

CERTIFICATION OF APPROVAL

**Inferential Development of MLNG Depropanizer Bottom Product**

By

Khairul Azlan B Khairianuar

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Approved by,

V. R. Radhakrishnan  
(Prof. Dr. V. R Radhakrishnan)

Main Supervisor

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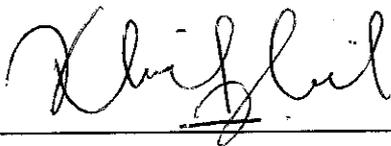
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1) Neural networks (computer science)

## CERTIFICATION OF ORIGINALITY

This is to certify that I am responsible for the work submitted in this project, that the original work is my own except as specified in the references and acknowledges, and that the original work contained herein have not been undertaken or done unspecified sources or persons.



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(KHAIRUL AZLAN B KHAIRIANUAR)

## ABSTRACT

This is an individual Final Year Project titled as 'Inferential Development for MLNG Depropanizer Bottom Product' which carries four credits hours.

The main objective of this research project is to develop an appropriate inferential model to predict the quality of a Depropanizer bottom product that consists of butane and propane. In this research project, neural network technique was employed to predict the property of the Depropanizer bottom product. There were twenty seven inputs and one output used to develop the neural network model. This research project was carried out in conjunction with MLNG whereby data were collected from the plant to construct the network and training it to perform the property prediction. The software used for this project is Matlab 6.1 especially neural network toolbox and Microsoft Excel.

The neural network used was of 'Feed Forward Backpropagation' type and suitable configuration was tested and analyzed to achieve a minimum number of prediction error. For this project, the error calculation used was Root Mean Square (RMS). The network model were developed with the configuration of 3 layers which consist of 36 neurons in the first layer, 27 neurons in the second layer and 1 neuron in the third layer. The training function used for this network is 'Trainrp' and the adaptation learning function is 'Learnngdm'. This network was trained with 100 times iteration. The model can be considered accurate to predict the concentration of the propane at the Depropanizer bottom product with RMSE obtained at 5.36%.

## **ACKNOWLEDGEMENT**

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Next I would like to acknowledge University Teknologi PETRONAS (UTP) specifically the final year research project committee for proper organization and management of this course.

Lastly I would like to acknowledge my parents for their endless support and confidence in me throughout the semester especially during conducting this project. I also apologize to those tat had contributed towards the project whom I had neglected to mention in this report. I appreciate all the effort of those in making this project success. Without all that support this project would not be successful.

## TABLE OF CONTENTS

<b>CERTIFICATION OF APPROVAL</b>	.	.	.	.	.	.	.	<b>i</b>
<b>CERTIFICATION OF ORIGINALITY</b>	.	.	.	.	.	.	.	<b>ii</b>
<b>ABSTRACT</b>	.	.	.	.	.	.	.	<b>iii</b>
<b>ACKNOWLEDGEMENT</b>	.	.	.	.	.	.	.	<b>iv</b>
<b>TABLE OF CONTENTS</b>	.	.	.	.	.	.	.	<b>v</b>
<b>LIST OF FIGURES</b>	.	.	.	.	.	.	.	<b>vi</b>
<b>LIST OF TABLES</b>	.	.	.	.	.	.	.	<b>vi</b>
<b>LIST OF GRAPHS</b>	.	.	.	.	.	.	.	<b>vii</b>
<b>CHAPTER 1: INTRODUCTION</b>	.	.	.	.	.	.	.	<b>1</b>
<b>1.1 Background of Study</b>	.	.	.	.	.	.	.	<b>1</b>
<b>1.2 Problem Statement</b>	.	.	.	.	.	.	.	<b>2</b>
<b>1.3 Objective and Scope of Study</b>	.	.	.	.	.	.	.	<b>3</b>
<b>CHAPTER 2: LITERATURE REVIEW AND THEORY</b>	.	.	.	.	.	.	.	<b>5</b>
<b>2.1 Distillation Column</b>	.	.	.	.	.	.	.	<b>5</b>
<b>2.2 Neural Network</b>	.	.	.	.	.	.	.	<b>6</b>
<b>2.3 Statistical Analysis</b>	.	.	.	.	.	.	.	<b>13</b>
<b>CHAPTER 3: METHODOLOGY OR PROJECT WORK</b>	.	.	.	.	.	.	.	<b>16</b>
<b>3.1 Project Overview</b>	.	.	.	.	.	.	.	<b>16</b>
<b>3.2 Methodology</b>	.	.	.	.	.	.	.	<b>17</b>
<b>3.3 Project Work.</b>	.	.	.	.	.	.	.	<b>19</b>
<b>CHAPTER 4: RESULTS AND DISCUSSION</b>	.	.	.	.	.	.	.	<b>27</b>
<b>4.1 Results</b>	.	.	.	.	.	.	.	<b>27</b>
<b>4.2 Discussion</b>	.	.	.	.	.	.	.	<b>33</b>
<b>CHAPTER 5: CONCLUSION AND RECOMMENDATIONS</b>	.	.	.	.	.	.	.	<b>41</b>
<b>5.1 Conclusion</b>	.	.	.	.	.	.	.	<b>41</b>
<b>5.2 Recommendation</b>	.	.	.	.	.	.	.	<b>42</b>
<b>REFERENCES</b>	.	.	.	.	.	.	.	<b>43</b>
<b>APPENDICES</b>	.	.	.	.	.	.	.	<b>44</b>

## **LIST OF FIGURES**

Figure 2.1	Component of neurons
Figure 2.2	The neuron model
Figure 2.3	Basic Backpropagation network
Figure 2.4	Multiple layer of backpropagation network
Figure 2.5	Neuron without bias and Neuron with bias
Figure 2.6	Multiple Input Neurons
Figure 2.7	Transfer function
Figure 3.1	Methodology in developing the NN
Figure 3.2	Depropanizer bottom product process variables
Figure 3.3	Information from The Microsoft® Excel's 'Descriptive Statistic'
Figure 3.4	Neural Network Data/Manager
Figure 3.5	Network Creation
Figure 3.6(a) and (b)	Consideration for construction of network
Figure 4.1	Performance curve of the network
Figure 4.2	Network setting
Figure 4.3	Performance curve during training
Figure 4.4	Network for training targets separately

## **LIST OF TABLES**

Table 4.1	Sample of the segmentation of data from original data
Table 4.2	ANOVA test
Table 4.3	Sample of normalized values of inlet parameters of training set
Table 4.4	Information for the testing of normal distribution
Table 4.5	Optimum network setting
Table 4.6	Sample of the result predicted by Neural Network

## **LIST OF GRAPH**

- Graph 4.1      Graph of Predicted value Vs. Actual value  
Graph 4.2      Actual Propane conc. vs. Predicted Propane conc.

# **CHAPTER 1**

## **INTRODUCTION**

The Chemical Engineering Final Year Project is a four hour credit course which involved in modeling works. The project is entitle 'Neural Network Model and Advanced Process Control for MLNG Debutaniser distillate Product'. The supervisor of the project is Prof. Dr. V.R. Radhakrishnan and Co-supervisor is Pn. Haslinda Zabiri.

### **1.1 BACKGROUND OF THE STUDY**

This final year research work was based on previous work by Sujendren. Based on his work, further development on the model was done and the appropriate control strategy will be devised.

Neural Network (NN) is a new age technology in the information processing that was developed based on the neuron in the human brain. Neural network consist of large number of interconnecting processing elements that normally operates in parallel. The system behaves as human brain where it has the ability to learn, recall and generalize from training patterns or sets of data.

For this work, Malaysia Liquefied Natural Gas (MLNG) debutanizer column was chosen and the necessary data was obtained. Based on the previous model done by Sujendren, further work will be done to improve the Neural Network system.

## 1.2 PROBLEM STATEMENT

Debutanizer is very common and crucial equipment in oil and gas industries. It serves the purpose to separate butane and other higher key components from the feed. The most common problem encountered with the Debutanizer overhead product is the impurity which might be due to the column feed quality. The column receives its feed from Depropanizer bottom which splits propane and butane plus higher hydrocarbon component. If the propane content in the feed is high, it will result in off-specification of the butane produce from Debutanizer overhead product since propane which is lighter than butane could not be removed at the column bottom. This condition may happen particularly in the improper Depropanizer operating parameter coupled with higher propane in the Depropanizer feed.

As such, an inferential model is desired for the Depropanizer column bottom to predict the propane concentration so that proper column adjustment can be done to prevent propane carryover into the Debutanizer column.

## **1.3 OBJECTIVE AND SCOPE OF STUDY**

### **1.3.1 Objective**

This Final Year Project will be an open ended project where the availability of the time will decide on the development of the project. As of the problem statement, the objectives of project are:

- i. To develop the NN model MLNG Debutanizer distilled product
- ii. To construct and develop a Feed Forward Backpropagation (BP) NN architecture using MATLAB's "Network/Data Manager"
- iii. To train, make necessary amendment and develop a suitable NN configuration using training set of data.
- iv. To test the network using testing set of data to compute the tolerance and estimated error of the network via RMSE.
- v. To develop dynamic model
- vi. To integrate the NN ability in the internal model control strategies.

### **1.3.2 Scope**

The scope of this research work is to study the characteristic of NN model and make the necessary modification on the NN model developed by Sujendren which was based on a Malaysia Liquefied Natural Gas (MLNG) Debutanizer column. Further study will be conducted to determine the compatibility and accuracy of the NN model based on the data obtained from MLNG. The NN model training, validation and testing phase will be conducted in MATLAB NN TOOL.

The Debutanizer column used for this research work belongs to MLNG. It is a distillation column used to separate the butane from other heavy component such as n-pentane. The data obtained from the equipment is limited to 16 hours (July 12 2003

23:00 to July 14 2003 14:51) on which the data is recorded every minute. This data will be used in developing the NN model.

## **CHAPTER 2**

### **LITERATURE REVIEW AND THEORY**

#### **2.1 DISTILLATION COLUMN**

The purpose of the distillation column is to separate between light key and heavy key component. Distillation column is a common separation process used in industry. From the Christie J. Giankopolis, "Transport Process and Unit Operation", Distillation used to separate te component of a liquid solution, which depends upon the distribution of these various components between a vapour and liquid phase. All components are present in both phases. The vapour phases is created from the liquid phase vaporization at the boiling point.

The basic requirement for the separation of the components by distillation is that the composition of the vapour be different from the composition of the liquid with which it is in equilibrium at the boiling point of the liquid. Distillation is concern with solutions where all components are appreciably volatile, where both components will be in the vapour phase.

For this study research, two distillation column from industry was used that is depropanizer and debutanizer column. Depropanizer used to separate propane (overhead product) from the other heavy component (bottom product). The Debutanizer column used to separate butane (overhead product) from the other heavy component (bottom product). The feed to the debutanizer column is the botom stream of the depropanizer column. That stream consist of propane, n-butane, iso-butane, iso-pentane and n-pentane. Since the feed to the debutanizer have propane component, that is lighter than butane, separation of that feed at the debutanizer column will result with the offset of debutanizer distilled product because propane exist in that product. In order to control the composition of the propane at the bottom product, the operating parameter of the

depropanizer column should be control. Because of that, the study of neural network model at the depropanizer bottom product is applicable to control the quality of the butane at the debutanizer distilled product. All the inputs and output for this research were taken from the depropanizer column. It consist of twenty seven inputs that consist of the operating parameters at that column such as pressure recoder controller alarm (PRCA) and the output is the propane concentartion at the bottom product stream. The diagrams of Depropaniser column and detailed about the inputs and output can refer to appendix 1.

## **2.2 NEURAL NETWORK**

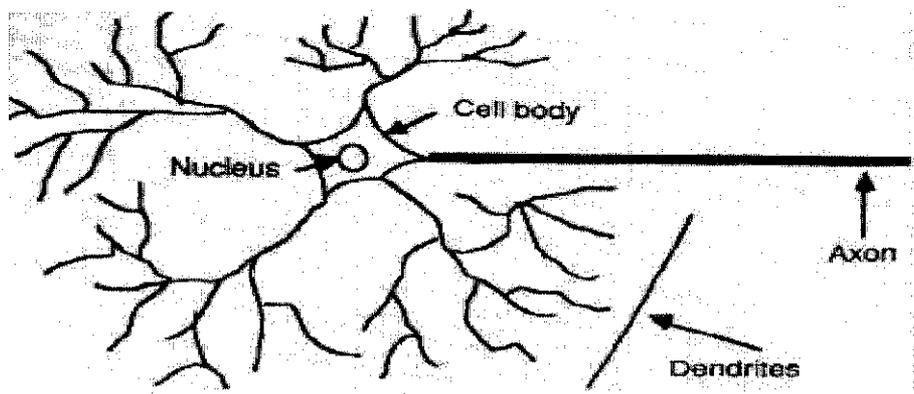
### **2.2.1 Biological Analogy**

Works related on Artificial Neural Network (ANN) are commonly referred to as Neural Network (NN) was originated from the biological NN in the human brain. It comprises of a large number of interconnected neurons. Each neuron has a branching input structure (dendrites), a cell body, and a branching output structure (axon). The synapse connects axon of each cell to dendrites of another as shown in figure. ANN is used to distinguish them from real NN inside the human brain.

To maintain the characteristic of biological neural systems, ANN is defined as follow:

- I. A number of inputs (either from original data or from output of other neurons) are received. Each input originates by a connection that has weight and each neuron had a single threshold value.
- II. It is passed through a transfer function to produce the output of the neuron.

Figure 2.1: Component of neurons



### 2.2.2 Artificial Neural Network

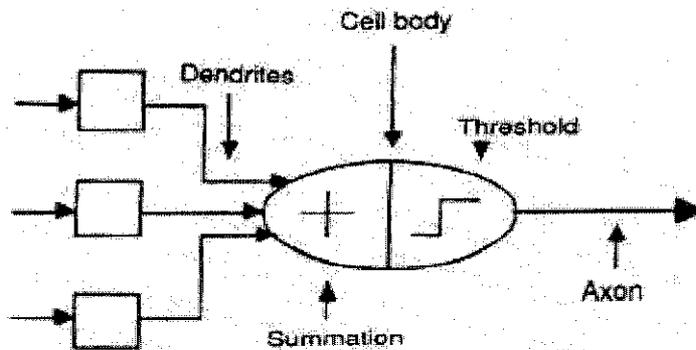
NN is identified as a form of nonlinear mapping between the inputs and outputs. The connectivity between inputs and outputs are by nodes arranged in several layers as shown in figure 2.2. The complexity of these connections often contributes to excellent accuracy for nonlinear prediction from process data.

According to Radhakrishnan and Mohamed (2000)

A feed forward neural network essentially consists of a number of nodes interconnected as shown in figure. The inputs  $x_i$  are connected to the nodes in the inputs layer. The output  $y_p$  are taken from the output layer. There are no limitation on the number of inputs and outputs. Between the input layer and the output layer there exists one or more hidden layers. The transformation or mapping takes place in the hidden layers. All the nodes in one layer are connected to all the nodes in the next layer. The connection strength between the outputs of node  $i$  with node  $j$  are given by weight  $W_{ij}$ . The weights can take values between 0 and 1, 0 signifying no transmission of the signal and 1 signifying the transmission of the full signal strength to the node  $j$ . at the node all

the incoming signals are summed and the bias subtracted from the sum to give the total activation. The output is calculated as a nonlinear function of the total activation. A nonlinear function which is commonly used for the transformation is the sigmoid function.

Figure 2.2: The neuron model



$$\text{Total activation of node } j, z_j = \sum x_i W_{ij} - b_j$$

$$\text{Output of node } j, x_j = \frac{1}{1 + e^{-z_j}}$$

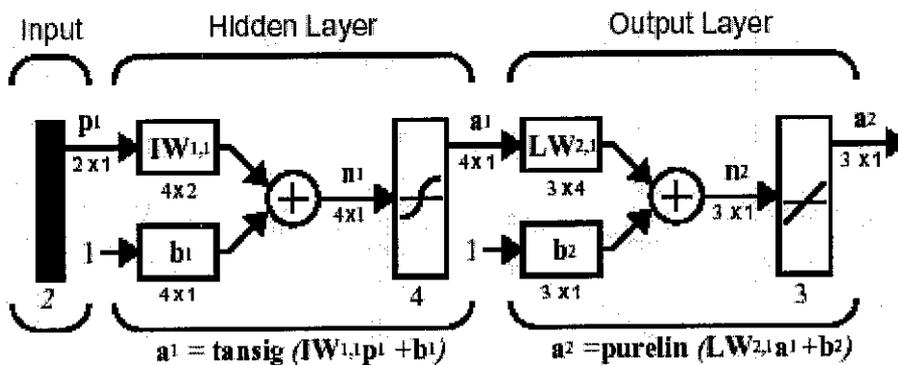
- Where  $x_i, i = 1, 2, \dots, j, \dots, n$  = output of node
- $z_i, i = 1, 2, \dots, j, \dots, n$  = activation of node
- $W_{ij}, i, j = 1, 2, \dots, n, i \neq j$  = weight of signal from  $i$ th node to  $j$ th node
- $b_i, i = 1, 2, \dots, j, \dots, n$  = bias of the  $i$ th node

Hence if activation is zero or negative the output  $x_j$  of the  $i$ th node is zero. The mathematical operation at the node is shown above.

### 2.2.3 Backpropagation Network

According to the book ‘Neural Network Toolbox’ by Howard Demuth and Mark Beale, the Backpropagation was created by generalizing the Window-Hoff learning rule to multiple-layer networks and nonlinear differentiable transfer functions. This rule utilizes the inputs and outputs or the targets to train the network and is known as the Delta Rule which uses the difference between the inputs and the targets to change the weights to the nodes. Training proceeds until an approximation of the function, which relate the inputs and outputs, is generated. Once trained, the network is able to approximate a set of inputs without the outputs provided to certain accuracy. This network is identified as loop free or feed forward where the inputs undergo “no past state of the network feeding back to any of its units” (Ng, 1997, [.16) through the network layer that its from the inputs layer through the hidden layers and to the output layer. Backpropagation poses a gradient descending algorithm where weights are moved along the negative gradient of the performance function. It is referred to the manner in which the gradient is generated for nonlinear multilayer networks.

Figure 2.3: Basic backpropagation network



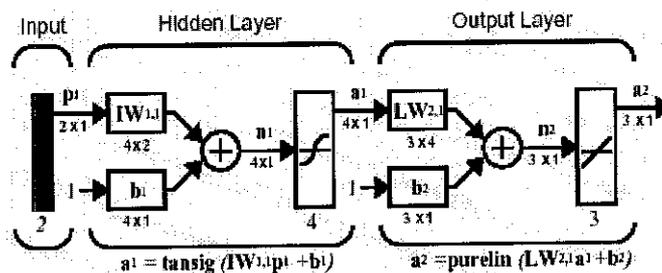
Basic Backpropagation network architecture is shown in figure 2.3. The number of hidden layers in a Feed Forward network is often one or more layers. Multiple layers of neurons with nonlinear transfer functions allow the network to adapt and learn nonlinear

relationships between inputs and outputs. Linear output layer allows the network to produce values outside the range -1 to +1. Multiple layers of Backpropagation network is shown in figure 2.4. For detailed explanation the book by Howard Demuth and Mark Beale (1996) should be referred.

There are no rules governing the amount of layers and number of neurons. Usually trial and error approach is used for determining the best configuration that able to be specified before training the network such as:

- I. Training function
- II. Adoption learning function
- III. Performance function
- IV. Number of layers (including hidden layers)
- V. Number of neurons in each layer
- VI. Transfer function of each layer.

Figure 2.4: Multiple layer of backpropagation network

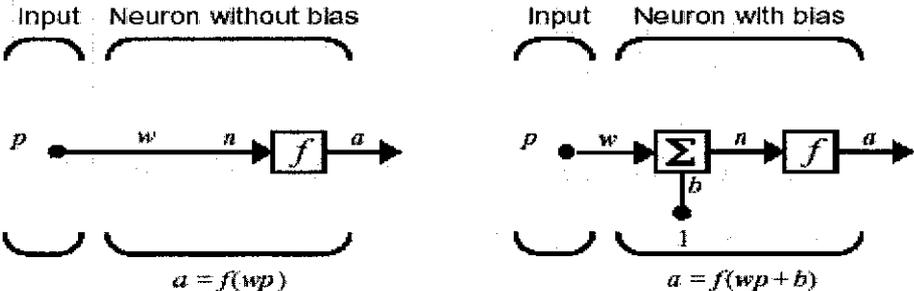


### Single Input Neuron

A neuron with single input and no bias is shown in figure 2.5. The scalar input  $p$  multiplied with its strength by the scalar weight  $w$ , to form the product  $w \cdot p$ . The product then will be the argument for of the transfer function  $F$ , which produces the

scalar output **a**. The neuron also contains a bias scalar, **b**. The bias has a constant output of 1. The transfer function net input, **n** is the sum of the weighted input **w**\***p** and the bias **b**. This sum becomes the argument for the transfer function **F**. The transfer function which is typically a step function or sigmoid function, takes the argument and produces the output **a**.

