

EVALUATION OF RIVERBANK EROSION BASED ON MANGROVE
BOUNDARY CHANGES IDENTIFICATION USING MULTI-TEMPORAL
SATELLITE IMAGERY

NORHAFIZI BIN MOHAMAD

A thesis submitted in fulfilment of the
requirements for the award of the degree of
Master of Philosophy

Faculty of Built Environment and Surveying
Universiti Teknologi Malaysia

SEPTEMBER 2019

DEDICATION

This thesis is dedicated to my father, who taught me that the best kind of knowledge to have is that which is learned for its own sake. It is also dedicated to my mother, who taught me that even the largest task can be accomplished if it is done one step at a time.

ACKNOWLEDGEMENT

While preparing this thesis, I was in contact with many individuals, researchers, academicians, and practitioners. The entire individuals have contributed to help me understand and practice the knowledge toward successful study in the geoinformatics field. I want to express my infinite appreciations to my main supervisor, Sr Dr Mohd Faisal bin Abdul Khanan for continuous guidance, support and precious knowledge in my study. I am also grateful to cooperate with my co-supervisor, Sr Dr.Ivin Amri bin Musliman for his endless advises and motivations. I am incapable to complete this study without these individuals aid.

My gratitude goes to Universiti Teknologi Malaysia for giving me an opportunity to further my postgraduate study here, which is one of the prestigious Research University (RU) in Malaysia. A million thanks to the Ministry of Education (MOE) which provides Trans-Disciplinary Research Grant Scheme (TRGS) Vote No: RJ130000.7827. 4L855 who funded my study. This research scheme gives a chance for me to become a research assistant (RA) which not only focus solely on my study but also involves me in my project. Without this scheme, I cannot fulfil the aim and objective of my thesis as well as my research project.

I am also recognizing the effort of my fellow RA's, other members of TRGS and my postgraduate friends which supported me with valuable ideas and technical skills. Some of them whose already expert in this field are very helpful and I cannot imagine my study progress without their guidance.

Finally, I want to express my gratitude to my family especially my parents which blesses my study and always pray for my success. They also give motivation for me to never give up and always focus on completing my study. Thank you.

ABSTRACT

Evaluating riverbank erosion in mangrove forests is dynamic and challenging because of the complex environment that is exposed to tidal and sedimentation factor. Besides, assessing riverbank erosion in this environment requires a technique that reduces dependency on tidal and sedimentation without affecting the quality of the assessment. Hence, this study evaluated riverbank erosion based on mangrove boundary changes using multi-temporal satellite images comprising Quickbird, WorldView-2 and Pleiades-1B. The first objective of this study is to determine mangrove boundary shifting and its long-term impact towards riverbank features followed by validating the mangrove boundary shifting of satellite imagery with field measurement data, which comprise Real Time Kinematic-Global Positioning System (RTK-GPS). Next, the study assessed the rates of changes of the riverbank erosion and accretion and the final objective developing a riverbank erosion prediction model. In this study, a change detection technique was used to identify the mangrove boundary changes of Kilim River at different timelines. The extracted mangrove boundary from satellite images for the years 2005, 2012 and 2017 were used to identify changes in the riverbank features such as line shifting, river width, erosion, and accretion. Subsequently, a vector image overlay was used to determine the mangrove boundary shifting for the corresponding years and evaluate the erosion and accretion rates using symmetrical difference and erase tool in ArcGIS software. Sequentially, Root Mean Square Error (RMSE) analysis validated the accuracy of image geo-referencing process while residual analysis was employed to validate the accuracy between satellite imagery and field measurement data comprising RTK-GPS and erosion pin data. Then, line buffering and kernel density analysis were used to develop a riverbank erosion prediction model based on three parameters, namely distance of erosion, area of erosion and direction of shifted mangrove boundary. The initial findings of this study showed that the mangrove boundary changes shifted backwards in the opposite direction from the river and the range of shifting was different according to the intensity of boat traffic. One of the findings showed that the increasing rates of riverbank erosion ranged from 11302.019 square meters in the first epoch to 15674.721 square meters in the second epoch. Another finding illustrated the riverbank erosion prediction model which displayed several areas such as Sections A, B, I and L which are potentially facing serious riverbank erosion problems in the future in comparison to Sections C, D, E, F, G, H and K. The final finding discussed data validation between Pleiades-1B and GPS-RTK which recorded 0.305 of the r-square value whereas 0.477 was recorded as the r-square value for both Pleiades-1B and the erosion pin. The other validation comprised the second epoch of satellite image (WorldView-2 and Pleiades-1B) and the erosion pin data which revealed the r-square of 0.9347 and showed the strong relationship between both data. As a conclusion, the findings have shown that the evaluation of the riverbank erosion based on mangrove boundary changes using multi-temporal satellite images is capable of assisting stakeholders including the Langkawi Development Authority (LADA), Department of Irrigation and Drainage Malaysia (DID) and Marine Department Malaysia to have in-depth understanding of riverbank erosion issue that would enable them to prepare a mitigation plan in the future.

ABSTRAK

Menilai hakisan tebing sungai dalam kawasan bakau bersifat dinamik dan mencabar disebabkan persekitaran kompleks yang terdedah kepada faktor pasang surut dan pemendapan. Selain itu, menilai hakisan tebing sungai di persekitaran ini memerlukan teknik yang boleh mengurangkan pergantungan pada pasang surut dan pemendapan tanpa menjejaskan kualiti penilaian. Oleh itu, kajian ini menilai hakisan tebing sungai berdasarkan perubahan sempadan bakau menggunakan imej satelit pelbagai tempoh masa yang merangkumi *Quickbird*, *WorldView-2* dan *Pleiades-1B*. Objektif pertama kajian ini adalah untuk mengenal pasti anjakan sempadan bakau dan kesan jangka panjangnya terhadap tebing sungai diikuti dengan pengesahan anjakan sempadan bakau antara imej satelit dengan data ukur lapangan, yang merangkumi Sistem Penentukedudukan Sejagat-Masa Hakiki Kinematik (RTK-GPS). Seterusnya, kajian ini menilai kadar perubahan hakisan dan tokokan tebing sungai dan objektif terakhir membangunkan model ramalan hakisan sungai. Dalam kajian ini, teknik pengesanan perubahan digunakan untuk mengenal pasti perubahan sempadan bakau yang berlainan garis masa. Sempadan bakau yang diekstrak daripada imej satelit pada tahun 2005, 2012 dan 2017 digunakan untuk mengenal pasti perubahan tebing sungai seperti anjakan sempadan, lebar sungai, hakisan dan tokokan. Kemudiannya, penindanan imej vektor digunakan untuk menentukan anjakan sempadan bakau yang berlaku tahun tersebut dan menilai nilai hakisan dan tokokan menggunakan fungsi perbezaan simetri dan padam dalam perisian *ArcGIS*. Seterusnya, Analisis Min Selisih Punca Kuasa Dua (RMSE) mengesahkan ketepatan imej geo-rujukan manakala analisis sisa digunakan untuk mengesahkan ketepatan antara imej satelit dengan data ukur lapangan merangkumi data RTK-GPS dan data pin hakisan. Berikutnya, garisan penampan dan ketumpatan kernel digunakan untuk membangunkan satu model ramalan hakisan berdasarkan tiga parameter, iaitu jarak dan luas hakisan serta arah anjakan sempadan bakau. Penemuan awal kajian ini menunjukkan perubahan sempadan bakau yang menganjak kebelakang secara bertentangan daripada sungai dan kadar anjakan berbeza berdasarkan kesibukan lalulintas bot. Salah satu penemuan menunjukkan kadar hakisan pada epok pertama ialah sebanyak 11302.019 meter persegi manakala epok kedua menunjukkan pertambahan sehingga 15674.721 meter persegi. Satu lagi penemuan mempamerkan model ramalan hakisan tebing sungai yang menyaksikan sesetengah kawasan seperti Seksyen A, B, I dan L berpotensi mengalami masalah hakisan tebing sungai yang serius pada masa hadapan jika dibandingkan dengan Seksyen C, D, E, F, G, H dan K. Penemuan terakhir membincangkan pengesahan data antara *Pleiades-1B* dan GPS-RTK yang merekodkan nilai kuasa dua r sebanyak 0.305, sementara nilai kuasa dua r untuk *Pleiades-1B* dan pin hakisan ialah sebanyak 0.477. Data pengesahan yang lain melibatkan epok kedua imej satelit (*WorldView-2* dan *Pleiades-1B*) dan data pin hakisan yang merekodkan nilai kuasa dua r sebanyak 0.9347 serta menunjukkan hubungan yang kuat antara kedua-dua jenis data. Kesimpulannya, penemuan kajian menunjukkan bahawa penilaian hakisan tebing sungai berdasarkan perubahan sempadan bakau menggunakan imej satelit pelbagai tempoh masa berkemampuan untuk membantu pihak seperti Lembaga Pembangunan Langkawi (LADA), Jabatan Pengairan dan Saliran (JPS) serta Jabatan Laut Malaysia (JLM) bagi mendapatkan pemahaman mendalam tentang isu hakisan tebing sungai yang memudahkan mereka merancang satu pelan mitigasi pada masa hadapan.

