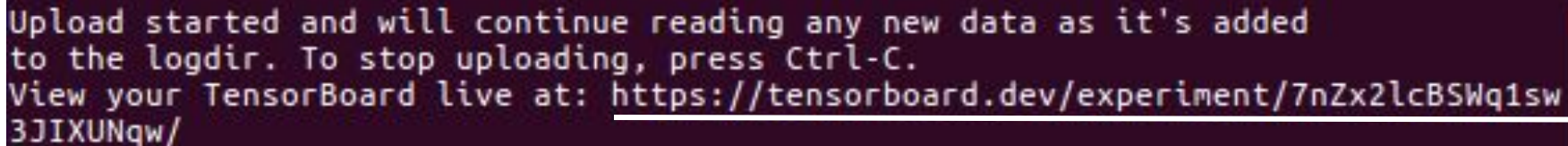
# TensorBoard.dev

Install the latest TensorBoard. You may need to first uninstall other TensorBoard versions.

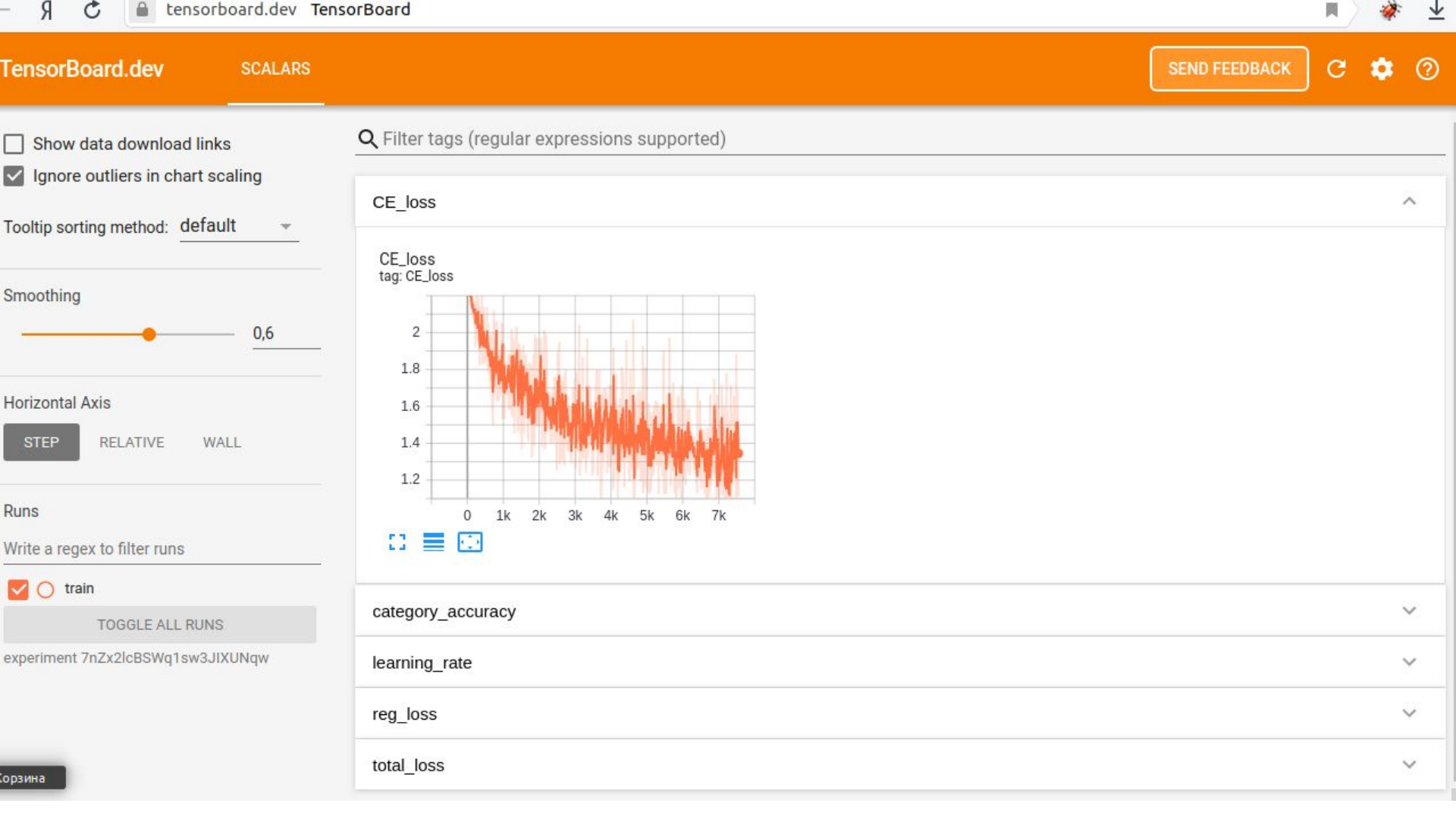
```
$ pip install -U tensorboard
```

For help, run "tensorboard dev --help" or "tensorboard dev COMMAND --help"

```
$ tensorboard dev upload --logdir logs
```

A terminal window with a dark background and light-colored text. The text shows the upload process starting and continuing to read new data. It also provides a live URL to view the TensorBoard experiment. The URL is underlined.

```
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/7nZx2lcBSWq1sw  
3JIXUNqw/
```



# MLflow



Open-source platform for managing the end-to-end machine learning lifecycle.

```
$ pip install mlflow
```

# MLflow



- **MLflow Tracking:** log parameters, metrics etc.
- **MLflow Projects:** save model
- **MLflow Models:** managing and deploying

# MLflow Tracking

- Code Version
- Start & End Time
- Source
- Parameters
- Metrics
- Artifacts

# MLflow

Experiment name as global scope for runs

```
import mlflow
mlflow.set_experiment(cfg.train.experiment_name)
```

Experiments

Default

ImageClassification

**ImageClassification**

Experiment ID: 1

Artifact Location: file:///home/firiuza/PycharmProjects/TensorflowPractice1/Lesson11/mlruns/1

Description: [📝](#)

Search Runs:  State: Active

Filter Params:  Filter Metrics:

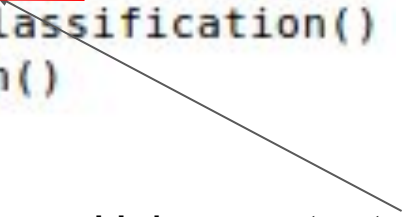
Showing 1 matching run

<input type="checkbox"/>	Date	User	Run Name	Source	Version	Tags	Parameters