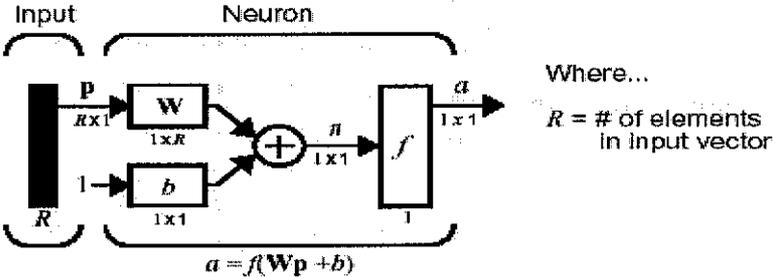
Figure 2.5: Neuron without bias and Neuron with bias



*Multiple Input Neurons*

A single neuron with R inputs is shown as figure 2.6. The individual inputs p(1), p(2)..p(R) are weighted by elements w(1,1), w(1,2)..w (1,R) and the weighted values are inputs to the summing junction.

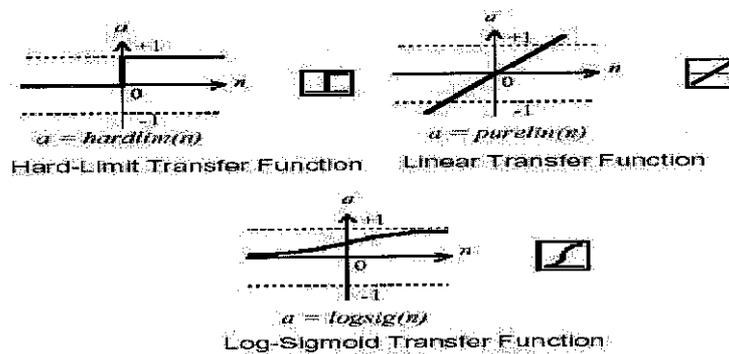
Figure 2.6: Multiple Input Neurons



## Transfer function

The commonly used transfer functions for neuron are; hard limit transfer function, linear transfer function and log-sigmoid transfer function. Hard limit transfer function take argument value between 0 and 1 and mostly used for making decision such as classification. Linear transfer function used as linear approximators. The sigmoid transfer function log-sig takes the input of any finite value and gives the output into the range 0 to 1.

Figure 2.7: Transfer function



### 2.2.4 Training Algorithm

Network is trained for purposes like function approximation (nonlinear regression), pattern association or pattern classification. The training process requires a set of inputs and its targets. Weights and biases are iteratively adjusted to minimize the network performance function (minimize error). In backpropagation weights are moved in the direction of negative gradient. Gradient descent algorithm can be implemented by incremental mode and batch mode.

In incremental mode, the gradient is computed and the weights are updated after each input is applied to the network. However in batch mode all the inputs are applied to the

network before the weights are updated. Examples of batch mode are such as batch training (*train*), batch gradient descent (*traingd*) and batch gradient descent with momentum (*traingdm*).

The training algorithm *traingd* and *traingdm* are often too slow for practical problems. Fast algorithm can be generalized as those which use heuristic techniques and those that use standard numerical optimization techniques. Heuristic is based on the analysis of the performance of the standard steepest descent algorithm. Variable Learning Rate backpropagation (*traingda*) and resilient backpropagation (*trainrp*) are example of fast heuristic training algorithm. Example of algorithm uses the standard numerical optimization techniques are Conjugate Gradient (*traincgf*, *traincgp*, *traincgb*, *trainscg*), Quasi-Newton (*trainbfg*, *trainoss*), and Levenberg-Marquardt problems. However, it does not perform well on fuction approximation problems. Its performance also degrades as the error goal is reduces. The memory requirements for this algorithm are relatively small in comparison to the other algorithms considered. '*trainrp*' is expressed here because the suitable network uses this training function. Detailed explanation of each algorithm and its comparison can be referred to Matlab's Neural Network Toolbox Helps Files version 6.1 Release 12.1 of the software.

## 2.3 STATISTICAL ANALYSIS

### 2.3.1 Data processing

The purpose of processing data is to normalize the data so that it can be used successfully for training the NN. By doing so, some of the inherent characteristics can be incorporated in to the model. The approach for the processing data is according to journal referred to Radhakrishan and Mohamed (2000). The procedures involved are data segmentation, normalization and testing for normal distribution. Random numbers are used for specifying the inlet parameters so that the study is without bias. Microsoft® Excel's 'Random Number Generation' is used for this purpose. 'Sampling' is used for

data segmentation using random numbers and randomly performed. The set of three hundred thirty four data obtained from the experiments is divided into training set of 147 data, validation set of 144 data and testing set of 43 data. The test data are used only once for testing the model accuracy. ‘ANOVA: Single Factor’ was used to verify that three segmented sets and the original set are from the same population by their means and standard deviations. The following equations are used in ANOVA testing.

$$SS_T = SS_{Treatment} + SS_E$$

$$MS_{Treatments} = \frac{SS_{Treatment}}{a - 1}$$

$$MS_E = \frac{SS_E}{a(n - 1)}$$

$$F_o = \frac{MS_{Treatments}}{MS_E}$$

Where  $SS_T$  is the total sum of squares

$SS_{Treatments}$  is the treatment sum of squares

$SS_E$  is the error sum of squares

$MS_{Treatment}$  is the mean square for treatment

$MS_E$  is the error mean square

Normalization on the data was done based on this formula:

$$x_n = \frac{(x - x_{\min})}{(x_{\max} - x_{\min})}$$

Where  $x_n$  is the normalized value

$x_{\min}$  is the minimum value

$x_{\max}$  is the maximum value

Information about distribution of data is important to the NN architecture. Hence statistical distributions of the variables are analyzed accordingly. ‘Descriptive Statistic’ is used for generating a set of information that some of the information’s are for testing segmented sets for normal distribution. This method was used in the journal referred to the Radhakrishnan and Mohamed (2000), which was suggested by ‘Modern Data Analysis-A first Course in Applied Statistics’ by L.C. Hamilton (1990).

- I. Test for symmetry is based on the skewness of the data.
- II. Normality can be tested for symmetric data by comparing the standard deviation with the pseudo standard deviation.
- III. Relative Peakness or Flatness of the data is tested by the Kurtosis.

### **2.3.2 Percentage Error**

The error is identified by using Root Means Square Error method (RMSE). RMSE determined the error between the predicted and calculated values, square them, sum them, divide by the number of the data point and determined the square root of them.

$$\text{RMSE} = \sqrt{\frac{\sum ((\text{predicted value} - \text{actual value})^2)}{\text{number of data}}}$$

The best RMSE required for this modeling to consider as a good modeling is less than 5% because the chromatograph in the MLNG plant can be only give the reading with 5% accuracy. For this research project, trial and error method was used to develop the Neural Network models that enable to achieve the error less than 5%. The RMSE were calculated by using Microsoft® Excel's.

## **CHAPTER 3**

### **METHODOLOGY OR PROJECT WORK**

#### **3.1 PROJECT OVERVIEW**

The study of modeling debutanizer column with NN was conducted via research and modeling approaches. To model a neural network to control the debutanizer column distilled product using NN the potential process variable must be identified. Generally twenty-seven inputs operating parameter such as temperature indicator (TI), flow recorder controller (FRC) and pressure recorder controller alarm (PRCA) are the basic parameters related to the debutanizer column distilled product. The study uses the NN to predict the propane composition at the debutanizer feed stream with inlet parameter specified. The NN needs to be trained with sufficient amount of inputs and targets for it to be able predict.

The input parameters and corresponding outlets conditions are needed. These sets of data were taken from the MLNG. The three hundred thirty four set of inputs and one output of data is segmented to three separate sets (training sets, validation sets and testing sets). The NN trained with different configuration until a minimal error in prediction could be achieved. Then it is validated and tested so that a performance study of the NN for corresponding outlet conditions of the butane product quality could be conducted and the RMSE can be calculated.

#### **3.1.2 Tools Required**

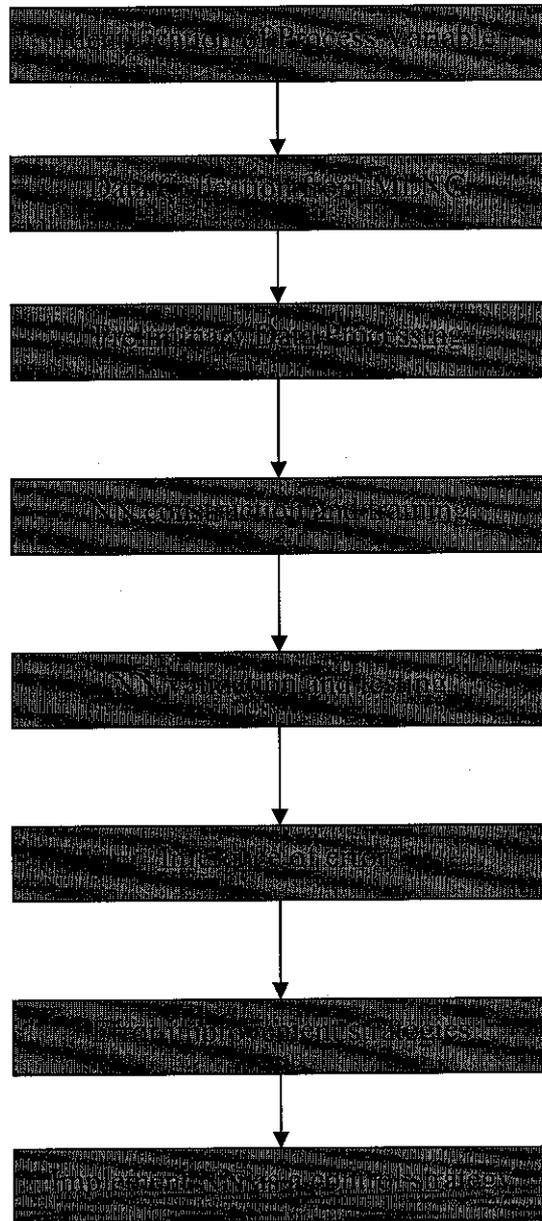
The study approaches utilized software only. The software aspects utilized are Matlab version 6.1 releases 12.1 and Microsoft® Excel 2000. The Neural Network Toolbox's 'Network Data/Manager' is an extension in Matlab, used is matter related to NN. The process of construction, training, validation, testing and enhancement of the NN is done

using this software. Microsoft® Excel is used for tabulation and auxiliary purposes. The 'Spreadsheet' is used for tabulation and performing calculation for set of data with the equation specified. Calculation such normalization and RMSE used 'Spreadsheet' for those purpose. 'Random Number Generation' used for generating sets of random number so that the inlet parameters can be specified. 'Sampling' is used for selecting randomly a set of data of specified sample size from its original set. The 'ANOVA: Single Factor' data analysis is used for verifying segmented sets and the original sets are from the same population. 'Descriptive Statistics' is used in testing for normal distribution of the inlet and outlet conditions.

### **3.2 METHODOLOGY**

They study to develop the NN model for the Debutanizer distilled product could be summarized to series of steps which are interrelated to each other as shown in figure 3.1. The succeeding steps are highly dependent on the completion of its predecessors. The results would be affected if at one particular stage the work were not completed. The steps shown here is a briefing and concise of a work involved however in each steps the work related are explained in details as in the following subchapter. The steps in figure 3.1 must proceed accordingly. There are additional works conducted such research, familiarization session with the NN toolbox software and familiarization with the Microsoft® Excel software.

Figure 3.1: Methodology in developing the NN

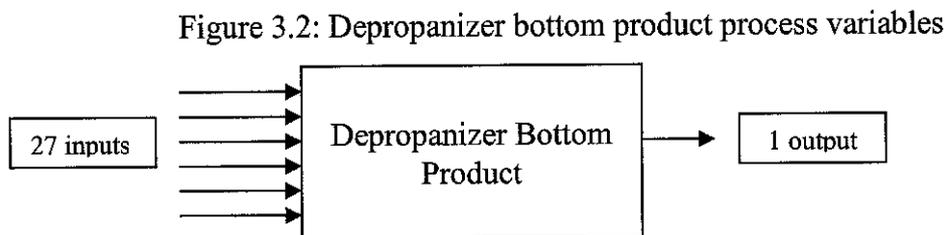


The last steps are not specified as one of the objectives. This is the following stage of any NN project that is to develop a control strategy suitable for application in industry. However this project will provide the fundamentals for developing a predictive control strategy, which may be used by other study related to this matter.

### 3.3 PROJECT WORK

#### 3.3.1 Identification of the Process Variables

Process variable related to this study are operating parameters for the Depropanizer column (inlet) and the reading from analyzer at the bottom product of Depropanizer column (outlet). Three hundred and thirty four sets of data are collected from the MLNG that consists of 27 inputs and 1 output. Detail about the inputs and output were attached in appendix 1. Three sets of data that is training, validation and testing are generated using Microsoft® Excel's 'Random Number Generation'. The following figure illustrates the inlet and outlet process variables.



#### 3.3.2 Preliminary Processing of Data

Processing of data is done on set of inputs with its corresponding output. These work needed to be done before attempting to train the network. Three steps involved that is:

- I. Data segmentation
- II. Normalization
- III. Testing for normal distribution

##### *Data segmentation*

The sets of three hundred thirty four inputs and output data are needed to be divided to three sets that are training, validation and testing. These sets are needed for different

stages of work in NN. The ratio between each set is according to the journal by Radhakrishnan and Mohamed (2000) that is 43% for the training, 43% for the validation and 14% for the testing. From that ratio, the training set has 147 of data, validation 144 of data and testing 43 sets of data. Segmentation is conducted randomly using Microsoft® Excel's 'Sampling'. The software required user to specify the set of data for sampling and amount of sample size required. Sampling is done in all data sets. Performing sampling using random numbers rather than absolute values will have similar result because absolute values are generated from random number by an equation. Generally the relation is constant and the random numbers could be used in segmentation. The specified size for sampling must be larger than the desired size because the software replaces the number after selection. If sampling has repetition, the following sampled number is selected. The sets should not have repeated values.

After the segmentation, an ANOVA test is required to verify the original and the three segmented sets are from the same population by comparing their means and standard deviations. The Microsoft® Excel's 'ANOVA: Single Factor' is used for this purpose. Test is conducted on the random number of the all data, training data, testing data and validation data. The means and standard deviation are compared.

### *Normalization*

The study had numerous process variable of each different in units and ranges. Due to inconsistency in units, the absolute values must be normalized. Normalization is done using equation and the normalized values are all in the range of 0 to 1. Normalized values are used so that all inputs to the NN are all within 0 to 1 and the output is within these normalized ranges. Microsoft® Excel Spreadsheet Calculation is used to tabulate and performing normalization calculation with the equation specified.

### *Testing for Normal Distribution*

The test for normal distribution is based on three criteria as follow:

- I. Test for symmetry is based on the skewness of the data. Skew = 0, symmetric; Skew < 0 asymmetric tail extending to positive values; Skew > 0 asymmetric tail extending to negative values.
- II. Normality can be tested for symmetric data by comparing the standard deviation with the pseudo standard deviation. SD = PSD Normal; SD > PSD Heavy tailed; SD < PSD Light tailed.
- III. Relative Peakness or Flatness of the data is tested by the Kurtosis. Kurt = 0, Normal; Kurt > 0, Peaked distribution; Kurt < 0 Flat distribution.

The Microsoft® Excel's 'Descriptive Statistic' is used to generate a set of statistical information each for the inlets and outlet variables. However three information's that required is the skewness, standard deviation and Kurtosis. For each variable, the information is compared with the above criteria and conclusion about the distribution of the variable can be generated. The suggested test was journal referred to Radhakrishnan and Mohamed (2000). A sample of what in information obtained from the software is at figure 3.3.

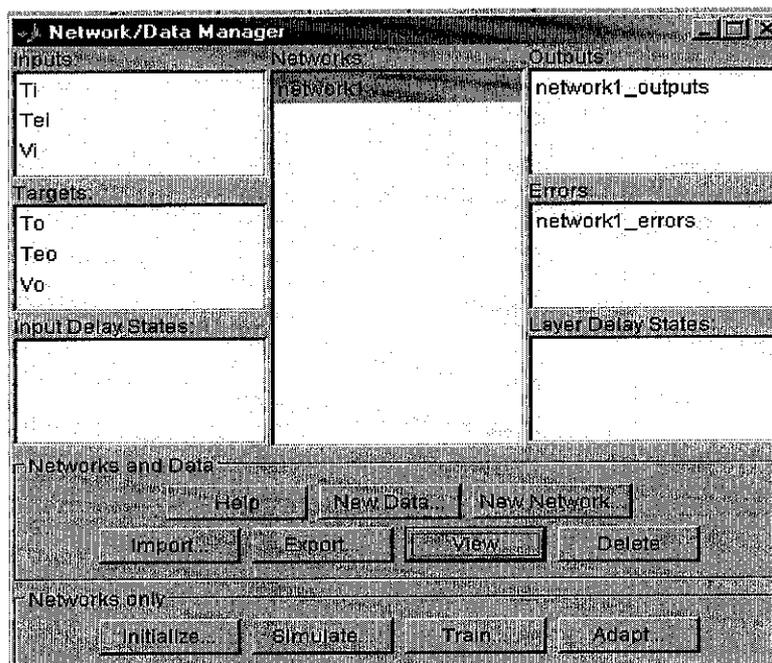
Figure 3.3: Information from The Microsoft® Excel's 'Descriptive Statistic'

Mean
Standard Error
Median
Mode
Standard Deviation
Sample Variance
Kurtosis
Skewness
Range
Minimum
Maximum
Sum
Count
Confidence Level(95.0%)

### 3.3.3 NN construction and Training

There are three sets of inputs and output that arranged in a matrix form. For the training sets the matrix arrangement is 27X147 for the inputs and 1X147 for the output. For the validation sets the matrix arrangement is 27X144 for the inputs and 1X144, and for the testing sets the matrix arrangement is 27X43 for the inputs and 1X43 for the output. All this data has been corrected to ensure that it can be used to construct the NN. Matlab Neural Network Toolbox's 'Network/ Data Manager' is used for constructing and training the NN. Figure 3.4 shows the network manager. This is used for managing the NN with multiple inputs and output.

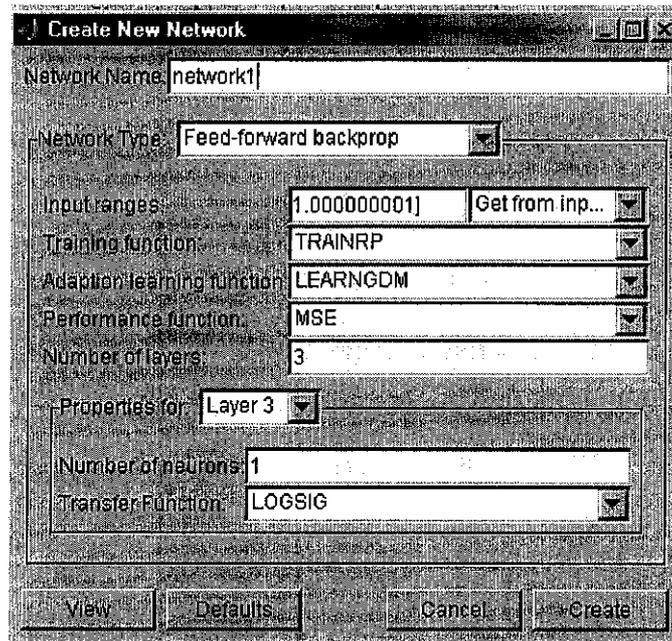
Figure 3.4: Neural Network Data/Manager



The rearranged matrixes of all data sets are specified in the Matlab's workspace before importing to the Network Data/ Manager as inputs and targets using the 'Import' button.