TABLE OF CONTENTS

	TITLE	PAGE
	DECLARATION	ii
	DEDICATION	iii
	ACKNOWLEDGEMENT	iv
	ABSTRACT	v
	ABSTRAK	vi
	TABLE OF CONTENTS	vii
	LIST OF TABLES	xii
	LIST OF FIGURES	xiv
	LIST OF ABBREVIATIONS	xix
	LIST OF SYMBOLS	xxi
	LIST OF APPENDICES	xxii
CHAPTER 1	INTRODUCTION	1
1.1	Background of Study	1
1.2	Problem Statement	5
1.3	Aim and Objectives of Study	8
1.4	Research Question	8
1.5	Significance of Study	9
1.6	Scope and Limitation of Study	11
	1.6.1 Scope of Study	11
	1.6.2 Limitation of Study	13
1.7	Thesis Outlines	14
CHAPTER 2	LITERATURE REVIEW	17
2.1	Introduction	17
2.2	The Definition of Riverbank Erosion	17
2.3	The Factor of Riverbank Erosion	21
	2.3.1 The Natural Factor of Riverbank Erosion	21

2.3.2	The Anthropological Factor of Riverbank Erosion	22
2.4	The Definition of Riverbank Line and Mangrove Boundary as the Indication of Riverbank Erosion	25
2.4.1	The Definition of Riverbank Line	25
2.4.2	The Definition of Mangrove Boundary	27
2.5	The Characteristic of Mangrove at Kilim River	28
2.5.1	The Main Species of Mangrove at Kilim River	29
2.5.2	The Growth Pattern of <i>Rhizophora Apiculata</i> and <i>Rhizophora Muncronata</i>	30
2.5.3	Mangrove Canopy Spread during Growth Period	31
2.6	Riverbank Erosion Issues at Kilim River	33
2.7	Impact of Riverbank Erosion towards River Morphology	36
2.8	Evaluation of Riverbank Erosion Impact towards River Morphology	38
2.8.1	Field Measurement Approaches	38
2.8.2	Geospatial Approaches	41
2.9	Characteristic of Geospatial and Field Measurement Data Types	46
2.9.1	Quickbird Satellite	46
2.9.2	World View-2 Satellite	48
2.9.3	Pleiades-1B Satellite	50
2.9.4	GPS Data	51
2.9.5	Erosion Pin Data	54
2.10	Satellite Image Processing Technique	55
2.10.1	Image Pan-Sharpening	56
2.10.2	Image Geo-referencing	57
2.10.3	Change Detection	58
2.10.4	Image Classification	60
2.10.5	Maximum Likelihood Classification (MLC)	63
2.10.6	Feature Extraction	65
2.10.7	Image Overlay	66
2.10.8	Buffering	68

2.11	Issue and Research Gap	71
CHAPTER 3	METHODOLOGY	73
3.1	Introduction	73
3.2	Methodology	73
3.3	Data Collection	76
3.3.1	Satellite Imagery	76
3.3.1.1	Quickbird Satellite Image	76
3.3.1.2	WorldView-2 Satellite Image	78
3.3.1.3	Pleiades-1B Image	79
3.3.2	Field Measurement Data	80
3.3.2.1	GPS Observation	80
3.3.2.2	Erosion Pin Data	81
3.4	Case Study Area	82
3.5	Data Pre-Processing	87
3.5.1	Image Pan-sharpening	87
3.5.2	Image Geo-referencing	88
3.6	Data Processing	91
3.6.1	Image Classification	91
3.6.2	Feature Extraction	94
3.6.3	Image Overlay	94
3.6.4	Developing Riverbank Erosion Prediction Model	95
3.6.4.1	Buffering of Pleiades-1B Mangrove Boundary	96
3.6.4.2	Kernel Density Analysis	97
3.7	Data Analysis and Output	99
CHAPTER 4	RESULT AND DISCUSSION	101
4.1	Introduction	101
4.2	Result of Data Processing	101
4.2.1	Image Pan-sharpening	101
4.2.2	Image Geo-referencing	103
4.2.3	Image Classification	104

4.2.4	Feature Extraction	111
4.2.5	Image Overlay	112
4.3	Determination of Mangrove Boundary Shifting and its Impact towards Riverbank Features	113
4.3.1	Mangrove Boundary Shifting for the Year 2005, 2012 and 2017	114
4.3.2	Impact of Mangrove Boundary Shifting towards Riverbank Features	117
4.3.2.1	Impact of Mangrove Boundary Shifting towards Riverbank Features	118
4.3.2.2	Total Area Changes of Kilim River	120
4.4	The Assessment of Riverbank Erosion and Accretion Rates	121
4.4.1	The Map of Riverbank Erosion and Accretion at Kilim River	122
4.4.2	Riverbank Erosion Rates (Total Area) at Kilim River	124
4.4.3	Riverbank Erosion Rates (Average Distance) at Kilim River	125
4.5	Data Accuracy of Geospatial and Field Measurement Data	127
4.5.1	Comparison of Pleiades-1B Mangrove Boundary and RTK GPS Location	128
4.5.2	Comparison between Pleiades-1B Mangrove Boundary and Erosion Pin Location	135
4.5.3	Comparison of Riverbank Erosion Rates Value (Average Distance) between Pleiades-1B Mangrove Boundary and Erosion Pin Location	141
4.6	Riverbank Erosion Prediction Model at Kilim River	142

CHAPTER 5	CONCLUSION AND RECOMMENDATIONS	149
5.1	Introduction	149
5.2	Did the Study Fulfill its Objective?	149
5.3	Recommendation for Future Works	152
5.4	Conclusion	154
REFERENCES		157
LIST OF PUBLICATIONS		196

