



UNIVERSITI PUTRA MALAYSIA

***3D FACE REGISTRATION ACROSS POSE VARIATION
AND FACIAL EXPRESSION USING CROSS PROFILE ALIGNMENT***

LAILI HAYATI BINTI ANUAR

FK 2011 81

**3D FACE REGISTRATION ACROSS POSE VARIATION
AND FACIAL EXPRESSION USING CROSS PROFILE ALIGNMENT**

By

LAILI HAYATI BINTI ANUAR

**Thesis Submitted to the School of Graduate Studies, Universiti Putra Malaysia,
in Fulfilment of the Requirements for the Degree of Master of Science**

JUNE 2011

Thesis abstract presented to the Senate of Universiti Putra Malaysia in fulfilment
of the requirement for the degree of Master of Science

**3D FACE REGISTRATION ACROSS POSE VARIATION AND FACIAL
EXPRESSION USING CROSS PROFILE ALIGNMENT**

By

LAILI HAYATI BINTI ANUAR

June 2011

Chair : Syamsiah binti Mashohor, PhD

Faculty: Faculty of Engineering

In a 3D face recognition system, face registration is usually employed to compensate the pose variation in a 3D face model. Most previous methods in 3D face registration are based on the well known global-based approach, Iterative Closest Point (ICP). The experiments are usually conducted using cleaned and frontal-viewed face models, neglecting the facial variation that often occur in real-time scenarios, such as pose variation, facial expression, facial outliers and occlusion. The proposed thesis uses a local-based approach known as Cross Profile Alignment (CPA) as an alternative to the global-based approach, utilizing the facial feature of a face surface as an attempt to cater all the above problems.

Among all features on a face surface, nose tip is the most commonly used feature for facial feature landmarking. It is crucial to accurately detect the nose tip as it will affect the overall performance of the registration process. Most of the presented nose tip detection algorithms were developed merely based on the assumption that the nose tip is the highest point on a face, which is not robust enough for face model

under large rotation variation and having large facial outliers. Thus, as the first step prior face registration, the thesis proposed a novel nose tip region detection algorithm using localized point signature, developed specially to locate the nose tip region across various facial variation.

The experiment conducted on challenging 3D face databases yields good results with 94.77% detection rate for the nose tip region detection algorithm. Based on the nose tip region location, a cross-profile is extracted and face model is compensated for rotation variation and translation displacement. The registration framework with CPA which gained accuracy rate of 93.9% when tested within 10 degrees error margin, outperforms the registration framework with ICP using Average Face Model (AFM) with accuracy rate of 87.7%, with lower processing time. The findings during this work indicate the accuracy and the reliability of the proposed registration framework towards 3D face model with challenging facial variation.

Abstrak tesis yang dikemukakan kepada Senat Universiti Putra Malaysia sebagai memenuhi keperluan untuk ijazah Master Sains

**PENDAFTARAN WAJAH 3D MERENTASI VARIASI GAYA DAN
EKSPRESI WAJAH MENGGUNAKAN PENJAJARAN PROFIL
BERSILANG**

Oleh

LAILI HAYATI BINTI ANUAR

Jun 2011

Pengerusi: Syamsiah binti Mashohor, PhD

Fakulti: Fakulti Kejuruteraan

Di dalam sistem pengecaman wajah 3D, pendaftaran wajah lazimnya dilaksanakan untuk mengatasi masalah variasi gaya pada model wajah 3D. Kebanyakan kaedah pendaftaran wajah 3D yang terdahulu adalah berdasarkan kepada kaedah berasaskan global yang diketahui umum, *Iterative Closest Point (ICP)*. Eksperimen yang telah dilaksanakan lazimnya menggunakan model wajah yang telah dibersihkan dan menghadap posisi hadapan, tanpa mengambil kira variasi wajah yang selalu wujud dalam persekitaran realiti-masa seperti variasi gaya, ekspresi wajah, lebihan dan penambahan pada wajah. Tesis ini mencadangkan penggunaan kaedah berasaskan tempatan yang dikenali sebagai Penjajaran Profil Bersilang (CPA) sebagai alternatif kepada kaedah berasaskan sejagat, dengan menggunakan ciri-ciri pada permukaan wajah sebagai percubaan untuk mengatasi semua masalah di atas.

Di antara semua ciri-ciri yang terdapat pada permukaan wajah, puncak hidung didapati paling banyak digunakan untuk tujuan penandaan wajah. Adalah sangat

penting untuk mengesan puncak hidung dengan tepat kerana ia akan mempengaruhi prestasi proses pendaftaran secara keseluruhannya. Kebanyakan algoritma pengesanan puncak hidung yang telah dikemukakan sebelum ini adalah semata-mata berdasarkan anggapan bahawa puncak hidung merupakan titik paling tinggi pada wajah, di mana kurang tepat bagi model wajah yang mempunyai putaran yang besar dan unsur asing yang banyak. Oleh sebab itu, sebagai langkah pertama sebelum pendaftaran, tesis ini mencadangkan algoritma baru pengesanan bahagian puncak hidung dengan menggunakan *point signature* yang telah diubahsuai, dibangunkan khas untuk mengesan bahagian puncak hidung dalam pelbagai variasi wajah.

