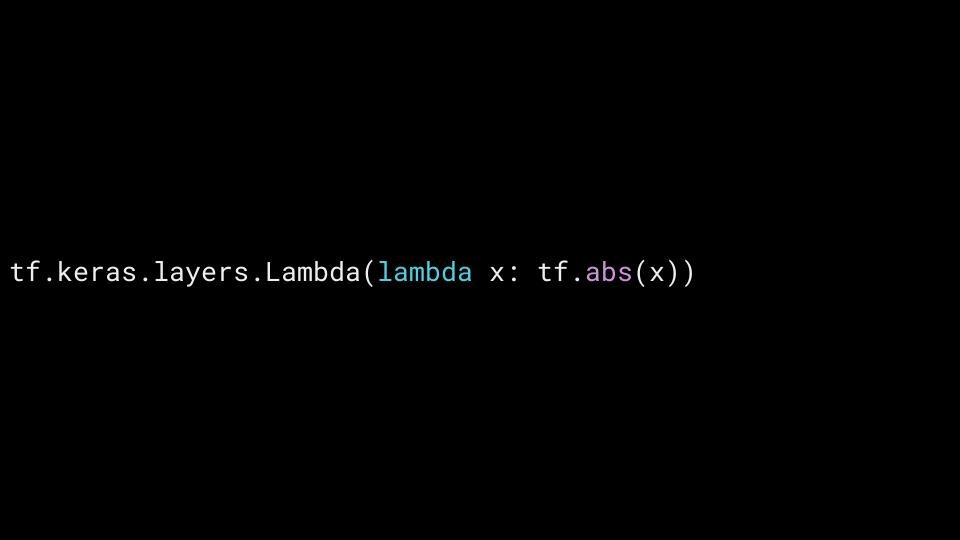
Copyright Notice

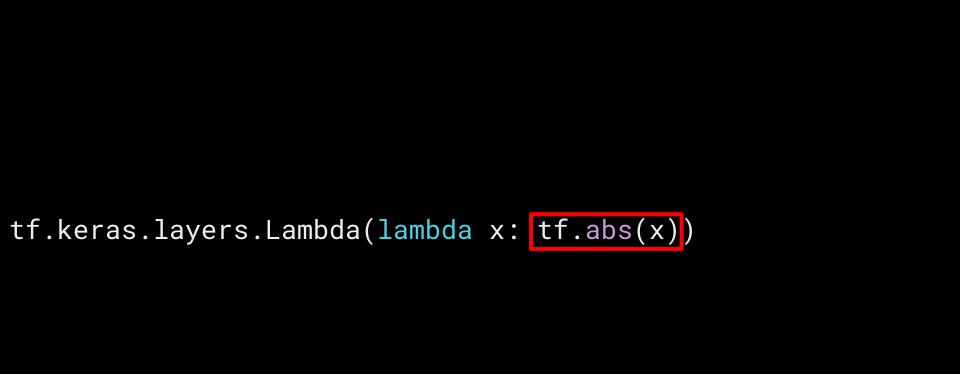
These slides are distributed under the Creative Commons License.

<u>DeepLearning.Al</u> makes these slides available for educational purposes. You may not use or distribute these slides for commercial purposes. You may make copies of these slides and use or distribute them for educational purposes as long as you cite <u>DeepLearning.Al</u> as the source of the slides.

For the rest of the details of the license, see https://creativecommons.org/licenses/by-sa/2.0/legalcode



```
tf.keras.layers.Lambda(lambda x: tf.abs(x))
```



```
model = tf.keras.models.Sequential([
   tf.keras.layers.Flatten(input_shape=(28, 28)),
   tf.keras.layers.Dense(128, activation='relu'),
```

tf.keras.layers.Dense(10, activation='softmax')