The 'New Network' button can create network. A window for creating a network shown in figure3.5:

Figure 3.5: Network Creation

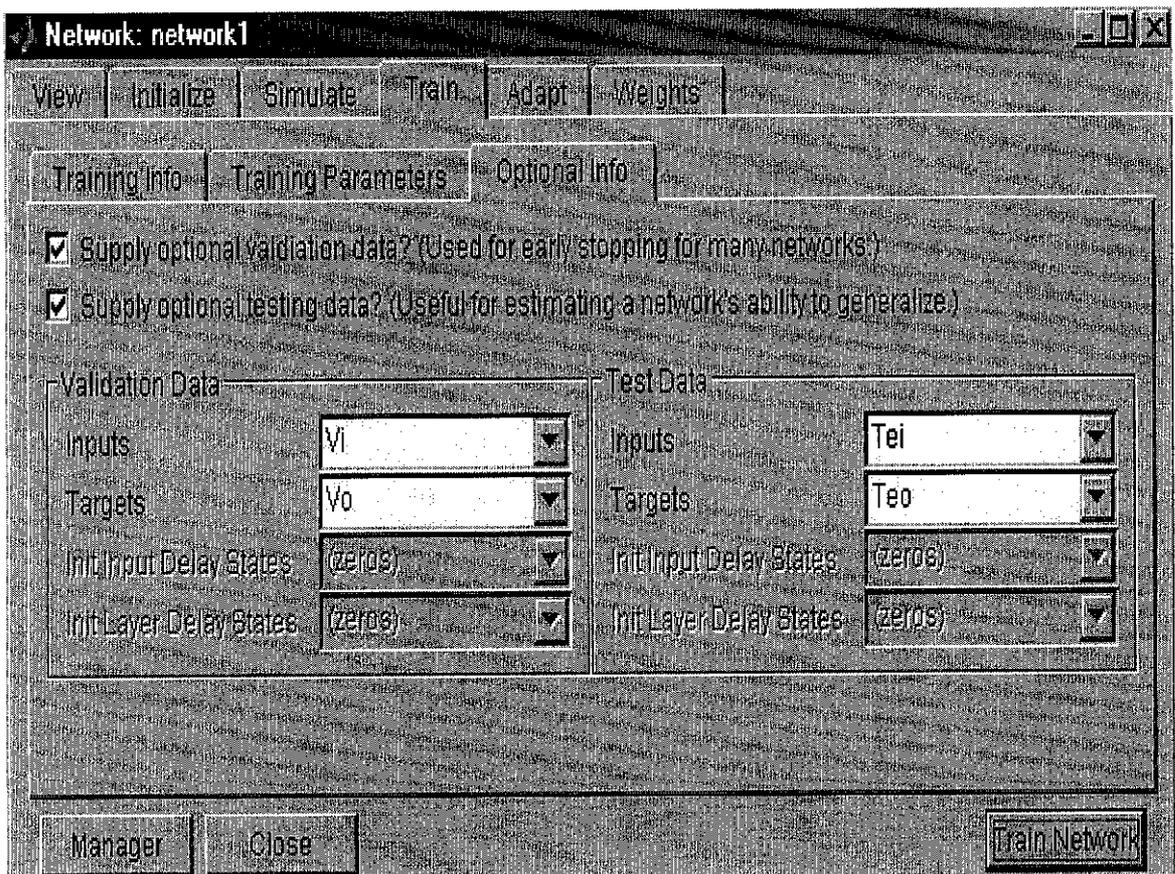


Familiarization session is conducted to determine the potential configurations. Trail and error approach is used to determine the optimum configuration that would provide the minimal error generated. The proposed network used is 'Feed Forward Backpropagation'. The input range should be specified and get from training inputs. The suitable NN configuration is determined by changing the training function, adaptation learning function, performance function number of layers, number of neurons and transfer function. The desired output in the study must be positive in value, therefore the last layer utilized the transfer function of *logsig*. For each configuration tested the output in the form of a performance curve is analyzed to identify the configuration that will produce minimum error. For each training session the same network is prohibited to be used again. The error is inconsistent for different training with the same configuration.

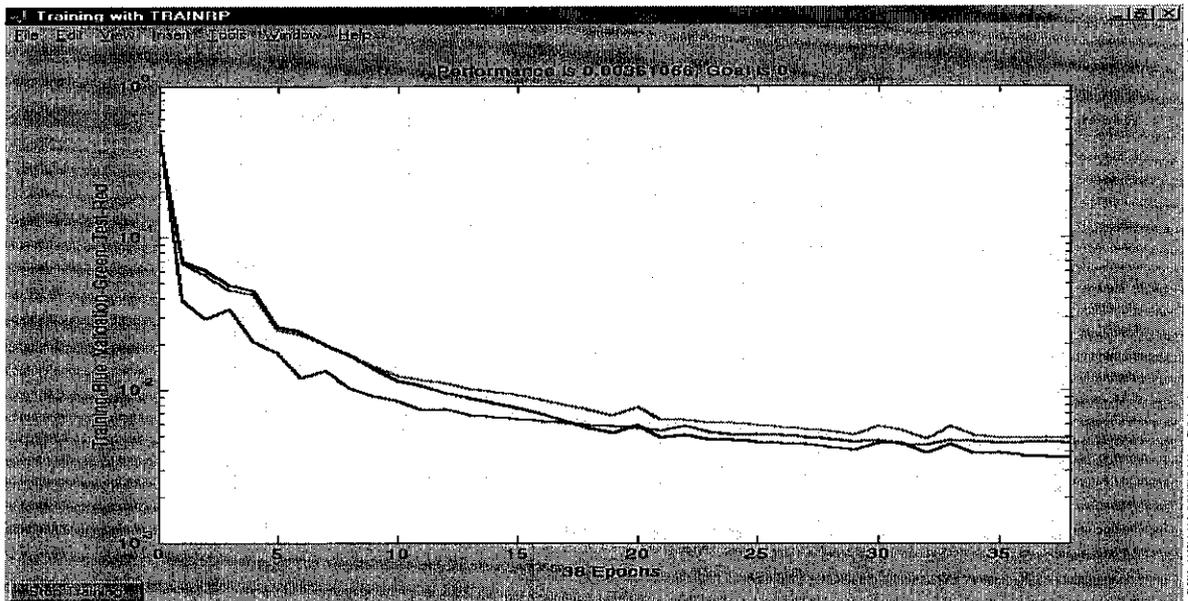
### 3.3.4 NN Validation and Testing

In determining a suitable network, the validation and testing set must be used with the training set so that a reasonable configuration network can be identified. It is used by supplying these sets of data before training shown in figure, so that an approximation performance curve for all sets can be generated as shown in figure 3.6(a):

Figure 3.6 (a) and (b): Consideration for construction of network



(a)



(b)

Thus additional information provided as figure 3.6(a) will generate the curve as in figure 3.6(b). This is useful for classifying a suitable NN. The testing set is not simulated to obtain the output. The reason it is useful is that the curves of the validation and testing set must be below the training set as one of the criteria for the optimum configuration. If the curves of the validation and training are higher than the training set, the error generated is much higher than the training set. Hence it is required to determine a configuration that produces validation and testing curve below the training curve. Otherwise the NN is not able to generated is robust and accurate prediction.

After a suitable configuration is identified, the validation set is used for validating the NN in its performance by simulating it using the trained network created. If the results are satisfactory, testing can be conducted using the testing set. If not the NN must be retrained with different configuration until it is successful.

### 3.3.5 Testing of Error

Error testing is conducted only on validation and testing set. Error is calculated on the Root Means Square Error (RMSE). RMSE determined the error between the predicted

and actual plant values, square them, sum them, divide by the number of the data point and determined the square root of them.

### **3.3.6 Error Improvement Strategy**

Potential improvement is done after suitable NN is constructed. The purpose this is to further minimize the error in prediction value. The error for the best modeling is must be less then 5%. Various improvement strategies are employed for improving the error as stated below:

- I. Reduce the number of input
- II. Reduce the number of data set from 2219 to 334
- III. Increase the epoch number
- IV. Calculate the RMSE for validation data at 500 epochs
- V. Find the highest epoch number for validation set
- VI. Test the testing data line by line and calculate RMSE
- VII. Increase the number of inputs from 27 to 54
- VIII. Using trial and error to create new NN model
- IX. Calculate the RMSE at every epoch number to find the best epoch number
- X. Reduce the number of inputs to 27
- XI. Using trial and error and create the new NN model

## CHAPTER 4

### RESULTS AND DISCUSSION

#### 4.1 RESULTS

##### 4.1.1 Preliminary Processing of Data

###### *Data segmentation*

The output of the segmentation is three sets of data with training are 147 sets, validation 144 sets and testing 43 sets. The segmentation was done using random number of inputs data. A sample of segmented data set is shown in table. The segmentation was successful and complete segmented data sets for training, validation and testing is shown in Appendix 2. In this table 4.1 it also indicates the random numbers that were generated and used.

Table 4.1: Sample of the segmentation of data from original data

Classification	random number	215 TI001 15.PNT	215 TRC005.MEAS	215 TI001 11.PNT	215 QRA3 C3.PNT
T	16.05529954	41.97441101	42.48392868	42.66430664	1.293962598
T	5.190588092	41.97576523	42.48300552	42.70524979	1.274089575
T	33.42191839	42.85163498	43.01528549	43.37582779	1.109123945
T	42.38923307	43.37921524	43.30970764	43.55733871	0.787819684
TE	91.4496292	43.40631104	44.06969452	44.54824448	0.392793477
TE	87.81798761	44.18074799	45.46683884	45.39764023	0.362660438
TE	88.48570208	42.01700974	42.45500565	42.92372131	1.361850619
TE	87.67900632	43.06742477	42.92456818	43.52058792	2.537902594
TE	88.3104648	43.30468369	45.26287079	45.00749207	0.439023405
TE	95.28067873	43.44897079	44.48462677	44.30818939	0.460583776
TE	98.29898984	42.09120178	42.4419899	42.73360062	0.814858258
V	85.10180975	42.94654083	43.4081459	43.47973251	1.984263659
V	80.5335551	43.30179214	45.83115387	45.65475464	0.432972103
V	49.87307352	43.33198166	43.27628326	43.74859238	0.392847538
V	73.21588794	42.77770996	43.01279068	43.37051773	1.766743064

ANOVA test was performed to verify the original and the three-segmented sets are from the same population. The ANOVA test was performed on the random numbers of the inputs and output variable. The results are shown in table 4.2.

Table 4.2: ANOVA test

Anova: Single  
Factor

SUMMARY

<i>Groups</i>	<i>Count</i>	<i>Sum</i>	<i>Average</i>	<i>Variance</i>
All Data	334	16730.58684	50.09157737	828.4021054
Training	147	7955.579302	54.11958709	781.6106129
Validation	144	6813.751488	47.31771867	766.5647026
Testing	43	2326.704337	54.10940318	875.3401037

ANOVA

<i>Source of Variation</i>	<i>SS</i>	<i>df</i>	<i>MS</i>	<i>F</i>	<i>P-value</i>	<i>F crit</i>
Between Groups	3987.249751	3	1329.08325	1.645383168	0.177629502	2.61832156
Within Groups	536356.0874	664	807.7651919			
Total	540343.3371	667				

As can be seen the average of the segmented sets is almost similar to the average of the original set and because of the random number is taken from 1 to 100, the average value given large number but still acceptable. The conclusion is that the segmented sets are from the original set. The complete test is shown in appendix 3.

*Normalization*

The table 4.3 showed a sample of the tabulated normalized values from the inlet data. The complete normalized value of training, validation and testing set can be referred from Appendix 2. The result is calculated using equation mentioned in the literature review and theory part. All the normalized values are within the range of 0 to 1.

Table 4.3: Sample of normalized values of inlet parameters of training set

215_TI001_15.PNT	215_TRC005.MEAS	215_TI001_11.PNT	215_TI001_12.PNT	215_QRA3_C3.PNT
0.000908365	0.023140719	0.020391272	0.098900052	0.201820716
0.001226069	0.023070366	0.022906232	0.099400323	0.197848184
0.206707936	0.063634651	0.064096931	0.479517114	0.164872261
0.330479966	0.086072136	0.075246361	0.414905471	0.100644916
0.048802884	0.040122401	0.056860651	0.153300999	0.147073705
0.453532464	0.550205766	0.390491308	0.177620987	0.023300216

### *Testing for Normal Distribution*

The test for normal distribution was conducted on all inlet and outlet properties based on the three mentioned criteria. The table 4.4 contains relevant information for the testing. The complete test result for normal distribution can be referred to Appendix 4. Overall from the test conducted it was concluded that all the inlet and outlet variables were essentially normally distributed. The values of the skewness and kurtosis were small attesting to the normality of the distribution.

Table 4.4: Information for the testing of normal distribution

215_TI001_15.PNT	
Mean	43.08958797
Standard Error	0.040577825
Median	43.06869507
Mode	42.14569092
Standard Deviation	0.741586816
Sample Variance	0.549951006
Kurtosis	0.986418761
Skewness	0.666692984
Range	4.262516022
Minimum	41.97053909
Maximum	46.23305511
Sum	14391.92238
Count	334
Confidence Level(95.0%)	0.079821219

### 4.1.2 NN Construction and Training

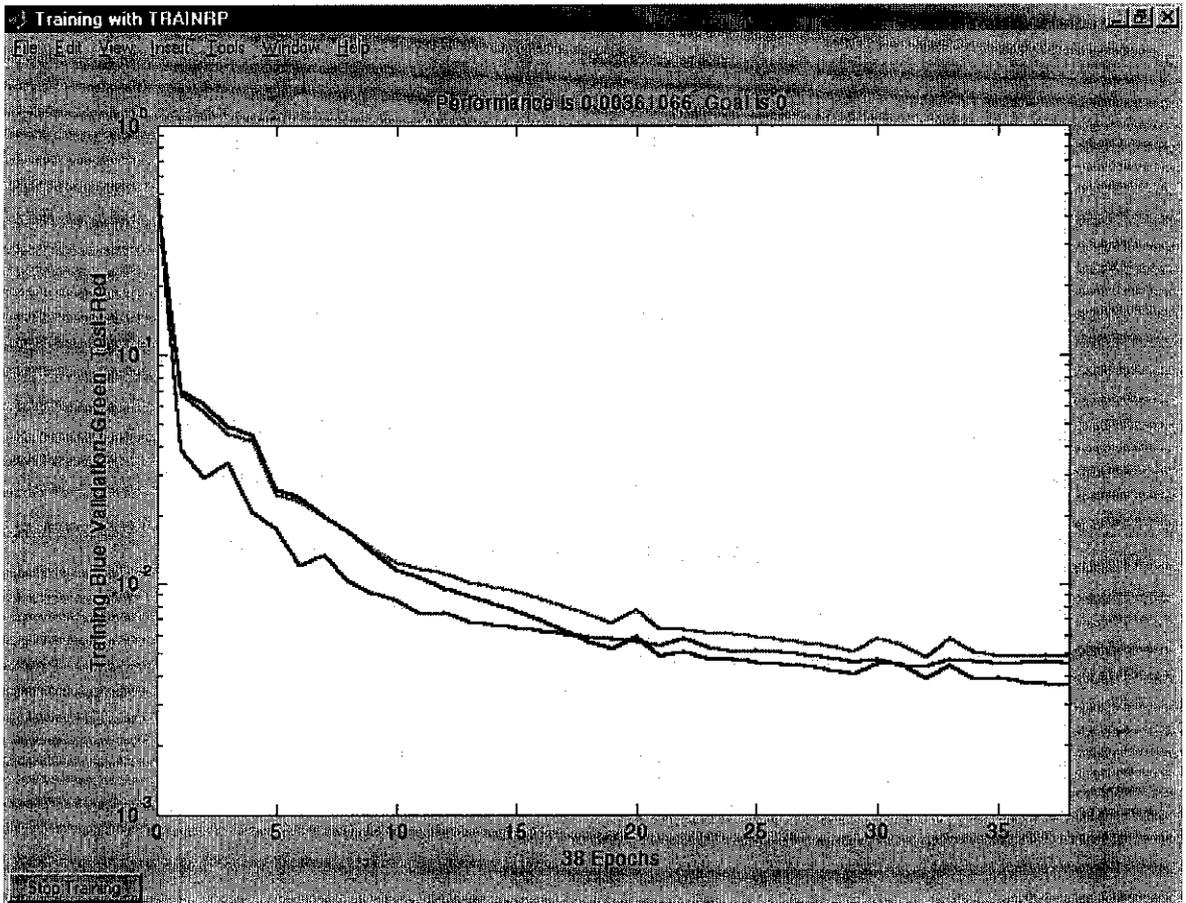
The numerous trial and errors had been performed to obtain the optimum configuration and the suitable configurations for the NN are tabulated as table 4.5.

Table 4.5: Optimum network setting

Parameters	Variable
Network	Feed-forward backprop
Training function	TRAINRP
Adaptation learning function	LEARNGDM
Performance function	MSE
Epochs	100
Number of layers	3
Layer 1: Number of Neuron Transfer function	36 LOGSIG
Layer 2: Number of Neuron Transfer function	27 LOGSIG
Layer 3: Number of Neuron Transfer function	1 LOGSIG

The curves in figure 4.1 indicate the performance of the NN in predicting all three sets. The desired error is 0 and the performance is 0.00361066. The amount of iteration (epoch), for predicting the value to this performance is 38. However the validation and testing set had not been simulated. This performance is with regards to the termination due to validation and testing set. The actual performance based on training set is 0.00121794 with termination at 100 epochs. This is the result that produces minimum error.

Figure 4.1: Performance curve of the network



### 4.1.3 NN Validation and Testing

The table 4.6 is a sample of the result of testing conducted. The input of the testing set is simulated and the predicted result by NN and the error of the prediction is tabulated. The RMSE and standard deviation are calculated by using the formula given. And the result showed that the RMSE for this model is 5.36% and standard deviation of 0.00417. After that the graph of predicted output value vs. actual output value is developed. Graph in graph 4.1 show the performance of the prediction value. The complete set of the result of the simulated validation and testing sets can be referred to Appendix 5. The predicted values are quite similar as the actual value obtained from MLNG.

Table 4.6: Sample of the result predicted by Neural Network

NN value	Normalized Value	NN Error
0.0215	0.391888655	3.27139E-08
0.0163	0.365875091	4.12929E-07
0.2432	1.500966955	0.000773327
0.4026	2.298382746	0.002292398
0.0289	0.428907958	4.08862E-06
0.0293	0.430909001	3.5187E-05
0.1861	1.215318011	0.006408033

RMSE	0.053642803
Standard Deviation	0.004171314

Graph 4.1: Graph of Predicted value Vs. Actual value



#### 4.1.4 Inference of Error

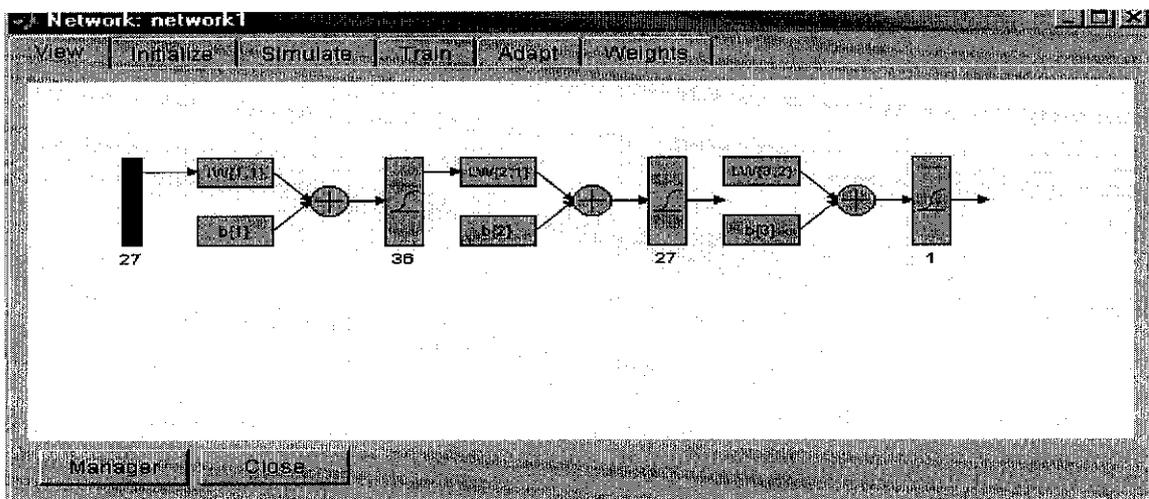
The error calculated for this project is by using Root Means Square Root Error (RMSE). RMSE can be calculated by using the equation given. The graph of predicted output value vs. actual output value was plotted to determined the point were the predicted is not accurate. The final error calculated by using RMSE is 5.36% and it can be consider good because the good modeling will produce error less than 5%. From the inference work conducted on the testing set it can be concluded that the NN is capable of predicting the outlet value of the propane concentration.

