

**AN ALTERNATIVE SCALING FACTOR IN
QUASI-NEWTON METHODS FOR
UNCONSTRAINED OPTIMIZATION**

MUHAMMAD FAUZI BIN EMBONG

**MASTER OF SCIENCE
UNIVERSITI MALAYSIA TERENGGANU**

2011

7966

1100084329



tesis
QA 402.S .M8 2011



110C084329
An alternative scaling factor in quasi-newton methods for
unconstrained optimization / Muhammad Fauzi Embong.

PERPUSTAKAAN SULTANAH NUR ZAHIRAH
UNIVERSITI MALAYSIA TERENGGANU (UMT)
21000 KUALA TERENGGANU.

1100084329		

Linat sebelah

HAK MILIK
PERPUSTAKAAN SULTANAH NUR ZAHIRAH UMT

**AN ALTERNATIVE SCALING FACTOR IN
QUASI-NEWTON METHODS FOR
UNCONSTRAINED OPTIMIZATION**

MUHAMMAD FAUZI BIN EMBONG

**Thesis Submitted in Fulfillment of the Requirement
for the Degree of Master of Science in the
Faculty of Science and Technology
Universiti Malaysia Terengganu**

July 2011

TABLE OF CONTENTS

	Page
ABSTRACT	ii
ABSTRAK	iv
ACKNOWLEDGEMENTS	vi
APPROVAL	vii
DECLARATION	x
LIST OF TABLES	xi
LIST OF FIGURES	xiii
LIST OF ABBREVIATIONS AND SYMBOLS	xiv
LIST OF ALGORITHMS	xvi

CHAPTER

1. INTRODUCTION

1.1	Introduction	1
1.2	Research Background	1
1.3	Objective of Research	4
1.4	Scope of Research	4
1.5	Importance of Research	5
1.6	Organization of Thesis	5

2. FUNDAMENTALS OF UNCONSTRAINED OPTIMIZATION

2.1	Introduction	8
2.2	Local and Global Optimization	11

2.3	Line Searches	16
2.4	Eigenvalues and Eigenvectors	18
2.5	Stopping Criterion	19
2.6	Convergence Rate	20
2.7	Conclusion	21
3.	UNCONSTRAINED OPTIMIZATION METHODS	
3.1	Introduction	23
3.2	Steepest Descent Method	24
3.3	Newton Method	26
3.4	Conjugate Gradient Methods	28
3.5	Quasi-Newton Methods	29
3.6	Performance Comparison	40
3.7	Conclusion	45
4.	SELF SCALING VARIABLE METRIC METHODS	
4.1	Introduction	46
4.2	Self-scaling Variable Metric (SSVM) Methods	46
4.3	Choices of The Scaling Factor	47
4.4	An Alternative Scaling Factor	50
4.5	Standard Optimization Test Problems	52
4.6	Conclusion	57
5.	NUMERICAL RESULTS AND DISCUSSION	
5.1	Introduction	58

5.2	Numerical Results	58
5.3	Discussion	62
5.4	Conclusion	63
6.	CONCLUSION AND SUGGESTIONS	
6.1	Introduction	64
6.2	Conclusion	64
6.3	Suggestions	67
	REFERENCES	68
	APPENDICES	71
	LIST OF PUBLICATION BY THE AUTHOR	99
	ABOUT THE AUTHOR	101

Abstract of thesis presented to the Senate of Universiti Malaysia Terengganu
in fulfillment of the requirement for the degree of Master of Science.

AN ALTERNATIVE SCALING FACTOR IN QUASI-NEWTON METHODS FOR UNCONSTRAINED OPTIMIZATION

MUHAMMAD FAUZI BIN EMBONG

JULY 2011

Chairman : Associate Professor Hj. Mustafa Bin Mamat, Ph.D.

**Members : Professor Hj. Ismail Bin Mohd, Ph.D.
Yosza Bin Dasril, Ph.D.**

Faculty : Science and Technology

Quasi-Newton methods play a vital role in theoretical and computational mathematics. The first quasi-Newton algorithm was developed by Davidon in mid 1950s, and later demonstrated by Fletcher and Powell that the new algorithm was more reliable and faster than the existing methods.