LIST OF TABLES

TABLE NO.	TITLE	PAGE
Table 1.1	Environmental and ecological setting of Indo-Malayan mangroves (Revised from Dasgupta et.al, 2012)	3
Table 1.2	Status and trends in mangrove area at Malaysia from 1980 until 2005 (FAO, 2007)	4
Table 2.1	Quickbird satellite specification	47
Table 2.2	WorldView-2 satellite specification	49
Table 2.3	Pleiades-1B satellite specification	51
Table 2.4	Summary of image classification technique (Im and Jensen, 2005)	61
Table 3.1	Detail specification of Quickbird image at 2005	77
Table 3.2	Detail specification of WorldView-2 image at 2012	78
Table 3.3	Detail specification of Pleiades-1B image at 2017	79
Table 3.4	The coordinates of erosion pin at Kilim River	82
Table 4.1	RMSE value of image geo-referencing for first epoch (Quickbird-WorldView-2)	103
Table 4.2	RMSE value of image geo-referencing for first epoch (WorldView-2 - Pleiades-1B)	104
Table 4.3	Ground truth (pixel) for classification image of Quickbird	106
Table 4.4	Ground truth (percent) for classification image of Quickbird	106
Table 4.5	Commission and omission of Quickbird classification image	106
Table 4.6	Producer and user accuracy of Quickbird classification image	107
Table 4.7	Overall accuracy and kappa coefficient of Quickbird classification image	107
Table 4.8	Ground truth (pixel) for classification image of WorldView-2	107
Table 4.9	Ground truth (percent) for classification image of WorldView-2	107

Table 4.10	Commission and omission of WorldView-2 classification image	108
Table 4.11	Producer and user accuracy of WorldView-2 classification image	108
Table 4.12	Overall accuracy and kappa coefficient of WorldView-2 classification image	108
Table 4.13	Ground truth (pixel) for classification image of Pleiades-1B	108
Table 4.14	Ground truth (percent) for classification image of Pleiades-1B	109
Table 4.15	Commission and omission of Pleiades-1B classification image	109
Table 4.16	Producer and user accuracy of Pleiades-1B classification image	109
Table 4.17	Overall accuracy and kappa coefficient of Pleiades-1B classification image	109
Table 4.18	Changes of Kilim River width	119
Table 4.19	Total area of Kilim River	121
Table 4.20	The riverbank erosion rate (total area) of Kilim River	124
Table 4.21	The riverbank erosion rate (average distance) of Kilim River	126
Table 4.22	Data validation of Pleiades-1B mangrove boundary and RTK GPS location	131
Table 4.23	Regression statistic of residual model between Pleiades-1B and RTK GPS	135
Table 4.24	Data accuracy of Pleiades-1B mangrove boundary and erosion pin	138
Table 4.25	Regression statistic of residual model between Pleiades-1B and RTK GPS	141
Table 4.26	Mangrove boundary shifted rates	144

LIST OF FIGURES

FIGURE NO.	TITLE	PAGE
Figure 1.1	Percentage of mangrove degradation caused by coastal development	4
Figure 2.1	Riverbank erosion process (Rose, 1960)	18
Figure 2.2	The shape of river that changing the speed of flowing water (Lawler et al., 1997)	18
Figure 2.3	The types of riverbank erosion process; (a) Sub-aerial; (b) Fluvial; (c) Mass failure (Wolman, 1959; Duijsings, 1987; Thorne, 1982; Lawler et al., 1997; Green et al., 1999)	20
Figure 2.4	The pattern of boat wakes at deep water; (a) Raw captured image; (b) Sketch image (Sorenson, 1973)	23
Figure 2.5	Wave height as function of speed in planning hull vessels (Maynord, 2001)	24
Figure 2.6	Riverbank line at clear water-land boundary	26
Figure 2.7	Dense vegetation-water boundary at mangrove area	28
Figure 2.8	Different mangrove species for each zone (Waycott et al., 2011)	29
Figure 2.9	Measuring tree height on level ground (The University of British Columbia, n.d)	31
Figure 2.10	Crown spread measurement (The University of British Columbia, n.d)	32
Figure 2.11	The mangrove riverbank erosion problem at Kilim River	34
Figure 2.12	Boat wakes from eco-tourism activities	34
Figure 2.13	The recommended criteria of operating boat that should be used along Kilim River (NAHRIM and NRE, 2015)	35
Figure 2.14	Types of river form; (a) Straight; (b) Braided; (c) Meandering (Sarkar, 2016)	37
Figure 2.15	Erosion pin installed at riverbank	40
Figure 2.16	Component of remote sensing system, a remote sensing monitors a target and send data to ground station for processing (Hossam, 2015)	41

Figure 2.17	Example of UAV DJI Phantom 4 model (Anurogo et.al, 2017)	42
Figure 2.18	Combination of remote sensing and GIS in identifying river changes (Uddin et al., 2011)	44
Figure 2.19	Quickbird satellite on space	46
Figure 2.20	WorldView-2 satellite on space	48
Figure 2.21	Pleiades-1B satellite on space	50
Figure 2.22	Static GPS observation: (a) El-Rabbany, 2002; (b) USGS	53
Figure 2.23	RTK GPS observation (El-Rabbany, 2002)	54
Figure 2.24	Erosion pins installed at Kilim riverbank	55
Figure 2.25	Example of pan-sharpening process (Jason, 2013); (a) Panchromatic image; (b) Multispectral image; (c) Pan-sharpened image (panchromatic + multispectral)	56
Figure 2.26	Image-to-image matching geo-referencing methods using stereo satellite image (Oh et.al, 2010)	58
Figure 2.27	Change detection of IKONOS image (Aleksandrowicz et.al, 2014)	59
Figure 2.28	Example of image classification method (Al-doski et.al, 2013)	60
Figure 2.29	Unsupervised classification diagram	62
Figure 2.30	Supervised classification diagram	63
Figure 2.31	Basic concept of MLC (JAARS, 1999)	64
Figure 2.32	Conventional method of image overlay (Ian McHarg, 1971)	66
Figure 2.33	Example of image overlay process (Nusayba, 2012)	67
Figure 2.34	Image overlay tool (a) Intersect tool; (b) Symmetrical difference tool; (c) Erase tool (Miranda, 2018)	68
Figure 2.35	Buffer zones (yellow) surround vector and raster representations of a pond and stream.	69
Figure 2.36	Line buffering	69
Figure 2.37	Line buffering with line segments	70
Figure 2.38	Line buffering with overlap removed	70
Figure 3.1	General methodology of the study	74
Figure 3.2	Legend for general methodology	74

Figure 3.3	The Quickbird satellite image of Kilim River at the year 2005	77
Figure 3.4	The WorldView-2 satellite image of Kilim River at the year 2012	78
Figure 3.5	The Pleiades-1B satellite image of Kilim River at the year 2017	79
Figure 3.6	The distribution of static and RTK GPS point at Kilim River	81
Figure 3.7	The location of erosion pins at Kilim River	82
Figure 3.8	Location of study area (A: Peninsular Malaysia), (B: Langkawi Island), (C: Full Image of Satellite Image) and (D: Kilim River	83
Figure 3.9	The number of tourists visiting KKGP from 2010 to 2015 (The Cooperative of Kilim Village Community Langkawi Limited, 2017)	84
Figure 3.10	The visibility of boat wakes pattern from an aerial view	85
Figure 3.11	The distribution of tourist at KKGP; (a) The tourist distribution at the entire KKGP; (b) The tourist distribution at the study area	86
Figure 3.12	Pan-sharpening process on Quickbird image	87
Figure 3.13	Pan-sharpening process on WorldView-2 image	87
Figure 3.14	Pan-sharpening process on Pleiades-1B image	88
Figure 3.15	Image-to-image geo-referencing process of Quickbird and WorldView-2	89
Figure 3.16	Image-to-image geo-referencing process of WorldView-2 and Pleiades-1B	89
Figure 3.17	The distribution of tie points between base image (WorldView-2) and warp image (Quickbird); (a) Base image; (b) Warp image	90
Figure 3.18	The distribution of tie points between base image (WorldView-2) and warp image (Pleiades-1B); (a) Base image; (b) Warp image	91
Figure 3.19	Image classification using MLC algorithm	92
Figure 3.20	Training sample of satellite image; (a) Quickbird image; (b) WorldView-2 image; (c) Pleiades-1B image	93
Figure 3.21	Extraction of river feature from raster image	94
Figure 3.22	Image overlay method on Quickbird, WorldView-2 and Pleiades-1B images	95