## 4.2 DISCUSSION

### 4.2.1 Neural Network

The network that was developed with configuration of table 4.5 is the optimum configuration that will provide with the minimum error in prediction. The network that is generated is shown in figure 4.2 below.

Figure 4.2: Network setting

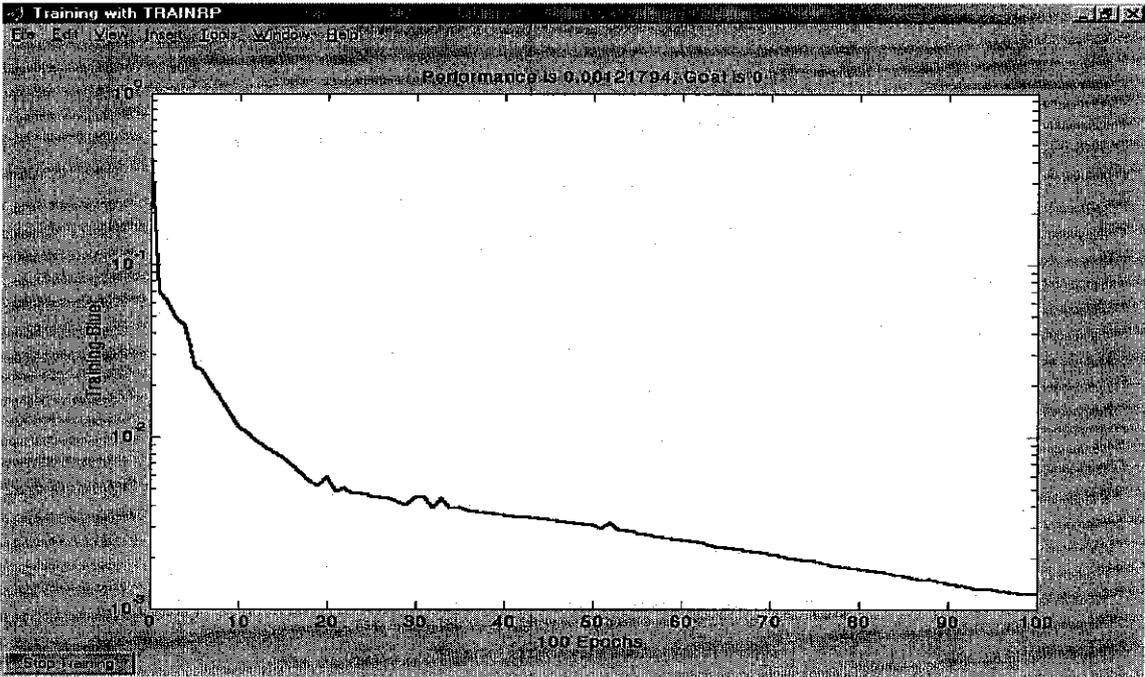


The first block is the input to the network. The numeric '27' indicates that it is of 27 rows of data. In other words, the input has twenty seven different parameters to be used for prediction. The network developed as this, will enable that at any instance during prediction the network is able to predict any amount of set provided the twenty seven parameters are specified. There are three layers as indicated by the block with the numeric at the bottom. The numeric present the amount of neuron present at each respective layer. The first layer has 36 neurons. The inputs are connected to the nodes in the input layer. The output layer has 1 neurons and the output is taken from this layer. The layer in between is commonly known as the hidden layer with 27 neurons. All the neurons in one layer are connected to all the nodes in the layer. The weight indicated as block with notation of 'W {2, 1}'. There are three sets of weight for this network. The weights are connection strength between the neuron of the previous layer and the upcoming layer which in this case is between layer 1 and 2. The inputs are multiplied with the weights and summed with the bias which is then fed to the transfer function. The results of the weights and bias are shown in Appendix 7. The result of the multiplication and summation is then fed to the transfer function. The block with a graphical representation shows the type of transfer function. The transfer function is used to limit the output according to the limits of the transfer function. The output from the transfer function is the input for the following layer. The entire process is repeated until it completes. The output layer is indicated with a numeric value of 1 indicating 1 predicted variables are expected to be produced. The figure 4.3 shows the performance curve when training during these configurations. The performance of this configuration is 0.00121794 and is closed to the desired error of 0. The amount of iteration is 100 times.

A second testing was conducted to ensure that these configurations are suitable for prediction. The performance curve is shown in figure 4.1. This technique utilized validation and testing set without simulation them. The NN merely predict the

performance using the inputs of the sets. This configuration is able to predict with error generated smaller than the error produced in training set. This is one of the characteristics of desired for an optimum configuration. However the iteration terminates at the 38<sup>th</sup> iteration compared to the training set only (100 iteration). The effect is due to failing of other sets input to converge which cause early termination. The error is higher compared to the previous due to the lower number of iterations.

Figure 4.3: Performance curve during training



If the network is trained using other training function such as *trainsecg* or *traingdx*, the performance is similar to *trainrp* but it converges slowly. The prediction is also not consistent and give relatively high in error compared with *trainrp*. Other training function were tried and it had been determined that the best training function for this study is *trainrp*.

The final layer's number of neurons is 1 because the output has one process variable as mentioned previously. Other numerical values will produce an inconsistency in the matrix format. Transfer function *logsig* is used in the last layer to ensure that the normalized values are positive. Only this transfer function will generate positive numerical. The first two layers also used the transfer function *logsig*. This is determined through the trial and error, which stipulates that these transfer function produce minimum error. In this study, it had been determined that there is inconsistency between number of neuron and performance. At times when the neuron number is increased, the error is smaller. However when it is increased further, the error seems to increase. The higher the number of neuron will decrease the number of iteration to achieve the performance. However there is a limit in performance and when the limit approaches the convergence will be constant. Generally the curve is of decreasing nature due to the higher number of iteration, convergence is higher, error is smaller and offset to the desired error is smaller.

From the result obtained by prediction of the test set, the NN is capable of predicting the propane composition accurately with RMSE 5.36%. Even though the best modeling required the RMSE less than 5%, the value of error get from this study can be acceptable. The problem to achieve the RMSE less than 5% must be because of the performance of the inputs data. Since all this data is taken from industry, changes in one of the equipment is the industry will results the bad data for the study.

#### **4.2.2 Statistical Analysis**

A series of statistical analysis performed to conclude matters which are crucial to this study as indicated in the methodology. The ANOVA test was conducted to verify that the segmented sets are originated from the original set. From the results obtained as shown in Appendix 3, the means and standard deviations of the segmented sets are similar to the means and standard deviation of the original set. It is observed that the variances of each set to the original set are small. 'ANOVA': Single Factor' test is

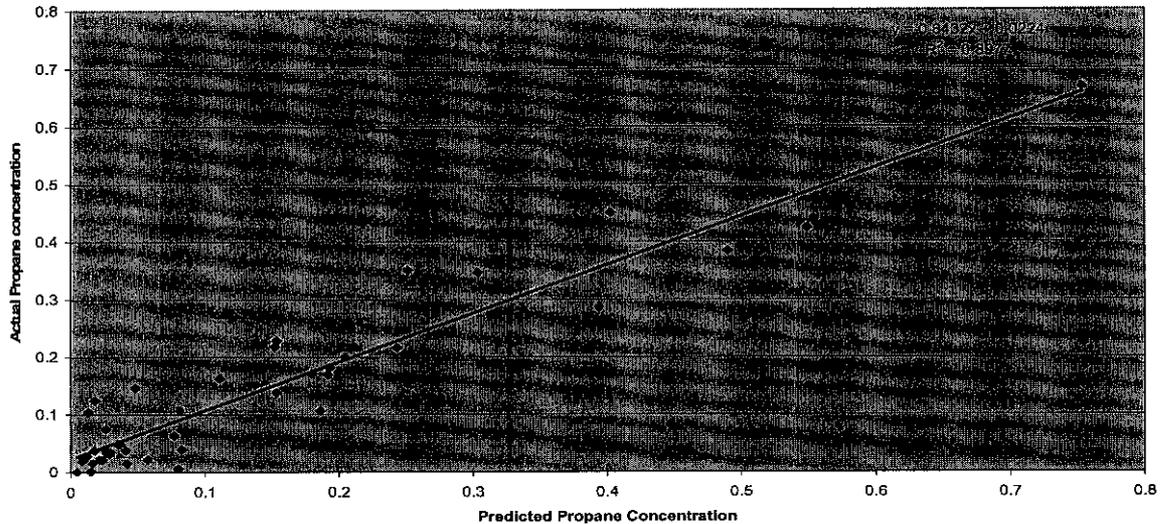
selected compare to others because in this project only this test applies. The natures of these sets of data violate the rules for other ANOVA test.

From all the statistical information in Appendix 4, it can be concluded that the all inlet and outlet properties are essentially symmetric except for the inlet number 215\_TI001.PNT, 215\_TRC005.MEAS and 215\_QRA3\_C3.PNT with slight asymmetric tailing to negative and inlet number 215\_PRCA008.MEAS, 215\_TI001\_14.PNT, 215\_PIC010.MEAS, 215\_TI001\_18.PNT and 215\_TRC006.MEAS with slightly asymmetric tailing to positive. All this asymmetric value has peak distribution. Beside that, the relative Peakness of remaining properties is normal. Therefore it can be concluded that, generally the inlet and outlet properties are essentially normally distributed with small values of skewness and kurtosis attesting to the normality of distribution.

In the testing error generated for each inlet and outlet variables, the network can be consider enable to performance well because the RMSE got is slightly higher than 5% that is 5.36%. The graph below, show the performance of the predicted propane concentration by NN vs. the actual propane concentration from MLNG.

Graph 4.2: Actual Propane conc. vs. Predicted Propane conc.

Actual Propane Concentration Vs. Predicted Propane Concentration



From that graph in graph 4.2, the linear line is the ideal plot that is desired. In that plot, the regression value and the equation are generated. From the regression value we are able to identify the deviation of the predicted value to the actual values. Basically the regression value of unity is desired, but if the plot is approximately close to the ideal value, it indicates that the predicted values and the actual values are close. However if the predicted and the actual values deviate significantly, the generated regression value will be less than unity. The graph shows that the regression value for this study is close to unity, which is 0.8977. This is according to the result of the statistical analysis conducted on the error which concludes that the network constructed is able to predict the output of propane concentration at high accuracy.

### 4.2.3 Improvement Strategy

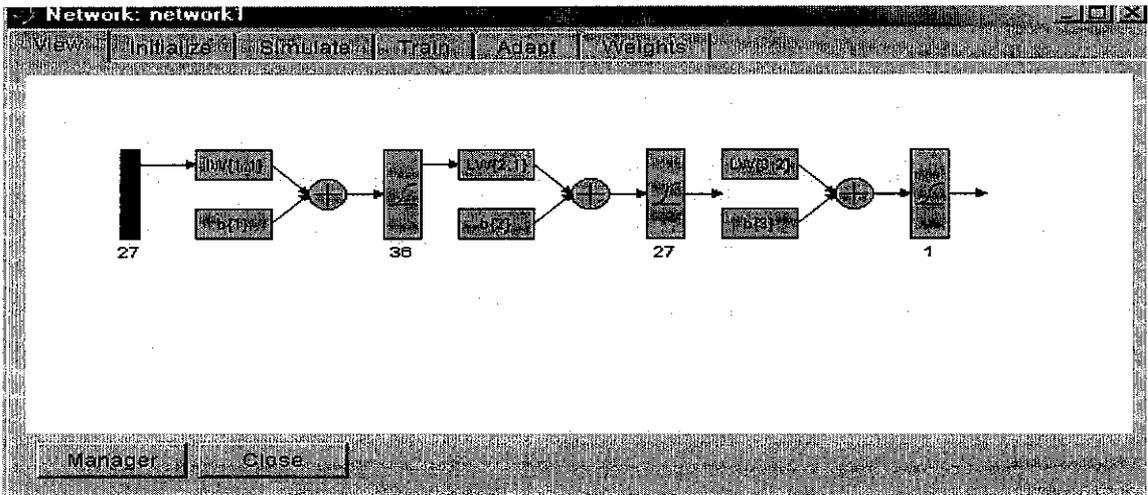
There are a number of designed strategies for improving the performance of the network developed in this study as had been mentioned earlier. The trial for improving the performance varying the epoch's number and decreasing the number of inputs had contributed large amount of changes. It is observed that once the optimal solution had

been obtained, increasing or decreasing the number of iteration merely changes about 1% to 3% of the error.

For this research several steps were taken in order to improve the performance and reduce the error. As mentioned earlier, to develop the NN model, the trial and error method were used. For the first trial, the number of inputs variables was decrease from 27 to 10 and by using the existing NN model develop by previous student, the results show that the percentage of error is still high. After that the number of data sets were reduce from 2219 to 334 and the trial and error method used to develop the NN model. The results also give higher number of RMSE. In order to get the better training performance number, the validation and training sets of data was trained until it reached their limit and the RMSE calculated. From that trial, the limit for the validation sets of data is 2966 epochs while for the training sets of data is 3610 epochs number. The RMSE for both trials is quick high that is 37.2% and 29.1%.

By double the number of inputs from 27 to 54, the RMSE get is still high. To know the best iteration for these new sets of inputs data, several test has been conducted. This data were trained with the lowest epoch's number that is 25 to the highest epoch's number that will give low RMSE. From that test, the best number of iteration for these new data sets is 100 epochs that will give RMSE 11.6%. Since the number of RMSE still not reduce to less than 5%, the 27 inputs of data sets were used back. This time the new NN models were develop by using trial and error method. Results from this trial produces lower RMSE with value of 5.36% by using model developed in figure 4.4 below.

Figure 4.4: Network for training targets separately



The strategy of training the network with less number of inputs is able to help improve the performance of the network. This is because by training the network with more inputs, the error generated would be maximized and the accuracy is decreased. The network is also more robust in capable of recovering detailed ranges and minimizing the error. The study also conducted improvement test by training the network with more inputs by combining training and validation sets and simulating only the test set. Results for the improvement strategy are available in Appendix 6.

## CHAPTER 5

### CONCLUSION AND RECOMMENDATIONS

#### 5.1 CONCLUSION

Overall the study of the 'Neural Network Model of a Debutanizer Column' was successfully completed within the period given. All the mentioned objectives had been achieved and the result is reported in this report. The Neural Network that has been constructed as shown in figure 4.6 and tested so that the best configuration for predicting purpose is able to be performed. The network type used is Feed Forward Backpropagation Network. The network was trained with *trainrp* and the model was developed with three number of layer. Layer 1 consists of 36 numbers of neuron, layer 2 consist 27 numbers of neuron and layer 3 consist of 1 number of neuron. The performance is validated using validation set. During validation the performance of the predicting output (propane concentration) is slightly accurate with the actual propane concentration from the data given by MLNG. Lastly the network is tested by using the testing data and the Root Means Square Error (RMSE) were calculated from that testing data. The neural network generated had been able to predict the output accurately with the RMSE 5.36% slightly higher than RMSE for good modeling that is 5%. Hence the network could be used for predicting any inlet parameters within the specified ranges to obtain the outlet conditions using the network constructed from this study. This study is aimed to provide a better understanding of Neural Network and its application for controlling the distilled product of the debutanizer column. This study may be a reference for any upcoming studies related to this field for the benefit in industrial controlling using predictive control method.

## 5.2 RECOMMENDATION

A few recommendations had been proposed for a better performance network. The first recommendation is to train and simulate the neural network by using more than one set of data. For this project only one sample of data were taken from MLNG so all the project done based on that data. The good modeling cannot be develop if only refer to one set of data. Since the condition of the plant during the time were the data were collected is not mentioned. So the accuracy of the data set given can be argued. In order to avoid that and to improve the performance of the neural network a lot set of data should be taken from MLNG.

Second recommendation is by decreasing the number of inputs parameter. Some of the inputs data get from MLNG are not highly related with the output. Data that are not highly related can be removed. The removing of inputs data is called removing the outlier. Basically it has a lot of method to remove the outlier but the easier and more practicable method is by using software called Simca-P. By using this software the inputs that didn't give highly correlated to the output can be removing and the remaining input can be used to develop the neural network model.

Last recommendation is to training using higher epochs and maximum time before failing. Naturally increasing the higher epochs and higher value of times before failing will produced better result. However this should be implemented with caution. As the epochs number approaching the limits it will produce bad results.

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## **APPENDICES**

Appendix 1: Depropanizer Column diagram and detailed about the inputs and output

Appendix 2: Result of Data Segmentation

Appendix 3: Result of AVOVA test

Appendix 4: Result of the Normal Distribution test

Appendix 5: Result of Predicting Using Neural Network

Appendix 6: Result of Improvement strategy

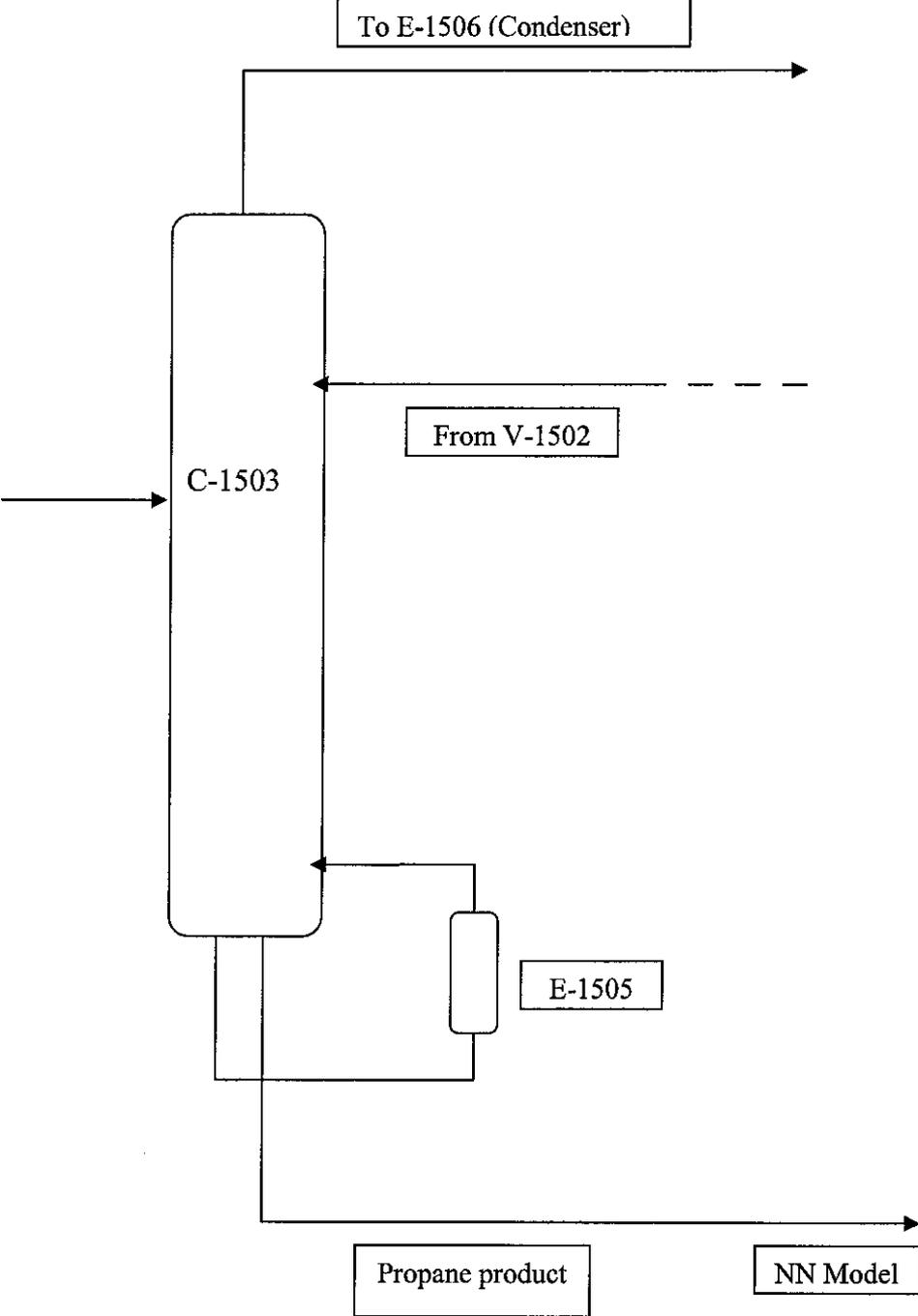
Appendix 7: Results of weight and bias

## **Appendix 1**

### **Depropanizer column diagrams and detailed about the inputs and output**

This show the diagrams of the Depropanizer column and explanation about the inputs and output

**The MLNG Depropanizer Column**



Original Tag	Description
215_TI001_15.PNT	Temperature of top product of C-1503 depropaniser column
215_TRC005.MEAS	Temperature of the top section of the C-1503 Depropaniser column
215_TI001_11.PNT	Temperature of the top section of the column same as TRC 005
215_TI001_12.PNT	Feed temperature to C-1503 depropaniser column
215_TI001_13.PNT	Liquid boilup temperature for C-1503 depropaniser
215_TI001_14.PNT	Temperature of reflux liquid to C-1503 depropaniser column
215_LRCA008.MEAS	level of knock-out drum for C-1503 depropaniser column
215_PRC008.MEAS	C-1503 Depropaniser column pressure
215_FRC028.MEAS	total feed to C-1501
215_FRC006.MEAS	flow rate of feed inlet to column C-1503 depropaniser column
215_FT020.PNT	LP steam flow rate for C-1503 reboiler (E-1505)
215_PIC010.MEAS	Steam pressure for C-1503 reboiler
151_TRC008.MEAS	IJ-5140 LP STM TEMP CTR (Temperature of steam to reboiler)
215_FRC010.MEAS	flow rate of feed to column C-1504 debutaniser column
215_TI001_24.PNT	Top product temperature for column C-1504 debutaniser column
215_TI001_23.PNT	Liquid reflux temperature for C-1504 debutaniser
215_TI001_20.PNT	Boiled up vapor temperature from reboiler to column C-1504 Debutaniser column
215_TI001_21.PNT	C-1504 bottom product temperature
215_TI001_19.PNT	Feed temperature of C-1504 debutaniser
215_TI001_18.PNT	C-1504 Column temperature-middle section
215_TRC006.MEAS	C-1504 Column temperature-middle section
215_PRC013.MEAS	pressure of feed entering C-1504 Debutaniser column
215_PIC015.MEAS	Pressure of LP steam going into C-1504 column reboiler
215_PDIC017.MEAS	Column C-1504 top product pressure
215_FT013.PNT	LP steam flow rate to C-1504 column reboiler (E-1507)
215_FIC012.MEAS	Reflux flow rate for C-1504
215_FRC029.MEAS	C3 to LPG Export Flow Cont

## **Appendix 2**

### **Result of Data Segmentation**

The result of the random segmentation from the original set into three sets (training set, validation set and testing set) using Microsoft® Excel's 'Sampling'.