])

```
model = tf.keras.models.Sequential([
   tf.keras.layers.Flatten(input_shape=(28, 28)),
   tf.keras.layers.Dense(128, activation='relu'),
```

tf.keras.layers.Dense(10, activation='softmax')

```
model = tf.keras.models.Sequential([
  tf.keras.layers.Flatten(input_shape=(28, 28)),
  tf.keras.layers.Dense(128, activation='relu'),
  tf.keras.layers.Dense(10, activation='softmax')
                                          if(x>0):
                                              return x
                                          else:
                                              return 0
```

```
accuracy: 0.9262
Epoch 2/5
accuracy: 0.9662
Epoch 3/5
accuracy: 0.9760
Epoch 4/5
accuracy: 0.9820
Epoch 5/5
accuracy: 0.9862
accuracy: 0.9758
```

```
accuracy: 0.9262
Epoch 2/5
accuracy: 0.9662
Epoch 3/5
accuracy: 0.9760
Epoch 4/5
accuracy: 0.9820
Epoch 5/5
accuracy: 0.9862
accuracy: 0.9758
```

```
accuracy: 0.9262
Epoch 2/5
accuracy: 0.9662
Epoch 3/5
accuracy: 0.9760
Epoch 4/5
accuracy: 0.9820
Epoch 5/5
accuracy: 0.9862
accuracy: 0.9758
```

```
Epoch 1/5
accuracy: 0.8984
Epoch 2/5
accuracy: 0.9170
Epoch 3/5
accuracy: 0.9192
Epoch 4/5
accuracy: 0.9205
Epoch 5/5
accuracy: 0.9227
accuracy: 0.9154
```

```
Epoch 1/5
accuracy: 0.8984
Epoch 2/5
accuracy: 0.9170
Epoch 3/5
accuracy: 0.9192
Epoch 4/5
accuracy: 0.9205
Epoch 5/5
accuracy: 0.9227
accuracy: 0.9154
```

```
tf.keras.layers.Flatten(input_shape=(28, 28)),
 tf.keras.layers.Dense(128),
 tf.keras.layers.Lambda(lambda x: tf.abs(x)),
 tf.keras.layers.Dense(10, activation='softmax')
])
```

model = tf.keras.models.Sequential([

```
model = tf.keras.models.Sequential([
  tf.keras.layers.Flatten(input_shape=(28, 28)),
  tf.keras.layers.Dense(128),
  tf.keras.layers.Lambda(lambda x: tf.abs(x)),
  tf.keras.layers.Dense(10, activation='softmax')
```

])

```
accuracy: 0.9377
Epoch 2/5
accuracy: 0.9734
Epoch 3/5
accuracy: 0.9807
Epoch 4/5
accuracy: 0.9853
Epoch 5/5
accuracy: 0.9875
accuracy: 0.9751
```

```
1875/1875 [==================]
                     4s 2ms/step -
                            loss: 0.2229 -
accuracy: 0.9377
Epoch 2/5
loss: 0.0908 -
accuracy: 0.9734
Epoch 3/5
loss: 0.0636 -
accuracy: 0.9807
Epoch 4/5
4s 2ms/step -
                            loss: 0.0471 -
accuracy: 0.9853
Epoch 5/5
loss: 0.0396 -
accuracy: 0.9875
accuracy: 0.9751
```

```
return K.maximum(0.0, x)
model = tf.keras.models.Sequential([
  tf.keras.layers.Flatten(input_shape=(28, 28)),
  tf.keras.layers.Dense(128),
  tf.keras.layers.Lambda(my_relu),
  tf.keras.layers.Dense(10, activation='softmax')
```

```
return K.maximum(0.0, x)
model = tf.keras.models.Sequential([
  tf.keras.layers.Flatten(input_shape=(28, 28)),
  tf.keras.layers.Dense(128),
  tf.keras.layers.Lambda(my_relu),
  tf.keras.layers.Dense(10, activation='softmax')
```

```
return K.maximum(0.0, x)
model = tf.keras.models.Sequential([
  tf.keras.layers.Flatten(input_shape=(28, 28)),
  tf.keras.layers.Dense(128),
 tf.keras.layers.Lambda(my_relu),
  tf.keras.layers.Dense(10, activation='softmax')
```

```
return K.maximum(0.0
model = tf.keras.models.Sequential([
  tf.keras.layers.Flatten(input_shape=(28, 28)),
  tf.keras.layers.Dense(128),
  tf.keras.layers.Lambda(my_relu),
  tf.keras.layers.Dense(10, activation='softmax')
```

```
return K.maximum(0.5
model = tf.keras.models.Sequential([
  tf.keras.layers.Flatten(input_shape=(28, 28)),
  tf.keras.layers.Dense(128),
  tf.keras.layers.Lambda(my_relu),
  tf.keras.layers.Dense(10, activation='softmax')
```

