

### for Developers NiftyNet Tutorial



Let's start from training a linear model with TensorFlow APIs...



# A TensorFlow minimal working example

1 import tensorflow as tf

```
A linear model \hat{y} \approx Wx + b
```

```
Sub Add Add
```

```
[y_hat, error], feed_dict={x: 10.0, y: 15.0})
# y_pred [16.], loss [1.]
                                                                                                                                                                                                                                                                                                                                                                                                     sess.run(tf.global_variables_initializer())
                                                                                                                                                                W = tf.Variable([2.0], dtype=tf.float32)
b = tf.Variable([-4.0], dtype=tf.float32)
                                                                                                                                                                                                                                                                                                                                                                    14 with tf.Session(graph=demo_graph) as sess:
                                                               x = tf.placeholder(tf.float32)
y = tf.placeholder(tf.float32)
                                                                                                                                                                                                                                                                                                                                                                                                                                       [y_pred, loss] = sess.run(
                                 4 with demo_graph.as_default():
                                                                                                                                                                                                                                                                                                     error = tf.abs(y\_hat - y)
3 demo_graph = tf.Graph()
                                                                                                                                                                                                                                                                   y_hat = W * x + b
```

Let's take a look at NiftyNet APIs...



### Application interfaces

Deep learning application

- Inputs (observations)
- Load image volumes
- Augmentation
- Sample
- Network model
- Params. management
- Layer operations
- Loss functions
- **Model sharing**
- Outputs aggregation

```
class BaseApplication(object):
    # Input data
    def initialise_dataset_loader()
    def initialise_sampler()
    # Network model (and sharing)
    def initialise_network()
    def connect_data_and_network()
    def connect_data_and_network()
    def interpret_output()
```

```
* Welcome Welcome CIMIC W EPSRC CIMIC WAtcome with CONTROL OF CIMIC CIMI
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                     An application demo
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                          self.net = ApplicationNetFactory.create('toynet')(...)
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                         self.sampler = UniformSampler(reader=self.reader, ...)
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                    def connect_data_and_network(variable_collector):
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                           window = self.sampler.pop_batch_op()
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                 self.reader = ImageReader(...)
                                                                     Class DemoApplication(BaseApplication):
                                                                                                                                                                                                                                                                                                                                                            def initialise_dataset_loader():
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                  def initialise_sampler():
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                   def initialise_network():
```

```
# In application engine
For each iteration:
    numpy_output = tf.Session.run(
    variable_collector.variables())
```

def interpret\_output(output\_numpy\_array):

self.decoder(output\_numpy\_array)

loss\_layer = LossFunction(net\_output, window['label'])

net\_output = self.net(window['image'])

if is training:

gradients = compute\_gradients(loss\_layer(net\_output))

variable\_collector.add(net\_output)





pip install NiftyNet

net\_run train -a apps.demo\_app.DemoApplication \

-c my\_config.ini

Commands for `pip install` user

Command for `git clone` user

python net\_run.py train -a apps.demo\_app.DemoApplication \ cd NiftyNet/

-c my\_config.ini

Class DemoApplication(BaseApplication):

apps/demo\_app.py

App. file layout

# Make sure my\_folder/apps is a Python module available for `import`

export \$PYTHONPATH=\$PYTHONPATH:my\_folder/apps



## Configuration file parsing

#### ini configuration file

[SYSTEM]

Low-level TF API configurations

[NETWORK]

Hyperparameters of networks

[TRAINING]

Describes a training process

[INFERENCE]

Describes a inference process

Class BaseApplication(object):
 self.net\_param
 self.action\_param

# Input data
def initialise\_dataset\_loader()
def initialise\_sampler()
# Network model (and sharing)
def initialise\_network()
def connect\_data\_and\_network()
# Outputs aggregation
def interpret\_output()



## Configuration file parsing

#### ini configuration file

```
# Task-specific parameters
[TASK_SECTION]
image = T1MR, T2MR
```

```
# Multi-modal input sources
```

```
[T1MR]
```

```
path_to_search = /folder/T1
filename_contains = T1
```

T2MR

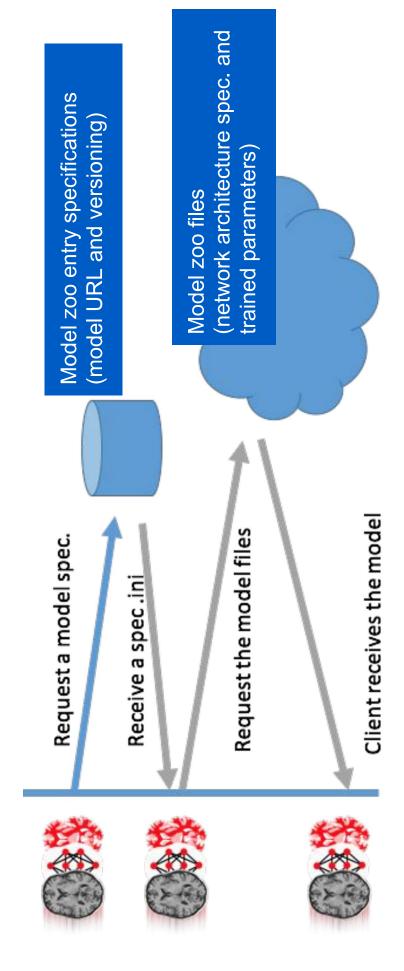
```
path_to_search = /folder/T2
filename_contains = T2
```

```
initialise_dataset_loader()
                                                                                                                                                                                                                                                     def connect_data_and_network()
                                                                                                                                                                                             # Network model (and sharing)
Class BaseApplication(object):
                                                                                                                                                                                                                        def initialise_network()
                                                                                                                                                                  def initialise_sampler()
                                                                                                                                                                                                                                                                                                         def interpret_output()
                                                                                                                                                                                                                                                                                 # Outputs aggregation
                            self.task_param
                                                       self.data_param
                                                                                                             # Input data
```



#### Model zoo

# (Under construction as of 23-Nov-2017)



net\_download dense\_vnet\_abdominal\_ct\_model\_zoo pip install NiftyNet



### For more info...

Commands and configurations:

https://github.com/NifTK/NiftyNet/blob/dev/config/README.md

Demos:

https://github.com/NifTK/NiftyNet/tree/dev/demos

Contributing

https://github.com/NifTK/NiftyNet/blob/dev/CONTRIBUTING.md