Although the quasi-Newton methods are sophisticated and reliable, these methods are more sensitive to calculation errors. The common errors are round-off errors and inaccurate line searches. To overcome the weakness, the self-scaling variable matrices (SSVM) method was introduced by Oren in 1973. The method introduces a scaling factor to quasi-Newton method. The choice of a suitable scaling factor is always of

interest of researchers. A few scaling factors that are commonly used are those introduced by Oren and Luenberger in 1974. But the use of the scaling factors does destroy the property of Hessian matrix in quadratic case. To overcome this problem, a much simpler initial scaling method was introduced by Shanno and Phua in 1978. The initial scaling method does not require additional information about the objective function that routinely required by variable metric algorithm as the scaling factor is the already available step size.

In this thesis, an alternative scaling factor was introduced to quasi-Newton methods. The alternative scaling factor had been tried and numerically tested on common standard optimization problems using Maple software. The numerical results show that the alternative scaling factor reduces the number of iteration of the standard quasi-Newton methods. The positive definiteness of Hessian matrix and global convergence property are also retained.

Abstrak tesis yang dikemukakan kepada Senat Universiti Malaysia Terengganu sebagai memenuhi keperluan untuk Ijazah Sarjana Sains.

**FAKTOR PENGSKALAAN ALTERNATIF DALAM KAEDAH
QUASI-NEWTON BAGI PENGOPTIMUMAN TAK
BERKEKANGAN**

MUHAMMAD FAUZI BIN EMBONG

JULAI 2011

Pengerusi : Profesor Madya Hj. Mustafa Bin Mamat, Ph.D.

**Ahli : Profesor Hj. Ismail Bin Mohd, Ph.D.
Yosza Bin Dasril, Ph.D.**

Fakulti : Sains dan Teknologi

Kaedah quasi-Newton memainkan peranan yang penting dalam matematik teori dan komputasi. Kaedah quasi-Newton diperkenalkan oleh Davidon pada pertengahan 1950-an, telah ditunjukkan oleh Fletcher dan Powell bahawa kaedah baru tersebut adalah lebih tekal dan pantas daripada kaedah sedia ada pada masa itu.

Walaupun kaedah quasi-Newton lebih canggih dan tekal, kaedah ini adalah lebih sensitif kepada ralat pengiraan. Ralat yang lazim adalah ralat bundaran dan panjang langkah yang tidak tepat. Untuk mengatasi masalah ini, kaedah penskalaan sendiri matriks (SSVM) telah diperkenalkan oleh Oren dalam tahun 1973. Kaedah ini menambahkan faktor penskalaan kepada kaedah quasi-Newton. Pemilihan faktor penskalaan yang sesuai sentiasa menarik minat para pengkaji. Faktor penskalaan yang lazim digunakan ialah faktor penskalaan yang diperkenalkan oleh Oren dan

Luenberger dalam tahun 1974. Tetapi penggunaan faktor penskalaan tersebut boleh merosakkan sifat matrik Hessian dalam kes kuadratik. Untuk mengatasi kekurangan ini, kaedah penskalaan awal yang lebih ringkas telah diperkenalkan oleh Sanno dan Phua dalam tahun 1978. Kaedah penskalaan awal tidak memerlukan maklumat tambahan memandangkan faktor penskalaan yang digunakan merupakan panjang langkah yang memang telah tersedia ada.

Dalam tesis ini, satu faktor penskalaan alternatif diperkenalkan ke dalam kaedah quasi-Newton. Faktor penskalaan ini telah dicuba dan diuji secara berangka ke atas masalah pengoptimuman piawai yang lazim, menggunakan perisian Maple. Keputusan berangka menunjukkan faktor penskalaan alternatif tersebut telah mengurangkan bilangan lelaran kaedah quasi-Newton asal. Sifat positif tentu bagi matrik Hessian dan penumpuan global juga dikekalkan.