Some commonly used layers

Convolutional

Conv1D/Conv2D/Conv3D

SeparableConv2D

DepthwiseConv2D

Merge

Add

Subtract

Multiply

Recurrent

LSTM

GRU

Activations (Advanced)

LeakyReLU

PReLU

ELU

Pooling

MaxPooling2D

AveragePooling2D

GlobalAveragePooling2D

Core

Activation

Lambda

Input

Dense

Dropout

BatchNormalization

Some commonly used layers

Convolutional

Conv1D/Conv2D/Conv3D

SeparableConv2D

DepthwiseConv2D

Merge

Add

Subtract

Multiply

Recurrent

LSTM

GRU

Activations (Advanced)

LeakyReLU

PReLU

ELU

Pooling

MaxPooling2D

AveragePooling2D

GlobalAveragePooling2D

Core

Activation

Lambda

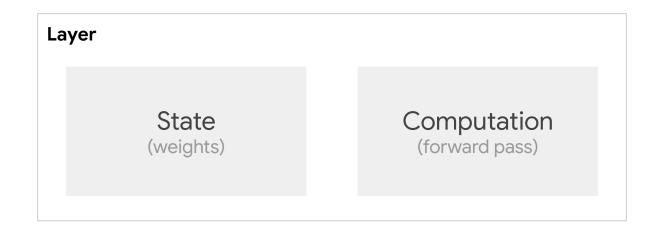
Input

Dense

Dropout

BatchNormalization

What is a Layer?



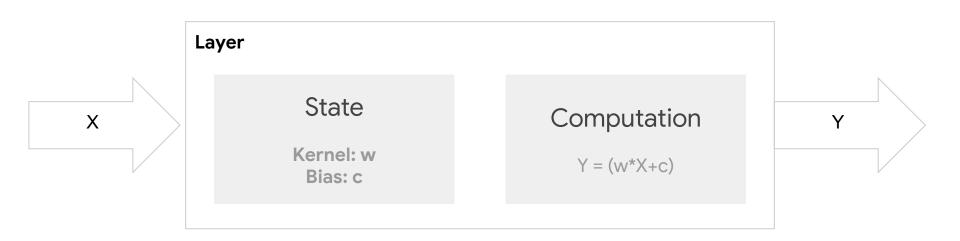
What is a Layer?

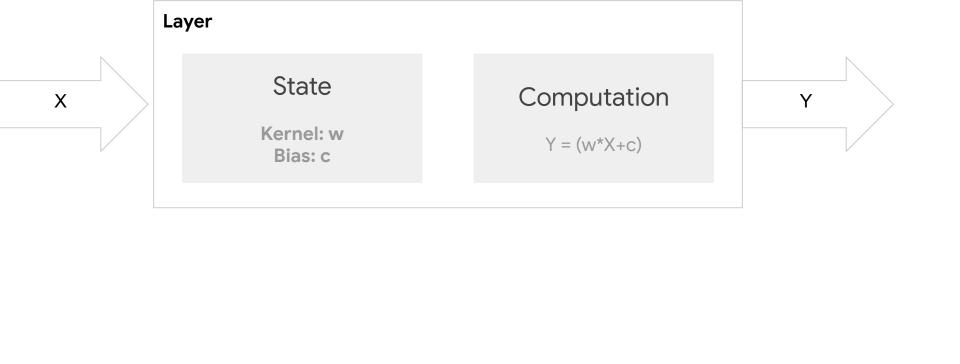


What is a Layer?