<input type="checkbox"/>	2019-11-29 02:14:01	firiuza	First Train	📁 image...	5ac9ba		

# MLflow Tracking. Start

```
with mlflow.start_run():  
    img_net = ImageClassification()  
    img_net.run_train()
```

Using context manager in Python  
run code within MLflow scope





# MLflow Tracking. Start

```
with mlflow.start_run(run_name=cfg.train.run_name):  
    mlflow.log_artifact(os.path.abspath(__file__))  
  
    img_net = ImageClassification()  
    img_net.run_train()
```

- Start with defining **run\_name**
- Log code as **artifact**

## Experiments



Default

## Default

Experiment ID: 0

Artifact Location: file:///home/firiuza/PycharmProjects/TensorflowPractice1/Lesson11/mlruns/0

▼ Description:

Search Runs: metrics.rmse &lt; 1 and params.model = "tree"



State:

Active ▼

Search

Filter Params: alpha, lr

Filter Metrics: rmse, r2

Clear

Showing 1 matching run

Compare

Delete

Download CSV

<input type="checkbox"/>	Date	User	Run Name	Source	Version	Tags	Parameter
<input type="checkbox"/>	2019-11-27 11:17:08	firiuza	ImageClass...	image...	da6432		

Your run

# MLflow Tracking. Log artifact

Log local files or directory as artifact

```
mlflow.log_artifact(os.path.abspath(__file__))
```

## MLflow Tracking. Log param

```
mlflow.log_param('lr', cfg.train.learning_rate)  
mlflow.log_param('optimizer', cfg.train.optimizer)
```

# MLflow Tracking. Log metric

```
from mlflow import log_metric, log_artifact
```

```
log_metric('validation_category_accuracy', category_metric.result().numpy(), step)
```