**Table of classification of training set, validation set and training set**

classification	random number	215 TI001 15.PNT	215 TRC005.MEAS	215 TI001 11.PNT	215 TI001 12.PNT
T	16.05529954	41.97441101	42.48392868	42.66430664	90.0951004
T	5.190588092	41.97576523	42.48300552	42.70524979	90.09922791
T	33.42191839	42.85163498	43.01528549	43.37582779	93.23539734
T	42.38923307	43.37921524	43.30970764	43.55733871	92.70231628
T	8.973296304	42.17856216	42.70676041	43.25802231	90.54393768
T	18.10678426	43.90372849	49.40001678	48.68947601	90.74459076
T	28.86877041	44.06997681	45.14725876	45.32014084	91.58087921
T	21.15833003	43.77100372	46.95195007	46.45788956	90.96573639
T	42.56749168	42.89976883	43.01691055	43.36001968	93.40815735
T	16.2003235	43.95920563	45.53767395	45.55353928	91.64841461
T	7.275307474	43.59327698	43.98371124	44.57313538	90.85061646
T	34.82683798	42.02243042	42.45132446	42.89260483	90.15467072
T	23.45454268	44.17292023	45.61970901	45.92420959	91.35503387
T	23.75063326	42.0156517	42.45592499	42.58903885	90.47626495
T	26.23718986	42.8017807	43.01360321	43.39220047	92.86101532
T	36.11694693	42.97197342	43.01935196	43.35414124	93.59978485
T	23.44850002	44.06178665	47.27427673	47.18490601	90.98164368
T	38.33460494	42.7505188	42.83504105	43.09783554	93.37377167
T	8.060853908	43.159935	42.93337631	43.6493988	93.82307434
T	27.12546159	42.79370499	43.47177887	43.40771103	96.46908569
T	40.20178838	43.31123734	44.01582336	44.32733536	91.26148224
T	8.024597919	41.97305679	42.48484802	42.62336349	90.35340118
T	3.858180486	41.99648285	42.46894073	42.99247742	90.422966
T	31.391583	43.7229805	43.83165359	44.23141479	91.38314056
T	3.359660634	42.92383957	43.0177269	43.35211563	93.57049561
T	10.72869045	42.02378464	42.45040512	42.83264542	90.23165894
T	16.59913938	43.15278244	44.05174637	44.47264099	90.82649994
T	20.08575701	42.69841003	43.4924469	43.20703506	96.49929047
T	36.99313334	44.62383652	49.91522598	49.30975723	90.98212433
T	3.595324564	43.40918732	44.63751602	44.68418884	93.33533478
T	17.6445204	42.66856766	42.66135406	42.8768158	93.08092499
T	9.036744285	42.28913498	42.61045456	42.94877625	92.33433533
T	36.14111759	43.08200073	43.02306747	43.39994431	93.37110138
T	12.1487167	43.20046616	43.29832077	43.66950226	94.71951294
T	35.73323771	44.13362885	55.21386719	53.86916733	90.51911926
T	20.4755089	42.63049316	42.80589294	43.4180336	93.31342316
T	9.372112186	43.22493362	43.40274811	44.31086731	94.33531189
T	20.38789026	42.7698822	43.47694397	43.58037186	96.34562683
T	14.81655324	43.77878189	45.65834427	45.74651718	91.90744019
T	9.260322886	42.01003647	42.45973969	42.62533951	90.08080292
T	17.07046724	43.5490036	45.6049118	45.64576721	90.89762878
T	17.88018433	44.84537888	51.37614059	50.27877808	91.46993256
T	42.54634236	42.75527954	43.04855347	43.28162766	93.26172638
T	3.377788629	43.31603241	43.27775955	43.46319199	92.88160706
T	35.61238441	42.8757019	43.01609802	43.36792374	93.55885315
T	25.23108615	43.21616364	43.83480072	44.25284576	91.57563019
T	26.30365917	43.34292984	44.13506317	44.54310608	91.24402618
T	7.819147313	42.86857986	43.45553589	43.60276031	96.75845337
T	14.32105472	41.99784088	42.46802139	42.52061462	90.09263611
T	37.22879727	43.26580429	43.28681946	43.58541489	93.5133667
T	22.62971892	43.23152161	43.34469986	44.14256287	93.77423096
T	41.32572405	43.09826279	42.91413879	43.56352234	94.7218399
T	21.84719382	42.81633377	43.00949097	43.36563492	93.24082184

T	33.63945433	43.18966675	43.21385956	43.54101944	92.74656677
T	7.912808618	44.88684464	50.47634125	49.37268829	91.87115479
T	9.30262154	43.46700668	44.52216721	44.21505737	90.87476349
T	26.52723777	44.73432922	52.30968094	51.34700012	90.93343353
T	11.94326609	42.19291306	42.18027878	42.63453674	90.22879028
T	9.04278695	43.47377396	46.46772003	46.3891716	90.86364746
T	38.04153569	42.99611282	43.46429825	43.52734375	96.19159698
T	10.58668783	41.9991951	42.46710205	42.98097229	90.09094238
T	41.03869747	43.00131226	43.54998779	43.75835419	96.46324158
T	12.19705802	42.84032059	43.25123215	43.55542374	95.97116852
T	15.87099826	43.20924759	43.37586975	44.08283615	94.30025482
T	29.14371166	44.24769592	52.34916306	50.99059296	90.26737213
T	14.03704947	43.1301384	43.04742432	43.567276	94.78978729
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T	12.90404981	42.75466156	43.01197433	43.49690628	92.93006134
T	32.37351604	42.60031891	43.38595963	43.27191544	96.13259888
T	36.23780023	42.78593063	46.35245895	46.14216995	92.95994568
T	29.98364208	44.29151917	46.2162323	46.1686821	91.6072998
T	21.05862606	43.73226547	52.65516663	51.40036392	93.09285736
T	11.48402356	42.72223663	43.4872818	43.39495468	96.5875473
T	21.8079165	44.95615005	53.47898865	52.31388092	90.41056061
T	38.90563677	42.14569092	42.36947632	42.70433044	90.3883667
T	15.47520371	42.45466232	43.22332764	43.68887711	90.81409454
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T	42.21097446	43.20705414	43.35648346	43.83482361	94.70661163
T	25.6540727	42.15900803	42.26199341	42.62687683	90.45781708
T	32.66658528	44.14099884	47.0381012	46.67692947	91.32606506
T	32.45207068	43.35879135	44.83878326	44.573349	90.90117645
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T	13.85274819	43.62300491	46.22553253	45.76983643	90.87325287
T	27.64513077	42.99776077	43.02022171	43.74593735	93.40314484
T	25.47883541	43.10606766	43.02388	43.41876221	94.48662567
T	33.43400372	43.0940361	43.02347565	43.82487488	93.66672516
T	7.933957945	42.58451843	42.83996964	43.43962097	93.65994263
T	13.21826838	42.88988876	43.34397125	43.66165924	96.18405914
T	9.299600208	42.05729675	42.44291306	42.84059525	90.64955902
T	36.24082156	41.9895134	42.47367477	42.73558807	90.14115906
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T	13.44486831	42.92790604	43.03287125	43.34963989	93.42009735
T	2.009125034	44.51306534	48.54286575	47.90647125	90.9960022
T	12.36625263	44.1958847	48.83995056	48.31026077	89.56231689
T	30.63322855	43.66748047	43.81449509	44.41483688	90.44239807
T	17.78350169	42.72462845	42.74060822	43.2544899	93.36122131
T	42.76689962	42.95994186	43.01894379	43.369133	93.69154358
T	7.426374096	43.48815155	43.7449379	44.18625641	91.05078888
T	37.49769585	43.08939743	44.3904953	44.44211197	91.1844101
T	34.51866207	44.51053619	49.9354744	49.22558975	91.04747772
T	33.7391583	43.52273178	43.88727188	44.35438538	91.04530334
T	9.305642872	42.65076447	43.50278473	43.41859818	96.32276917
T	30.18909268	42.01836395	42.4540863	42.90552902	90.54299927
T	9.834376049	42.86472321	42.98532867	43.45879745	93.08811188
T	18.46028016	42.00732803	42.46157837	42.70743179	90.08079529
T	11.4507889	43.13399506	43.91386032	44.20199966	96.50993347
T	32.03814814	42.61516571	42.8172493	43.42523193	93.68190765
T	11.88586077	42.60621262	43.34571457	43.2980423	96.11950684

T	22.31550035	43.045681	43.52045059	43.57495117	95.88632202
T	42.46476638	43.39486313	44.49952316	44.31308365	90.94217682
T	25.06189154	42.84717178	42.99906158	43.36944962	93.41078949
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T	11.3480636	42.01971817	42.45316696	42.88733292	90.53733063
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T	19.69600513	41.98680115	42.47551346	42.86332703	90.13288879
T	29.64223151	42.94005203	43.46751785	43.48077393	96.27186584
T	33.5155797	42.26072311	42.47901917	43.04017639	90.50639343
T	21.34263131	43.06258392	46.7914238	46.15948486	89.87981415
T	37.09585864	42.98400879	43.01975632	43.33914566	93.50801849
T	30.62718589	43.16795731	43.15216064	43.23760605	94.71021271
T	15.64741966	41.98815918	42.47459412	42.55958176	90.13702393
T	19.30927458	41.99086761	42.47275162	42.41950226	90.22511292
T	6.99734489	42.0113945	42.45882034	42.88720703	90.57106018
T	28.16782128	43.41289902	44.41911316	44.14911652	90.94309235
T	14.85280923	43.00979614	43.02062988	43.28824615	92.87718201
T	29.92623676	43.85218811	47.39404297	47.18949127	90.90711212
T	22.8321482	43.06330109	43.13474274	43.67076874	93.38452148
T	35.44318979	42.88773727	43.0165062	43.36397171	93.48350525
T	39.41019929	43.99300003	47.45022583	46.77817535	91.01074982
T	9.677266762	42.87800598	42.9886322	43.37326431	93.76341248
T	18.94369335	42.81381226	43.01400757	43.38824844	93.61891937
T	34.54585406	43.12648392	43.18191147	43.79190826	93.00565338
T	27.17984558	44.04560852	49.42921448	48.60918045	91.93297577
T	31.22843104	43.05793381	43.02225494	43.48459244	93.49136353
T	31.40971099	43.2040596	43.48148346	43.83148956	93.83010101
T	1.634479812	42.03211212	42.44475174	42.81157303	90.12748718
T	27.60585345	43.21834564	43.4561882	43.84181213	94.18913269
T	14.49327067	42.63199997	43.23111343	43.43028259	96.04004669
T	42.1868038	44.40229034	47.25790405	46.9397316	91.00987244
T	1.057405316	42.12510681	42.44107056	43.05683517	90.68617249
T	38.76665548	43.77051926	52.73551559	50.80497742	89.53234863
T	12.65327921	43.84500122	47.18431091	46.48727798	91.09339905
T	1.293069246	42.67458725	43.49761581	43.28824615	96.411026
T	14.68361461	42.58662033	42.79549789	42.79424286	93.40933228
T	15.89214759	43.17999268	43.18548584	43.75510788	94.83821106
TE	91.4496292	43.40631104	44.06969452	44.54824448	91.24402618
TE	87.81798761	44.18074799	45.46683884	45.39764023	91.57311249
TE	88.48570208	42.01700974	42.45500565	42.92372131	90.54866791
TE	87.67900632	43.06742477	42.92456818	43.52058792	94.44438934
TE	88.3104648	43.30468369	45.26287079	45.00749207	90.8396759
TE	95.28067873	43.44897079	44.48462677	44.30818939	90.89754486
TE	98.29898984	42.09120178	42.4419899	42.73360062	90.62759399
TE	89.29239784	43.21395493	43.41741562	44.06187439	94.59860992
TE	99.7673574	41.99222565	42.47183228	42.36899567	90.11270905
TE	90.01751762	43.59635544	43.80687332	44.35749817	90.90437317
TE	90.92391736	42.93587112	43.01813126	43.36862946	93.26290131
TE	95.22629475	41.97867203	42.48103714	42.79298782	90.10809326
TE	89.25009919	43.46969223	44.04477692	44.59421539	91.20648956
TE	95.64928129	44.63305664	47.7172699	47.42410278	91.34163666
TE	99.13589892	42.61137009	43.3053627	43.32090378	96.16597748
TE	92.10223701	43.05318069	44.77981186	44.7173996	91.0638504
TE	99.52867214	43.22932434	43.364048	44.02333069	93.74598694
TE	96.04809717	44.06700134	47.32515335	46.60293198	91.08551025
TE	91.23813593	44.59110641	50.45166016	49.9426384	92.79386902

TE	99.79152806	42.02920532	42.44672394	42.76671219	90.18654633
TE	93.27753533	43.48538971	44.90420914	44.94952393	90.97301483
TE	90.993408	42.81753159	43.46660995	43.71548462	96.25499725
TE	88.99932859	42.81729889	46.73164749	46.40558624	90.77540588
TE	90.42237617	43.91900253	47.51528549	46.95341873	91.40843964
TE	96.59495834	42.90884018	42.97820282	43.37707901	93.71636963
TE	93.87575915	43.19439316	43.50413895	44.01150131	93.67999268
TE	90.92391736	42.14569092	42.46273804	42.68366241	90.1842804
TE	92.80620746	42.35199738	43.36165237	43.81731415	90.85533142
TE	96.52244636	42.02513885	42.44948578	42.81452179	90.84324646
TE	97.91830195	43.46973419	43.86824417	44.48357773	91.04576111
TE	98.74614704	43.35771561	43.4269371	43.90708923	93.38899231
TE	90.984344	42.67865753	42.77189636	43.41360855	94.68618774
TE	98.62227241	43.03659058	42.93499756	43.47764969	94.23839569
TE	88.48570208	42.98770142	43.53166199	43.7743454	96.14502716
TE	91.63393048	43.37058258	43.50226212	44.10880661	93.41673279
TE	98.91534165	43.91303635	46.89526367	46.69910049	93.02462006
TE	94.0207831	42.62168503	43.19848633	43.27889252	97.1849823
TE	87.46449171	43.10284805	48.97848129	48.47714233	90.54281616
TE	97.27475814	42.85976791	43.24819946	43.81390381	96.23635864
TE	99.42594684	42.14569092	42.2762146	42.72499847	90.7702179
TE	92.51011689	42.74605942	43.48211288	43.50437546	96.31784058
TE	94.18997772	42.59516144	43.4211731	43.24905396	96.14405823
TE	93.23523667	43.74168015	44.39925003	44.90654755	91.6815567
V	54.58635212	42.72509003	43.46660995	43.81386566	95.36199951
V	43.12945952	42.78549957	43.01156998	43.36182022	92.88031769
V	84.74831385	42.00461578	42.46342087	42.83598328	90.08417511
V	67.55088961	42.22681808	42.32077026	42.83735657	90.31665802
V	57.72249519	43.53304291	43.79448318	44.42053986	91.0419693
V	80.12869655	43.24007034	43.3253479	43.76763153	93.55690765
V	49.7038789	42.37271118	43.51310349	43.88951874	90.53017426
V	65.03411969	43.61536026	44.38602448	44.61660767	91.3789978
V	61.97350993	43.38778305	46.06331253	45.82452774	90.93806458
V	51.55897702	42.70930481	42.7510376	42.90555573	93.29959106
V	61.48103275	43.20266342	43.31770706	43.8280983	94.70195007
V	85.10180975	42.94654083	43.4081459	43.47973251	96.18807983
V	80.5335551	43.30179214	45.83115387	45.65475464	91.29795837
V	49.87307352	43.33198166	43.27628326	43.74859238	93.60961151
V	73.21588794	42.77770996	43.01279068	43.37051773	93.23243713
V	71.7777337	43.12108994	44.13776779	44.45737457	90.86494446
V	53.82799768	43.39631653	44.22356796	44.51224136	93.61868286
V	48.5859859	43.28050995	43.27290344	43.51247406	93.51809692
V	62.4267098	42.94790649	43.01853943	43.38412857	93.26290131
V	47.67656484	41.97169876	42.48576736	42.58242035	90.6505661
V	81.87804804	42.50648499	43.02193069	43.87723923	91.05936432
V	55.78279977	43.21609497	43.4928093	43.93782043	93.84892273
V	68.63252663	42.00597	42.46249771	42.67279434	90.08248138
V	46.15381329	42.03056335	42.4458046	42.89287567	90.59233093
V	47.55873287	45.14063644	53.21250534	52.00383377	91.55514526
V	77.74788659	42.03346634	42.4438324	42.60203171	90.67152405
V	50.41389203	42.60311508	43.45639038	43.22619247	96.15551758
V	56.42030091	43.84960175	44.35086441	44.6278801	91.45649719
V	74.82927946	43.65966797	43.81926346	44.29445648	90.85494995
V	57.62581256	42.58919525	42.81267166	43.10476685	90.68251038
V	69.33649709	43.15592575	43.11883545	43.46815491	95.25019073
V	45.78823206	43.25284958	43.24580765	43.82448959	93.07342529