Simple Dense Layer





```
def __init__(self, units=32):
    super(SimpleDense, self).__init__()
    self.units = units
def build(self, input_shape): # Create the state of the layer (weights)
 w_init = tf.random_normal_initializer()
  self.w = tf.Variable(name="kernel",
      initial_value=w_init(shape=(input_shape[-1], self.units), dtype='float32'),
      trainable=True)
  b_init = tf.zeros_initializer()
  self.b = tf.Variable(name="bias",
      initial_value=b_init(shape=(self.units,), dtype='float32'),
      trainable=True)
def call(self, inputs): # Defines the computation from inputs to outputs
```

```
def __init__(self, units=32):
    super(SimpleDense, self).__init__()
    self.units = units
def build(self, input_shape): # Create the state of the layer (weights)
 w_init = tf.random_normal_initializer()
  self.w = tf.Variable(name="kernel",
      initial_value=w_init(shape=(input_shape[-1], self.units), dtype='float32'),
      trainable=True)
  b_init = tf.zeros_initializer()
  self.b = tf.Variable(name="bias",
      initial_value=b_init(shape=(self.units,), dtype='float32'),
      trainable=True)
def call(self, inputs): # Defines the computation from inputs to outputs
```

```
class SimpleDense(Layer):
 def __init__(self, units=32):
      super(SimpleDense, self).__init__()
      self.units = units
 def build(self, input_shape): # Create the state of the layer (weights)
   w_init = tf.random_normal_initializer()
    self.w = tf.Variable(name="kernel",
        initial_value=w_init(shape=(input_shape[-1], self.units), dtype='float32'),
        trainable=True)
    b_init = tf.zeros_initializer()
    self.b = tf.Variable(name="bias",
        initial_value=b_init(shape=(self.units,), dtype='float32'),
        trainable=True)
 def call(self, inputs): # Defines the computation from inputs to outputs
```

```
def __init__(self, units=32):
    super(SimpleDense, self).__init__()
    self.units = units
def build(self, input_shape): # Create the state of the layer (weights)
  w_init = tf.random_normal_initializer()
  self.w = tf.Variable(name="kernel",
      initial_value=w_init(shape=(input_shape[-1], self.units), dtype='float32'),
      trainable=True)
  b_init = tf.zeros_initializer()
  self.b = tf.Variable(name="bias",
      initial_value=b_init(shape=(self.units,), dtype='float32'),
      trainable=True)
def call(self, inputs): # Defines the computation from inputs to outputs
```

```
def __init__(self, units=32):
    super(SimpleDense, self).__init__()
    self.units = units
def build(self, input_shape): # Create the state of the layer (weights)
  w_init = tf.random_normal_initializer()
  self.w = tf.Variable(name="kernel",
      initial_value=w_init(shape=(input_shape[-1], self.units), dtype='float32'),
      trainable=True)
  b_init = tf.zeros_initializer()
  self.b = tf.Variable(name="bias",
      initial_value=b_init(shape=(self.units,), dtype='float32'),
      trainable=True)
def call(self, inputs): # Defines the computation from inputs to outputs
```

```
def __init__(self, units=32):
    super(SimpleDense, self).__init__()
    self.units = units
def build(self, input_shape): # Create the state of the layer (weights)
  w_init = tf.random_normal_initializer()
  self.w = tf.Variable(name="kernel",
      initial_value=w_init(shape=(input_shape[-1], self.units), dtype='float32'),
      trainable=True)
  b_init = tf.zeros_initializer()
  self.b = tf.Variable(name="bias",
      initial_value=b_init(shape=(self.units,), dtype='float32'),
      trainable=True)
def call(self, inputs): # Defines the computation from inputs to outputs
    return tf.matmul(inputs, self.w) + self.b
```

```
def __init__(self, units=32):
    super(SimpleDense, self).__init__()
    self.units = units
def build(self, input_shape): # Create the state of the layer (weights)
 w_init = tf.random_normal_initializer()
