

KOSZUL CONNECTIONS OF FLAT EEG BUNDLES FOR DESCRIPTION OF  
BRAIN SIGNAL DYNAMICS

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A thesis submitted in fulfilment of the  
requirements for the award of the degree of  
Doctor of Philosophy (Mathematics)

Faculty of Science  
Universiti Teknologi Malaysia

MARCH 2016

THIS WORK IS DEDICATED TO

MY PARENTS

MY UNIVERSITY

MY COUNTRY

## ACKNOWLEDGEMENT

I extend deepest thanks to my supervisor, Prof. Dr. Tahir bin Ahmad for showing great patience, wisdom, and openness during the course of this research. He has allowed me a lot of independence and personal space to explore ideas and solve problems, and his guidance has been essential through the years. He is as humble as he is inspirational, and there are so many reasons for him to be proud in leading the way for future educators and scientists like me.

I also offer gracious thanks to the thesis examiners, Prof. Dato' Dr. Abdul Razak bin Salleh and Assoc. Prof. Dr. Yusof bin Yaacob, and to the Chairman of the *viva voce* session, Prof. Dr. Zuhaimy bin Ismail, for their advice, wisdom and encouraging words.

Thanks also to the staff and educators at the Ibnu Sina Institute and the Mathematics Department of the Faculty of Science, Universiti Teknologi Malaysia for the life experiences and lessons, both in and out of the offices and lecture rooms, and for offering a conducive environment for my studies.

Immense gratitude goes to my parents, for nurturing a love for language and academia, for giving me a wicked sense of humor, and for being patient with my quirks and oddities. They are great sources of energy and inspiration.

Praises be to the Prophet Muhammad, for the gift of Revelation. Praises be to Allah the Wise and Merciful, for the gift of Creation. Verily He is the source of all things, and all return to Him.

## ABSTRACT

The bio-electromagnetic inverse problem is the identification of electromagnetic sources based on signals recorded from Electroencephalography (EEG) or Magnetoencephalography (MEG) and physical equations with a minimum of priori information. Following initial applications in modelling epilepsy patients' electrical brain activity, extensive research has been done in processing massive amounts of signal data from patients while preserving as much information as possible. Improvements in analyzing EEG/MEG recordings have significant utility not just in epilepsy treatment and diagnosis, but neuro-cognitive research in general. The main objective of this research is to build structures holding visualized and flattened EEG data as differential geometric entities, and to extend these structures as a dynamical system dealing with the evolution of large amounts of point data about brain activity. One aspect of existing research involves EEG signal data recorded across a time interval and processed using fuzzy clustering techniques, resulting in point data sets representing areas of high electrical activity within the brain. Concepts in differential geometry are applied to these spaces as a dynamical and visualized approach to modelling the evolution of signal clusters in the brain over time. Initially, Flat EEG data sets are shown to be topological spaces, manifolds and vector spaces. Two vector bundle structures for the Flat EEG space are thus developed: one analogous to Minkowski space-time and the other based on the classical notion of spatial change over linear time. From there, Koszul connections were constructed for both vector bundles, and both are shown to have zero curvature. Having provided a continuous differential structure to Flat EEG data, the evolution of signal clusters as a discrete dynamical system is then interpolated into a continuous form, allowing an enhanced view of the brain's state changes over time.

## ABSTRAK

Masalah songsangan bio-elektromagnet ialah mengenal pasti sumber elektromagnet berdasarkan isyarat rakaman Elektroensefalografi (EEG) atau Magnetoensefalografi (MEG) dan persamaan fizis bersama maklumat *priori* yang minimum. Berikutan daripada penggunaan awal dalam membina model aktiviti elektrik otak pesakit epilepsi, penyelidikan telah dilakukan demi memproses bilangan besar data isyarat pesakit sambil memelihara sebanyak mungkin maklumat asal. Penambahbaikan analisis rakaman EEG/MEG mempunyai kegunaan bukan sahaja dalam rawatan dan diagnosis epilepsi, malah juga penyelidikan neuro-kognitif secara am. Objektif utama penyelidikan ialah membina struktur menempatkan data EEG yang berbentuk visual dan rata sebagai objek geometri keterbezaan, dan melanjutkan struktur tersebut sebagai sistem dinamik berkenaan evolusi sejumlah besar data titik aktiviti otak. Satu aspek penyelidikan kini melibatkan data isyarat EEG yang dirakam pada suatu selang masa dan diproses menggunakan teknik kelompok kabur, menghasilkan set data titik mewakili kawasan aktiviti elektrik yang tinggi di dalam otak. Konsep geometri keterbezaan digunakan terhadap ruang set tersebut sebagai pendekatan dinamik dan visual bagi permodelan evolusi semasa kelompok isyarat dalam otak. Sebagai permulaan, data set EEG Rata dibuktikan sebagai ruang topologi, manifold dan ruang vektor. Dengan itu dua struktur berkas vektor untuk ruang EEG Rata dibina: satu setara dengan ruang-masa Minkowski dan satu lagi berdasarkan idea klasik perubahan ruang melawan masa linear. Dari situ, kaitan Koszul dibangunkan untuk kedua-dua berkas vektor, yang juga terbukti mempunyai kelengkungan sifar. Setelah menyediakan struktur keterbezaan lancar bagi data EEG Rata, evolusi kelompok isyarat tersebut dalam bentuk sistem dinamik diskret kemudian diberi interpolasi menjadi sistem dinamik berterusan, membolehkan pandangan lebih baik bagi perubahan keadaan otak terhadap masa.

