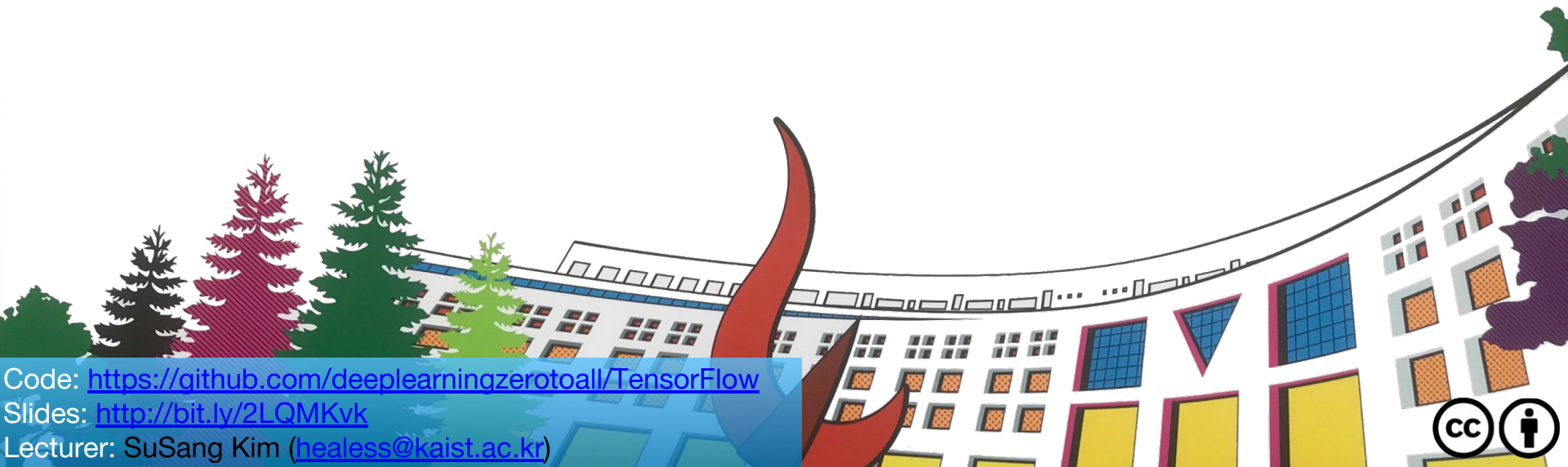


ML/DL for Everyone Season2

with  TensorFlow

Lab 05-1 Logistic Regression



Code: <https://github.com/deeplearningzerotoall/TensorFlow>

Slides: <http://bit.ly/2LQMKvk>

Lecturer: SuSang Kim (healeess@kaist.ac.kr)



Logistic Regression

- What is Logistic Regression?
 - Classification
 - Logistic vs Linear
- How to solve?
 - Hypothesis Representation
 - Sigmoid/Logistic Function
 - Decision Boundary
 - Cost Function
 - Optimizer (Gradient Descent)
- Codes
- Summary

Classification

What is Binary(Multi-class) Classification?

variable is either 0 or 1 (0:positive / 1:negative)

- Exam : Pass or Fail
- Spam : Not Spam or Spam
- Face : Real or Fake
- Tumor : Not Malignant or Malignant

To start with machine learning, you must encode variable [0,1]

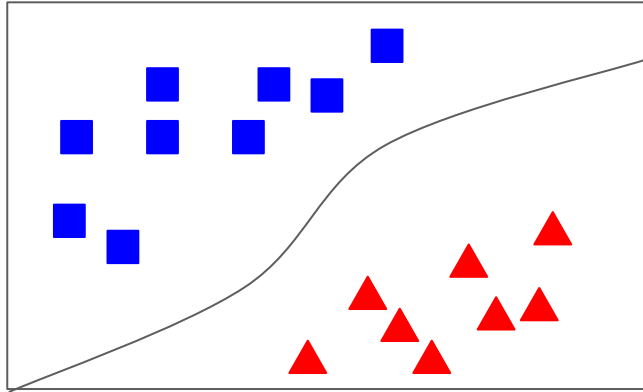
[Python Code]

```
x_train = [[1, 2], [2, 3], [3, 1], [4, 3], [5, 3], [6, 2]]
```

```
y_train = [[0], [0], [0], [1], [1], [1]] # One Hot
```