  self.w = tf.Variable(name="kernel",
      initial_value=w_init(shape=(input_shape[-1], self.units), dtype='float32'),
      trainable=True)
  b_init = tf.zeros_initializer()
  self.b = tf.Variable(name="bias",
      initial_value=b_init(shape=(self.units,), dtype='float32'),
      trainable=True)
def call(self, inputs): # Defines the computation from inputs to outputs
```

```
def __init__(self, units=32):
    super(SimpleDense, self).__init__()
    self.units = units
def build(self, input_shape): # Create the state of the layer (weights)
 w_init = tf.random_normal_initializer()
 self.w = tf.Variable(name="kernel",
      initial_value=w_init(shape=(input_shape[-1], self.units), dtype='float32'),
      trainable=True)
  b_init = tf.zeros_initializer()
  self.b = tf.Variable(name="bias",
      initial_value=b_init(shape=(self.units,), dtype='float32'),
      trainable=True)
def call(self, inputs): # Defines the computation from inputs to outputs
```

```
def __init__(self, units=32):
    super(SimpleDense, self).__init__()
    self.units = units
def build(self, input_shape): # Create the state of the layer (weights)
 w_init = tf.random_normal_initializer()
  self.w = tf.Variable(name="kernel",
     initial_value=w_init(shape=(input_shape[-1], self.units), dtype='float32'),
     trainable=True)
  b_init = tf.zeros_initializer()
  self.b = tf.Variable(name="bias",
      initial_value=b_init(shape=(self.units,), dtype='float32'),
      trainable=True)
def call(self, inputs): # Defines the computation from inputs to outputs
```

```
def __init__(self, units=32):
    super(SimpleDense, self).__init__()
    self.units = units
def build(self, input_shape): # Create the state of the layer (weights)
 w_init = tf.random_normal_initializer()
  self.w = tf.Variable(name="kernel",
      initial_value=w_init(shape=(input_shape[-1], self.units), dtype='float32'),
      trainable=True)
  b_init = tf.zeros_initializer()
  self.b = tf.Variable(name="bias",
      initial_value=b_init(shape=(self.units,), dtype='float32'),
      trainable=True)
def call(self, inputs): # Defines the computation from inputs to outputs
```

```
def __init__(self, units=32):
    super(SimpleDense, self).__init__()
    self.units = units
def build(self, input_shape): # Create the state of the layer (weights)
 w_init = tf.random_normal_initializer()
  self.w = tf.Variable(name="kernel",
      initial_value=w_init(shape=(input_shape[-1], self.units), dtype='float32'),
      trainable=True)
  b_init = tf.zeros_initializer()
  self.b = tf.Variable(name="bias",
      initial_value=b_init(shape=(self.units,), dtype='float32'),
      trainable=True)
def call(self, inputs): # Defines the computation from inputs to outputs
    return tf.matmul(inputs, self.w) + self.b
```

```
my_dense = SimpleDense(units=1)
x = tf.ones((1, 1))
y = my_dense(x)
print(my_dense.variables)
```

```
my_dense = SimpleDense(units=1)
x = tf.ones((1, 1))
y = my_dense(x)
print(my_dense.variables)
```

```
my_dense = SimpleDense(units=1)
x = tf.ones((1, 1))
y = my_dense(x)
print(my_dense.variables)
```

```
my_dense = SimpleDense(units=1)
x = tf.ones((1, 1))
y = my_dense(x)
print(my_dense.variables)
```

```
my_dense = SimpleDense(units=1)
x = tf.ones((1, 1))
y = my_dense(x)
print(my_dense.variables)
```

```
my_dense = SimpleDense(units=1)
x = tf.ones((1, 1))
y = my_dense(x)
print(my_dense.variables)
```

```
my_dense = SimpleDense(units=1)
x = tf.ones((1, 1))
y = my_dense(x)
print(my_dense.variables)
```

```
[<tf.Variable 'simple_dense_7/kernel:0' shape=(1, 1)
dtype=float32, numpy=array([[0.03688493]], dtype=float32)>,

<tf.Variable 'simple_dense_7/bias:0' shape=(1,)
dtype=float32, numpy=array([0.], dtype=float32)>]
```

```
my_dense = SimpleDense(units=1)
x = tf.ones((1, 1))
y = my_dense(x)
print(my_dense.variables)
  [<tf.Variable 'simple_dense_7/kernel:0' shape=(1, 1)</pre>
```