## TABLE OF CONTENTS

CHAPTER	TITLE	PAGE
	DECLARATION	ii
	DEDICATION	iii
	ACKNOWLEDGEMENT	iv
	ABSTRACT	v
	ABSTRAK	vi
	TABLE OF CONTENTS	vii
	LIST OF TABLES	x
	LIST OF FIGURES	xi
	LIST OF SYMBOLS/NOTATIONS	xiii
	LIST OF APPENDICES	xiv
<b>1</b>	<b>INTRODUCTION</b>	<b>1</b>
	1.1 Introduction	1
	1.2 Background of Research	1
	1.3 Problem Statement	2
	1.4 Research Objectives	2
	1.5 Research Scope	3
	1.6 Significance of Research	3
	1.7 Thesis Outline	4
	1.8 Context of Research	5

<b>2</b>	<b>LITERATURE SURVEY</b>	<b>6</b>
2.1	Epilepsy	6
2.2	Inverse Problem and FTTM	8
2.3	Differential Geometry and Seizures as Dynamical Systems	10
2.4	Research in Context	12
<b>3</b>	<b>DIFFERENTIAL GEOMETRY ON MANIFOLDS</b>	<b>15</b>
3.1	Fibre Bundles	15
3.2	Vector Bundles	17
3.3	Connections	18
3.4	Dynamical Systems	20
3.5	Minkowski Space	22
<b>4</b>	<b>VECTOR BUNDLES ON FLAT EEG</b>	<b>24</b>
4.1	Flat EEG as Base Space	24
4.2	Tangent Bundle of $M_{EEG}$	34
4.3	Flat EEG as Vector Bundle	37
4.4	Differences Between Tangent Bundle $TM_{EEG}$ and Vector Bundle $V_{EEG}$	40
4.5	Conclusion	40
<b>5</b>	<b>CONNECTIONS FOR VECTOR BUNDLES OF FLAT EEG</b>	<b>41</b>
5.1	Connection for Tangent Bundle $TM_{EEG}$	41
5.2	Connection for Vector Bundle $V_{EEG}$	44
5.3	Physical Interpretation of $\nabla_x Y$ and $\nabla_T V$	46
5.4	Associated Connection between Bundles	47
5.5	Curvature of Connections	50

<b>6</b>	<b>FLAT EEG BUNDLES AS DYNAMICAL SYSTEMS</b>	<b>53</b>
6.1	Advantages of Structuring Data as Dynamical Systems	53
6.2	$M_{EEG}$ as Discrete Dynamical System	54
6.3	$V_{EEG}$ as Discrete Dynamical System	55
6.4	Interpolation and Approximated Continuous Dynamical System	56
<b>7</b>	<b>CONCLUSION</b>	<b>61</b>
7.1	Summary of Research	61
7.2	Future Research	62
7.3	Conclusion	63
	<b>REFERENCES</b>	<b>64</b>
	APPENDIX A	67



**LIST OF TABLES**

<b>TABLE NO.</b>	<b>TITLE</b>	<b>PAGE</b>
4.1	Positions of Sensors and Potential Differences Detected on a Flattened EEG Plane for Model of a Patient's Head with Mean Radius of 8.3 Centimeters	27
4.2	Sample Data of Five Clusters Generated by FCM Clustering at Time $t$	28