Figure 3.23	Riverbank erosion prediction model flowchart	96
Figure 3.24	Line buffer zone process of mangrove boundary at the year 2017	97
Figure 3.25	The direction of mangrove boundary shifting	98
Figure 3.26	The erosion rates of Kilim river from 2005 to 2017	99
Figure 4.1	The pan-sharpening process of Quickbird, WorldView-2 and Pleiades-1B; (a) Quickbird; (b) WorldView-2; (c) Pleiades-1B	102
Figure 4.2	Image classification result of satellite imagery; (a) Quickbird; (b) WorldView-2; (c) Pleiades-1B	105
Figure 4.3	Kappa coefficient bar chart of all satellite imageries	110
Figure 4.4	Overall accuracy bar chart of all satellite imageries	110
Figure 4.5	Feature extraction process of river features using 'select by location' tool	111
Figure 4.6	Image overlay process of Kilim River at 2005, 2012 and 2017	112
Figure 4.7	Riverbank line determination using symmetrical differences and erase tool (image overlay analysis)	113
Figure 4.8	The position of mangrove boundary at Kilim River	114
Figure 4.9	Mangrove boundary point of Kilim River at the year 2005, 2012 and 2017	115
Figure 4.10	Mangrove boundary of Kilim River at the year 2005, 2012 and 2017	116
Figure 4.11	Direction of riverbank erosion or boat wakes impact towards riverbank	116
Figure 4.12	Mangrove boundary shifting at Kilim River	117
Figure 4.13	The distribution of cross-section line at Kilim River	118
Figure 4.14	The increasing width of Kilim River at 2005, 2012 and 2017	120
Figure 4.15	The increasing trend of total area changes	121
Figure 4.16	The riverbank erosion and accretion map of Kilim River (A: First epoch) and (B: Second Epoch)	123
Figure 4.17	Riverbank erosion and accretion (total area) at Kilim River	125
Figure 4.18	The distribution of erosion pin location at Kilim River	126
Figure 4.19	The riverbank erosion rate (average distance) at Kilim River	127

Figure 4.20	The location of RTK GPS and Pleiades-1B riverbank points at Kilim River	129
Figure 4.21	Coordinate comparison; (a) Easting Pleiades-1B and Easting RTK GPS; (b) Northing Pleiades-1B and Northing RTK GPS	133
Figure 4.22	Residual model between Pleiades-1B and RTK GPS data; (a) Residual plot; (b) Line fit plot	134
Figure 4.23	The distribution of Pleiades-1B mangrove boundary and erosion pin location at Kilim River	136
Figure 4.24	Coordinate comparison; (a) Easting Pleiades-1B and Easting erosion pin; (b) Northing Pleiades-1B and Northing erosion pin	139
Figure 4.25	Residual model between Pleiades-1B and erosion pin data; (a) Residual plot; (b) Line fit plot	140
Figure 4.26	Regression model between Pleiades-1B and erosion pin data	142
Figure 4.27	Mangrove boundary lines in the future	143
Figure 4.28	Direction of riverbank erosion at Kilim River	145
Figure 4.29	Riverbank erosion interpolation in the future	146
Figure 4.30	The riverbank erosion prediction model of Kilim River	147

LIST OF ABBREVIATIONS

ANN	-	Artificial Neural Network
DBMGP	-	Dayang Bunting Marble Geoforest Park
DEM	-	Digital Elevation Model
DID	-	Department of Irrigation and Drainage
DTM	-	Digital Terrain Model
DIP	-	Digital Image Processing
EDM	-	Electronic Distance Measurement
ESRI	-	Environmental System Research Institute
EU	-	European Union
GCP	-	Ground Control Point
GGN	-	Global Geopark Network
GIS	-	Geographical Information System
GNSS	-	Global Navigation Satellite System
GPS	-	Global Positioning System
GS	-	Gram-Schmidt
GSD	-	Ground Sampling Distance
HSC	-	High Speed Crafts
IGD	-	Integrated GIS Database
ISMP	-	Integrated Shoreline Management Plans
KKGP	-	Kilim Karst Geoforest Park
LADA	-	Langkawi Development Authority
LULC	-	Land Use and Land Cover
MCGP	-	Machincang Cambrian Geoforest Park
MDM	-	Marine Department Malaysia
MIHS	-	Modified Intensity- Hue-Saturation
MLC	-	Maximum Likelihood Classification
MOTAC	-	Ministry of Tourism and Culture
NAHRIM	-	National Hydraulic Research Institute Malaysia
NOAA	-	National Oceanic and Atmospheric Administration

NIR	-	Near Infra-Red
OBIA	-	Object-Based Image Analysis
QGIS	-	Quantum GIS
RGB	-	Red Green Blue
RMSE	-	Root Mean Square Error
RSO	-	Rectified Skewed Orthomorphic
RTK	-	Real-Time Kinematic
SGW	-	Ship Generated Wave
SLR	-	Sea Level Rise
SQL	-	Structured Query Language
TLS	-	Terrestrial Laser Scanner
UAV	-	Unmanned Aerial Vehicle
USGS	-	United States Geological Survey
USLE	-	Universal Soil Loss Estimation
UNESCO	-	United Nations of Education, Scientific and Cultural Organization
UTM	-	Universal Transverse Mercator
VHR	-	Very High Resolution
WGS	-	World Geodetic System
WLNR	-	Water, Land and Natural Resources
WPCA	-	Wavelet Principal Component Analysis
WRI	-	World Resources Institute

LIST OF SYMBOLS

C_1	-	Classes can be represented in Baye's classification
N	-	The number of classes for determining the class of a particular pixel with measurement vector
V	-	Member of the class
$P(v C_i)$	-	The set of class conditional probability
$P(C_i)$	-	The probability that pixel from class C_i appears anywhere in the map
$P(v)$	-	The probability of finding a pixel with measurement vector
$P(C_j)$	-	The conditional probability function is estimated from labeled training data for each class
Z_i	-	The mean vector of the data
Y_i	-	Covariance matrix of the data

LIST OF APPENDICES

APPENDIX	TITLE	PAGE
Appendix A	1 st Epoch of GPS Observation-December 2016	177
Appendix B	2 nd Epoch of GPS Observation- December 2017	159
Appendix C	Real-Time Kinematic (RTK) and Global Positioning System (GPS) Measurement at Kilim River	191
Appendix C	Erosion Pin Measurement at Kilim River	193

CHAPTER 1

INTRODUCTION

1.1 Background of Study

Malaysia has 641,446 hectares of mangrove forest, with Peninsular Malaysia having 104,200 hectares of mangrove forest from this total area (Abd. Shukor et al., 2004). Although mangrove forest is globally decreasing, Malaysia's mangrove forest is still intact under a mangrove management system such as mangrove forest reserve and the establishment of Ramsar sites (Jusoff, 2013). However, a study from the World Resources Institute (WRI) revealed that Malaysia lost 4.6% of its mangrove forests from the year 2001 to 2012, about the size of the whole Federal Territory of Kuala Lumpur (Lee, 2015). The same study also stated that least 1000 hectares of mangrove forest in Malaysia is vanishes every year, especially in the year 2009 which recorded a loss of 4052 hectares (Lee, 2015). Lee (2015) stated that several issues such as fish farming, urbanisation, agriculture, sea level rise, boat wake effects, and deforestation are factors that decrease mangrove forest area in Malaysia.