V	43.06903287	43.73174667	47.8027916	47.44417572	90.89361572
V	63.23340556	43.66878891	45.97119141	46.0695076	90.94006348
V	75.76287118	42.02649689	42.44856644	42.33233643	90.63944244
V	82.2103946	43.09525299	43.52679443	43.62256241	94.79759979
V	69.46641438	42.7399559	42.79841995	43.4488678	93.35076904
V	61.22724082	42.0278511	42.44764328	42.45795822	90.83382416
V	80.53053377	43.93784332	47.57894897	47.43503571	91.93753052
V	58.55336161	43.43093491	44.45186996	44.57313538	90.9203186
V	62.04904324	43.37682724	44.67341232	44.44321442	90.92167664
V	77.17685476	43.14389038	43.08551025	43.75885391	95.26901245
V	44.5253151	43.98971939	49.69126892	49.19797516	90.56407928
V	73.92892239	44.28674316	48.22639847	47.88284302	91.16152954
V	82.53065584	42.59984207	42.82860947	43.43242645	93.67092896
V	77.09225745	43.55731583	43.97950363	44.27688217	90.59962463
V	70.99520859	43.31911469	43.2363739	43.29906464	93.71992493
V	80.34925382	43.83915329	45.04546356	44.88862228	91.80169678
V	58.08505509	43.21615219	43.43680191	44.10070801	94.38182068
V	47.60405286	43.06996536	43.02266312	43.57421112	93.63261414
V	52.37171545	43.48761749	44.78935623	44.5251503	90.88870239
V	78.88995025	44.11090469	48.88344193	48.42472458	91.42851257
V	85.61845759	42.86366653	43.01569366	43.37187576	93.63420105
V	83.08658101	42.00190353	42.46525955	43.01846313	90.08755493
V	82.63942381	43.32271957	45.12150955	45.02614594	90.86017609
V	56.4656209	43.43800354	44.05723572	44.54824448	91.24402618
V	65.15799432	44.13990402	51.41306305	50.67970276	91.92897797
V	72.18561357	43.11810303	43.02428818	43.82589722	94.72505951
V	44.860683	41.98002625	42.48011398	42.83393097	90.11222076
V	78.08023316	41.98544693	42.4764328	42.70743942	90.12875366
V	80.60304575	43.50565338	45.22539902	44.53221893	90.92008209
V	71.89556566	43.84843063	46.39742279	46.41301346	91.85238647
V	82.16205329	43.04589844	43.02185059	43.69133377	93.35010529
V	55.62266915	42.89240646	43.45036697	43.45392609	96.37101746
V	60.78612629	43.27954483	43.95548248	44.11156845	91.36619568
V	46.33811457	43.41898346	44.7945137	44.76259613	90.22145844
V	44.48905911	42.00868225	42.46065903	42.64796066	90.38512421
V	73.44248787	43.00011444	43.08720398	43.41470718	93.40493774
V	47.03302103	42.00326157	42.46434021	42.55308914	90.08586884
V	78.9503769	43.78628922	43.85325623	44.16837311	91.42706299
V	59.25431074	43.02183151	43.02103424	43.63832855	92.90765381
V	69.36671041	42.80154037	42.92188263	43.42735291	93.0350647
V	82.59410382	43.55976486	46.65616989	46.41501236	90.84766388
V	83.6817835	42.89301682	43.64962387	43.77192307	96.84545135
V	48.44398328	42.70954514	42.74819946	43.08246994	92.93737793
V	67.38471633	43.25293732	43.30599976	43.80638123	93.73069
V	77.86269723	43.22054291	43.44144821	43.95856857	94.13986206
V	77.09527879	42.9118042	43.01731873	43.35606766	93.33434296
V	81.12875759	43.14482117	43.5154686	43.67016983	93.68797302
V	82.44001587	43.64575577	47.26569748	47.24001694	90.49772644
V	70.0646382	42.69398117	42.76146698	43.26866531	94.29785919
V	78.52436903	41.98409271	42.47735596	42.87942886	90.12462616
V	81.14990692	43.37461853	44.08855057	44.54824448	91.24402618
V	60.41148106	42.01274872	42.45789719	42.82948685	90.0300827
V	80.34623249	44.06294632	46.08095169	46.19817352	91.76656342
V	78.45185705	42.62694168	43.49160385	43.2205162	96.2345047
V	83.5609302	43.12909698	42.90370941	43.60646057	94.23456573
V	67.48139897	43.26862335	43.34165573	43.65148926	92.53153992

**Appendix 3**  
**Result of ANOVA test**

The results of ANOVA: Single Factor tests performed using Microsoft® Excel's 'ANOVA: Single Factor' to check the segmented sets are from the original set.

random number(1)	random number(2)	random number(3)	random number(4)
16 05529955	81 28665268	26 77436036	2 187 703216
5 10058492	19 26410088	45 27729288	11 62646286
33 42191839	59 36005737	91 14533386	62 82825084
42 38223307	38 74852748	2 14542076	88 2748671
8 13328234	73 174481111	88 10644456	85 16934502
18 10678246	48 06226232	40 07187108	22 00732444
26 66877041	39 11853781	28 45883245	28 89282297
21 15833003	15 04919584	63 52789256	58 5103526
42 10018154	24 43611724	29 38523252	41 42944929
18 2003235	64 041281	69 01864881	81 71184745
7 27537474	68 16532354	24 48888005	71 89528863
34 82853768	54 33858204	66 78327816	31 5070369
23 45459288	79 82836391	91 7324223	15 26675177
23 70833228	69 30207221	10 13048683	78 81748531
26 23718896	90 58259279	89 50111393	80 01751752
38 11848683	85 12901774	66 39504582	32 74211859
23 44859032	81 28847725	6 72838268	64 50840785
38 33484944	72 04813865	54 30838954	10 16087955
8 080835978	77 58743994	46 43942681	49 51897782
27 13345159	33 86808386	43 7384589	57 4581184
40 20178835	54 5728813	28 07101857	44 22822482
8 024587919	61 12735855	24 20081176	24 83431284
3 858184989	81 82123478	18 37272256	84 04822025
11 387853	98 1209919	48 8953308	36 5168621
3 33880634	78 87447548	29 0440789	30 88557512
10 72889045	48 96347371	11 21878668	87 17029173
15 59918888	68 78949269	77 80281435	68 1937616
20 08576701	42 7971285	14 8268483	38 7235882
38 96313334	81 82244331	5 78788287	23 18944019
3 68932454	53 40198881	15 77733895	88 5848709
17 84418638	5 83014638	44 2080755	42 8883337
9 038744285	97 31403946	5 081820124	42 58581988
35 14111769	41 35835871	81 62848588	65 17432173
7 1487187	2 813820785	87 3817681	30 27843883
35 23327171	89 86737678	25 71348972	33 87674524
20 4745048	85 7787571	84 80721783	84 89333781
8 37212186	59 81687083	11 6889287	71 11001923
20 38789026	23 822116488	20 8052526	69 2653287
14 81853204	18 86786401	64 5478817	95 2987873
8 280322886	60 52040283	32 69076894	7 43668753
17 0704874	41 5554532	27 8544928	85 7338788
17 18618431	48 14585851	81 27348827	71 82818811
42 54834236	18 28812525	70 6328487	28 0440769
3 377788879	81 50822474	10 24527726	82 8883337
35 81288441	35 23188592	34 1338084	82 8883337
26 2310813	70 0484888	77 38171331	77 38171331
26 30385917	68 8076281	28 17084282	26 17084282
7 81914713	97 02996922	90 3828353	90 3828353
14 3204527	73 1044787	38 72435862	38 72435862
37 22879727	89 1889116	10 02188889	10 02188889
22 82971892	47 9449143	82 81131321	82 81131321
41 32922405	10 65624247	85 28158895	85 28158895
21 84718828	43 4582878	78 3348487	78 3348487
33 8304533	28 63005516	93 08794845	93 08794845
7 81280918	34 22257148	44 34403516	44 34403516
8 30262194	42 3898611	62 11011196	62 11011196
26 5273777	35 88317008	2 7829271	2 7829271
11 84328698	50 21184588	81 87873826	81 87873826
9 04278635	4 84313481	88 6947002	88 6947002
38 04185889	28 48883145	87 82759611	87 82759611
10 8888703	20 4755838	27 83830012	27 83830012
41 03689747	53 84848098	87 85885788	87 85885788
12 19783692	73 1182933	11 37223428	11 37223428
15 8788828	68 2384182	83 42845431	83 42845431
28 14371888	76 57580581	32 45811335	32 45811335
14 03704947	87 76282933	18 82839174	18 82839174
36 8286743	81 1048888	8 18848827	8 18848827
12 80484981	53 3101598	82 37348681	82 37348681
32 3731604	53 82294707	2 305215613	2 305215613
38 23780023	87 8681818	75 7888883	75 7888883
39 88388888	92 32888884	48 18887123	48 18887123
21 08628007	41 6187187	31 18518639	31 18518639
11 48821356	68 48810037	76 40338065	76 40338065
21 8078185	63 81222868	23 8188187	23 8188187
38 80888877	88 2984777	84 73438021	84 73438021
15 47580371	44 25335518	7 8624738	7 8624738
31 33118835	72 18883811	53 14818788	53 14818788
12 8887809	5 88834763	28 18188884	28 18188884
42 21887448	21 80488817	48 7104888	48 7104888
28 6540727	85 77858821	78 82828024	78 82828024
32 88888828	28 61438843	57 28440189	57 28440189
32 4582088	87 8078011	84 8341872	84 8341872
3 32884801	31 78822822	38 18847889	38 18847889
13 85274819	57 45388881	64 0281382	64 0281382
27 64313077	83 0878138	56 0774102	56 0774102
32 21034469	18 0382385	88 0338281	88 0338281
25 47832511	2 184382316	40 48881497	40 48881497
33 43400372	25 20887283	14 88000122	14 88000122
7 83887845	44 8388724	22 2082328	22 2082328
15 21888888	38 8518485	81 8284272	81 8284272
8 28880208	73 21888784	68 38204077	68 38204077
38 24882128	24 38811307	83 2318131	83 2318131
7 82181884	44 1034888	18 88888002	18 88888002
13 44428831	31 48107384	74 84487616	74 84487616
2 008128034	89 71283805	83 887275	83 887275
12 18820283	17 34801898	14 28828289	14 28828289
39 83328856	78 08828856	8 828188488	8 828188488
17 78380189	68 50881825	53 88123234	53 88123234
42 78888882	75 32178883	28 48110385	28 48110385
7 48814896	21 0078841	33 7270287	33 7270287
37 48788845	84 58888889	81 18828881	81 18828881
34 81888207	88 3218805	86 30018808	86 30018808
33 7381883	72 53819847	17 4782847	17 4782847
8 30888372	48 6888788	85 11811888	85 11811888
30 18882828	42 0478225	21 0344654	21 0344654
8 834378049	6 833888968	70 7283134	70 7283134
18 48828018	7 71079345	70 3488812	70 3488812
11 487888	87 8438883	15 87017494	15 87017494
32 03814814	46 84842372	25 1318818	25 1318818
11 88588077	83 0537677	28 43888002	28 43888002
27 31888005	91 4374887	49 48723106	49 48723106
42 19478836	46 59180648	78 88718588	78 88718588
25 08189154	80 49188882	21 48871826	21 48871826
2 063722343	7 207880072	88 50588889	88 50588889
11 348388	31 38178889	82 8347777	82 8347777
35 78884302	81 41888881	25 81118188	25 81118188
18 88880313	78 88888889	88 83019501	88 83019501
28 84221311	28 548788	87 88877885	87 88877885
33 618787	84 4288881	78 88888887	78 88888887
21 34281311	65 3884483	30 284828	30 284828
37 0828884	87 8218818	26 81201818	26 81201818
30 82718889	72 0878883	11 8727844	11 8727844
15 84741888	28 32889181	3 860644551	3 860644551
18 30927488	83 84483942	26 71474343	26 71474343
8 8973449	15 2777444	50 708488	50 708488
28 1878128	68 81807407	23 02831347	23 02831347
14 85280283	38 2378223	36 58270181	36 58270181
29 8282878	29 6878618	21 8187086	21 8187086
22 8374887	31 0882878	38 3184328	38 3184328
35 44318879	50 12483344	88 2087879	88 2087879
39 41018829	48 8584852	72 12828826	72 12828826
8 87288782	81 02801888	8 8018884	8 8018884
18 84888003	35 28818242	28 0283813	28 0283813
34 54888405	1 746288112	75 78287118	75 78287118
27 1784858	48 08048738	82 38848888	82 38848888
31 2241104	38 8481888	47 8444471	47 8444471
31 40971890	31 11888308	40 4374921	40 4374921
1 834478812	37 72731712	17 48741111	17 48741111
27 8088845	89 8057882	74 42744284	74 42744284
14 4832807	88 5437071	37 8148387	37 8148387
42 1888028	68 36848883	82 34888827	82 34888827
1 08748318	46 8788821	80 4344819	80 4344819
38 7884844	1 88188888	88 2488111	88 2488111
12 83278821	38 82188258	78 30891840	78 30891840
1 28388245	5 444380018		
14 8888481	12 6284818		
16 88214789	87 8888388		

ANOVA: Single Factor

Groups	Count	Sum	Average	Variance
All Data	334	16738 58884	50 08187737	225 4621054
Training	147	7885 878008	54 11888108	781 8188108
Validation	144	6813 754488	47 81771867	768 5647028
Testing	43	2326 704337	54 10540218	875 3401037

ANOVA

Source of Variat	SS	df	MS	F	p-value	F crit
Between Groups	3887249755	3	1328083252	1.845383168	0.1776268	2.918322
Within Groups	8383580474	684	8077659110			
Total	12270830229	687				

91 4426292			
87 8176761			
86 44870281			
87 87900832			
86 31104848			
85 288516731			
85 28898884			
89 78238784			
89 7823974			
80 0111362			
80 02291736			
95 22624475			
89 2326919			
95 84227120			
89 13588922			
92 10273701			
89 02857214			
88 04806717			
81 23813583			
89 7818286			
83 27755333			
80 863408			
85 89632899			
90 42237617			
86 50425834			
83 87575915			
80 82391788			
92 86262748			
86 02244638			
87 81830195			
89 74814784			
90 884344			
88 8227241			
86 48570208			
81 83383844			
86 81534165			
84 0207831			
87 46489171			
87 2747811			
89 42684684			
92 61011888			
84 48897771			
83 2352367			
84 58638212			
43 12943982			
84 74511385			
87 55084981			
57 72249318			
81 3889685			
45 7038788			
85 05411888			
81 87930933			
81 58897736			
81 48103275			
85 10180675			
80 8389581			
89 8781282			
73 21988784			
71 7777337			
83 87878788			
48 8658889			
82 4287088			
47 87864684			
81 81864684			
55 78278977			
85 8322683			
48 18381329			
47 08813287			
77 74788888			
50 41889203			
86 4203081			
74 82027046			
87 82581256			
89 33946706			
45 1853258			
43 0893287			
83 73340588			
75 78287188			
82 710386			
89 48841438			
81 22724082			
80 83083771			
86 86338161			
82 04043284			
77 17883778			
44 5283151			
73 82892239			
85 33085584			
77 89287485			
70 8852858			
80 34625182			
86 08583586			
47 88488888			
82 37171545			
78 88888025			
58 03347911			
85 81843788			
83 08858101			
82 83842381			
56 4888289			
81 1788482			
72 18881357			
44 8888883			
76 88883318			
80 80384878			
71 88888888			
82 18883288			
85 82888185			
80 78812828			
48 33811487			
44 48888817			
73 44488887			
47 03382183			
76 88883788			
89 22421074			
89 38871041			
82 88410382			
83 8817888			
48 44888888			
87 38471883			
77 88288923			
77 03857818			
81 72878788			
82 44001387			
70 884882			
78 82438883			
81 14888882			
80 41148108			
80 8882248			
78 45188708			
83 8888382			
87 48138887			
88 0888813			
88 8078387			
81 80842419			
86 11088887			
76 77211828			
85 71818188			
48 4347872			
83 82288888			
48 81284887			
44 20232823			
85 84381848			
83 88888408			
78 18588818			
89 25784841			
75 87183818			
88 28180273			

62 18924528			
72 40617054			
46 5951227			
79 60902738			
50 05694388			
84 02602073			
61 20911283			
60 60484534			
78 83357419			
51 20294978			
84 88897253			
81 64194251			
82 8847428			
72 74456068			
74 72957548			
79 88318721			
78 28795877			
70 06485153			
57 21189031			
63 80236787			
45 46182816			
71 11806188			
56 17250185			
49 7038789			
57 37504166			
52 38265145			
82 814008			
68 81851028			
47 02369703			
45 31389287			
58 88807144			
48 38898328			
66 6503225			
65 56383294			
51 20688511			
44 8898843			
71 38100314			
69 71114231			
85 8463753			

## **Appendix 4**

### **Result of Normal Distribution test**

The result of the normal distribution test performed on the inlet and outlet properties using Microsoft® Excel's 'Descriptive Statistics'.

215_QRA3_C3.PNT	
Mean	1.114047735
Standard Error	0.053937123
Median	0.685210407
Mode	#N/A
Standard Deviation	0.985736897
Sample Variance	0.971677723
Kurtosis	5.085599701
Skewness	2.085562752
Range	5.002608478
Minimum	0.284332573
Maximum	5.286941051
Sum	372.0919435
Count	334
Confidence Level(95.0%)	0.106100484

215_TI001_15.PNT	
Mean	43.08959
Standard Error	0.040578
Median	43.0687
Mode	42.14569
Standard Deviation	0.741587
Sample Variance	0.549951
Kurtosis	0.986419
Skewness	0.666693
Range	4.262516
Minimum	41.97054
Maximum	46.23306
Sum	14391.92
Count	334
Confidence Level(95.0%)	0.079821

215_TRC005.MEAS	
Mean	44.30451634
Standard Error	0.142587635
Median	43.36285019
Mode	43.46660995
Standard Deviation	2.598070363
Sample Variance	6.749969609
Kurtosis	5.428406391
Skewness	2.357251268
Range	13.12188721
Minimum	42.18027878
Maximum	55.30216599
Sum	14709.09943
Count	332
Confidence Level(95.0%)	0.280492006

215_TI001_12.PNT	
Mean	92.4915
Standard Error	0.110807
Median	91.82704
Mode	91.24403
Standard Deviation	2.025081
Sample Variance	4.100951
Kurtosis	-0.74852
Skewness	0.599467
Range	8.250542
Minimum	89.27912
Maximum	97.52966
Sum	30892.16
Count	334
Confidence Level(95.0%)	0.217971

215_TI001_13.PNT	
Mean	116.3845086
Standard Error	0.126244182
Median	116.3755074
Mode	113.644928
Standard Deviation	2.307196618
Sample Variance	5.323156232
Kurtosis	0.752948952
Skewness	-0.320769954
Range	15.50811768
Minimum	106.281517
Maximum	121.7896347
Sum	38872.42587
Count	334
Confidence Level(95.0%)	0.248336731

215_TI001_14.PNT	
Mean	44.08573
Standard Error	0.03001
Median	44.21335
Mode	44.2658
Standard Deviation	0.548447
Sample Variance	0.300794
Kurtosis	4.178698
Skewness	-1.35411
Range	4.454041
Minimum	40.64476
Maximum	45.0988
Sum	14724.63
Count	334
Confidence Level(95.0%)	0.059032

215_LRCA008.MEAS	
Mean	59.54611151
Standard Error	0.450372256
Median	60.46327591
Mode	59.98502731
Standard Deviation	8.230853331
Sample Variance	67.74694656
Kurtosis	4.133315041
Skewness	0.007358001
Range	75.44108009
Minimum	27.55696678
Maximum	102.9980469
Sum	19888.40124
Count	334
Confidence Level(95.0%)	0.885933687

215_PRC008.MEAS	
Mean	13.79334
Standard Error	0.009716
Median	13.81236
Mode	13.76641
Standard Deviation	0.177571
Sample Variance	0.031532
Kurtosis	3.352024
Skewness	-1.11665
Range	1.379471
Minimum	12.7722
Maximum	14.15167
Sum	4606.976
Count	334
Confidence Level(95.0%)	0.019113

215_FRCA028.MEAS	
Mean	804.6457808
Standard Error	3.457470246
Median	816.3564453
Mode	#N/A
Standard Deviation	63.18757447
Sample Variance	3992.669568
Kurtosis	-1.474959735
Skewness	-0.049977181
Range	247.0421753
Minimum	684.9434204
Maximum	931.9855957
Sum	268751.6908
Count	334
Confidence Level(95.0%)	6.801239018

215_FRC006.MEAS	
Mean	698.4118
Standard Error	2.644569
Median	701.9258
Mode	#N/A
Standard Deviation	48.33126
Sample Variance	2335.911
Kurtosis	-1.08454
Skewness	-0.00402
Range	244.2437
Minimum	568.5394
Maximum	812.7831
Sum	233269.6
Count	334
Confidence Level(95.0%)	5.202169

215_FT020.PNT	
Mean	150.9730142
Standard Error	0.438384388
Median	148.295845
Mode	149.6151428
Standard Deviation	8.011767034
Sample Variance	64.18841101
Kurtosis	4.310064445
Skewness	-0.774529557
Range	58.02138519
Minimum	109.4191971
Maximum	167.4405823
Sum	50424.98676
Count	334
Confidence Level(95.0%)	0.862352179