## LIST OF FIGURES

FIGURE NO.	TITLE	PAGE
1.1	Thesis Outline	4
1.2	Context of Research	5
2.1	Woman Undergoing EEG	7
2.2	Typical EEG Readouts	7
2.3	FTTM Version 1 Algorithms	8
2.4	FTTM Version 2 Algorithms	9
2.5	Electrical Potential Readings from Sensors and Signal Clusters of Neural Activity on Flat EEG	10
2.6	Time Series of Sensor Readings and Signal Clusters of Neural Activity on Flat EEG	11
2.7	Comparison of Big Bang Model with Neuroelectrical Brainstorm	13
2.8	Signal Cluster Partitions and Their Centroids	14
3.1	Fibre Bundle	15
3.2	Fibre Bundle Relations	16
3.3	Tangent Bundle of $S^2$	17
3.4	Parallel Transport as Connection for Tangent Bundle	18
3.5	State Transition of Dynamical System	20
3.6	Chapman-Kolmogorov Law	21
3.7	Orbit of a Dynamical System	22
3.8	Minkowski Space Depicting World Line Boundary Light Cone	23
4.1	Construction of space for EEG signal data, $W$	25
4.2	Set of signal cluster centers at a time $t$	28
4.3	Combining $W$ and $C$ to Generate $M_{EEG}$	29

## LIST OF FIGURES

FIGURE NO.	TITLE	PAGE
4.4	An $M_{EEG}$ Section with Real Recorded Data.	29
4.5	Tangent space $T_p M_{EEG}$	35
4.6	Construction of fibre $V_{EEG}^t$ for vector bundle $V_{EEG}$	38
5.1	Elements of $\nabla_x Y$	42
5.2	Elements of $\nabla_T V$	44
5.3	Mapping of Flat EEG and Connection Elements to $S^2$	46
5.4	Permutations of Orbits for Cluster Centroids in $M_{EEG}$	47
5.5	Relationship Diagram between Vector Bundles	48
6.1	Determinism of $M_{EEG}$	55
6.2	Determinism of $V_{EEG}$	56
6.3	Linear Interpolation from Single-Point State to Single-Point State	57
6.4	Linear Interpolation between Two Time-Parametrised Points in $M_{EEG}$	56
6.5	Orbits for Cluster Centers in $M_{EEG}$ Using Linear Interpolation	57
7.1	Summary of Research	62

**LIST OF SYMBOLS/NOTATIONS**

$M$	–	Manifold
$\nabla$	–	Connection on a manifold
$L_x$	–	Lie differential operator
$E$	–	Vector bundle on a manifold
$T_p(M)$	–	Tangent space on a point $p$ in manifold $M$
$\text{Hom}(X, Y)$	–	Set of homomorphisms from $X$ to $Y$
$L(X, Y)$	–	Set of linear transforms from $X$ to $Y$
$\text{End}(X)$	–	Set of endomorphisms from $X$ to itself
$S^2$	–	Unit sphere manifold

**LIST OF APPENDICES**

<b>APPENDIX</b>	<b>TITLE</b>	<b>PAGE</b>
A	Publications	67

## **CHAPTER 1**

### **INTRODUCTION**

#### **1.1 Introduction**

The bio–electromagnetic inverse problem is the identification of electromagnetic sources based on signals recorded from Electroencephalography (EEG) or Magnetoencephalography (MEG) and physical equations with a minimum of priori information. Going from initial applications in modelling epilepsy patients' electrical brain signals, extensive research has been done in processing and transforming massive amounts of signal data from patients while preserving as much information as possible. Improvements in analysing EEG/MEG records have significant utility not just in epilepsy treatment and diagnosis, but neuro–cognitive research in general.

#### **1.2 Background of Research**

The field of signal processing presents the challenge of preserving data integrity as they are transformed into spaces with varying dimensions. One example of this in the field of medicine is the visualization of EEG signal data into two-dimensional arrays to aid diagnosis. Previous research were dependent on data recorded over instances within an interval. The data set is essentially discretised over time, even though EEG signal data is continuous. This is due to transformations required for the clustering process.

The question of the movement of clusters within space should involve differential geometrical structures. Vector spaces are simple, well-understood objects useful for modelling the spatial path of information over time. Neuroelectrical activity in the brain also exhibits the properties of a dynamical system.

### **1.3 Problem Statement**

Analysis of Flat EEG signals has depended on discrete instances recorded over an interval. In order to aid the visualization and ease of interpretation of these massive sets of data by professionals, the dynamics of Flat EEG signals should be described as a set of vectors and thus rendered as an evolving system.