Mangrove forests are vital sources to the economy of Malaysia, especially in fishery, timber, and tourism sectors. Within the fishery sector, mangrove forest is considered as the breeding nurseries for several marine species such as barramundi and banana prawn (Jusoff, 2013). Mangrove forests provides an ideal habitat for fish, crab, and prawn to grown up well. Mangrove forests is harvested for its high calorific value and good quality of wood for the combustion process compared to other woods. In the aspect of tourism, mangrove forest is capable to attract tourist due to its uniqueness and the beauty of its ecosystem. Tourist surging is not only increase the reputation of mangrove forest eco-tourism but also generate several incomes including boat tour activities, restaurant, and souvenir shop.

Mangrove forests play an important role in maintaining the sustainability of ecology, biodiversity, and environmental values. Mangrove forests is considered as the natural protector from riverbank erosion by reducing the silt accumulation in the marine habitat. It also could stop sediment movement by trapping it at the root of the mangrove tree. Mangrove forests protect the coastal area from the storm surge and tsunamis by reduce the impact of the huge wave to the half or three-quarter from actual strength (Onrizal et al., 2017). The previous study in Vietnam showed the reduction of the wave increased with the height of water (Bao, 2011). Another study discovered the capability of mangrove forests in created the “live sea-walls” which is cost effective compared to concrete sea-wall and other man-made structure in protecting the coast (Ca and Xuyen, 2008). In aspect of sea level rise, mangrove forests has the capability to adapt with sea level dwelling and interact well with tidal changes. This is because of natural characteristic of mangrove forests which is dynamically subjects to the periodic fluctuation in climate and its response to the changes of sea level.

Mangrove degradation in Malaysia was serious and worrisome since the year 1980s (Rahman and Asmawi, 2016). According to Table 1.1, it rated mangrove forest in Peninsular Malaysia as critically degraded while mangrove forest in Sabah and Sarawak as degraded (Dasgupta et al., 2013). The situation showed that Peninsular Malaysia faced a critical mangrove forest degradation compares to Sabah and Sarawak.

Table 1.1 Environmental and ecological setting of Indo-Malayan mangroves (Revised from Dasgupta et.al, 2012)

Category	Indus River Delta	Godvari-Krishna mangrove	Suburban mangrove	Burmese Coast mangrove	Indochina mangrove	Sunda shelf mangrove
Type	Backwater estuarine	Deltaic/estuarine	Deltaic	Deltaic and coastal	Coastal	Coastal
Dominance	Transboundary	Domestic	Transboundary	Transboundary	Transboundary	Transboundary
Major rivers	Indus	(i) Mahanadi	(i) Ganges	Ayeyarwady	(i) Mekong	Mahakam River
		(ii) Godavari	(ii) Brahmaputra		(ii) Red River	
		(iii) Krishna	(iii) Meghna			
Species richness	4	34	36	41	40	43
Total forest area (sq - km)	6000 (approx.)	7000 (approx.)	25000 (approx.)	3822 (approx.)	26936 (approx.)	40000 (approx.)
Mangrove under protected area (sq -km)	823	920	2700	125	820	6530
					(i) Thailand (east coast)	(i) Sabah and Sarawak
	Western of India and eastern	Eastern coast of India	(i) Bangladesh	(i) Myanmar	(ii) Cambodia	(ii) Indonesia
	Coast of Pakistan	(Orissa to Tamil Nadu)	(ii) India	(ii) Thailand (West coast)	(iii) Vietnam	(iii) Brunei
					(iv) Peninsular Malaysia	
Occurrence					(v) Philippine	
	Critically degraded and	Degraded			Critically degraded	Degraded
Status	fragmented					

Based on Table 1.2, Malaysia lost 110 000 hectares of its mangrove forests from the year 1980 to 2005. The annual change between the year 1980 until 1990 is -0.5% while the annual change for the year 1990 until 2000 is -0.8% and the annual change for the year 2000 until 2005 is -8.0% (FAO, 2007). During first decade (1980–1990), mangrove forest was degraded because of land conversion for agriculture, shrimp ponds or urban development purposes. Shrimp farming spread rapidly in the countryside, especially in peninsular Malaysia, which led to the clearing of large areas of mangrove forest.

Table 1.2 Status and trends in mangrove area at Malaysia from 1980 until 2005 (FAO, 2007)

Country / Area	Most recent reliable estimate		1980	1990	Annual change 1980-1990		2000	Annual change 1990-2000		2005	Annual change 2000-2005	
	ha	Ref. year	ha	ha	ha	%	ha	ha	%	ha	ha	%
Malaysia	564971	2005	6740000	642000	-3200	-0.5	589500	-5250	-0.8	565000	-4900	-0.8

This issue is a global concern since Asia continent is the major contributors to the mangrove population in the world. As illustrates in Figure 1.1, mangrove forest degradation is caused by few factors including mangrove clearing, residential purpose, commercial area, agriculture, aquaculture and others factor (Shahbudin and Kamaruzzaman, 2011). However, mangrove clearing dominating the percentages of mangrove degradation caused in Figure 1.1.

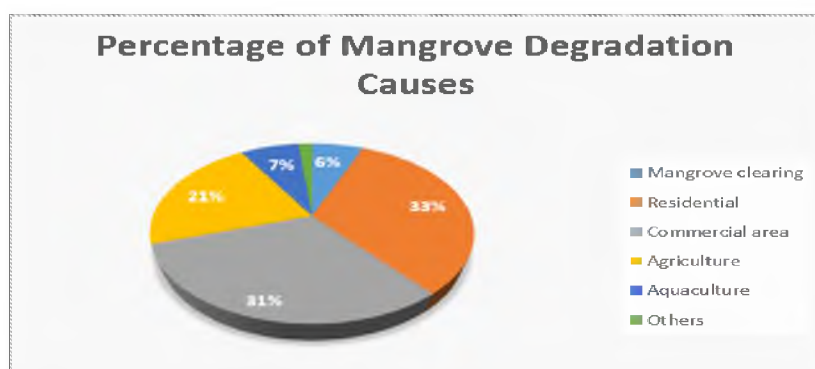


Figure 1.1: Percentage of mangrove degradation caused by coastal development (Shahbudin and Kamaruzzaman, 2011)

Mangrove forests clearing is frequently happened within the area which lacks monitoring and less protection by local authority. Even the area is well-protected, mangrove degradation is still happened when another factor prevails. Boat wakes is a factor which indirectly caused the riverbank erosion since the impact is a long-term and not instantaneous (McConchie et al., 2003). Boat wakes has potential to causes a mangrove degradation if the waves hold enough energy to erode the riverbank and if it frequently happened (Suprayogi et al., 2013). Boat wakes regularly existed within the busy waterways and contain enough energy to reach the riverbank (Gourlay, 2011). Less people aware of this situation since the impact of boat wakes taking a long time to be notice unless the effect is too severe and mangrove population drastically decreased.

This study assesses the impact of riverbank erosion based on mangrove boundary changes identification. For this assessment, Geographical Information System (GIS) and digital image processing are utilised to evaluate the mangrove boundary changes. Very High Resolution (VHR) satellite image is used as the sources of data to represent the earth surface in the years of 2005, 2012 and 2017. Integration of GIS and digital image processing techniques are capable to identify the changes of river morphology and could achieve the purpose of this study. The output enables the beneficiary to have a deep understanding on this issue and might assist for mitigation plan.

1.2 Problem Statement

Riverbank erosion is the major threat to mangrove forest. It is a process of soil loss at the cliff or riverbank because of soil run-off (Amsalu et al., 2014). The biophysical environment which comprising soil, climate, terrain and ground cover could generate the riverbank erosion. Riverbank erosion is causes by natural and anthropological factor. Riverbank erosion causes the changes of river morphology which is contributes to land degradation. Critical erosion would affect the riverbank structure and causes degradation of mangrove forest if it consistently happen. The

collapsed riverbank would alter mangrove boundary location by shifting it from the original position.