Logistic vs Linear

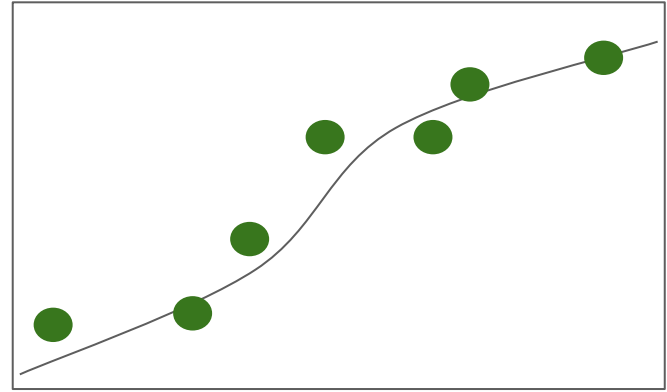
What is the difference between logistic and linear?



Discrete (Counted)

Shoe Size / The number of workers in a company

VS



Continuous (Measured)

Time / Weight / Height

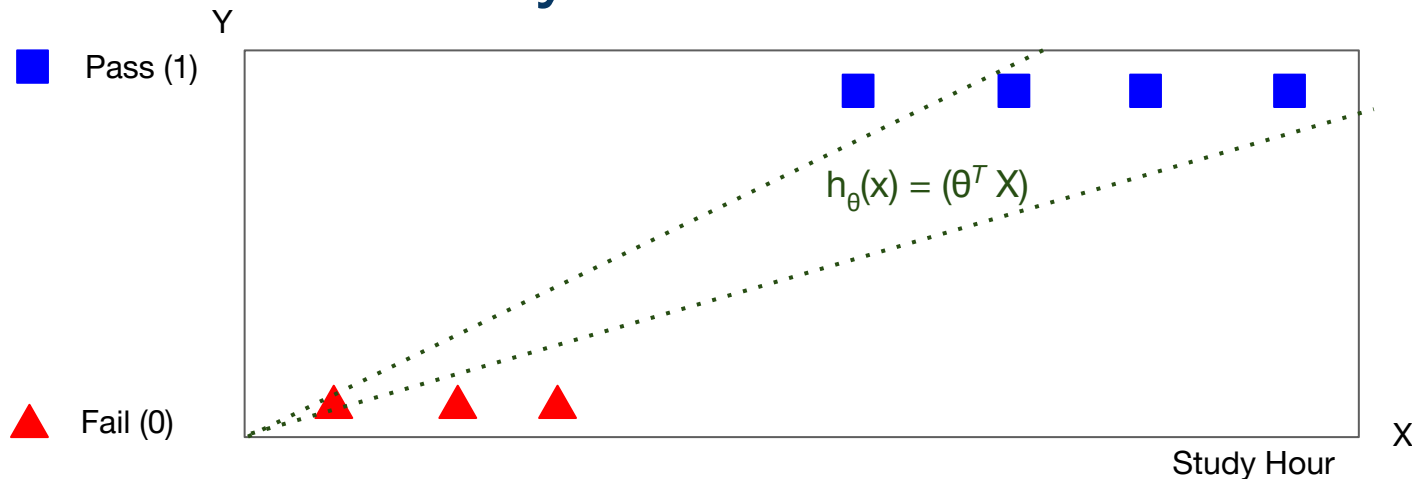
[Python Code]

```
Logistic_Y= [[0], [0], [0], [1], [1], [1]] # One Hot
```

```
Linear_Y = [828.659973, 833.450012, 819.23999, 828.349976, 831.659973] # Numeric
```

