

STATISTICAL ANALYSIS OF FACTORS  
AFFECTING MONOCLONAL ANTIBODY  
PRODUCTION BY USING PRINCIPAL  
COMPONENT ANALYSIS : PHYSIOLOGICAL  
CHARACTERISTICS OF CELL LINE

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## **SUPERVISOR'S DECLARATION**

I hereby declare that I have checked this thesis and in my opinion, this thesis is adequate in terms of scope and quality for the award of the degree of Bachelor in Manufacturing Engineering Technology (Pharmaceutical) with Hons.

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Date : 11 DECEMBER 2017



## **STUDENT'S DECLARATION**

I hereby declare that the work in this thesis is based on my original work except for quotations and citations which have been duly acknowledged. I also declare that it has not been previously or concurrently submitted for any other degree at Universiti Malaysia Pahang or any other institutions.

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ANTIBODY PRODUCTION BY USING PRINCIPAL COMPONENT ANALYSIS :  
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WONG SHIN YIE

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## TABLE OF CONTENT

**DECLARATION**

**TITLE PAGE**

**ACKNOWLEDGEMENTS** **ii**

**ABSTRAK** **iii**

**ABSTRACT** **iv**

**TABLE OF CONTENT** **v**

**LIST OF TABLES** **ix**

**LIST OF FIGURES** **x**

**LIST OF SYMBOLS** **xi**

**LIST OF ABBREVIATIONS** **xii**

**CHAPTER 1 INTRODUCTION** **2**

1.1 Background 2

1.2 Problem Statement 4

1.3 Research Objectives 5

1.4 Scope of the Study 5

**CHAPTER 2 LITERATURE REVIEW** **7**

2.1 Antibody 7

2.1.1 Structure of Antibody 8

2.1.1.1 Heavy Chain 9

2.1.1.2 Light Chain 9

2.1.2 Classes of Antibody 10

2.2	Mammalian Cell Culture	12
2.2.1	Chinese Hamster Ovary (CHO) Cells	12
2.3	Physiological Characteristics Affecting Productivity of CHO Cell Lines	13
2.4	Data Mining	15
2.5	Multivariate Analysis	16
2.6	Principal Component Analysis	17
2.6.1	Data Preprocessing	19
	2.6.1.1 Methods of data Preprocessing	20
2.6.2	Principal Components	22
	2.6.2.1 Mathematical Model of Principal Components	22
	2.6.2.2 Limit and Significance of Principal Components	23
2.6.3	Cross-Validation	24
2.7	Partial Least Square	25
	<b>CHAPTER 3 METHODOLOGY</b>	<b>28</b>
3.1	Data Acquisition	28
3.2	Data Preprocessing	28
3.3	Partial Least Square (PLS)	29
3.4	Principal Component Analysis (PCA)	29

<b>CHAPTER 4 RESULTS AND DISCUSSION</b>	<b>31</b>
4.1 Data Acquisition	31
4.1.1 Growth, Viability and Antibody Concentration Profile	31
4.1.2 Summary of Data	34
4.2 Data Preprocessing	36
4.2.1 Arrangement of Data	36
4.2.2 Standardization of Data	36
4.3 Partial Least Square (PLS)	37
4.4 Principal Component Analysis (PCA)	42
4.4.1 Arrangement of Data by All the Six Cell Lines for Five Consecutive Days	42
4.4.2 Arrangement of Data by Individual Cell Line for Five Consecutive Days	46
4.4.2.1 Scatter Plot for Data Arranged by Individual Cell Line for Five Consecutive Days	46
4.4.2.2 Standardized Biplot and Loading Scatter Plot for Data Arranged by Individual Cell Line for Five Consecutive Days	49
4.4.3 Arrangement of Data by Individual Day for All the Six Cell Lines	50
4.4.3.1 Scatter Plot for Data Arranged by Individual Day for All the Six Cell Lines	50
4.4.3.2 Standardized Biplot and Loading Scatter Plot for Data Arranged by Individual Day for All the Six Cell Lines	55