Accreditation of Geopark status starting from 2007 until now, make it more popular and show the rising number of incoming tourist (Kamaruddin, 2014). As the popular place with mangrove forest and natural habitat of flora and fauna, requirement for boat operating service taking tour across mangrove forest in Kilim Geoforest Park is rising every year (Mohamad et al., 2018). The growing number of tourist visiting Kilim River and the increasing usage of boat tour service indirectly caused riverbank erosion. The boat-generated wave slowly erodes the riverbank and as the result, the mangrove area is slowly decreasing and it harming flora and fauna in the ecosystem (Tyler, 2014).

Riverbank erosion at Kilim River has become LADA's main issue since the area is the centre of KKGP (NAHRIM and NRE, 2015). The critical riverbank erosion might jeopardise the geo-heritage value of KKGP and threatens the incoming Geopark's accreditation. Geopark retraction would affect the entire concept of Geopark development including heritage conservation, economy and community development at Langkawi (Tyler, 2014). Identification of mangrove boundary shifting enables the beneficiaries such as Langkawi Development Authority (LADA) and Department of Irrigation and Drainage (DID) to collect useful information about the current condition of Kilim River. Despite of mangrove boundary shifting, the beneficiaries also could get the rate of riverbank erosion and riverbank erosion prediction model of Kilim River in the future.

Mangrove boundary is the important element in this study since it becomes the indicator for river morphological changes. Mangrove boundary shifting required multiple data to generate mangrove boundary for comparison (Adarsa et al., 2012). However, mangrove boundary is difficult to be identify since the extreme conditions of mangrove forest which is not suitable for the field measurement process (Hogarth, 2001). The condition of mangrove forests which is muddy, sandy and full of roots would complicates the data collection process. The measuring equipment such as a total station, Terrestrial Laser Scanner (TLS), Electronic Distance Measurement

(EDM) and other survey equipment which require tripod are difficult to be set up at this area.

Data of mangrove forests and river should cover the entire study area. Using survey equipment such as a total station, TLS and EDM would only collect the certain parts of study area. Although this kind of measurement techniques are very accurate, it will be a waste if it overlooks the important part of study area. The data redundancy is crucial when involved the large scale of study area. The coverage of whole study area is important and should be measured entirely.

The identification of mangrove boundary shifting requires multiple sets of geospatial data. Single geospatial data could not displays the long-term impacts of riverbank erosion towards river morphology. The relationship of past, intermediate and present data are crucial to illustrates the trend of mangrove boundary shifting and the morphological issue of Kilim River. However, collecting multiple datasets especially the past data is difficult to do. The images are usually expensive and restricted which urge the researcher to spend some money. VHR satellite images are not a downloadable item because it contains high resolution pixel of earth surface compared to a free image like Landsat, Sentinel or National Oceanic and Atmospheric (NOAA).

Evaluating the impact of riverbank erosion based on mangrove boundary changes identification needs an efficient technique of image processing. The problem would arise if the technique is not compatible with the images in the term of accuracy, error and the quality of output. Selection of suitable technique for classifying and extracting river feature would decide the output quality, accuracy and error. The problem get worse if the technique is only available in expensive and premium software. This situation would complicate the data processing unless the technique is available in open source or free software.

1.3 Aim and Objectives of Study

The aim of study is to evaluate changes of mangrove boundary due to riverbank erosion. This study support by four main objectives:

- i. To determine mangrove boundary shifting and its impact towards riverbank features;
- ii. To validate mangrove boundary shifting of satellite imagery and field measurement data;
- iii. To assess the changes rates of riverbank erosion and accretion;
- iv. To develop riverbank erosion prediction model of Kilim River

1.4 Research Question

The first objective is to determine mangrove boundary shifting and its impact towards riverbank features. It is supported by the following research question:

- i. How the riverbank erosion does affects mangrove boundary shifting?
- ii. What is the implications of mangrove boundary shifting towards river morphology?

The second objective is to validate mangrove boundary shifting of satellite imagery and field measurement data. Implementation of the second objective is supported by the following research question:

- i. What is the technique to validate the accuracy of satellite imagery and field measurement data?
- ii. What is the accuracy of satellite imagery and field measurement data?

The third objective is to assess the changes rates of riverbank erosion and accretion. The research questions for supporting this objective are:

- i. What kind of technique is used to evaluate riverbank erosion and accretion rates?
- ii. Where is the specific location of critical riverbank erosion at Kilim River?

The fourth objective is to develop riverbank erosion prediction model of Kilim River. Implementation of the fourth objective is supported by the following research questions:

- i. What is the purpose of developing erosion prediction model at Kilim River?
- ii. What would happens to Kilim River if riverbank erosion is consistently exist in the future?

1.5 Significance of Study

Riverbank erosion at Kilim River is concerned by several agencies. This is because Kilim River located within Kilim Karst Geoforest Park (KKGP). KKGP holds the title of Geopark which is granted by the United Nations Educational, Scientific and Cultural (UNESCO) started at 1 June 2007 (LADA, 2014). This study might captivates several beneficiaries such as LADA, DID, the Ministry of Tourism and Culture (MOTAC), National Hydraulic Research Institute Malaysia (NAHRIM), Department of Forestry Malaysia (DFM), and Marine Department Malaysia (MDM) for sharing the useful information in maintaining the status of Geopark at KKGP.

The main beneficiary of this study is LADA. LADA is responsible to managed Langkawi based on four functions comprise tourism, duty-free zones, investment and socio-economic (LADA, 2018). LADA's mission is to lead the tourism development that could benefit the locals, industry and tourist through strategic governance. As an island which is depending on tourism as the major attraction and the sources of an economy, Langkawi is really concerned about the tourist needs. Hence, LADA always

put a priority on tourist satisfaction especially for all Geoparks namely Machincang Cambrian Geoforest Park (MCGP), Dayang Bunting Marble Geoforest Park (DBMGP) and Kilim Karst Geoforest Park (KKGP) (Fauzi et al., 2017). The entire Geoparks are the major contributors to Langkawi's economy and as an authority, LADA is responsible to maintain and improves the number of tourists for the upcoming years.

The second beneficiary is DID. DID is a government body which responsible to build, operates and maintains the facilities of irrigation, drainage and prepare the flood mitigation plan (JPS, 2018). DID is also responsible in supporting the management of water resources, flood, river basin and coastal zones by developing an Integrated GIS Database (IGD). IGD comprises the Integrated Shoreline Management Plans (ISMP), River Basin Information System (RBIS) and Flood Mapping. Most of the data in this database comprise of field measurement and geospatial data. However, some extracted mangrove boundary from DID database is not parallel with the actual mangrove boundary on the ground. This might happen because of poor sources of geospatial data and the improper method of DIP, particularly the image classification or feature extraction process. This study could provide the method to determine mangrove boundary using VHR image and using DIP technique to generate mangrove boundary.

This study of evaluating riverbank erosion based on mangrove boundary changes identification is crucial for the development of knowledge in environmental and coastal field. Integrating GIS and DIP technique could expand the knowledge about riverbank erosion and river morphology. Different data and techniques are capable to construct a new approach for environmental and coastal studies. This study could inspire many researchers to explore various method to evaluate the riverbank erosion impact towards river morphology.

1.6 Scope and Limitation of Study

The scope of study discusses few question marks which is comprise ‘what’, ‘where’, ‘when’ and ‘how’ the study is conducted. ‘What’ means the data used as the input of this study. ‘Where’ means the location of case study area selected based on few criteria. ‘When’ is defined as the time of study period and is depend on the time when the data collection take place. ‘How’ means the process and method to generate output and to prove if the objectives are achievable or not.

Several limitations exist in this study and would discuss in this section. Limitations of this study comprise the selection of geospatial dataset, the insufficiency quantity of erosion pin location, the harsh ground conditions of study area and the sudden changes of image classification techniques of this study.