### **1.4 Research Objectives**

The objectives of this research include

- i. To construct vector bundles based on Flat EEG space.
- ii. To construct connection(s) on the bundles.
- iii. To express these geometric objects as dynamical systems.
- iv. To approximate orbits of Flat EEG cluster data.

## **1.5 Research Scope**

This research utilises mathematical theory based on differential geometry and dynamical systems on bioelectromagnetic field data of the brains of epilepsy patients during seizures, in order to be considered in conjunction with the Fuzzy Topographic Topological Mapping (FTTM) model.

## **1.6 Significance of Research**

A differential structure for post-clustering Flat EEG is needed to stitch together disparate sets of instantaneous information into a continuous whole. This is helpful in order to aid the detection of epileptogenic foci by modelling the paths of the strong electrical signals in the brain.



## 1.7 Thesis Outline

Figure 1.1 shows a flowchart outlining all the chapters in this thesis and their main topics of interest.

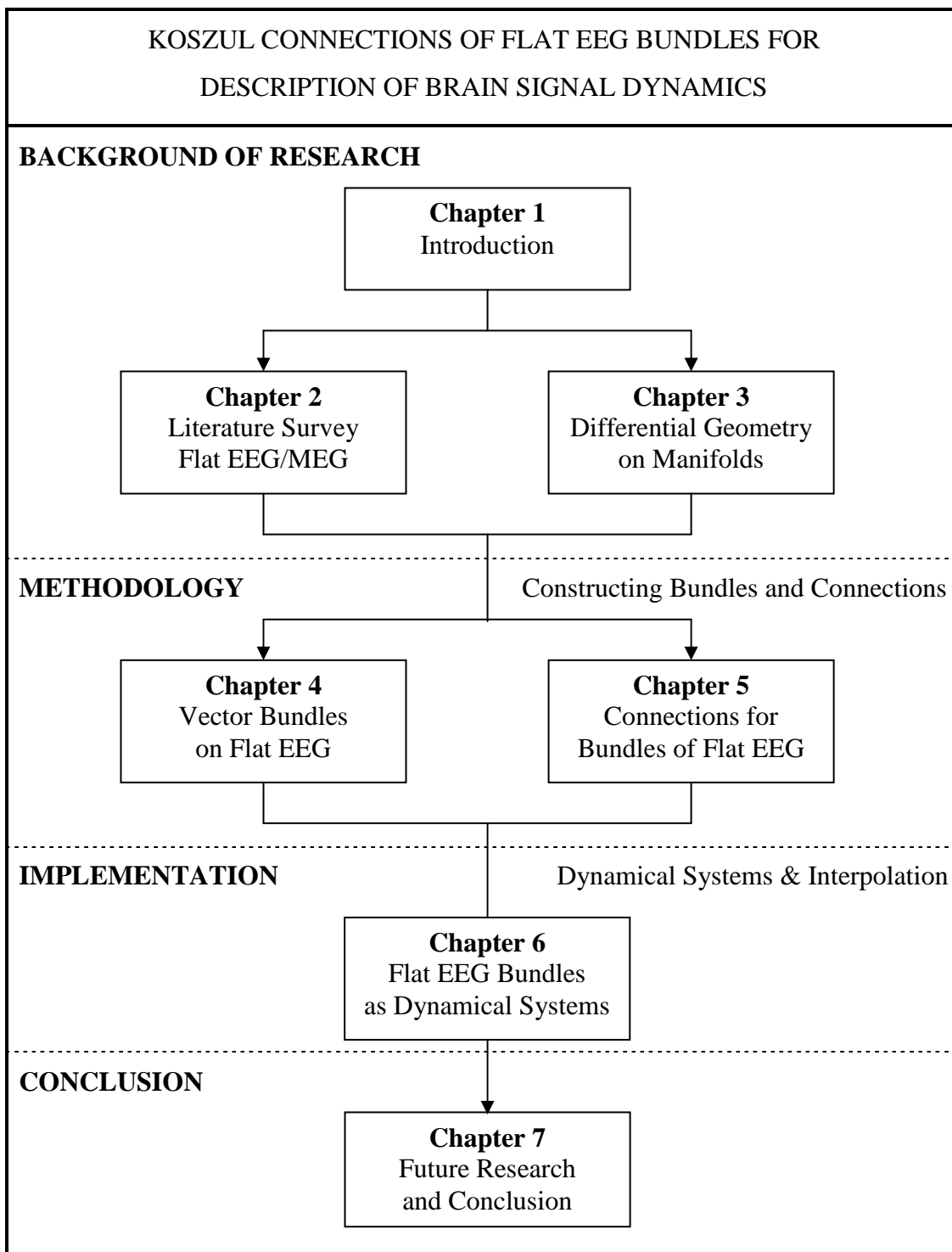
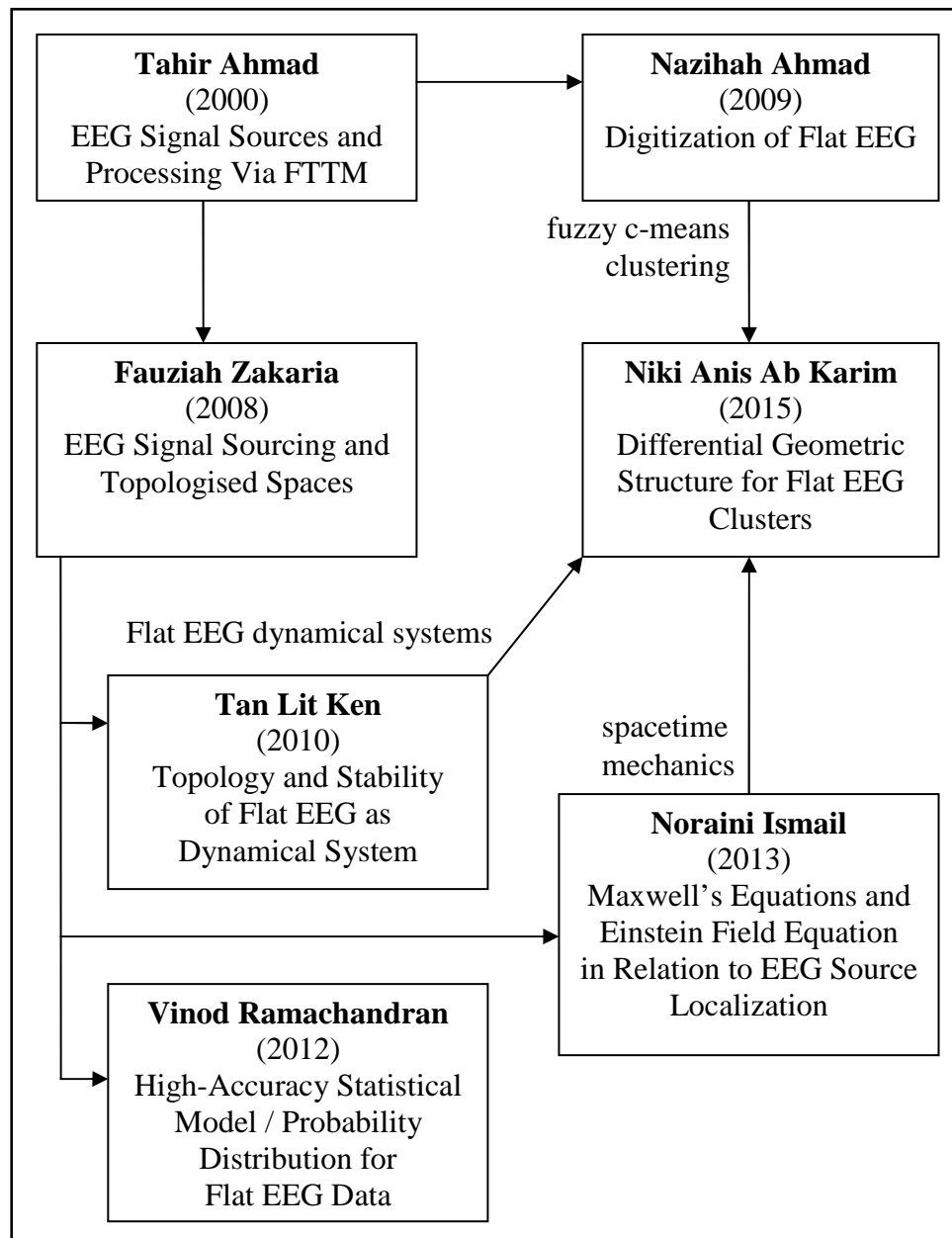


Figure 1.1 Thesis Outline

## 1.8 Context of Research

Figure 1.2 shows the relationship between the research in this thesis and other work previously done in similar fields. Further details and elaborations on this topic can be found in Chapter 2.



**Figure 1.2** Context of Research

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