



1495

UNIVERSITY OF  
**ABERDEEN**

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1495 – 2020

**ABERDEEN 2040**

# Train a Deep Feed-Forward Neural Network Demonstration

Did it Rain in Seattle from 1948 to 2017?

CSV Dataset

Coding, GIS and Remote Sensing Data for Glaciology

24 April 2024

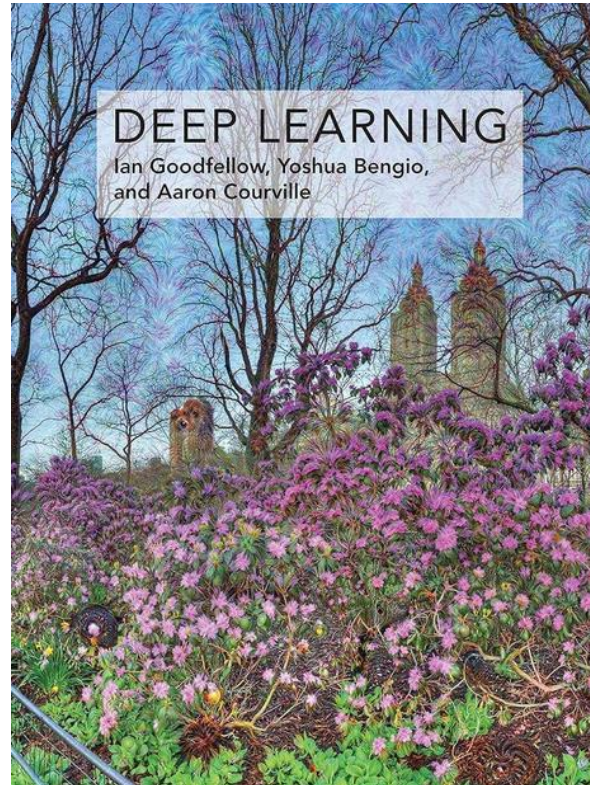
Meston G05

# Overview

1. Background and Theory
2. Training
3. Evaluation
4. Code Run Through



# Additional Reading



Deep Learning – Ian Goodfellow, Yoshua Bengio and Aaron Courville 2017

# Python Code for the Session

The code for the session can be found implemented in PyTorch and TensorFlow at:

GitHub ID: Stevieee83

<https://github.com/Stevieee83>

For our session we will use the PyTorch version but please feel free to use the TensorFlow version if you wish.

# Anaconda Cheat Sheet

<div><h2>CONDA CHEAT SHEET</h2><p>Command line package and environment manager</p><p>Learn to use conda in 30 minutes at <a href="https://bit.ly/tryconda">bit.ly/tryconda</a></p><p><small>TIP: Anaconda Navigator is a graphical interface to use conda. Double-click the Navigator icon on your desktop or in a Terminal or at the Anaconda prompt, type <code>anaconda-navigator</code></small></p></div>	
<b>Conda basics</b>	
Verify conda is installed, check version number	<code>conda info</code>
Update conda to the current version	<code>conda update conda</code>
Install a package included in Anaconda	<code>conda install PACKAGENAME</code>
Run a package after install, example Spyder*	<code>spyder</code>
Update any installed program	<code>conda update PACKAGENAME</code>
Command line help	<code>COMMANDNAME --help</code> <code>conda install --help</code>
<small>*Must be installed and have a deployable command, usually PACKAGENAME</small>	
<b>Using environments</b>	
Create a new environment named py35, install Python 3.5	<code>conda create --name py35 python=3.5</code>
Activate the new environment to use it	WINDOWS: <code>activate py35</code> LINUX, macOS: <code>source activate py35</code>
Get a list of all my environments, active environment is shown with *	<code>conda env list</code>
Make exact copy of an environment	<code>conda create --clone py35 --name py35-2</code>
List all packages and versions installed in active environment	<code>conda list</code>
List the history of each change to the current environment	<code>conda list --revisions</code>
Restore environment to a previous revision	<code>conda install --revision 2</code>
Save environment to a text file	<code>conda list --explicit &gt; bio-env.txt</code>
Delete an environment and everything in it	<code>conda env remove --name bio-env</code>
Deactivate the current environment	WINDOWS: <code>deactivate</code> macOS, LINUX: <code>source deactivate</code>
Create environment from a text file	<code>conda env create --file bio-env.txt</code>
Stack commands: create a new environment, name it bio-env and install the biopython package	<code>conda create --name bio-env biopython</code>
<b>Finding conda packages</b>	
Use conda to search for a package	<code>conda search PACKAGENAME</code>
See list of all packages in Anaconda	<a href="https://docs.anaconda.com/anaconda/packages/pkg-docs">https://docs.anaconda.com/anaconda/packages/pkg-docs</a>

Installing and updating packages		
Install a new package (Jupyter Notebook) in the active environment	<code>conda install jupyter</code>	
Run an installed package (Jupyter Notebook)	<code>jupyter-notebook</code>	
Install a new package (toolz) in a different environment (bio-env)	<code>conda install --name bio-env toolz</code>	
Update a package in the current environment	<code>conda update scikit-learn</code>	
Install a package (boltons) from a specific channel (conda-forge)	<code>conda install --channel conda-forge boltons</code>	
Install a package directly from PyPI into the current active environment using pip	<code>pip install boltons</code>	
Remove one or more packages (toolz, boltons) from a specific environment (bio-env)	<code>conda remove --name bio-env toolz boltons</code>	
Managing multiple versions of Python		
Install different version of Python in a new environment named py34	<code>conda create --name py34 python=3.4</code>	
Switch to the new environment that has a different version of Python	Windows: <code>activate py34</code> Linux, macOS: <code>source activate py34</code>	
Show the locations of all versions of Python that are currently in the path	Windows: <code>where python</code> Linux, macOS: <code>which -a python</code>	
<b>NOTE:</b> The first version of Python in the list will be executed.		
Show version information for the current active Python	<code>python --version</code>	
Specifying version numbers		
Ways to specify a package version number for use with conda create or conda install commands, and in meta.yaml files.		
Constraint type	Specification	Result
Fuzzy	<code>numpy=1.11</code>	1.11.0, 1.11.1, 1.11.2, 1.11.18 etc.
Exact	<code>numpy==1.11</code>	1.11.0
Greater than or equal to	<code>"numpy&gt;=1.11"</code>	1.11.0 or higher
OR	<code>"numpy=1.11.1 1.11.3"</code>	1.11.1, 1.11.3
AND	<code>"numpy&gt;=1.8,&lt;2"</code>	1.8, 1.9, not 2.0
<b>NOTE:</b> Quotation marks must be used when your specification contains a space or any of these characters: > <   *		
MORE RESOURCES		
Free Community Support	<a href="https://groups.google.com/a/continuum.io/forum/#forum/conda">groups.google.com/a/continuum.io/forum/#forum/conda</a>	
Online Documentation	<a href="https://conda.io/docs">conda.io/docs</a>	
Command Reference	<a href="https://conda.io/docs/commands">conda.io/docs/commands</a>	
Paid Support Options	<a href="https://anaconda.com/support">anaconda.com/support</a>	
Anaconda Onsite Training Courses	<a href="https://anaconda.com/training">anaconda.com/training</a>	
Anaconda Consulting Services	<a href="https://anaconda.com/consulting">anaconda.com/consulting</a>	
Follow us on Twitter @anacondaInc and join the #AnacondaCrew!		