1.6.1 Scope of Study

The data in this study comprise geospatial and field measurement data. For geospatial data, this study required VHR image as time-series data. This is because of quality from VHR image that reached below one meter of spatial resolution. The other reason of using VHR images as main data is because the availability of the historical data. VHR image usually stored their past data in the archive and might be useful for any study related to change detection. The comparison of the earth surface at past, intermediate and present are useful to distinguish any changes on the earth surface and are considered as the long-term evaluation of erosion impact. For field measurement data, this study needs GPS observation and erosion pin data to assess the rate of riverbank erosion for the short-term period.

The case study area is at Kilim River, Langkawi Island, Kedah, Malaysia. Kilim River is the strategic location at the centre of Kilim Karst Geoforest Park (KKGP), which is one of the famous Geoparks at Langkawi Island. The mangrove forests condition at this river is critical because of riverbank erosion is sourced by eco-tourism activities at KKGP. The condition of Kilim River become main concern since the accreditation of Geopark status is includes this area. The critical riverbank erosion

that happens within this area might affect the next accreditation by the United Nations Educational, Scientific and Cultural Organization (UNESCO) in the future.

The time of this study decided in the year of 2005, 2012 and 2017, approximately 12 years apart. This period is depends on the date of VHR image from the year 2005 until 2017. The requirements of this study prefer the VHR image from the year 2000 until 2017. The reason is to provide the image of Kilim River before Geopark and after the accreditation by UNESCO. 12 years gapd are enough to monitor the changes of the earth surface due to riverbank erosion impact and to evaluate its impact towards river morphology.

The reason why mangrove canopy or mangrove crown is considered as the indicator of riverbank erosion is because of mangrove boundary delineation from satellite imagery only detects the mangrove canopy spread from aerial view. Here, any natural phenomenon such as sedimentation and tidal inundation that happen underneath the mangrove canopy would remain hidden from aerial view. Since mangrove boundary changes is used as the indicator of riverbank erosion, hence this study only highlights the mangrove tree spread above tree-land boundary. Subsequently, the effect of sedimentology and tidal inundation will be exclude from this study.

The process of generating an output is by integrate GIS and DIP techniques. It comprises GIS techniques such as erase, symmetrical difference and intercept tools while DIP comprise image enhancement, image classification, and feature extraction. The combination of GIS and DIP techniques would produce the output such as mangrove boundary shifting, erosion, and accretion map as well as erosion prediction model. Beside the map or model, the output of this study is also includes the value of mangrove boundary shifting and riverbank erosion rates in the term of area and distance.

1.6.2 Limitation of Study

Satellite imagery is consist of Quickbird, Worldview-2, and Pleiades-1B images. This study used different VHR image because of unavailability of images such as Quickbird, WorldView-2, and Pleiades-1B. Different VHR images would resulted in the different sensor, different spatial resolution, different bands and different swath width. The same VHR images generate the better output and less error. However, this problem is inevitable since the Quickbird image is only available until 27 January 2015. Thus, the suitable VHR image for the year of 2012 is from WorldView-2 satellite and for the year of 2017, the suitable VHR image is from the Pleiades-1B satellite images.

The second limitation is the insufficient quantity of erosion pin location for data validation. Less erosion pin would affects the residual analysis and provides fewer points for data validation. In this study, only 5 points of erosion pin location are available for data validation. To generate the better result of data validation, it needs more points of erosion pin. This limitation occurs because of the difficulty to get data at site. Erosion pin data is crucial in this study to validate the result from satellite imagery.

The third limitation of this study is the harsh ground conditions of study area. The conditions of study area which is surrounded by mangrove forest especially at the riverbanks has complicates the process of field measurement including RTK GPS and erosion pin technique. The abundant data from field measurement technique is better for comparison of satellite imagery and field measurement data. Kilim riverbank conditions is full of mangrove forests and muddy soil which are caused the field measurement technique of tripod-based equipment is hard to be set up. Tripod-based equipment need a firm and solid ground conditions to maintain its stability and to avoid the equipment from falling into the ground.

The last limitation of this study is the sudden changes of image classification techniques. The propose technique of image classification is supposed to be an Object-Based Image Analysis (OBIA). This technique is better for the classification of earth

feature such as water, forest and hill in the term of quality of output and better accuracy. OBIA technique is widely used by researchers in delineating riverbank feature from the river and to notify the changes that occur at the river. However in this study, OBIA technique is facing an error at the middle of data processing and took a long time to process a single image. Since this study has limited duration of data processing, so OBIA technique was replaced by supervised classification technique and supervised classification work well according to the plan.

1.7 Thesis Outlines

This thesis comprises five chapters. Chapter 1 introduces this study by explaining the background of the study, problem statement, aims and objectives, the research question, the significance of the study, scope and limitation as well as thesis outlines. The content of this chapter introduces and describes the preliminary stage of the study.

Chapter 2 debriefs the literature review of this study, which comprises the definition of riverbank erosion, the factor of riverbank erosion, the impact of riverbank erosion towards river morphology, riverbank erosion issue at Kilim River, evaluation of riverbank erosion impact towards river morphology and the issue and research gap of the study. The content of this chapter describes the previous study of riverbank erosion impact towards river morphology using geospatial data.

Chapters 3 describes the methodology of this study. It outlines the methodology, scope of the study, data collection and data analysis. It also explains the case study area, pre-processing, data processing, data analysis and output. The content of this chapter describes the methodological process of generating output using the method described in general methodology.

Chapter 4 discusses the result of the study. It starts with the determination of mangrove boundary shifting and its impact towards riverbank features. Then, the assessment of riverbank erosion and accretion rates accomplished in the second

objective. Later, the validation of satellite imagery and field measurement accuracy discussed as the third objective. The last analysis is the riverbank erosion prediction model discussed as the last objectives.

Chapter 5 describes if the study fulfils its objectives. Chapter 5 also discusses recommendations to improve future studies. The last section explains the conclusion of the whole thesis.

REFERENCES

- Abd. Shukor, A.H. (2004) 'The use of mangrove in Malaysia, In: Promotion of mangrove-friendly shrimp aquaculture in Southeast Asia', (pp.136-144), Tigbauan, Iloilo, Philipines: Aquaculture Department, Southeast Asian Fisheries Development Center.
- Abernethy, B. and Rutherford, I.D. (1998) 'Where along a river's length will vegetation most effectively stabilise stream banks?'. *Geomorphology*, 23(1), pp.55-75.
- Abidin, R.Z, Sulaiman, M.S and Yusoff, N. (2017) 'Erosion Risk Assessment: A Case Study of the Langat River Bank in Malaysia', *International Soil and Water Conservation Research*, Vol.5, Issue.1, pp.26-35.
- Adarsa, J., Shamina, S. and Arkoprovo, B. (2012) 'Morphological change study of Ghoramara Island, Eastern India using multi temporal satellite data' *Research Journal of Recent Sciences*
- Adeofun, C.O, Oyedepo, J.A and Lasisi, T.I. (2011) 'An Assessment of Urban Encroachment on Ogun Riverbank Protection Zone in Abeokota City, Nigeria', *Journal of Agricultural Science and Environment*, Vol.11, Issue.1, pp.78-89.
- Aher, S. P, Bairagi, S.I, Deskmukh, P.P and Gaikwad, R.D. (2012) 'River Change Detection and Bank Erosion Identification using Topographical and Remote Sensing Data', *International Journal of Applied Information System*, Volume.2, No.3.
- Ahmad, A. and Quegan, S. (2012) 'Analysis of maximum likelihood classification on multispectral data'. *Applied Mathematical Sciences*, 6(129), pp.6425-6436.
- Ahmad Radzi, A. (2009) 'Trend Analysis of Sea Level Rise for West Coast of Peninsular Malaysia', *Master Final Project*, Universiti Teknologi Malaysia.
- Akhtar, M.N. (2013) 'Historical Trend of Riverbank Erosion along the Braided River Jamuna', *International Journal of Science: Basic and Applied Research*, Vol.11, No.1, pp.173-180.

