



빅데이터와 머신러닝 소프트웨어

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TensorFlow

▣ Symbolic graph style: define-and-run

- ▶ Step 1 : Define a graph, which contains model architecture, parameter specifications, optimization process, etc.
- ▶ Step 2 : Run the graph through a session (`Session.run()`), a binding to a particular execution context (e.g. CPU, GPU)
 - Initialize the session
 - Feed data and fetch results

TensorFlow Programming Example

Define a graph: $h = \text{ReLU}(Wx + b)$

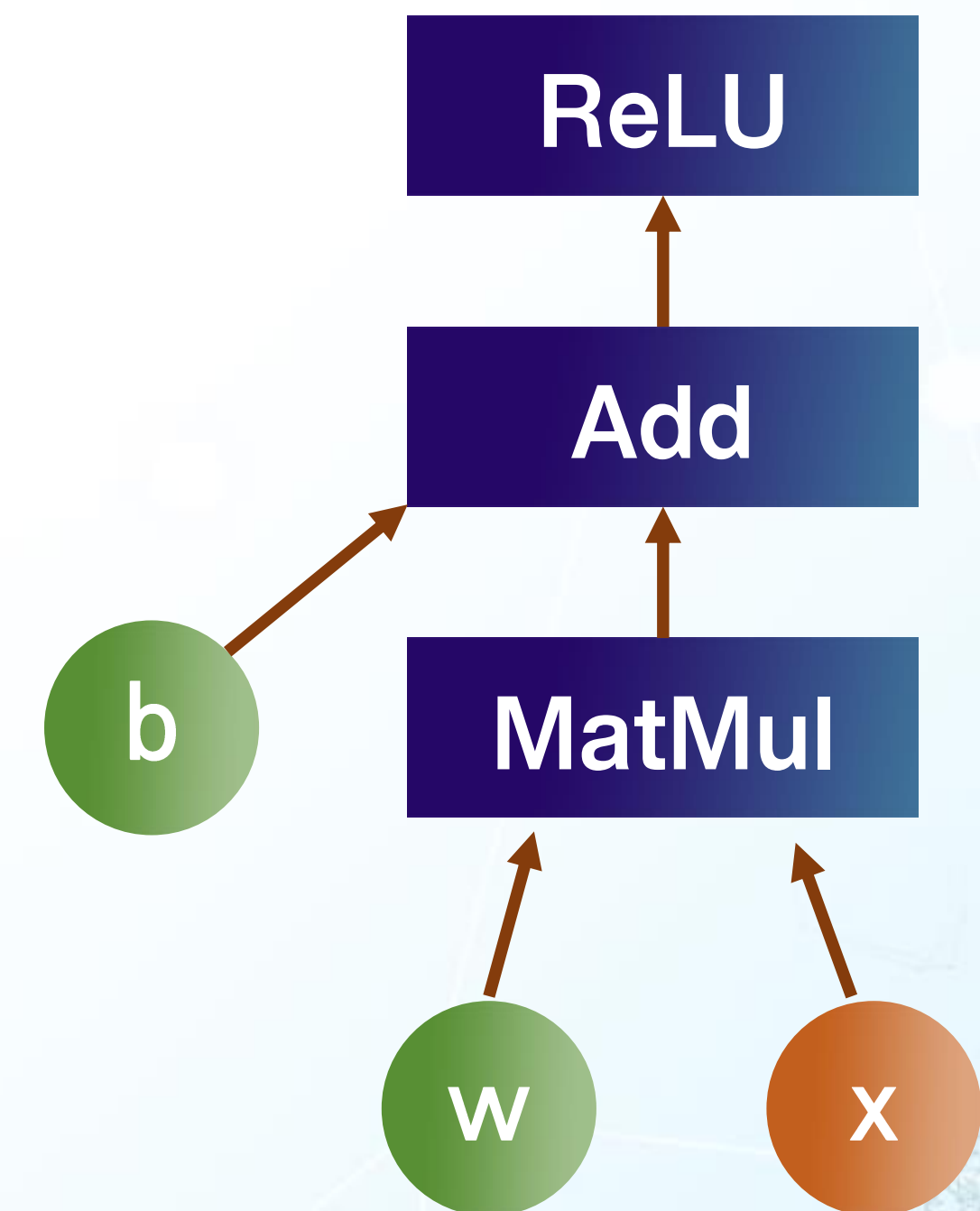
```
import tensorflow as tf
```

```
b = tf.get_variable('bias', tf.zeros((100,)))
```

```
W = tf.get_variable('weights',  
                    tf.random_uniform((784, 100), -1, 1))
```

```
x = tf.placeholder(tf.float32, (None, 784))
```

```
h = tf.nn.relu(tf.matmul(x, W) + b)
```