[https://docs.conda.io/projects/conda/en/4.6.0/\\_downloads/52a95608c49671267e40c689e0bc00ca/conda-cheatsheet.pdf](https://docs.conda.io/projects/conda/en/4.6.0/_downloads/52a95608c49671267e40c689e0bc00ca/conda-cheatsheet.pdf)



# Did it Rain in Seattle from 1948 to 2017?

- Tabular CSV dataset with over 25 000 examples

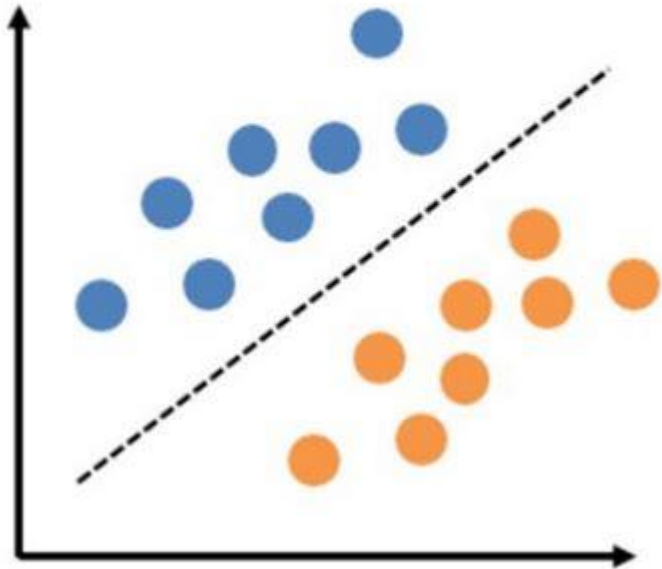


Kaggle.com Dataset Link:

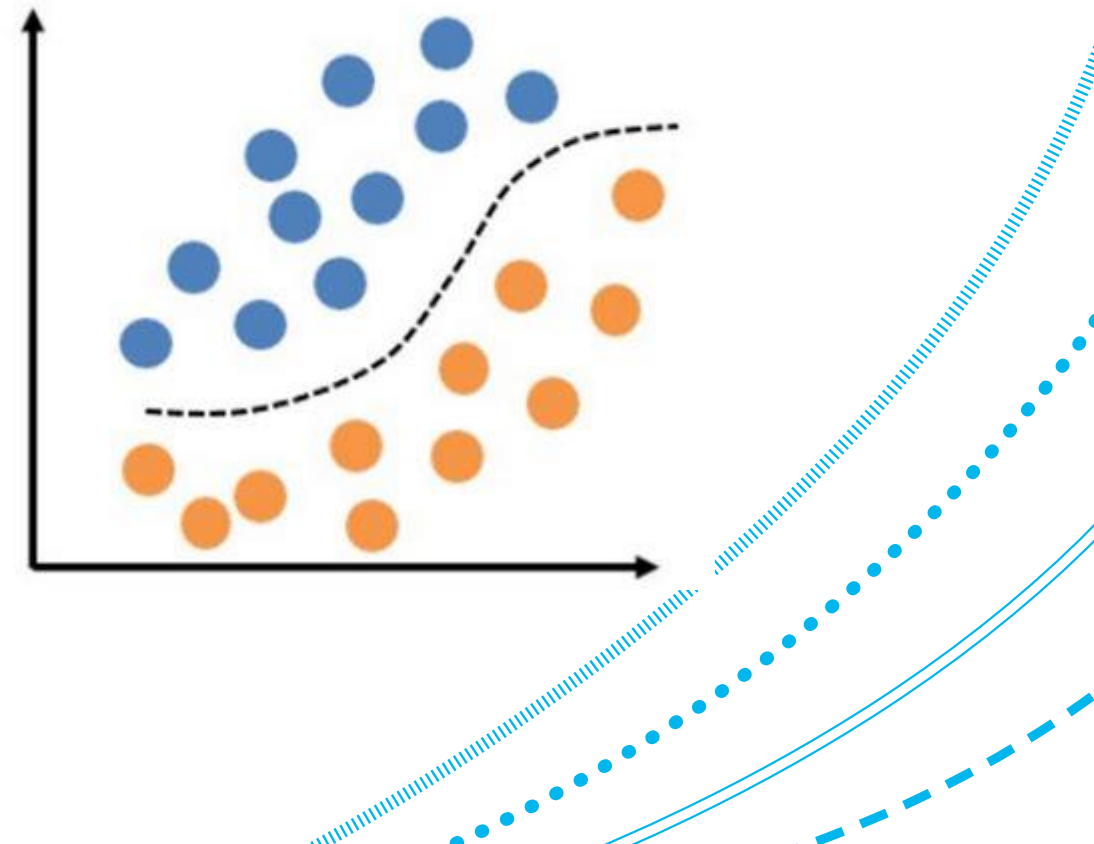
<https://www.kaggle.com/datasets/rtatman/did-it-rain-in-seattle-19482017>