import numpy as np

```
xs = np.array([-1.0, 0.0, 1.0, 2.0, 3.0, 4.0], dtype=float)
ys = np.array([-3.0, -1.0, 1.0, 3.0, 5.0, 7.0], dtype=float)
model = tf.keras.Sequential([SimpleDense(units=1)])
```

model continued in the continued in

Expected Answer: 19 (y=2x-1) Actual Answer: 0.36

(W = 0.036, B=0 => Y=.036 * 10 + 0 = 0.36)

```
Epoch 1/500
                                       0s 1ms/step - loss: 14.8152
Epoch 2/500
                                        0s 3ms/step - loss: 11.8951
Epoch 3/500
                                       0s 1ms/step - loss: 9.5928
Epoch 498/500
                                    - 0s 2ms/step - loss: 4.1124e-05
```

0s 2ms/step - loss: 4.0279e-05

- 0s 1ms/step - loss: 3.9452e-05

Epoch 499/500

Epoch 500/500

import numpy as np

```
xs = np.array([-1.0, 0.0, 1.0, 2.0, 3.0, 4.0], dtype=float)
ys = np.array([-3.0, -1.0, 1.0, 3.0, 5.0, 7.0], dtype=float)
model = tf.keras.Sequential([SimpleDense(units=1)])
model.compile(optimizer='sgd', loss='mean_squared_error')
```

model.fit(xs, ys, epochs=500, verbose=0)

print(model.predict([10.0]))

```
xs = np.array([-1.0, 0.0, 1.0, 2.0, 3.0, 4.0], dtype=float)
ys = np.array([-3.0, -1.0, 1.0, 3.0, 5.0, 7.0], dtype=float)
model = tf.keras.Sequential([SimpleDense(units=1)])
model.compile(optimizer='sgd', loss='mean_squared_error')
model.fit(xs, ys, epochs=500, verbose=0)
```

import numpy as np

print(model.predict([10.0]))

```
[[18.981468]]
```

```
[<tf.Variable
'sequential_15/simple_dense_19/kernel:0' shape=(1, 1)
dtype=float32, numpy=array([[1.9972587]],
dtype=float32)>, <tf.Variable</pre>
'sequential_15/simple_dense_19/bias:0' shape=(1,)
dtype=float32, numpy=array([-0.991501],
dtype=float32)>]
```

```
model = tf.keras.models.Sequential([
  tf.keras.layers.Flatten(input_shape=(28, 28)),
  tf.keras.layers.Dense(128, activation='relu'),
  tf.keras.layers.Dropout(0.2),
  tf.keras.layers.Dense(10)
```

```
model = tf.keras.models.Sequential([
  tf.keras.layers.Flatten(input_shape=(28, 28)),
  tf.keras.layers.Dense(128, activation='relu'),
  tf.keras.layers.Dropout(0.2),
  tf.keras.layers.Dense(10)
```

```
model = tf.keras.models.Sequential([
  tf.keras.layers.Flatten(input_shape=(28, 28)),
  SimpleDense(128),
  tf.keras.layers.Dropout(0.2),
  tf.keras.layers.Dense(10)
```

```
model = tf.keras.models.Sequential([
  tf.keras.layers.Flatten(input_shape=(28, 28)),
  SimpleDense(128),
 tf.keras.layers.Lambda(my_relu),
  tf.keras.layers.Dropout(0.2),
  tf.keras.layers.Dense(10)
```

```
model = tf.keras.models.Sequential([
  tf.keras.layers.Flatten(input_shape=(28, 28)),
  tf.keras.layers.Dense(128, activation='relu'),
  tf.keras.layers.Dropout(0.2),
  tf.keras.layers.Dense(10)
```

```
model = tf.keras.models.Sequential([
  tf.keras.layers.Flatten(input_shape=(28, 28)),
  tf.keras.layers.Dense(128, activation='relu'),
  tf.keras.layers.Dropout(0.2),
  tf.keras.layers.Dense(10)
```

```
model = tf.keras.models.Sequential([
  tf.keras.layers.Flatten(input_shape=(28, 28)),
 SimpleDense(128),
  tf.keras.layers.Lambda(my_relu),
  tf.keras.layers.Dropout(0.2),
  tf.keras.layers.Dense(10)
```

```
def __init__(self, units=32):
    super(SimpleDense, self).__init__()
    self.units = units
def build(self, input_shape): # Create the state of the layer (weights)
 w_init = tf.random_normal_initializer()
  self.w = tf.Variable(name="kernel",
      initial_value=w_init(shape=(input_shape[-1], self.units), dtype='float32'),
      trainable=True)
  b_init = tf.zeros_initializer()
  self.b = tf.Variable(name="bias",
      initial_value=b_init(shape=(self.units,), dtype='float32'),
      trainable=True)
def call(self, inputs): # Defines the computation from inputs to outputs
```

```
def __init__(self, units=32):
    super(SimpleDense, self).__init__()
    self.units = units
def build(self, input_shape): # Create the state of the layer (weights)
  w_init = tf.random_normal_initializer()
  self.w = tf.Variable(name="kernel",
      initial_value=w_init(shape=(input_shape[-1], self.units), dtype='float32'),
      trainable=True)
  b_init = tf.zeros_initializer()
  self.b = tf.Variable(name="bias",
      initial_value=b_init(shape=(self.units,), dtype='float32'),
      trainable=True)
def call(self, inputs): # Defines the computation from inputs to outputs
    return tf.matmul(inputs, self.w) + self.b
```

```
def __init__(self, units=32):
    super(SimpleDense, self).__init__()
    self.units = units
def build(self, input_shape): # Create the state of the layer (weights)
 w_init = tf.random_normal_initializer()
  self.w = tf.Variable(name="kernel",
      initial_value=w_init(shape=(input_shape[-1], self.units), dtype='float32'),
      trainable=True)
  b_init = tf.zeros_initializer()
  self.b = tf.Variable(name="bias",
      initial_value=b_init(shape=(self.units,), dtype='float32'),
      trainable=True)
def call(self, inputs): # Defines the computation from inputs to outputs
```

```
def __init__(self, units=32):
    super(SimpleDense, self).__init__()
    self.units = units
def build(self, input_shape): # Create the state of the layer (weights)
  w_init = tf.random_normal_initializer()
  self.w = tf.Variable(name="kernel",
      initial_value=w_init(shape=(input_shape[-1], self.units), dtype='float32'),
      trainable=True)
  b_init = tf.zeros_initializer()
  self.b = tf.Variable(name="bias",
      initial_value=b_init(shape=(self.units,), dtype='float32'),
      trainable=True)
def call(self, inputs): # Defines the computation from inputs to outputs
```

```
def __init__(self, units=32):
    super(SimpleDense, self).__init__()
    self.units = units
def build(self, input_shape): # Create the state of the layer (weights)
  w_init = tf.random_normal_initializer()
  self.w = tf.Variable(name="kernel",
      initial_value=w_init(shape=(input_shape[-1], self.units), dtype='float32'),
      trainable=True)
  b_init = tf.zeros_initializer()
  self.b = tf.Variable(name="bias",
      initial_value=b_init(shape=(self.units,), dtype='float32'),
      trainable=True)
def call(self, inputs): # Defines the computation from inputs to outputs
    return tf.matmul(inputs, self.w) + self.b
```

```
def __init__(self, units=32, activation=None):
    super(SimpleDense, self).__init__()
    self.units = units
    self.activation = tf.keras.activations.get(activation)

def call(self, inputs):
```