Hypothesis Representation

Study Hours \Leftrightarrow Pass/Fail



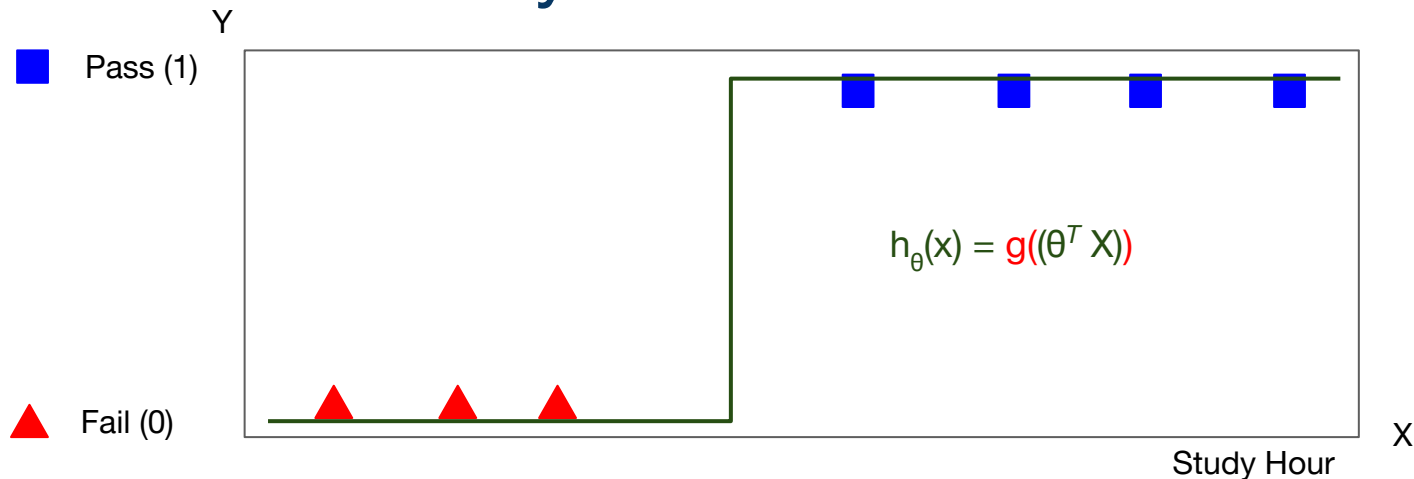
When using linear regression we did $h_{\theta}(x) = (\theta^T X)$
But start with binary classification, Y is only 0 or 1
So we need new function.

[Tensorflow Code]

```
hypothesis = tf.matmul(X,  $\theta$ ) + b #linear  $\theta^T$  is an  $[1 \times n+1]$  matrix /  $\theta_i$  are parameters
```

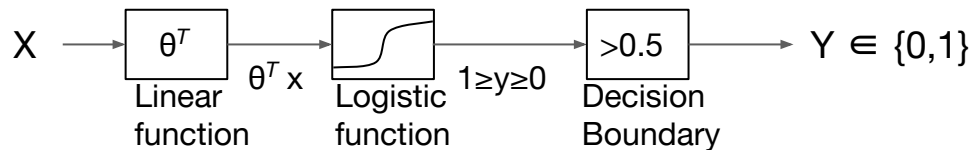
Hypothesis Representation

Study Hours \Leftrightarrow Pass/Fail



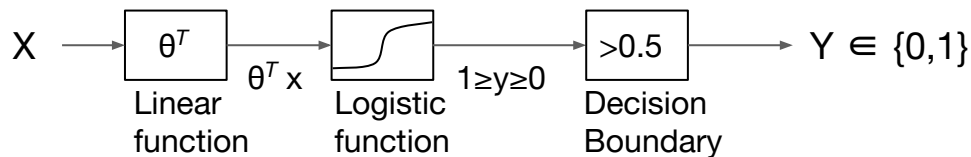
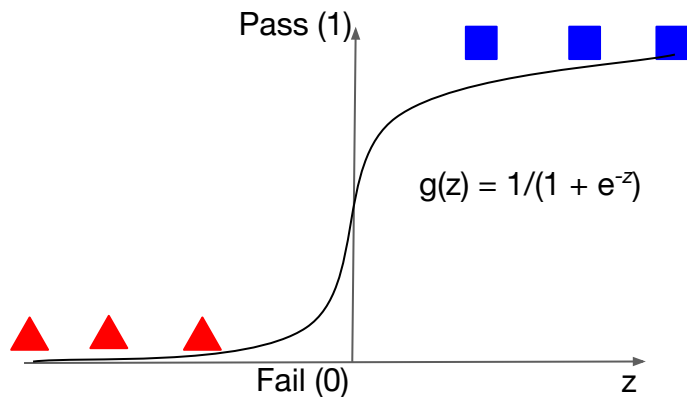
For classification hypothesis representation we do $h_{\theta}(x) = g((\theta^T X))$