# Exploratory Data Analysis

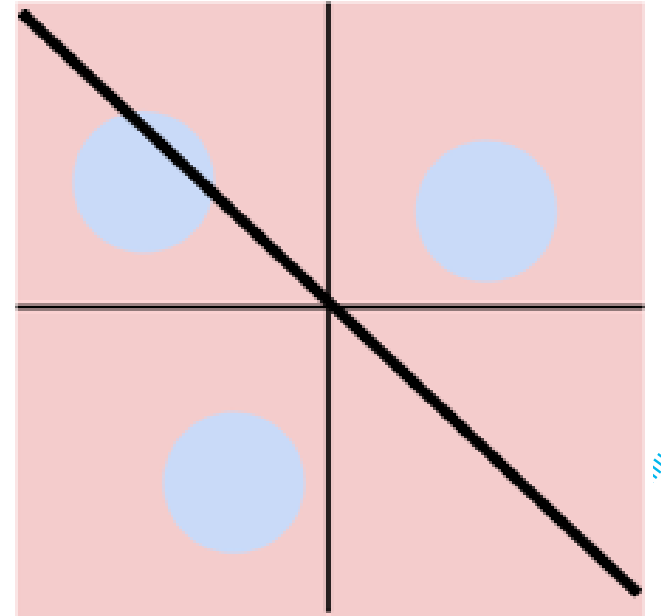
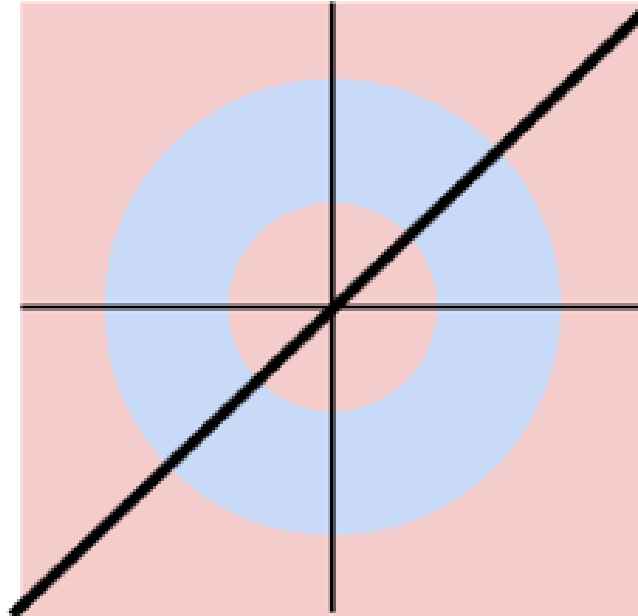
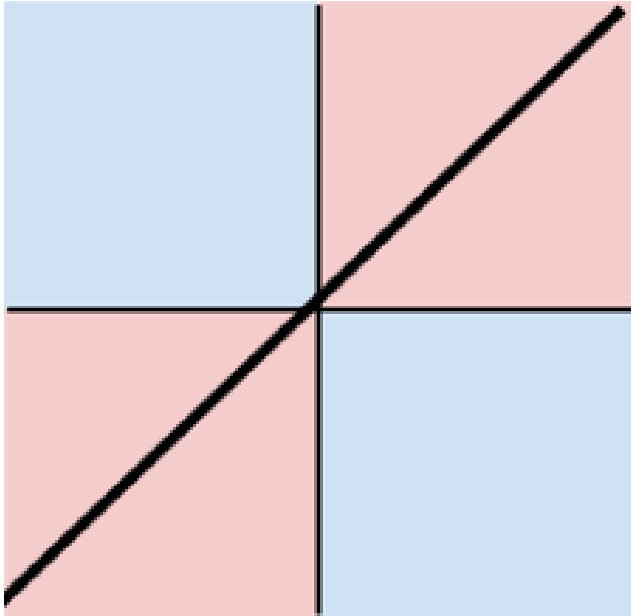
Linear