TensorFlow Programming Example

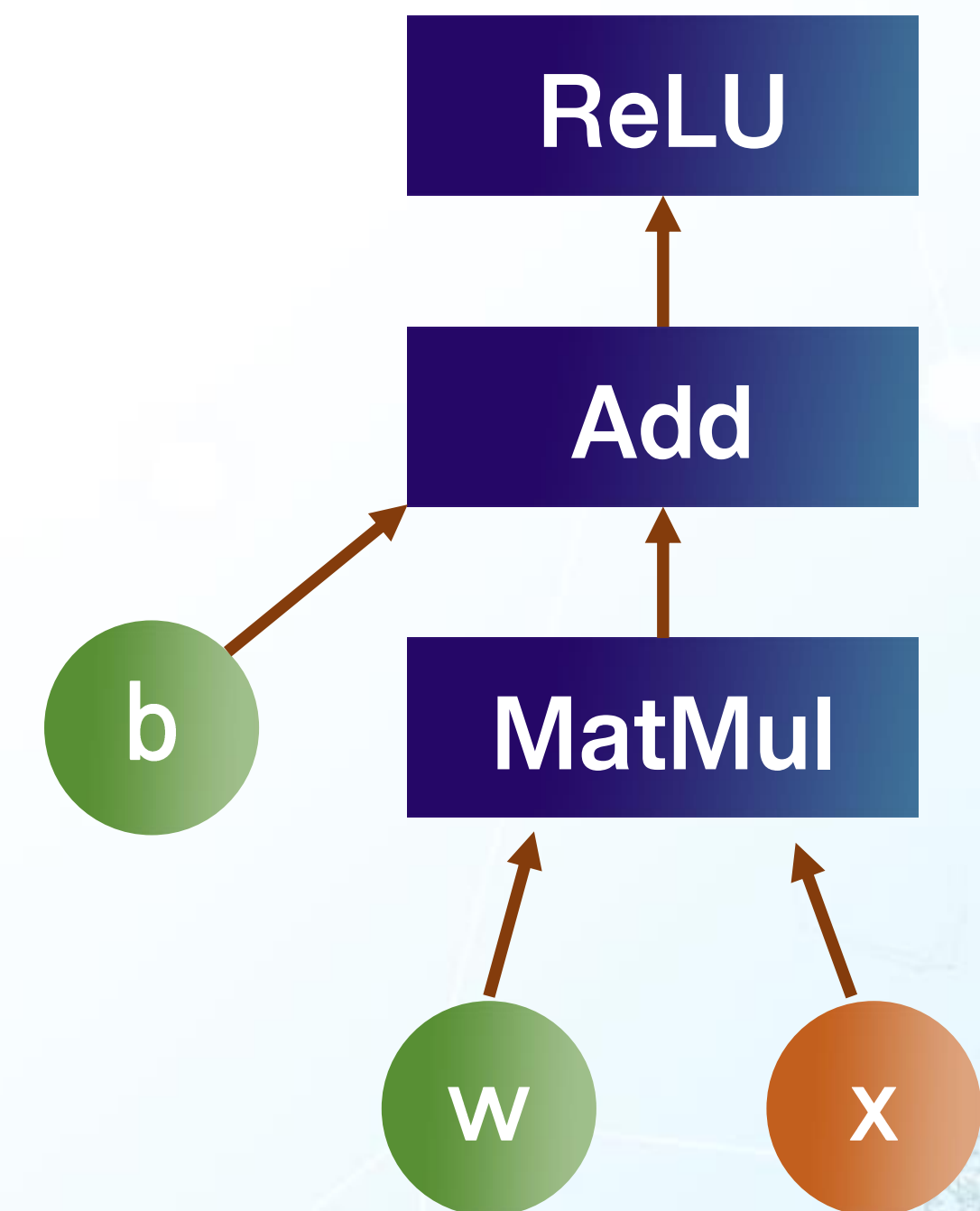
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TensorFlow Programming Example