What is $g(z)$ Function? (linear function : $z = \theta^T X$)



Sigmoid (Logistic) function

$g(z)$ function out value is between 0 and 1



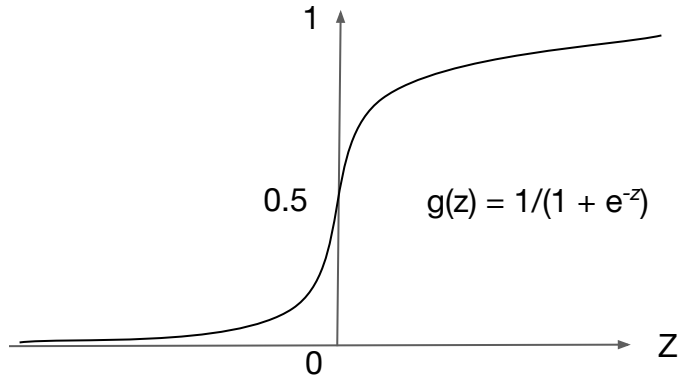
Where we define $g(z) \rightarrow z$ is a real number $\rightarrow g(z) = e^z/(e^z + 1) = 1/(1 + e^{-z})$

[Tensorflow Code]

```
hypothesis = tf.sigmoid(z) # z= tf.matmul(X, W) + b : θ=W  
hypothesis = tf.div(1., 1. + tf.exp(z))
```

Decision Boundary

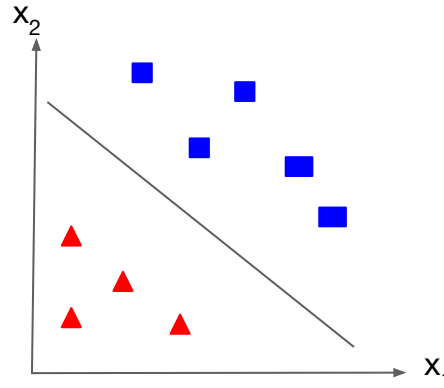
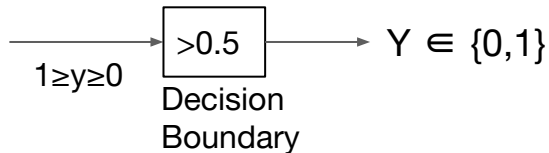
Linear / Non-linear decision boundary



if z is positive, $g(z)$ is **greater than 0.5**

$\theta^T x \geq 0$ then $y = 1$

$\theta^T x < 0$ then $y = 0$



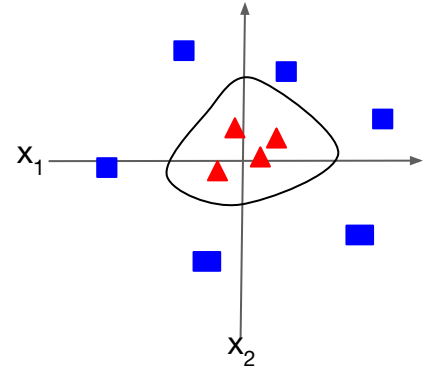
$$h_{\theta}(x) = g(\theta_0 + \theta_1 x_1 + \theta_2 x_2)$$

θ^T is a row vector $[-3, 1, 1]$

$$-3 + x_1 + x_2 \geq 0$$

Decision Boundary $x_1 + x_2 = 0$

※ θ^T is an $[1 \times n+1]$ matrix / θ_i are parameters / (h = hypothesis)



$$h_{\theta}(x) = g(\theta_0 + \theta_1 x_1 + \theta_3 x_1^2 + \theta_4 x_2^2)$$

θ^T was $[-1, 0, 0, 1, 1]$

$$-1 + x_1^2 + x_2^2 \geq 0$$

Decision Boundary $x_1^2 + x_2^2 = 1$

[Tensorflow Code]

```
predicted = tf.cast(hypothesis > 0.5, dtype=tf.int32)
```