<b>CHAPTER 5 CONCLUSION</b>	<b>58</b>
<b>REFERENCES</b>	<b>59</b>
<b>APPENDIX A RAW DATA OBTAINED FROM Edros et. al. 2013</b>	<b>65</b>
<b>APPENDIX B PREPROCESSED DATA</b>	<b>67</b>
<b>APPENDIX C STANDARDIZED DATA</b>	<b>68</b>
<b>APPENDIX D SCATTER PLOT FOR DATA ARRANGED BY INDIVIDUAL CELL LINE FOR FIVE CONSECUTIVE DAYS</b>	<b>69</b>
<b>APPENDIX E SCATTER PLOT FOR DATA ARRANGED BY INDIVIDUAL DAY FOR ALL THE SIX CELL LINES</b>	<b>70</b>
<b>APPENDIX F STANDARDIZED BIPLLOT AND LOADING SCATTER PLOT FOR DATA ARRANGED BY INDIVIDUAL DAY FOR ALL THE SIX CELL LINES</b>	<b>71</b>

## LIST OF TABLES

Table 4.1	Growth characteristics and cell productivity of GS-CHO cell lines	33
Table 4.2	Preprocessed data of the six GS-CHO cell lines	36
Table 4.3	Standardized data using STATISTICA	37

## LIST OF FIGURES

Figure 2.1	Structure of human antibody molecule	8
Figure 2.2	Structure of different classes of antibody	10
Figure 2.3	Schematic diagram for four human IgG subclasses	11
Figure 2.4	Data mean centering in two dimensions	20
Figure 2.5	Algebraic representation of a PC model	23
Figure 2.6	A graphical representation of X block and Y block	26
Figure 3.1	Summary of research	30
Figure 4.1	Growth and viability curve of GS-CHO cell lines	31
Figure 4.2	Antibody concentration profile of GS-CHO cell lines	32
Figure 4.3	Data distribution collected throughout exponential phase of triplicate batch cultures in the six GS-CHO cell lines	35
Figure 4.4	PLS scatter plot for day 1 (A), day 2 (B) and day 3 (C) respectively	39
Figure 4.5	PLS scatter plot for cell line 38 (A), cell line 76 (B) and cell line 150 (C) respectively	42
Figure 4.6	Scatter plot for PCA analysis on all the six cell lines for five consecutive days	43
Figure 4.7	Standardized biplot (A) and loading scatter plot (B) generated from PCA analysis on all the six cell lines for five consecutive days	44
Figure 4.8	Scatter plot for PCA analysis on cell line 38 (A), cell line 47 (B), cell line 160 (C) and cell line 164 (D) for five consecutive days	47
Figure 4.9	Standardized biplot and loading scatter plot for cell line 38 (A), cell line 47 (B), cell line 76 (C), cell line 150 (D), cell line 160 (E) and cell line 164 (F) respectively	51
Figure 4.10	Scatter plot for PCA analysis on day 1 (A), day 2 (B), day 4 (C) and day 5 (D) for all the six cell lines.	53
Figure 4.11	Standardized biplot and loading scatter plot for day 1 (A), day 2 (B), day 3 (C) and day 5 (D) respectively	56

## LIST OF SYMBOLS

$q_p$	Specific productivity
$\alpha$	Alpha
$\beta$	Beta
$\gamma$	Gamma
$\kappa$	Kappa
$\lambda$	Lambda
%	Percentage
$^{\circ}\text{C}$	Degree Celcius
$\mu_{\text{net}}$	Specific growth
$t_1$	Principal component 1
$t_2$	Principal component 2

## LIST OF ABBREVIATIONS

$\mu\text{M}$	Micromolar
ANOVA	Analysis of variance
BHK	Baby hamster kidney
cells/ml	Cells per millilitre
CHO	Chinese Hamster Ovary
<i>ekf</i>	Element wise <i>k</i> fold method
ELISA	Enzyme-linked immunosorbent assay
ER	Endoplasmic reticulum
g/L/cell	Gram per litre per cell
GS-CHO	Glutamine synthetase Chinese Hamster Ovary
HEK	Human embryonic kidney
IgA	Immunoglobulin A
IgD	Immunoglobulin D
IgE	Immunoglobulin E
IgG	Immunoglobulin G
IgG1	Immunoglobulin G 1
IgG2	Immunoglobulin G 2
IgG3	Immunoglobulin G 3
IgG4	Immunoglobulin G 4
IgM	Immunoglobulin M
KDD	Knowledge Discovery in Database
LV	Latent variable
mAb	Monoclonal antibody
ml	millilitre
MSX	Methionine sulphoxamine
MVS	Multivariate statistics
NSO	Mouse myeloma
PC	Principal component
PCA	Principal Component Analysis
pg/cell/day	Pictogram per cell per day
PLS	Partial Least Square

*rkf*

Row wise *k* fold method

rpm

Revolutions per minute