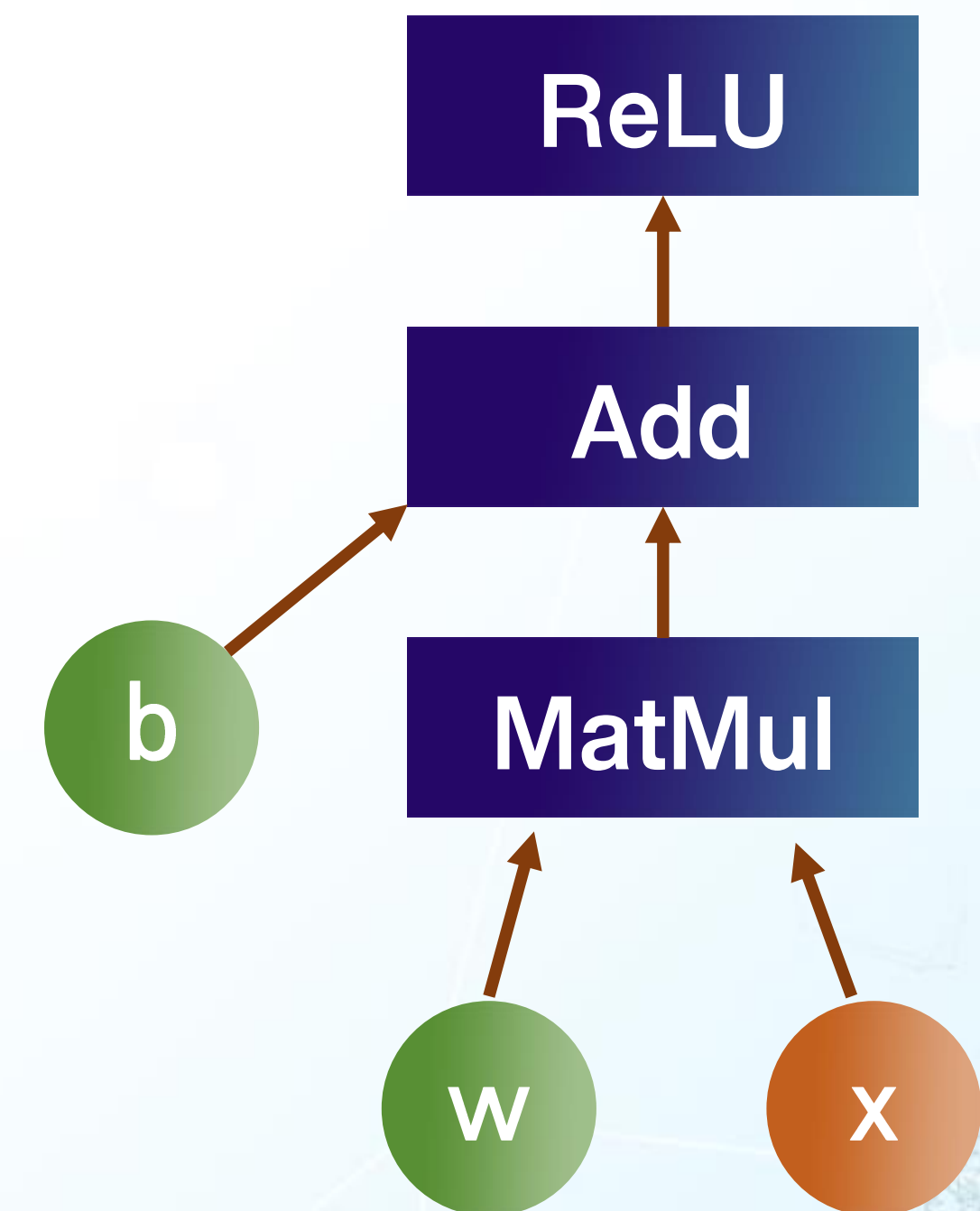
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TensorFlow Programming Example

