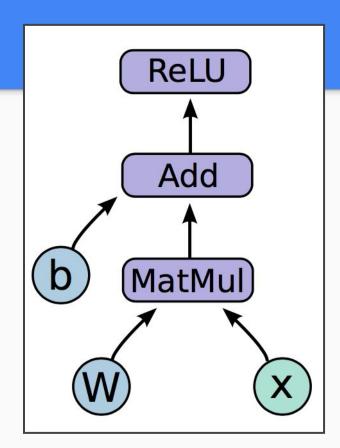
## TensorFlow and R

**Mochan Shrestha** 

#### What is TensorFlow

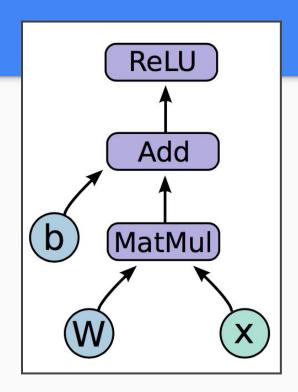
- Library that allows distributed numeric computation
- Computation is expressed as a graph
  - Graph nodes are operations
  - Graph edges are tensors (n-dimensional arrays, n-index matrices)

$$h_i = \text{ReLU}(Wx + b)$$



#### **TensorFlow Model**

- Variables are nodes with values (retained across multiple executions of a graph) - here W and b
- Placeholders are inputs here X



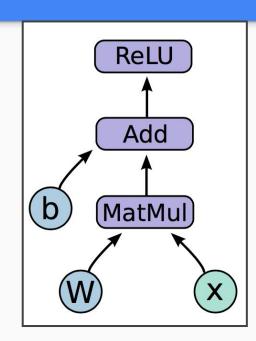
## In code (variables setup)

```
library(tensorflow)

x = tf$placeholder(tf$float32,
shape=shape(NULL, 7))

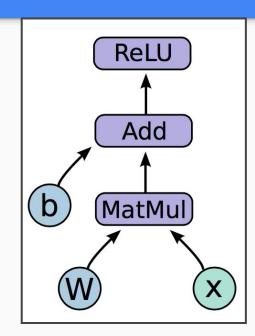
b = tf$Variable(tf$zeros(list(10)))

W = tf$Variable(tf$random_uniform(list(7L,10L), -1, 1))
```



## In code (computation graph)

Basic block of a neuron computation



## In code (execution)

```
sess = tf$Session()
sess$run(tf$global_variables_initializer())

xp = matrix(runif(5*7), 5, 7)
sess$run(h i, dict(x = xp))
```

#### Installing TensorFlow for R

- Install the R-package devtools and then R-tools
- Get the package from github and build it using the command: devtools::install github("rstudio/tensorflow")
- Setup the relevant python environment to run TensorFlow
  - Install Anaconda for Python
  - Use pip to get the TensorFlow package
  - If using GPU, install CUDA and then CuDNN

#### Hello World

- HelloWorld example (HelloWorld.R)
- Basic computation example (Basic.R)
- Computation Graph from before example (CompGraph.R)

## TensorBoard (Visualization Tool)

- Visualize TensorFlow graph
  - Grouped by name-scopes
  - Expands to show each operation
- Plots: Statistical and 3d embeddings
- Images and Audio
- Graph of Example Computation Graph (CompGraphTensorBoard.R)

### TensorFlow for Machine Learning

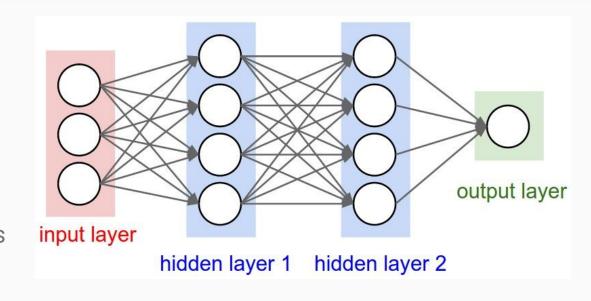
- Provides library of functions for machine learning and neural networks (deep learning) operations (on top of matrix operations)
- Computation graph leads very naturally to automated gradient computation - implemented function also has known derivatives and can optimize chain rule computations
- So optimization using stochastic gradient descent can be done on any computation graph

# Example (Regression using Gradient Descent)

- Regression using gradient descent (GradDesc.R)
- TensorBoard visualization (GradDescTensorBoard.R)

#### **Neural Networks**

- 1. Directional Graph
- Each layer is only connected to the one below it
- 3. Each edge is given a weight, each node a bias
- 4. Each input activates nodes based on the weights and biases

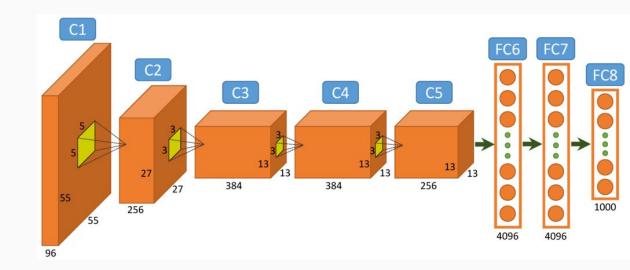


## Using Fully Connected Neural Networks for IRIS dataset

- Neural Network for IRIS dataset (iris.R)
- TensorBoard for the above model (irisTensorBoard.R)

#### Convolutional Neural Networks

- Modeled after the visual cortex and effective for image and video machine learning
- More 2D local connections



#### MNIST Dataset

Dataset of hand-written digits



### Sample MNIST Machine Learning

- Single Layer classified (mnist\_softmax.R)
- Multi Layer fully connected (fully\_connected\_feed.R)
- Multi-layer convnet No Example :(

```
conv2d <- function(x, W) {
    tf$nn$conv2d(x, W, strides=c(1L, 1L, 1L, 1L), padding='SAME')
}
h conv1 <- tf$nn$relu(conv2d(x image, W conv1) + b conv1)</pre>
```

#### Questions?

Slides and code will be uploaded to github:

https://github.com/MochanShrestha

Will add ConvNet example to the repo.