Eksperimen yang telah dijalankan ke atas pangkalan data wajah 3D yang mencabar telah menghasilkan keputusan yang baik dengan kadar pengesanan 94.77% untuk algoritma pengesanan bahagian puncak hidung. Berdasarkan lokasi puncak hidung ini, profil bersilang boleh diekstrak dan model wajah dibetulkan dari segi putaran dan sesaran peralihan. Rangka kerja pendaftaran menggunakan CPA memperoleh kadar ketepatan 93.9% apabila diuji dengan jidar ralat 10 darjah, mengatasi rangka kerja pendaftaran menggunakan ICP dengan *Average Face Model (AFM)* dengan kadar ketepatan 87.7%, dalam masa pemprosesan yang lebih rendah. Penemuan-penemuan sepanjang kerja ini menunjukkan ketepatan dan kebolehpercayaan rangka kerja pendaftaran yang dicadangkan ke atas model wajah 3D yang mengandungi variasi wajah yang mencabar.

ACKNOWLEDGEMENTS

First of all, all praises to the supreme almighty Allah s.w.t., whom without His blessing, this thesis will not come true.

I would like to take this opportunity to say many thanks to those who directly and indirectly supported me throughout my study. My utmost gratitude goes to my supervisor, Dr. Syamsiah Mashohor and my co-supervisor, Dr. Makhfudzah Mokhtar for their helpful guidance and efforts in making this thesis a reality. Many thanks also go to Dr. Wan Azizun Wan Adnan for the opportunity that she had given me and for supporting me with her research funds. I also would like to express my appreciation to the University Putra Malaysia for the financial support via the Graduate Student Fellowship (GRF) programme. Special thanks to the Institute of Advance Technology (ITMA) for letting me using the 3D laser scanner, and for the helpful technicians during the acquisition of 3D face models for UPMFace face database.

Not forgotten, to my parents and my family members for believing in me and for their undeniable support in my easy and tough days. To my lab mates, for their help, presence, love and friendship. Lastly, my deepest gratitude to my beloved husband, M. Iqbal Saripan, who is always by my side through my ups and downs, and my wonderful kids who always inspire me in their special way. And also for those who I do not mention here, thank you very much for everything.

This work is partly funded by research grant Science Fund Malaysia (5450083). I also would like to acknowledge the use of GavaDB face database by Moreno and Sánchez.

I certify that a Thesis Examination Committee has met on **6th June 2011** to conduct the final examination of **Laili Hayati binti Anuar** on her thesis entitled "**3D Face Registration Across Pose Variation and Facial Expression using Cross Profile Alignment**" in accordance with the Universities and University Colleges Act 1971 and the Constitution of the Universiti Putra Malaysia [P.U.(A) 106] 15 March 1998. The Committee recommends that the student be awarded the **Master of Science**.

Members of the Thesis Examination Committee were as follows:

Abdul Rahman bin Ramli, PhD

Associate Professor
Faculty of Engineering
Universiti Putra Malaysia
(Chairman)

Mohammad Hamiruce bin Marhaban, PhD

Associate Professor
Faculty of Engineering
Universiti Putra Malaysia
(Internal Examiner)

Rahmita Wirza binti O.K Rahmat, PhD

Associate Professor
Faculty of Computer Science and Information Technology
Universiti Putra Malaysia
(Internal Examiner)

Salina binti Abdul Samad, PhD

Professor
Faculty of Engineering
Universiti Kebangsaan Malaysia
Malaysia
(External Examiner)

NORITAH OMAR, PhD

Associate Professor and Deputy Dean
School of Graduate Studies
Universiti Putra Malaysia

Date:

This thesis was submitted to the Senate of Universiti Putra Malaysia and has been accepted as fulfilment of the requirement for the degree of Master of Science. The members of the Supervisory Committee were as follows:

Syamsiah binti Mashohor, PhD

Lecturer

Department of Computer and Communication Systems Engineering

Faculty of Engineering

Universiti Putra Malaysia

(Chairman)

Makhfudzah binti Mokhtar, PhD

Lecturer

Department of Computer and Communication Systems Engineering

Faculty of Engineering

Universiti Putra Malaysia

(Member)