Nonlinear



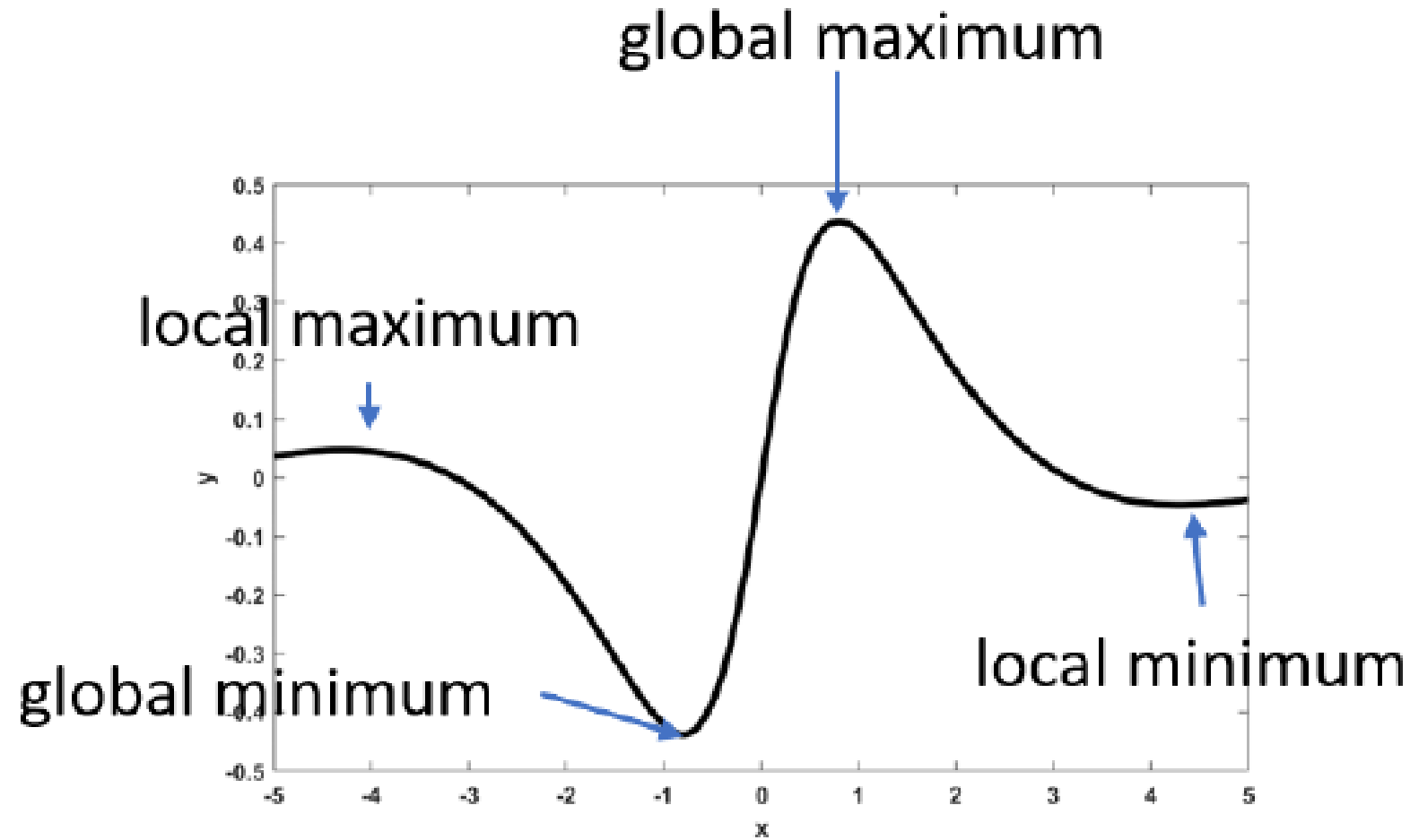
# Linear Classifiers



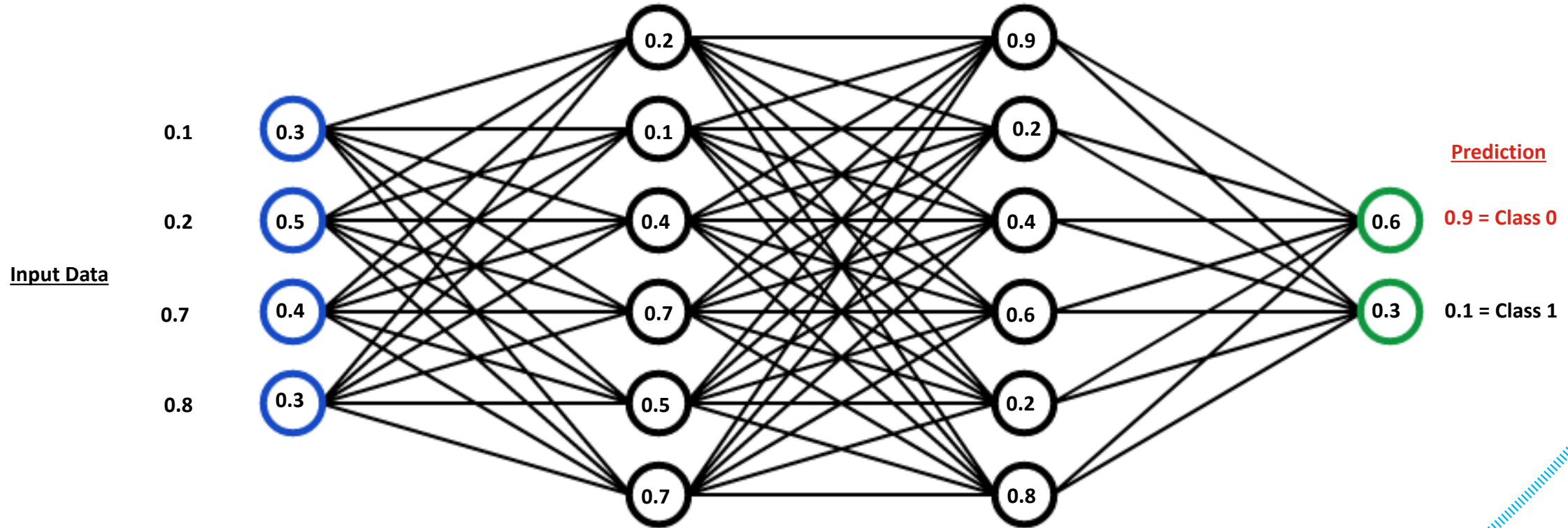
<https://cs231n.stanford.edu/>



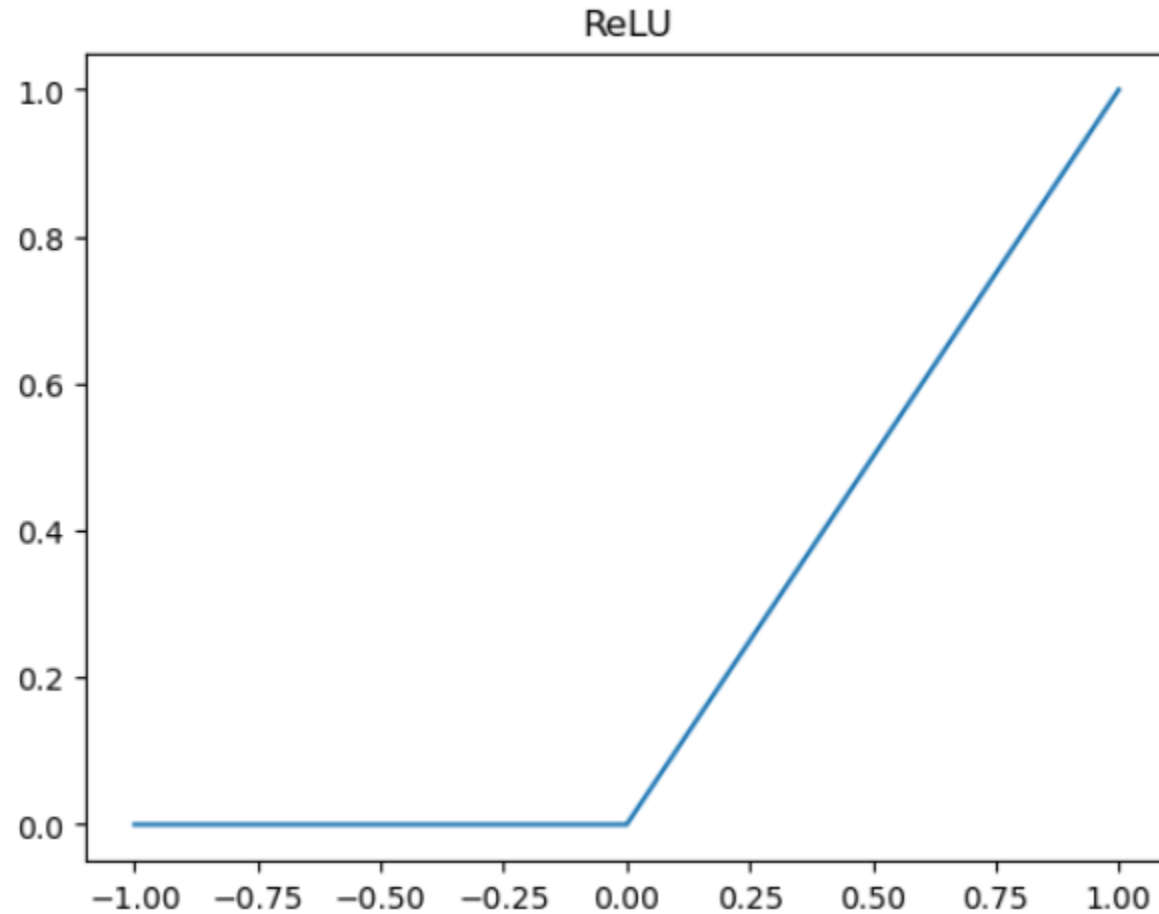
# Gradient Descent



# Feed-Forward Neural Network (FNN)

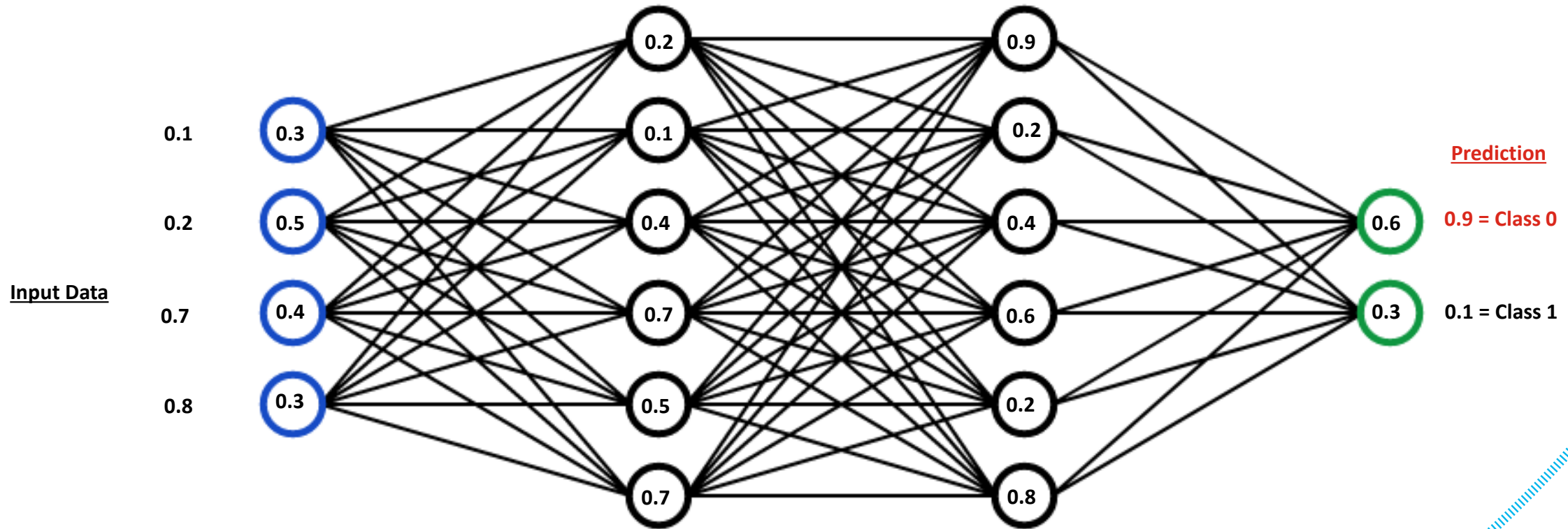