# MLflow. How to run?

In terminal:

```
cd folder/where/mlruns/exist
```

```
mlflow ui
```

```
[2019-12-05 23:02:18 +0300] [9231] [INFO] Starting gunicorn 20.0.2
[2019-12-05 23:02:18 +0300] [9231] [INFO] Listening at: http://127.0.0.1:5000 (9231)
[2019-12-05 23:02:18 +0300] [9231] [INFO] Using worker: sync
[2019-12-05 23:02:18 +0300] [9235] [INFO] Booting worker with pid: 9235
```

## ImageClassification > First Train ▾

Date: 2019-12-05 21:59:35

Source:  image\_classification.py

Git Commit: 0fbe352

User: firiuza

Duration: 58.9min

### ▾ Notes

None

### ▾ Parameters

Name	Value
lr	3e-05
optimizer	ADAM

### ▾ Metrics

Name	Value
<a href="#">validation_category_accuracy</a> 	0.681

### ▾ Tags

Name	Value	Actions
------	-------	---------

# MLflow Models

Save model and allow to deploy on a local machine and to several production environments.



# MLflow Projects

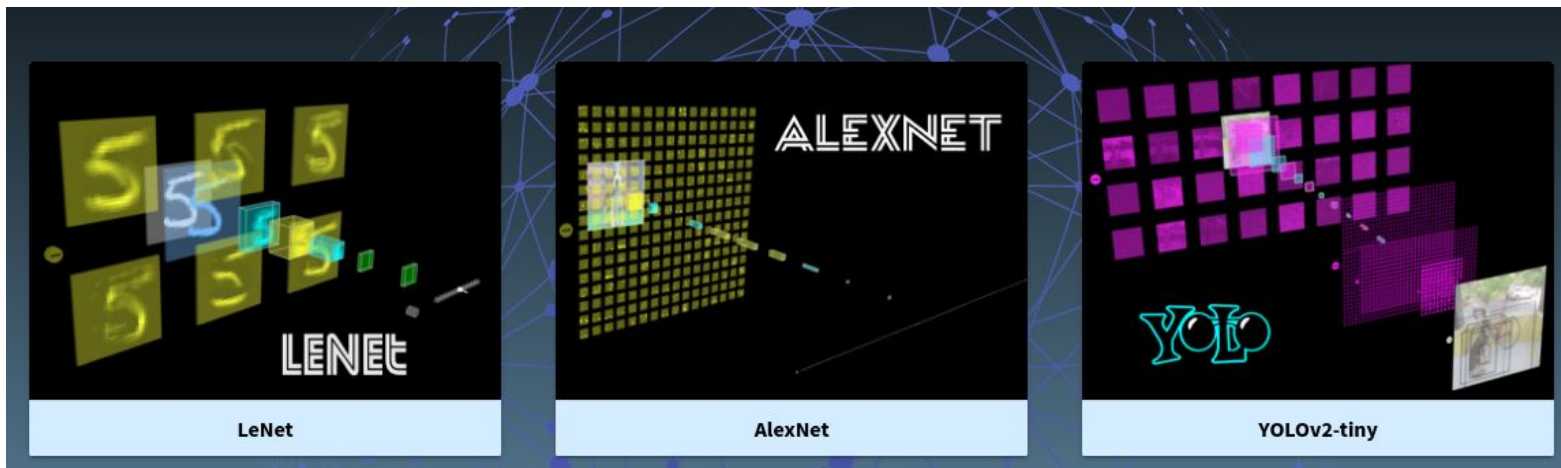
Packaging data science code.



# Tensorspace.js

## Neural Network 3D Visualization Framework

Build interactive and intuitive model in browsers



# Tensortspace js. Installation

```
$ conda create -n envname python=3.6  
$ source activate envname  
$ pip install tensortspacejs
```

Important step:

```
$ tensortspacejs_converter -init
```

# Tensospace js. Convert model

```
tensospacejs_converter \  
  --input_model_from="tensorflow" \  
  --input_model_format="tf_keras" \  
  --output_layer_names="conv_1,maxpool_1,conv_2,maxpool_2,dense_1,dense_2,softmax" \  
  ./rawModel/tf_keras_model.h5 \  
  ./convertedModel
```

# Assignment

1. Add TensorBoard logging into train and validation pipeline:
  - scalar
  - text (config file)
  - hyperparameters
  - images
2. Add MLflow into train and validation pipeline:
  - artifact (code files)
  - params
  - metrics
3. Commit screenshots with code.