Define a graph

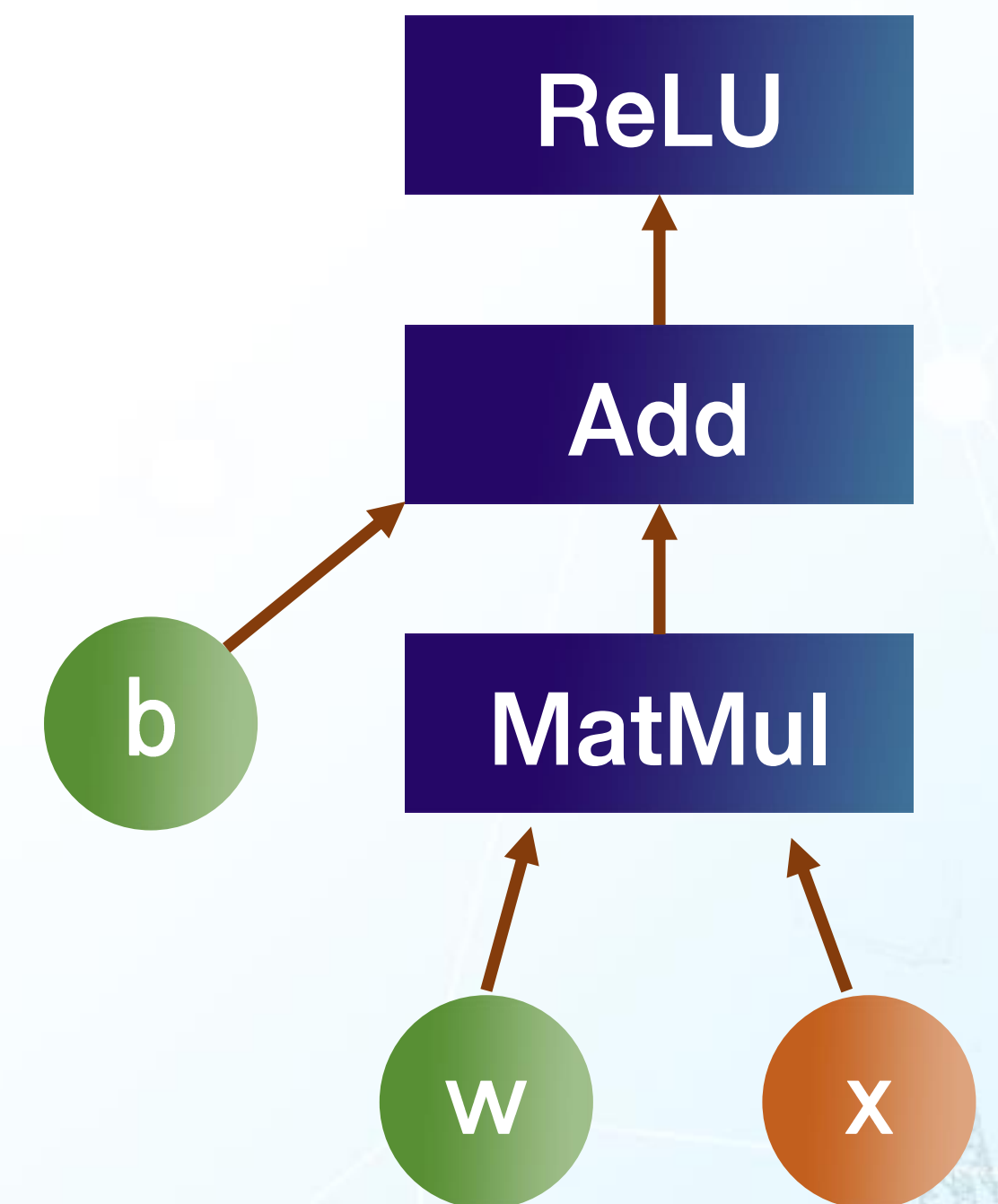
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TensorFlow Programming Example