HASANAH MOHD. GHAZALI, PhD

Professor and Dean

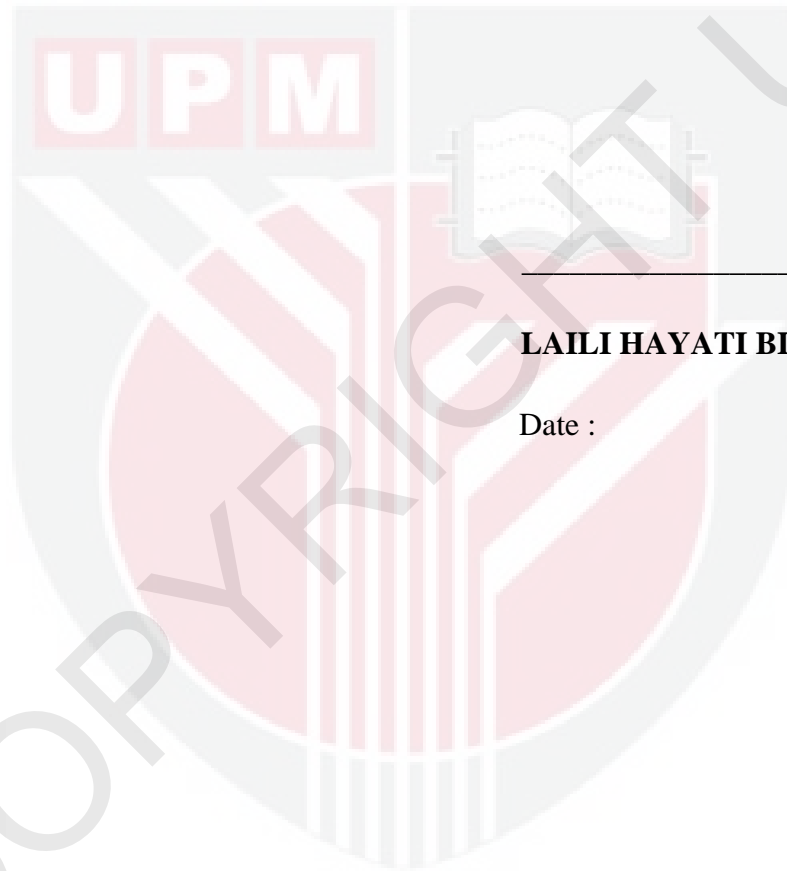
School of Graduate Studies

Universiti Putra Malaysia

Date :

DECLARATION

I declare that the thesis is my original work except for equations and citations which has been duly acknowledged. I also declare that it has not been previously, and is not concurrently, submitted for any other degree at Universiti Putra Malaysia or at any other institution.



LAILI HAYATI BINTI ANUAR

Date :

TABLE OF CONTENTS

	Page
ABSTRACT	ii
ABSTRAK	iv
ACKNOWLEDGEMENTS	vi
APPROVAL	vii
DECLARATION	ix
LIST OF TABLES	xii
LIST OF FIGURES	xiii
LIST OF ABBREVIATIONS	xvi
LIST OF SYMBOLS	xvii
CHAPTER	
1	
INTRODUCTION	1
1.1 Face for Biometrics	1
1.2 Introduction to Face Recognition	2
1.3 Introduction to 3D Face Registration	4
1.4 Motivations	5
1.5 Aim and Objective	6
1.6 Scope of Work	7
1.7 Thesis Structure	9
2	
LITERATURE REVIEW	11
2.1 3D Face Recognition	11
2.1.1 Introduction	11
2.1.2 2D and 3D Face	12
2.1.3 3D Face Recognition System	15
2.1.4 3D Face Representations	18
2.2 3D Face Registration	21
2.2.1 Introduction	21
2.2.2 Global and Local Approaches	22
2.2.3 Iterative Closest Point (ICP)	24
2.2.4 Average Face Model (AFM)	26
2.3 Local-based Face Registration Approach	28
2.3.1 Nose Tip Detection for Pose Estimation	29
2.4 Point Signature	34
2.4.1 Introduction	34
2.4.2 Point Signature Implementations	34
2.4.3 Definition of Point Signature	35
2.4.4 Matching of Point Signatures	38
2.5 Summary	39
3	
METHODOLOGY	40
3.1 Introduction	40
3.2 Rotation Variations in 3D Face Model	41

3.3	3D Face Databases	42
3.3.1	GavaDB	42
3.3.2	UPMFace	45
3.3.3	Experimental Data Sets	48
3.4	Nose Tip Region Detection	48
3.4.1	Convex Point Classification	49
3.4.2	Search for Candidate Regions Using Morphology Operations	52
3.4.3	Training for Tolerance Band	55
3.4.4	Localized Point Signature for Nose Tip Region Detection	56
3.5	Coarse Alignment	62
3.6	Registration with ICP using AFM	64
3.6.1	Construction of an AFM	65
3.6.2	3D Face Registration with ICP using AFM	68
3.7	Pose Estimation and Registration with CPA	71
3.7.1	Detecting the Centre of the Nose Tip Region	72
3.7.2	Cross Profile Alignment (CPA) for Fine Alignment	73
3.7.3	Translation Displacement Calculation	75
3.8	Ground Truth Annotation	76
3.9	Transformation Function for Registration	77
3.10	Performance Analysis	79
3.11	Summary	80
4	RESULTS AND DISCUSSION	81
4.1	Introduction	81
4.2	Experimental Setup	81
4.3	Training for Tolerance Band	85
4.4	Experimental Works	86
4.4.1	Nose Tip Region Detection	87
4.4.2	Registration with CPA	94
4.4.3	Registration with ICP using AFM	95
4.5	Performance Analysis	96
4.6	Summary	102
5	CONCLUSIONS AND FUTURE WORKS	103
5.1	Conclusions	103
5.2	Future Works	105
	REFERENCES	107
	APPENDICES	113
	BIODATA OF STUDENT	115
	LIST OF PUBLICATIONS	116