215_PIC010.MEAS	
Mean	3.589054
Standard Error	0.015658
Median	3.642179
Mode	3.637402
Standard Deviation	0.286152
Sample Variance	0.081883
Kurtosis	7.430903
Skewness	-1.69482
Range	2.350117
Minimum	1.737419
Maximum	4.087536
Sum	1198.744
Count	334
Confidence Level(95.0%)	0.0308

151_TRC008.MEAS	
Mean	99.37920135
Standard Error	0.00013229
Median	99.38085938
Mode	99.38085938
Standard Deviation	0.002417697
Sample Variance	5.84526E-06
Kurtosis	-0.914364994
Skewness	-0.953473843
Range	0.005859375
Minimum	99.375
Maximum	99.38085938
Sum	33192.65325
Count	334
Confidence Level(95.0%)	0.00026023

215_FRC010.MEAS	
Mean	424.119
Standard Error	1.763895
Median	423.4997
Mode	407.6954
Standard Deviation	32.23636
Sample Variance	1039.183
Kurtosis	1.203465
Skewness	0.495663
Range	231.0518
Minimum	335.5119
Maximum	566.5637
Sum	141655.7
Count	334
Confidence Level(95.0%)	3.469783

215_TI001_24.PNT	
Mean	56.64508625
Standard Error	0.028808203
Median	56.62149811
Mode	#N/A
Standard Deviation	0.526489116
Sample Variance	0.277190789
Kurtosis	0.393025518
Skewness	0.393062563
Range	2.953426361
Minimum	55.5029068
Maximum	58.45633316
Sum	18919.45881
Count	334
Confidence Level(95.0%)	0.056669026

215_TI001_23.PNT	
Mean	44.15685
Standard Error	0.038984
Median	44.11405
Mode	#N/A
Standard Deviation	0.712462
Sample Variance	0.507603
Kurtosis	1.084162
Skewness	-0.37612
Range	4.338848
Minimum	41.30321
Maximum	45.64206
Sum	14748.39
Count	334
Confidence Level(95.0%)	0.076686

215_TI001_20.PNT	
Mean	119.0583764
Standard Error	0.038706627
Median	119.1302338
Mode	118.3874893
Standard Deviation	0.707389422
Sample Variance	0.500399795
Kurtosis	-0.238579324
Skewness	-0.306326176
Range	3.941268921
Minimum	116.8643036
Maximum	120.8055725
Sum	39765.49773
Count	334
Confidence Level(95.0%)	0.076140358

215_TI001_21.PNT	
Mean	117.7384
Standard Error	0.036479
Median	117.8027
Mode	118.4
Standard Deviation	0.666682
Sample Variance	0.444465
Kurtosis	0.064694
Skewness	-0.09499
Range	4.009201
Minimum	115.8728
Maximum	119.882
Sum	39324.63
Count	334
Confidence Level(95.0%)	0.071759

215_TI001_19.PNT	
Mean	82.16961309
Standard Error	0.109365885
Median	81.52626038
Mode	#N/A
Standard Deviation	1.998734477
Sample Variance	3.994939511
Kurtosis	0.476745196
Skewness	0.219898338
Range	12.83483124
Minimum	74.86998749
Maximum	87.70481873
Sum	27444.65077
Count	334
Confidence Level(95.0%)	0.215135191

215_TI001_18.PNT	
Mean	104.6762
Standard Error	0.04619
Median	104.7788
Mode	105.1368
Standard Deviation	0.844155
Sample Variance	0.712598
Kurtosis	12.04591
Skewness	-2.36072
Range	7.743866
Minimum	98.76177
Maximum	106.5056
Sum	34961.86
Count	334
Confidence Level(95.0%)	0.090861

215_TRC006.MEAS	
Mean	103.9891241
Standard Error	0.043207564
Median	104.059391
Mode	104.3359375
Standard Deviation	0.78964705
Sample Variance	0.623542464
Kurtosis	18.46535534
Skewness	-3.054368694
Range	8.043838501
Minimum	97.57608795
Maximum	105.6199265
Sum	34732.36744
Count	334
Confidence Level(95.0%)	0.084994216

215_PIC015.MEAS	
Mean	2.709607
Standard Error	0.005968
Median	2.7049
Mode	#N/A
Standard Deviation	0.109062
Sample Variance	0.011895
Kurtosis	-0.19583
Skewness	0.373101
Range	0.568135
Minimum	2.485991
Maximum	3.054126
Sum	905.0088
Count	334
Confidence Level(95.0%)	0.011739

215_PDIC017.MEAS	
Mean	1.5795615
Standard Error	0.006586559
Median	1.592441678
Mode	#N/A
Standard Deviation	0.120373756
Sample Variance	0.014489841
Kurtosis	0.7679511
Skewness	-0.585414084
Range	0.80371511
Minimum	1.085399508
Maximum	1.889114618
Sum	527.5735412
Count	334
Confidence Level(95.0%)	0.012956514

215_FT013.PNT	
Mean	136.9427
Standard Error	0.298023
Median	136.9532
Mode	#N/A
Standard Deviation	5.446568
Sample Variance	29.66511
Kurtosis	1.016637
Skewness	0.415006
Range	40.01726
Minimum	123.4863
Maximum	163.5036
Sum	45738.86
Count	334
Confidence Level(95.0%)	0.586245

215_FIC012.MEAS	
Mean	700.8709552
Standard Error	0.204104646
Median	700.8557739
Mode	698.7125854
Standard Deviation	3.730148518
Sample Variance	13.91400796
Kurtosis	0.228121906
Skewness	0.258619333
Range	22.34326172
Minimum	691.4464722
Maximum	713.7897339
Sum	234090.899
Count	334
Confidence Level(95.0%)	0.401497159

215_FRC029.MEAS	
Mean	257.0517177
Standard Error	3.490088447
Median	253.6997986
Mode	322.6694641
Standard Deviation	63.78369385
Sample Variance	4068.359602
Kurtosis	-1.618978734
Skewness	-0.167450239
Range	218.6078033
Minimum	110.0694733
Maximum	328.6772766
Sum	85855.2737
Count	334
Confidence Level(95.0%)	6.865402747

215_PRC013.MEAS	
Mean	6.042531
Standard Error	0.005002
Median	6.072143
Mode	5.916102
Standard Deviation	0.091412
Sample Variance	0.008356
Kurtosis	0.292932
Skewness	-0.65589
Range	0.532927
Minimum	5.768587
Maximum	6.301514
Sum	2018.205
Count	334
Confidence Level(95.0%)	0.009839

215_TI001_11.PNT	
Mean	44.53851
Standard Error	0.134635
Median	43.67047
Mode	44.54824
Standard Deviation	2.460541
Sample Variance	6.054262
Kurtosis	8.448763
Skewness	2.683561
Range	16.28015
Minimum	42.33234
Maximum	58.61248
Sum	14875.86
Count	334
Confidence Level(95.0%)	0.264842

## **Appendix 5**

### **Result of Predicting Validation and Testing Set Using Neural Network**

The result obtained from predicting the outlet conditions of validation and testing set using the developed Neural Network

215 TI001_15.PNT	215 TRC005.MEAS	215 TI001_11.PNT	215 TI001_12.PNT
0.336836727	0.143989634	0.136113406	0.23815464
0.518522132	0.250463977	0.188288105	0.27804127
0.010902163	0.020936536	0.036325991	0.153874322
0.257332918	0.056721216	0.072988919	0.626051978
0.312994623	0.234919868	0.164322995	0.189145702
0.346844844	0.175611019	0.121367863	0.196159661
0.028307857	0.019944625	0.0246477	0.163440492
0.291709364	0.094280405	0.1062378	0.644744154
0.005087736	0.022218869	0.002251599	0.101034293
0.381421757	0.123960412	0.124396687	0.19698728
0.226470007	0.063851522	0.063654769	0.482850709
0.001908013	0.022920359	0.028295599	0.100474841
0.35170616	0.1420907	0.1389372	0.233605045
0.624635201	0.421966065	0.312764916	0.249985436
0.150341018	0.085741014	0.060723188	0.834715627
0.253991211	0.198106647	0.146503872	0.216316585
0.295315078	0.090213336	0.103870228	0.541402699
0.491836803	0.392083432	0.262323953	0.218941849
0.614793543	0.630349983	0.467467641	0.426002043
0.013763287	0.020305399	0.026681601	0.109983679
0.355388839	0.207586783	0.160762263	0.205306936
0.19870717	0.098029434	0.084960578	0.845505194
0.198652579	0.346853211	0.25020186	0.181355908
0.457115805	0.406573127	0.283852835	0.258082235
0.220128461	0.060808634	0.064173789	0.537812958
0.28712011	0.100889464	0.1031436	0.53340392
0.041091184	0.02152581	0.021580213	0.109709038
0.089491344	0.090030769	0.091215525	0.191043216
0.012809281	0.020515875	0.029618337	0.189578469
0.351716004	0.128637395	0.132141208	0.214124087
0.325436083	0.095006023	0.096730019	0.498133464
0.166126869	0.045086318	0.06641764	0.655358951
0.250099115	0.057516024	0.070351409	0.60108469
0.238629561	0.102986955	0.088576141	0.832176361
0.328454716	0.100746433	0.109120643	0.501495725
0.455716119	0.359322163	0.268231168	0.45397003
0.152760936	0.077596121	0.058142618	0.958223253
0.265643333	0.518081157	0.37744857	0.153165066
0.208615949	0.081384687	0.091006042	0.843246117
0.041091184	0.00731113	0.024119308	0.180727103
0.181939569	0.09921089	0.071993058	0.853122066
0.146538417	0.094566757	0.056309764	0.832058922
0.415515401	0.169104582	0.158122411	0.29118516

215 TI001 13.PNT	215 TI001 14.PNT	215 LRCA008.MEAS	215 PRCA008.MEAS
0.558006672	0.789719082	0.283742895	0.806475721
0.567279651	0.890095923	0.224896267	0.913743018
0.474810104	0.569212915	0.478494509	0.589191694
0.778733495	0.724570915	0.43921982	0.694044163
0.65184338	0.78360483	0.329567857	0.862438472
0.604894524	0.892279034	0.297050759	0.893135059
0.482087196	0.616495375	0.459079627	0.585618883
0.720586123	0.895379411	0.431339125	0.835506195
0.466957417	0.61725334	0.500109992	0.593811184
0.596883426	0.807595067	0.32690059	0.886351695
0.740422497	0.81297876	0.438809635	0.720715116
0.482805952	0.632975334	0.450816607	0.596338008
0.585519119	0.864940904	0.195361457	0.83094132
0.478710866	0.998037855	0.185893872	0.937211714
0.783800697	0.797340699	0.438530616	0.784879847
0.490799832	0.678890887	0.573260518	0.637746807
0.746639905	0.88826653	0.432920553	0.800642249
0.609153434	0.920675745	0.272899176	0.921152729
0.660825118	0.706251285	0.44338488	0.409806567
0.492363285	0.605656047	0.468138746	0.586917898
0.699850445	0.886488523	0.286498246	0.901962004
0.930384025	0.815747687	0.434316407	0.826410321
0.835776414	0.57038198	0.817685364	0.602727312
0.622216976	0.83080507	0.327354312	0.874643272
0.761962041	0.771282117	0.428647486	0.703534789
0.747049217	0.853165468	0.439157726	0.857514795
0.577206448	0.580981501	0.367551918	0.573669184
0.092385916	0.570121617	0.204548961	0.416226289
0.492544819	0.541535629	0.486196659	0.587676291
0.650988843	0.820676601	0.175361889	0.892595819
0.748904403	0.745463344	0.456846665	0.743450308
0.950049197	0.788741007	0.473151937	0.642472071
0.745574808	0.80125471	0.446661357	0.695889332
0.861664896	0.806103974	0.439137601	0.841042393
0.688432022	0.782699555	0.532782426	0.749566535
0.605035717	0.737165981	0.287013202	0.613944197
0.766783754	0.789403049	0.411614985	0.754768819
0.675480647	0.747046934	0.610944778	0.551833418
0.84694984	0.82555841	0.372492497	0.789242852
0.59316469	0.485387975	0.433409064	0.522698552
0.919975599	0.865360569	0.424015658	0.831264864
0.852212351	0.809812436	0.428379085	0.808770256
0.684822501	0.836315519	0.671740595	0.895173801

215_FRCA028.MEAS	215_FRC006.MEAS	215_FT020.PNT	215_PIC010.MEAS
0.653490183	0.653602766	0.813303363	0.760369626
0.695605651	0.6165774	0.896642712	0.830456424
0.645921633	0.64291303	0.685445022	0.673510562
0.072541117	0.314155348	0.658764869	0.819232744
0.844347392	0.82910491	0.899498736	0.882352893
0.77651951	0.829763132	0.913651043	0.867247141
0.649320735	0.555205065	0.66560644	0.667623844
0.192903144	0.316800981	0.65000666	0.799570888
0.652333677	0.717969087	0.659713984	0.661827011
0.714639686	0.839110935	0.91314164	0.856686537
0.252568536	0.397803277	0.641435696	0.807632281
0.702379149	0.61465896	0.656466112	0.677350837
0.662837344	0.738523158	0.812945703	0.766585548
0.778661305	0.759130207	0.847230347	0.740222942
0.217327369	0.386324374	0.578308631	0.83702468
0.699500857	0.65851869	0.872361777	0.730044498
0.124000535	0.281053325	0.682464869	0.811018975
0.778095282	0.764619639	0.889389306	0.882214415
0.296120433	0.421326345	0.821674721	0.81638627
0.599336782	0.63497788	0.667607234	0.677620287
0.76865226	0.724117991	0.860727557	0.90181256
0.240672666	0.42398972	0.624658003	0.939530933
0.569239975	0.551155524	0.892584318	0.9986913
0.7777909	0.734917181	0.870219234	0.864177782
0.167825931	0.146156285	0.632771109	0.807881644
0.24991606	0.312645485	0.630410024	0.810492552
0.646028611	0.768727655	0.636896827	0.653428603
0.525387402	0.287461869	0.208843311	0.147238956
0.70872671	0.677036121	0.666019327	0.663529032
0.840012412	0.734360166	0.883236758	0.877194686
0.249422921	0.303993639	0.692778112	0.804737415
0.168579969	0.322507821	0.70018405	0.98804497
0.072614248	0.292186124	0.613455342	0.807064467
0.333555032	0.43976206	0.613470333	0.868522465
0.233031973	0.312555273	0.732254356	0.821421825
0.226368418	0.345416648	0.828893413	0.818276987
4.11113E-11	0.07765596	0.428608547	0.713533769
0.702882912	0.704020977	0.588351	0.706857469
0.225498507	0.378941992	0.560344874	0.803681324
0.58931489	0.580954692	0.625796731	0.651090898
0.343532206	0.268115538	0.598175353	0.922383101
0.319386916	0.403980919	0.600765498	0.857084828
0.734028752	0.591984284	0.973704595	0.95154521

151_TRC008.MEAS	215_FRC010.MEAS	215_TI001_24.PNT	215_TI001_23.PNT
0.287760171	0.499738743	0.650700121	0.522633578
0.999999147	0.528962743	0.555103633	0.738719698
0	0.422222196	0.338487748	0.798854935
0.999999147	0.231223681	0.322288281	0.577409238
0.999999147	0.541066787	0.325193129	0.565776598
0.908853391	0.609635369	0.409072063	0.616847327
0	0.397632129	0.517428441	0.844323428
0.999999147	0.247068394	0.392341741	0.78698755
0	0.508734919	0.260515381	0.797895733
0.59765574	0.542464998	0.413268528	0.594009335
0.999999147	0.309918788	0.283561713	0.669752058
0	0.365784999	0.395962145	0.620355318
0.31640598	0.552830722	0.677479228	0.589624786
0.507812067	0.582215597	0.699015658	0.683653024
0.999999147	0.337086814	0.107413497	0.546418464
0.124999893	0.492197309	0.355214195	0.206188132
0.999999147	0.278839974	0.272998865	0.507611638
0.746093113	0.479085618	0.612473409	0.716088317
0.999999147	0.405995372	0.384896858	0.807886035
0	0.4324705	0.558234514	0.591802554
0.670572344	0.467548334	0.403397987	0.542649351
0.999999147	0.345273729	0.286143656	0.992413419
0.080729098	0.196838612	0.156257306	0.028632771
0.774738922	0.487436182	0.707985942	0.875670277
0.999999147	0.099099392	0.41414037	0.96201786
0.999999147	0.240607119	0.533314045	0.883096845
0.007812493	0.466503045	0.454345841	0.638011329
0.999999147	0.695887761	0.927203144	0.680164375
0	0.420505009	0.525910493	0.582388124
0.627603631	0.48607601	0.395276296	0.664084762
0.999999147	0.311801869	0.242511524	0.420555423
0.999999147	0.126695624	0.380465318	0.787984558
0.999999147	0.242779721	0.300410863	0.516790443
0.999999147	0.297399085	0.268279294	0.497936967
0.999999147	0.287593649	0.187972974	0.470231747
0.999999147	0.381069291	0.563434566	0.867506064
0.999999147	0.24988991	0.007953781	0.515729253
0	0.39591283	0.24560624	0.443378468
0.999999147	0.452030919	0.409490547	0.898811591
0.037760384	0.332250136	0.336360454	0.3343828
0.999999147	0.218439419	0.037664859	0.631453407
0.999999147	0.377718922	0.263726342	0.955423891
0.999999147	0.314793109	0.508485281	0.446140022

215 TI001_20.PNT	215 TI001_21.PNT	215 TI001_19.PNT	215 TI001_18.PNT
0.588729941	0.483012181	0.443386295	0.805105204
0.626442634	0.630366858	0.410205274	0.83455829
0.76203953	0.49888867	0.459552977	0.824664733
0.503757332	0.430964013	0.754128754	0.825933693
0.710772567	0.600193346	0.504607121	0.776645217
0.701895121	0.72831279	0.456566567	0.831881453
0.791025766	0.451046069	0.478385079	0.762923104
0.57409164	0.425346442	0.675199297	0.70038936
0.745533209	0.577957127	0.453286508	0.784768338
0.747834841	0.682285624	0.454878983	0.943341113
0.353522135	0.271015472	0.685946571	0.809610605
0.791258059	0.601961206	0.489818919	0.784904298
0.495774211	0.502770731	0.437815902	0.794170271
0.357513695	0.37822697	0.323655833	0.554144616
0.389440368	0.29635734	0.71106357	0.641829985
0.134191523	0.223380295	0.312966218	0.685563803
0.387769797	0.38555341	0.60596438	0.759754643
0.475363441	0.392019706	0.470089824	0.646781689
0.386470895	0.37961043	0.767133075	0.848759219
0.660754177	0.532575068	0.469645191	0.765514227
0.479672467	0.422334039	0.518741451	0.80567466
0.270448517	0.285401935	0.833154509	0.576877531
0.392001393	0.352620589	0.663764863	0.798922962
0.638401828	0.475421228	0.492468883	0.692403184
0.599705763	0.457748334	0.788322682	0.61238281
0.256491607	0.10428474	0.686865558	0.543633327
0.894663081	0.743028467	0.454448616	0.942347028
0.178123849	0.335823061	0.21811201	0.22050258
0.831390466	0.511216118	0.466281318	0.817193826
0.596052963	0.639339368	0.479863424	0.887363008
0.291904604	0.154977992	0.557466116	0.761393061
0.587721404	0.476974053	0.948975412	0.76978219
0.568768269	0.414588946	0.757663228	0.806984014
0.510398962	0.408413804	0.732426155	0.754865008
0.267076403	0.154977992	0.540832807	0.827793784
0.131313031	0.220071028	0.555008152	0.746426617
0.567662944	0.38301104	0.676826843	0.694639629
0.371298321	0.426364532	0.548278623	0.850954284
0.619560968	0.483583072	0.8148033	0.814123887
0.674500088	0.649208177	0.50258844	0.889864476
0.334410266	0.387054854	0.772923407	0.720432631
0.451481832	0.258421608	0.78629984	0.689173641
0.629423721	0.49145947	0.489652479	0.839862702