# Rectified Linear Unit (ReLU)

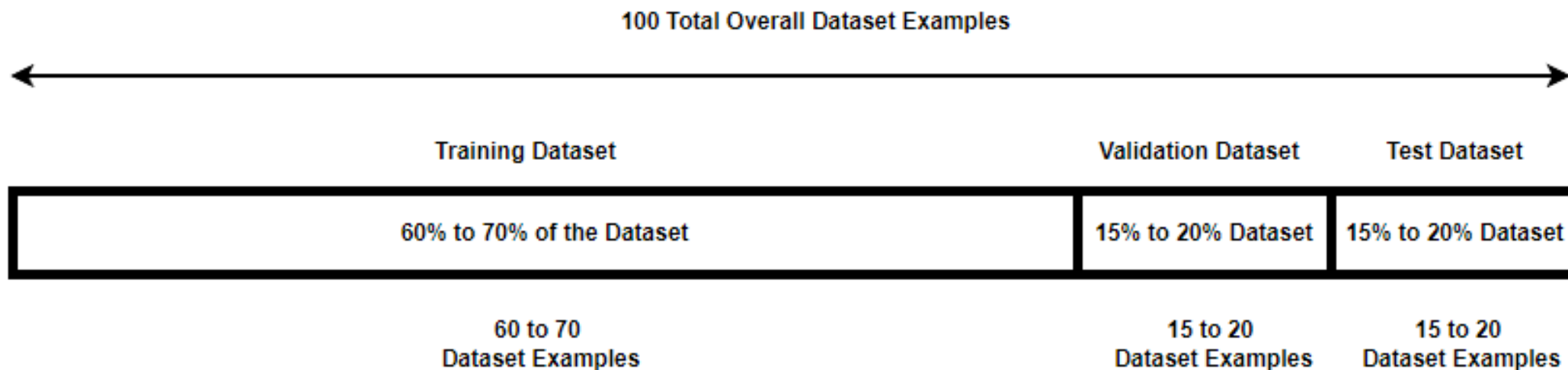


$$f(x) = x^+ = \max(0, x) = \frac{x + |x|}{2} = \begin{cases} x & \text{if } x > 0, \\ 0 & \text{otherwise.} \end{cases} \quad f'(x) = \begin{cases} 1 & \text{if } x > 0, \\ 0 & \text{if } x < 0. \end{cases}$$

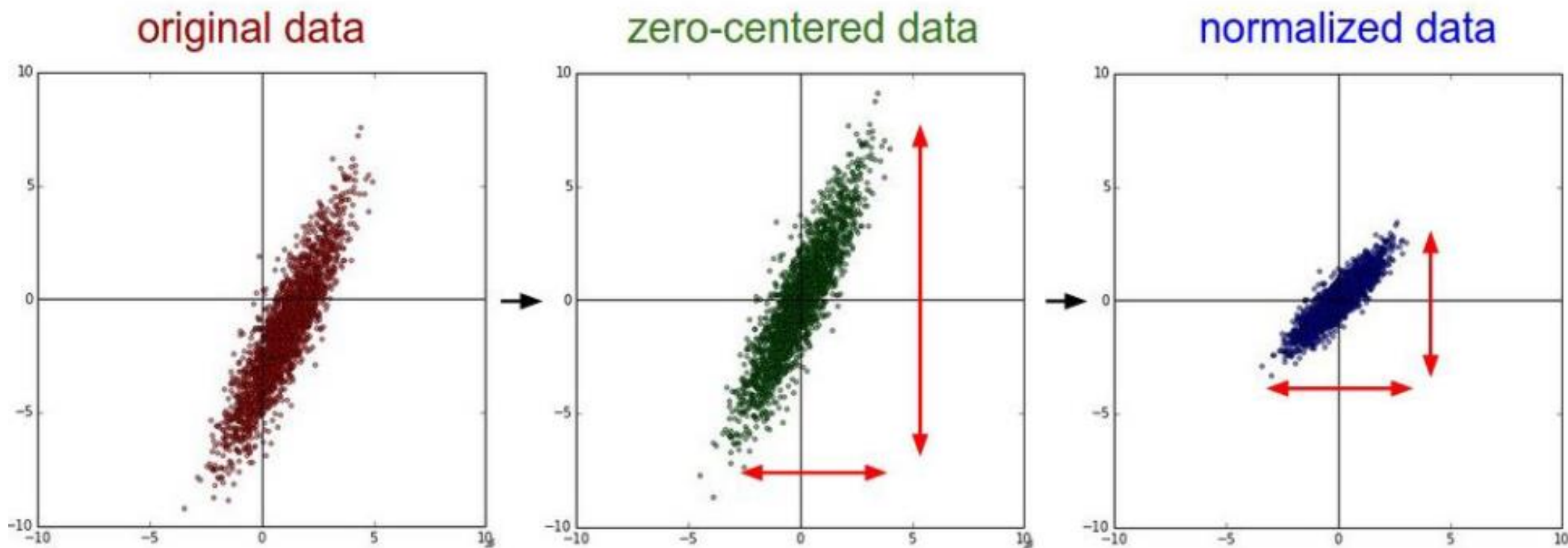
# Feed-Forward Neural Network (FNN)



# Hold Out Cross Validation



# Data Normalisation

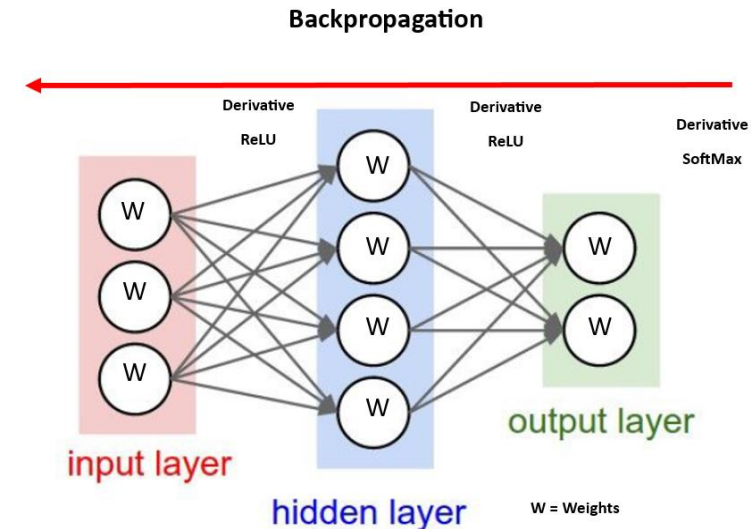
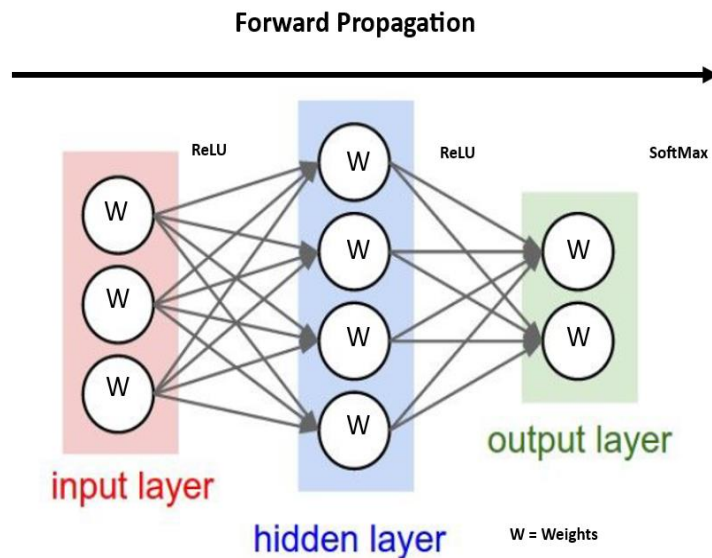