▣ We can deploy the graph with a session

```
import tensorflow as tf
import numpy as np

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W = tf.get_variable('weights',
                    tf.random_uniform((784, 100), -1, 1))
x = tf.placeholder(tf.float32, (None, 784))
h = tf.nn.relu(tf.matmul(x, W) + b)

sess = tf.Session()
sess.run(tf.initialize_all_variables())
sess.run(h, {x: np.random.random(64, 784)})
```

TensorFlow Eager Mode

- ▣ Enabling eager execution requires two lines of code

```
import tensorflow as tf
import tensorflow.contrib.eager as tfe
tfe.enable_eager_execution() # Call this at program start-up
```

- ▣ Lets you write code that you can easily execute in a REPL

```
x = [[3.]] # No need for placeholders!
m = tf.matmul(x, x)
print(m) # No sessions!
# tf.Tensor([[9.]], shape=(1, 1), dtype=float32)
```


TensorFlow Example: Linear Regression

```
import tensorflow as tf
import utils
DATA_FILE = "data/system_cpuutil_applatency.txt"

# Step 1: read in data from the .txt file
# data is a numpy array of shape (100000, 2), each row is a datapoint
data, n_samples = utils.read_system_cpuutil_applatency(DATA_FILE)

# Step 2: create placeholders for X (CPU util) and Y (App latency)
X = tf.placeholder(tf.float32, name='X')
Y = tf.placeholder(tf.float32, name='Y')
```

TensorFlow Example: Linear Regression

```
# Step 3: create weight and bias, initialized to 0
w = tf.get_variable('weights', initializer=tf.constant(0.0))
b = tf.get_variable('bias', initializer=tf.constant(0.0))

# Step 4: construct model to predict Y (app latency from CPU util)
Y_predicted = w * X + b

# Step 5: use the square error as the loss function
loss = tf.square(Y - Y_predicted, name='loss')

# Step 6: using gradient descent with learning rate of 0.01 to minimize loss
optimizer = tf.train.GradientDescentOptimizer(learning_rate=0.001)
optimizer.minimize(loss)
```

TensorFlow Example: Linear Regression

```
with tf.Session() as sess:  
    # Step 7: initialize the necessary variables, in this case, w and b  
    sess.run(tf.global_variables_initializer())  
  
    # Step 8: train the model  
    for i in range(100): # run 100 epochs  
        for x, y in data:  
            # Session runs train_op to minimize loss  
            sess.run(optimizer, feed_dict={X: x, Y:y})  
  
    # Step 9: output the values of w and b  
    w_out, b_out = sess.run([w, b])
```


TensorFlow Dataset

```
dataset = tf.data.FixedLengthRecordDataset([file1, file2, file3, ...])
iterator = dataset.make_initializable_iterator()
...
for i in range(100):
    sess.run(iterator.initializer)
    total_loss = 0
    try:
        while True:
            sess.run([optimizer])
    except tf.errors.OutOfRangeError:
        pass
```

TensorFlow Dataset

▣ Shuffle, repeat, batch your data

```
dataset = dataset.shuffle(1000)
dataset = dataset.repeat(100)
dataset = dataset.batch(128)
```

▣ Map each element of your dataset to transform it in a specific way to create a new dataset

```
dataset = dataset.map(lambda x: tf.one_hot(x, 10))
# convert each element of dataset to one_hot vector
```