215_TRC006.MEAS	215_PRCA013.MEAS	215_PIC015.MEAS	215_PDIC017.MEAS
0.803313404	0.689956766	0.594413272	0.865727655
0.865408286	0.639489168	0.555329084	0.761475403
0.846757437	0.609559711	0.543706433	0.589827933
0.853317103	0.435960803	0.2319633	0.566320546
0.787223443	0.581315071	0.52692837	0.798650886
0.856411983	0.603939773	0.632362723	0.732362452
0.835099708	0.630254432	0.590670405	0.472048046
0.71996126	0.596873915	0.308197923	0.643517381
0.791726811	0.598143569	0.520615561	0.42382637
0.921280211	0.603304499	0.627168284	0.671504265
0.788156744	0.286023615	0.146345701	0.626036647
0.785297087	0.643191652	0.516299452	0.716987902
0.816234504	0.665641877	0.512597711	0.841777525
0.588410368	0.645573483	0.484082432	0.854306057
0.76043087	0.213053897	0.283494753	0.63022736
0.751434567	0.29759097	0.230409752	0.898566624
0.814671414	0.375435297	0.262434991	0.703427934
0.751952435	0.611754537	0.446743153	0.661062784
0.887522023	0.220418601	0.068074932	0.39653601
0.793569702	0.598922898	0.450933787	0.758121824
0.812316346	0.52115015	0.448412944	0.772589232
0.710674723	0.422135988	0.187236906	0.445419354
0.881971537	0.042067665	0.272329101	0.702666444
0.722795309	0.694189838	0.613321483	0.67355913
0.706102117	0.678680205	0.376171718	0.401023665
0.543254335	0.665119342	0.248114404	0.488740296
0.989704278	0.626446367	0.702057087	0.636448464
0.316551299	0.836254997	0.486553336	1
0.808327053	0.644141879	0.563406945	0.715853974
0.896776312	0.545779097	0.411145005	0.706732863
0.796704418	0.216963069	0.199426925	0.723538579
0.756552548	0.546108365	0.194886302	0.470103979
0.830301364	0.521791688	0.394764352	0.586450029
0.836463618	0.431368935	0.275238541	0.57165379
0.791881413	0.241169692	0.155322874	0.713088495
0.782405181	0.325355128	0.170094166	0.455636572
0.801700994	0.101472047	0.222961368	0.563026889
0.816550347	0.222032734	0.24025686	0.707623986
0.793028122	0.637313131	0.329925768	0.442060287
0.964209221	0.462545677	0.514599446	0.731499955
0.814105174	0.144043457	0.087627307	0.488464861
0.736233329	0.351953423	0.23281645	0.474121748
0.857718036	0.486987621	0.387401996	0.769127674

215_FT013.PNT	215_FIC012.MEAS	215_FRC029.MEAS	215_QRA3_C3.PNT
0.468645463	0.390204658	0.981108116	0.02168087
0.422040052	0.234172511	0.703591502	0.015657405
0.416812358	0.111125679	0.981792573	0.215391241
0.172955852	0.383353547	0.973626271	0.450478991
0.369920967	0.460185427	0.97898983	0.030922035
0.424352287	0.504370724	0.973232461	0.03523186
0.439480571	0.466869904	0.307759697	0.106049811
0.212917401	0.333374308	0.971986394	0.180609739
0.447717908	0.658643654	0.508801166	0.286699321
0.48482615	0.573775103	0.823264439	0.038582528
0.207247011	0.421072903	0.956008932	0.074637754
0.430413133	0.323570225	0.960637778	0.20043258
0.443739369	0.486054655	0.388764641	0.020759654
0.498470776	0.265229243	0.404443011	8.27266E-11
0.350239517	0.260145544	0.218276116	0.021194416
0.529719501	0.248128782	0.978072521	0.049146035
0.298235587	0.404791952	0.954101302	0.005895281
0.385030949	0.632457548	0.790482108	0.019129376
0.161827841	0.5793669	0.337303944	0.124613053
0.412966513	0.404035271	0.506086371	0.13915844
0.349735051	0.624650341	0.370985646	0.027671558
0.18866372	0.164601498	0.974818034	0.2278857
0.394417921	0.500095609	0.95757175	0.107015606
0.424182225	0.237614457	0.473274445	0.021293993
0.290499667	0.520170894	0.414511847	0.384241717
0.27667087	0.198171397	0.968937258	0.217364675
0.437555361	0.206765335	0.152532886	0.162969672
0.563721631	0.043313882	0.972713429	0.00091471
0.423442111	0.336174303	0.446823099	0.169172639
0.326701546	0.349218185	0.35143848	0.033486909
0.339721594	0.290052229	0.337847056	0.039352731
0.139423109	0.161501015	0.963720278	0.667356842
0.226855251	0.411170479	0.476192637	0.424802499
0.220782202	0.569289647	0.441244905	0.350387919
0.198928457	0.222374286	0.329039713	0.048741114
0.329040854	0.325203784	0.95900851	0.103340429
0.169127166	0.474570575	0.959765559	0.015409144
0.355557963	0.339673615	0.91205751	0.038009394
0.213848167	0.40971175	0.502511014	0.346611956
0.419778912	0.314768678	0.146500924	0.170297674
0.072445894	0.524926789	0.965363227	0.146656262
0.171752071	0.149481521	0.298191535	0.039372867
0.309241581	0.481831442	0.435232487	0.063514011

NN value	Error	Data Number
0.0215	3.27139E-08	1
0.0163	4.12929E-07	2
0.2432	0.000773327	3
0.4026	0.002292398	4
0.0289	4.08862E-06	5
0.0293	3.5187E-05	6
0.1861	0.006408033	7
0.1929	0.000151051	8
0.3941	0.011534906	9
0.0407	4.48369E-06	10
0.026	0.002365631	11
0.2046	1.73674E-05	12
0.0092	0.000133626	13
0.0045	2.025E-05	14
0.0571	0.001289211	15
0.0353	0.000191713	16
0.08	0.005491509	17
0.0083	0.000117275	18
0.0178	0.011409028	19
0.1533	0.000199984	20
0.012	0.000245598	21
0.1535	0.005533232	22
0.0812	0.000666446	23
0.0238	6.28007E-06	24
0.49	0.011184814	25
0.1522	0.004246435	26
0.1108	0.002721675	27
0.0151	0.000201222	28
0.1916	0.000502987	29
0.0268	4.47148E-05	30
0.0261	0.000175635	31
0.7535	0.007420644	32
0.5489	0.01540019	33
0.2516	0.009759053	34
0.0367	0.000144988	35
0.013	0.008161393	36
0.042	0.000707074	37
0.0174	0.000424747	38
0.3037	0.001841436	39
0.1799	9.22047E-05	40
0.0478	0.00977256	41
0.0825	0.00185995	42
0.077	0.000181872	43

RMSE 0.053642803  
Standard Deviation 0.004171314

## **Appendix 6**

### **Result of Improvement strategy**

The conclusion of the step taken and the result to improve the Neural Network performance and reduce the number of Root Means Square Error (RMSE)

First trial (Reduce the number of input )

Inputs	RMSE
26	0.428149
25	0.442515
24	0.391788
23	0.371951
22	0.371961
21	0.417685
20	0.520335
19	0.386998
10	0.394454

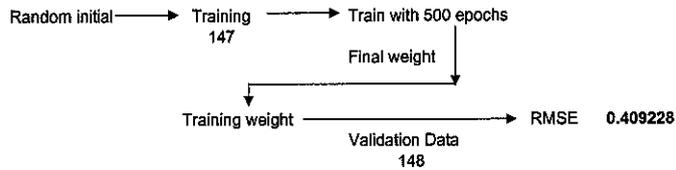
Second trial (Reduce the number of data set from 2219 to 334)

Inputs	RMSE
27	0.353117
26	0.428149
25	0.442515
24	0.391788
23	0.377276
22	0.371961
21	0.417685
20	0.520335
19	0.386998
10	0.394454

Forth trial (Increase the epochs number)

Inputs	Epochs	RMSE
27	1500	0.5065
	1000	0.4566
	500	0.2815
	250	0.4505
	200	0.366
	100	0.353117
10	1000	0.32026
	500	0.296907
	100	0.394454

Fifth trial (Calculate RMSE for Validation data at 500 epochs)



Sixth trial (Find the highest epochs number for validation data and calculate the RMSE)

Data types	Epochs	RMSE
Validation	2966	0.372
Training	3610	0.29152

Seven trial (Test the testing data line by line and calculate the RMSE)

Epochs	RMSE
500	0.113
100	0.085

Eight trial (Increase the number of inputs from 27 to 54 inputs)

Nine trial (using trial & errors, create the new NN model and calculate the RMSE by using 54 inputs)

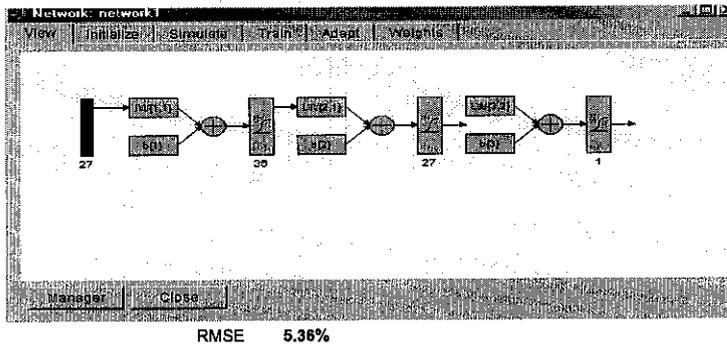
Ten trial (Calculate the RMSE for validation data set at every epochs number to find the best epoch number that will give less RMSE)

Epoch	RMSE
25	0.162
50	0.1409
75	0.1197
100	0.116
125	0.117
150	0.131

since 100 epoch give less RMSE, all trial should using 100 epochs

Eleven trial (Using trial&errors, create new NN model and calculate RMSE)

Twelve trial (Using 27 inputs data, create new NN model and calculate RMSE)



**Appendix 7**  
**Results of weight and biases**

Columns 1 through 6

2.0909	-1.5942	-1.2532	-0.6709	-12.3181	-0.5894
-3.8060	1.3199	0.5737	0.8054	0.0686	-1.7828
-0.5461	1.7701	-0.3404	2.7498	0.3368	-1.6207
0.4931	-1.2836	-1.7103	0.8482	2.0056	1.6044
-1.7343	2.5631	2.4874	-2.7411	1.3749	2.5655
0.3895	1.4214	-0.2481	-0.2510	-1.4754	-1.5285
1.7170	0.5860	0.7487	1.4917	-1.8909	-2.2738
-1.8077	1.5527	-1.3798	-0.5680	-2.1129	-0.7631
0.4913	0.8890	-0.4279	0.1995	-0.2340	-0.1719
1.7098	0.7685	-1.5138	3.1782	0.6218	-1.4769
-0.1798	2.3576	-0.5742	0.2814	-1.4058	-0.0347
-2.3897	-1.8682	-0.6938	-1.1842	1.4170	-0.9997
-2.1407	1.5473	0.5736	0.3093	4.7902	1.2331
-0.8069	-2.6235	-1.8092	-20.1352	0.1306	-2.5867
1.2678	1.2195	1.8044	0.5738	-2.1843	0.0136
-0.7064	-0.1950	-0.8405	-0.3757	-0.8155	-0.3966
1.9919	0.4894	1.0042	-2.0017	-0.4437	-0.6722
2.3618	-0.7715	1.6231	-0.6020	0.6741	-2.0582
0.6921	-0.0216	-1.6343	0.9181	-0.6385	-1.4877
-0.3456	1.2315	1.3156	2.0321	1.3334	-0.5105
1.8400	0.8138	1.6287	-2.1037	-1.6168	1.4249
-1.3691	-0.3414	1.0518	2.1391	-0.6348	-1.2389
-1.0664	-1.6238	0.4177	0.8016	-0.6417	0.2082
-0.0128	0.6930	-1.4266	-0.3082	1.1029	0.7770
1.3488	0.5866	-0.7007	1.5929	0.1084	-0.2975
1.3632	-0.1773	-1.2887	0.6831	1.3299	-1.9927
2.1916	-1.4803	0.5561	0.2147	1.6863	1.2722

Columns 7 through 12

3.8746	-2.5583	1.1815	2.0993	-9.2268	1.0490
-0.7551	-0.8997	-3.1603	0.0831	-57.2018	-1.4535
2.6035	-48.0850	1.2020	0.8857	-11.9522	-1.9724
2.7029	-0.6920	-0.2304	0.1622	-11.4458	-1.3033
2.2641	2.2565	-1.5623	0.4019	-52.9142	-0.8220
-1.5153	-1.3998	-1.5259	-1.9760	-54.2132	-0.8548
0.2469	-1.7045	-0.1998	-1.0728	-8.1705	0.5250
2.0629	1.0089	-0.6977	-0.5187	-55.6181	0.2503
0.6715	-0.6290	-2.3992	1.8482	-1.7872	-1.2813
1.2538	1.1058	-1.9525	-2.1975	-11.1299	-1.8727
-0.4239	-0.5275	0.7876	1.9961	-56.8568	-1.5138
1.0028	2.7446	0.0553	1.6137	-53.4787	2.1840
-1.2581	-0.1833	0.8510	-1.0733	-9.3690	0.4335
0.5353	-1.3799	1.5750	-2.6317	-317.4082	-2.3393
1.7727	1.6353	-1.1794	0.6038	-55.8108	1.6193
0.0302	0.4214	-0.8141	-1.8165	-319.6912	-0.0988
-2.0574	1.4499	1.6357	-0.5294	0.3312	-1.5561
-0.8315	0.2094	-0.3083	0.2789	-1.4324	-1.5683
0.3632	1.4027	0.7977	-0.0524	-53.3533	-1.7460
0.6629	1.0645	-1.3038	1.7451	-55.1394	0.5430
-0.3809	1.6519	1.0537	0.3191	-56.1547	-1.2985
2.1723	-0.9915	1.4645	1.7982	-3.4232	-1.1457
-0.2679	1.1005	-2.0648	-1.0530	-4.1912	-0.5729
-0.0998	1.0019	1.3790	12.7122	-318.9893	-1.9347
1.1664	0.9747	1.5438	0.0804	-55.2392	1.3601
0.9925	-5.6036	1.6009	-0.2139	-54.4449	-0.2534
-0.2387	-2.0083	1.7101	-2.3180	-9.0662	1.3275

Columns 13 through 18

-2.5714	-0.8975	-0.6556	1.4240	1.9444	0.2453
1.4126	0.0855	0.6564	-1.1286	-1.4191	-1.6536
-1.3401	2.3998	2.0566	-0.7774	2.0531	0.8895
-0.9030	-1.0342	-2.2645	-1.1155	0.3746	-1.9240
0.8700	0.6288	-2.5150	2.6060	1.8571	1.1490
-0.8984	1.6477	-1.8928	0.5631	0.1820	0.6910
-1.4694	1.6812	1.1380	1.6933	0.9882	-0.4291
0.6565	0.6805	0.5183	0.9590	0.0628	0.9707
-2.1905	-0.6614	-0.3165	0.0934	-1.7673	2.3636
-2.8302	1.9806	-1.4805	-1.8679	1.1077	0.2850
0.4804	1.8822	-1.8312	1.7157	-1.7331	-0.4191
-1.7873	1.6619	2.1881	-1.8059	-1.8324	1.5956
0.8338	-1.2213	0.5990	-1.1028	0.0895	0.1173
-0.2066	2.5838	-1.0032	2.9662	-1.8433	-2.5746
-0.0009	-0.7604	-0.1059	0.1376	1.8005	-0.7186
-2.6752	0.6653	0.8992	-0.0221	-0.8793	1.2384
2.2575	1.1477	-0.3003	-0.6046	1.7971	0.1990
2.2605	1.0250	1.1542	1.3626	0.6110	-2.0370
-0.1741	0.1902	-0.9812	0.2460	-1.9483	0.3051
-0.6131	0.2081	1.7279	-1.1880	0.5354	-0.5285
-1.1225	-1.1854	-0.2856	0.9492	-0.0735	1.4483
-1.3451	-1.8717	0.5591	-1.6756	1.3494	-2.2048
1.1985	-1.5753	-1.8250	0.5905	0.3526	-3.7376
-1.0358	-0.5068	1.6476	-1.4302	1.1102	2.6219
-1.6066	2.1420	-0.9556	0.5096	1.5516	1.2405
-0.3982	-1.2456	-1.2354	0.8741	-0.7628	0.8408
1.2995	1.0762	-1.4701	-0.2721	1.9611	1.4589

Columns 19 through 24

1.0244	1.3716	1.2281	1.6293	0.6758	2.1365
2.5546	0.2006	-1.4979	3.3299	0.5129	1.4961
-1.1709	0.1534	-0.5796	-0.4523	-1.7226	-1.6150
-2.4696	1.7687	2.2744	-1.1773	-2.1533	3.6368
-0.6466	1.1476	0.5301	-1.1937	1.9363	-0.2470
-0.8387	-1.1740	-0.4756	-0.8695	0.7066	1.8577
-0.9325	0.0264	0.2246	1.0774	1.2613	-0.0712
-0.0439	0.4055	1.9593	1.2273	-0.7856	0.5092
-1.6790	-2.4278	-1.0412	-1.7482	1.7870	-1.1469
-1.1885	-0.8257	-2.7038	1.9008	1.7905	-1.3047
-1.4625	0.9915	-1.1884	1.6364	-1.5475	0.2529
1.1369	0.8439	1.4000	0.7562	2.1139	-1.1135
-0.5113	0.9648	1.5794	-1.3491	-0.8165	3.1526
-1.4876	1.9915	-2.3996	-1.3291	2.6815	-1.7732
-1.9102	0.5515	1.6362	-0.2760	-1.1048	1.9650
1.2270	2.0508	-0.2248	1.8661	-0.2236	1.5898
-1.3582	-0.7265	-1.6167	-0.2896	-0.4461	-0.2014
-1.0579	0.1376	0.4910	-2.1105	-1.8090	-1.0456
0.5481	2.5884	1.0214	0.8478	-0.3059	1.4192
0.5083	0.8607	-0.5592	-0.4521	0.6330	1.3792
-0.2984	-0.1774	-0.3222	-0.4579	1.6688	-2.1344
-1.7047	2.3364	0.0302	-0.9775	-0.8849	-0.4744
-2.0974	-2.7951	0.2979	-2.0514	-0.6573	0.6663
2.2998	1.1177	-0.4477	-0.0562	-1.3073	-1.3322
-1.7073	-2.6846	1.8114	-1.4186	-1.0361	0.6457
-1.6401	0.6718	-0.4976	1.3601	1.4672	-3.4137
-0.5252	1.8978	-2.4410	-0.8779	1.5586	-3.9798

Columns 25 through 30

4.0836	0.0449	1.2438	0.9130	-0.7879	-4.0618
11.1212	0.2749	-1.1970	-3.9387	-2.2038	-2.2088
3.0015	1.4447	-2.0977	2.4016	-0.3854	1.0563
-16.0593	1.8731	-1.4189	0.9794	-1.1934	-1.8862
-2.5919	-2.1164	-0.2952	-1.0158	2.6882	2.4088
-0.3123	0.2724	-1.5586	-1.4695	-0.9591	0.3078
0.5788	-0.1584	-1.0924	0.4872	0.8476	1.0439
-0.8192	-0.9793	1.3042	0.8107	-2.1654	0.3335
2.3013	-0.3116	-0.5355	1.7240	-1.5902	0.1480
0.3920	-1.6413	0.4980	-1.0242	0.9831	2.4597
1.7330	1.8108	-0.4464	-0.2170	-0.0837	-1.9174
-0.6509	-1.5233	-2.3022	-2.4843	2.1582	-1.1573
-0.9624	1.7283	-0.4133	-1.9374	-1.9305	1.3725
0.2919	-1.0215	0.8799	2.7811	1.6764	1.1816
0.2930	2.3050	0.6327	1.8215	-1.2564	-0.3400
1.3948	-1.3343	-0.4207	0.1016	1.0155	0.3746
-0.0292	-1.9732	-0.5665	0.6022	-1.6527	0.7303
-0.8290	-0.1386	1.7549	0.4533	-0.8085	-0.1259
-0.4286	-1.7183	2.1181	1.6362	0.4849	-1.3482
-1.1401	-0.3017	0.3826	0.3172	1.0082	0.0591
-0.6493	-1.8303	0.7841	0.7010	2.2204	0.2849
-0.5739	0.3803	-2.0477	-2.2239	-0.2161	2.2253
1.7315	0.7405	-1.6926	-0.1895	-0.2772	-0.8042
-0.5721	2.0333	0.9166	-0.2933	1.2616	-1.3339
-1.1401	-0.0939	-1.9559	2.5294	0.4593	-0.4594
-0.2635	1.5907	1.7008	0.4725	1.4487	0.8722
-1.1961	-1.3723	-1.6772	0.6655	-1.1921	-1.9720