<https://cs231n.stanford.edu/>

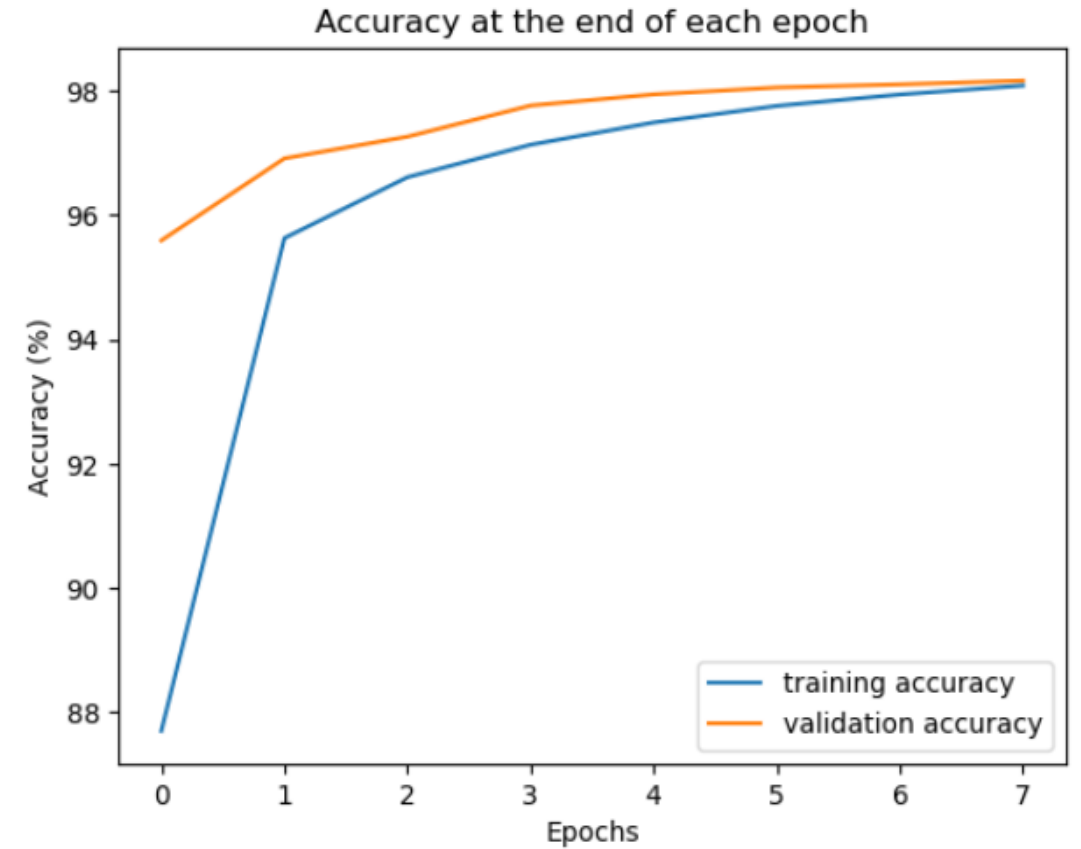
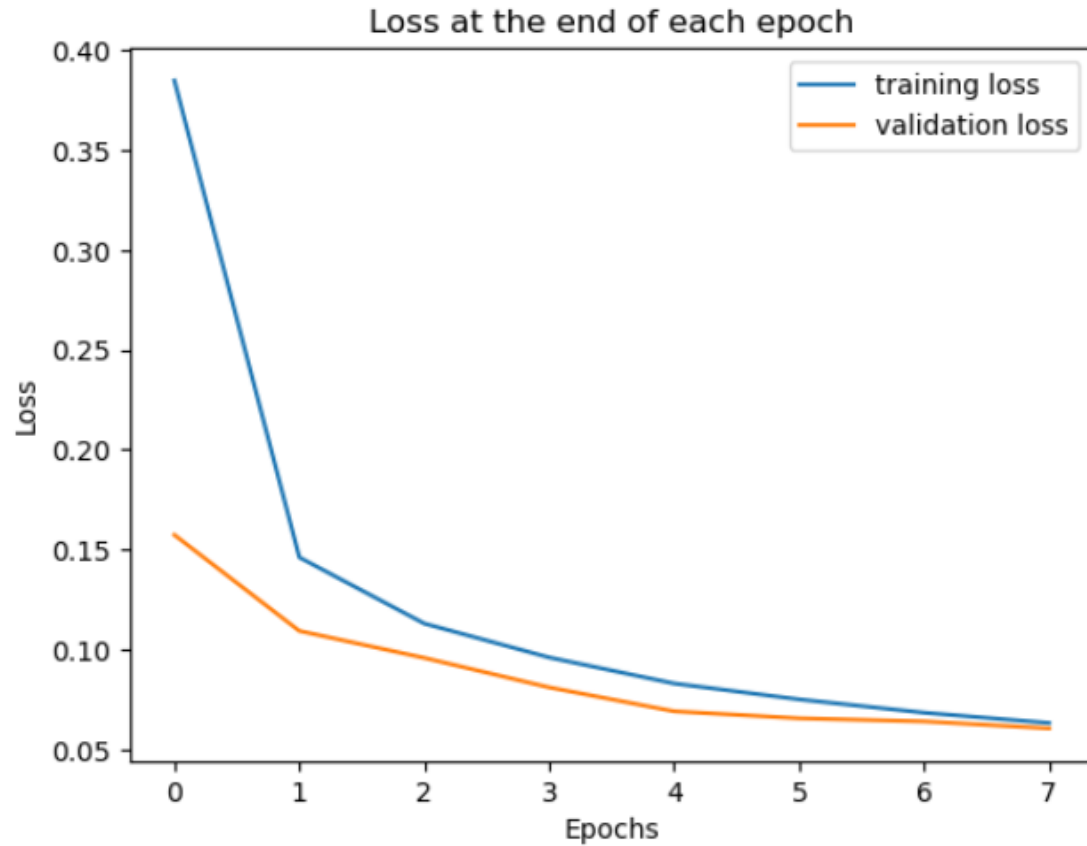