return self.activation(tf.matmul(inputs, self.w) + self.b)

```
def __init__(self, units=32, activation=None):
    super(SimpleDense, self).__init__()
    self.units = units
    self.activation = tf.keras.activations.get(activation)
```

return self.activation(tf.matmul(inputs, self.w) + self.b)

class SimpleDense(Layer):

def call(self, inputs):

```
def __init__(self, units=32, activation=None):
    super(SimpleDense, self).__init__()
    self.units = units
    self.activation = tf.keras.activations.get(activation)
```

```
def call(self, inputs):
    return self.activation(tf.matmul(inputs, self.w) + self.b)
```

```
def __init__(self, units=32, activation=None):
    super(SimpleDense, self).__init__()
    self.units = units
    self.activation = tf.keras.activations.get(activation)
```

```
def call(self, inputs):
    return self.activation(tf.matmul(inputs, self.w) + self.b)
```

```
model = tf.keras.models.Sequential([
   tf.keras.layers.Flatten(input_shape=(28, 28)),
   SimpleDense(128, activation='relu'),
   tf.keras.layers.Dropout(0.2),
   tf.keras.layers.Dense(10, activation='softmax')
])
```

```
model = tf.keras.models.Sequential([
   tf.keras.layers.Flatten(input_shape=(28, 28)),
   SimpleDense(128, activation='relu'),
   tf.keras.layers.Dropout(0.2),
   tf.keras.layers.Dense(10, activation='softmax')
])
```