# Training the FNN

- Set the Learning Rate
- Scale up the Network Parameters
- Adapt the Training Epochs if Required

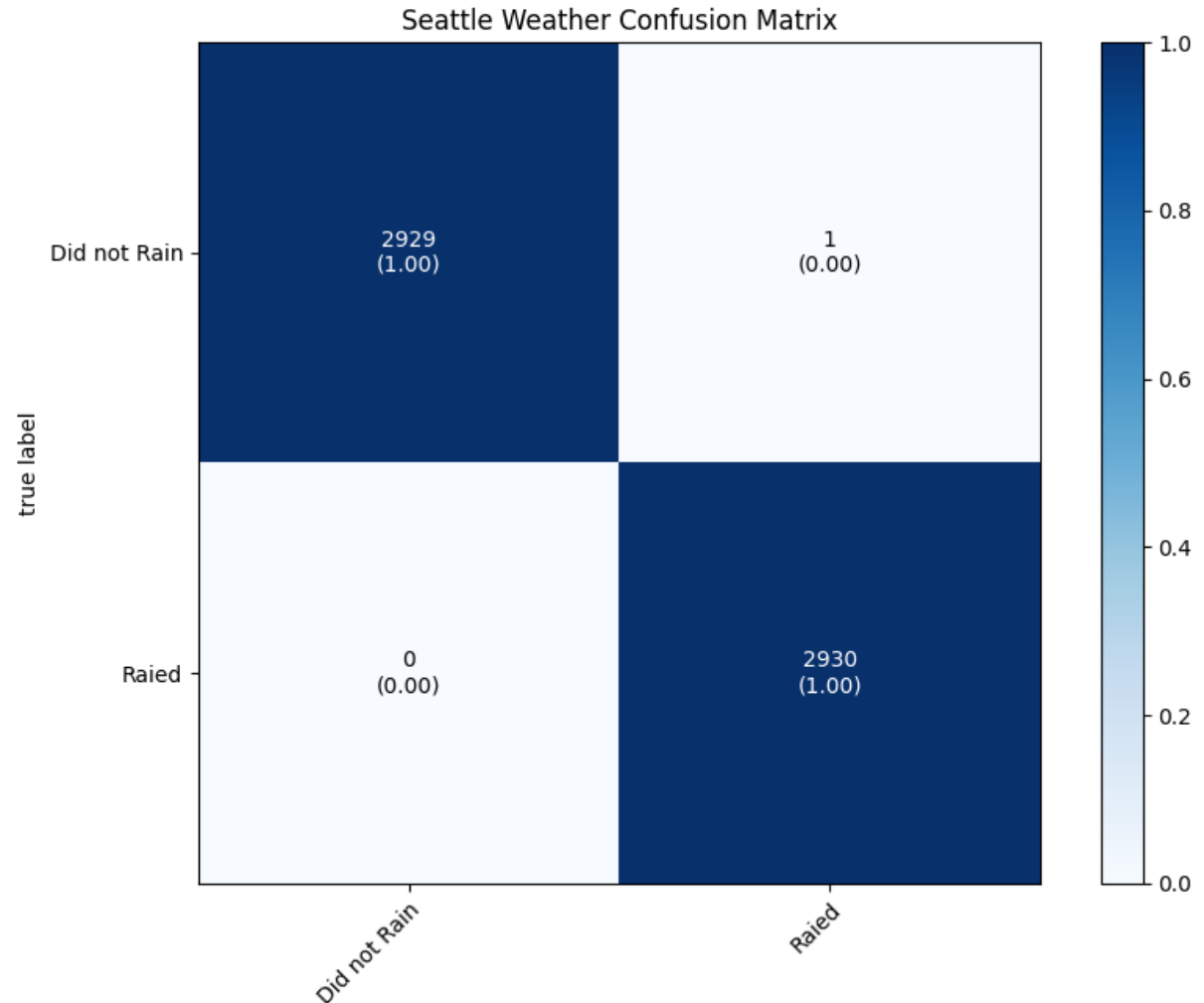


# Training the FNN



# Evaluating the FNN

- Accuracy
- Precision
- Recall
- F1-Score
- Confusion Matrix



# Code Run Through

```
# Hyperparameters
input_layer = 4          # Sets the number of parameters in the input layer
hidden_layer_1 = 7       # Sets the number of parameters in hidden layer 1
hidden_layer_2 = 7       # Sets the number of parameters in hidden layer 2
hidden_layer_3 = 7       # Sets the number of parameters in hidden layer 3
hidden_layer_4 = 7       # Sets the number of parameters in hidden layer 4
hidden_layer_5 = 7       # Sets the number of parameters in hidden layer 5
hidden_layer_6 = 7       # Sets the number of parameters in hidden layer 6
output_layer = 1         # Sets the number of parameters in the output layer
lr = 1e-3                # Sets the learning rate
epochs = 50              # Sets the number of training epochs
batch_size = 32          # Sets the batch size
# -----
```

# Summary

- Understanding gradient descent and how the learning rate affects the neural network is essential for training deep neural networks.
- Before training the deep neural network, data pre-processing and exploratory data analysis are essential.
- Deep neural networks require large amounts of data but solve problems with non-linear data points, including data with complex statistical trends.

# References

Goodfellow, I., Bengio, Y. and Courville, A. (2017) Deep learning. Cambridge, MA: The MIT Press.

Li, F.-F. CS231N: Deep Learning for Computer Vision, Stanford University CS231n: Deep Learning for Computer Vision. Available at: <https://cs231n.stanford.edu/> (Accessed: 24 April 2024).

Tatman, R. (2017) Did it rain in Seattle? (1948-2017), Kaggle. Available at: <https://www.kaggle.com/datasets/rtatman/did-it-rain-in-seattle-19482017> (Accessed: 01 May 2024).