- Aleksandrowicz, S., Turlej, K., Lewiński, S. and Bochenek, Z. (2014) 'Change detection algorithm for the production of land cover change maps over the European Union countries'. *Remote Sensing*, 6(7), pp.5976-5994.
- Ali, M.A. and Clausi, D.A. (2002) 'Automatic registration of SAR and visible band remote sensing images', *In Geoscience and Remote Sensing Symposium, 2002. IGARSS'02. 2002 IEEE International* (Vol. 3, pp. 1331-1333). IEEE.
- Alongi, D.M. (2007) 'Mangrove forest: Resident, protection from tsunamis, and responses to global climate change', *Estuarine Coastal and Shelf Science*, Vol.76, pp. 1-13.
- Alongi, D.M. (2015) 'The impact of climate change on mangrove forests'. *Current Climate Change Reports*, 1(1), pp.30-39.
- Alparone, L., Wald, L., Chanussot, J., Thomas, C., Gamba, P. and Bruce, L.M. (2007) 'Comparison of pansharpening algorithms: Outcome of the 2006 GRS-S data fusion contest'. *IEEE Transactions on Geoscience and Remote Sensing*, 45(10), pp.3012-3021.
- Amsalu, T and Mengaw, A. (2014) 'GIS Based Soil Loss Estimation Using RUSLE Model: The Case of Jabi Tehinan Woreda, ANRS, Ethiopia', *Journal of Natural Resources*, Vol.5, pp.616-626.
- Anurogo, W., Lubis, M.Z., Khoirunnisa, H., Hanafi, D.S.P.A., Rizki, F., Surya, G., Lestari, A.D., Situmorang, D.T., Sihombing, P.N., Lukitasari, C.A. and Dewanti, N.A. (2017) 'A Simple Aerial Photogrammetric Mapping System Overview and Image Acquisition Using Unmanned Aerial Vehicles (UAVs)'. *Geospatial Information*, 1(1).
- Asner, G. P., Palace, M., Keller, M., Pereira Jr, R., Silva, J. N., & Zweede, J. C. (2002). Estimating canopy structure in an Amazon forest from laser range finder and IKONOS satellite observations 1. *Biotropica*, 34(4), 483-492.
- Atkinson, P.M. and Aplin, P. (2004) 'Spatial variation in land cover and choice of spatial resolution for remote sensing', *International Journal of Remote Sensing*, 25(18), pp.3687-3702.
- Ayman A. Ahmed and Ahmed F. (2011) 'Meandering and bank erosion of the River Nile and its environmental impact on the area between Sohag and El-Minia, Egypt.' *Arabian Journal of Geoscience* 4: 1-11.
- Aziz, M. (2003) 'Effect of Seepage Forces on Nile River Bank Stability', *Seventh International Water Technology Conference Egypt*, pp.407-417.

- Babic, L, Pribicevic, B, and Dapo, A. Z, (2017) 'Geodetic Mobile Survey Methods for Riverbank Erosion Observations', *Geod.list*, Volume: 1, pp: 41-54.
- Baldwin, D.S. (2008) 'Impact of Recreational Boating on River Bank Stability: Wake Characteristic of Powered Vessels', *Report for the Murray Catchment Management Authority. Murray-Darling Freshwater Research Centre, Wodonga, Victoria*. Retrieved from <<http://arrow.latrobe.edu.au>.
- Baede, A.P.M. (2007) 'Annex I glossary. In Climate Change 2007: The Physical Science Basis. Contribution of Working Group I to the Fourth Assessment Report of the Intergovernmental Panel on Climate Change' (eds. Solomon, S. Qin, D., Manning, M., Chen, Z., Marquis, M., Averyt, K.B., Tignor, M. and Miller, H.L.). *Cambridge University Press*, Cambridge, pp. 941–954.
- Bao, T.Q. 2011) 'Effect of mangrove forest structures on wave attenuation in coastal Vietnam'. *Oceanologia*, 53(3), pp.807-818.
- Bauer, B.O, Lorang, M.S and Sherman, D.J. (2002) 'Estimating Boat-Wake-Induced Levee Erosion using Sediment Suspension Measurement', *Journal of Waterway, Port, Coastal and Ocean Engineering*, pp.152-161.
- Berger, J.F., Charpentier, V., Crassard, R., Martin, C., Davtian, G. and López-Sáez, J.A. (2013) 'The dynamics of mangrove ecosystems, changes in sea level and the strategies of Neolithic settlements along the coast of Oman (6000–3000 cal. BC)'. *Journal of Archaeological Science*, 40(7), pp.3087-3104.
- Beskow, S., Mello, C.R., Norton, L.D., Curi, N., Viola, M.R. and Avanzi, J.C. (2009) 'Soil erosion prediction in the Grande River Basin, Brazil using distributed modeling'. *Catena*, 79(1), pp.49-59.
- Bhatt, G., Kumar, M., Duffy, C., Dressler, K.A. and Wardrop, D.H. (2010) 'Identification and classification of wetlands using physics based distributed hydrologic model'. In AGU Fall Meeting Abstracts.
- Bouyoucos, G.J. (1962) 'Hydrometer Method Improved for Making Particle Size Analysis of Soils'. *Agronomy Journal*, 54, 464-465. <http://dx.doi.org/10.2134/agronj1962.00021962005400050028x>.
- Bieda, A., Hanus, P., & Parzych, P. (2012). The Problems of Establishing Cadastral Boundaries in River Erosion and Accumulation Area, According to The Polish Law.

- Bilkovic, D.M., Mitchell, M., Davis, J., Andrews, E., King, A., Mason, P., Herman, J., Tahvildari, N. and Davis, J. (2017) 'Review of boat wake wave impacts on shoreline erosion and potential solutions for the Chesapeake Bay'.
- Bird, E.C. (1996) 'Coastal erosion and rising sea-level'. In *Sea-Level Rise and Coastal Subsidence* (pp. 87-103). *Springer*, Dordrecht.
- Brice J.C. (1983) 'Planform properties of meandering rivers [C]. River Meandering', *Proceedings of the October 24–26, 1983 Rivers '83 Conference, ASCE*. New Orleans, Louisiana, 1983. 1-15.
- Brindha G. (2013) 'Emerging trends of telemedicine in India, *Indian Journal of Science and Technology*, v-6, iSUPPL5, pp-4572-4578.
- Ca, V.T. and Xuyen, N.D. (2008) 'Tsunami risk along Vietnamese coast'. *Journal of Water Resources and Environmental Engineering*, 23, pp.24-33.
- Carson M. A. and Kirkby M. J. (1972) 'Hillslope Form and Process'. *Cambridge Geographical Studies* No. 3. viii + 475 pp
- Casado, M.R, Gonzalez, R.B, Kriechbaumer, T and Veal, A. (2015) 'Automated Identification of River Hydromorphological Features Using UAV High Resolution Aerial Imagery', *Sensors*, Vol.15, Issue.11, pp. 27969-27989.
- Cengel, Y.A., Turner, R.H., Cimbala, J.M. and Kanoglu, M. (2008) 'Fundamentals of thermal-fluid sciences' (pp. 833-874). New York: McGraw-Hill.
- Chang, H.H. (2008) 'River morphology and river channel changes'. *Transactions of Tianjin University*, 14(4), pp.254-262.
- Chavez, P.S. Jr., Sides, S.R and Anderson, J.A. (1991) 'Comparison of three different methods to merge multi-resolution and multi-sectoral data: Landsat TM and SPOT Panchromatic', *Photogrammetric Engineering and Remote Sensing*, 57(3): 295-303.
- Cheng, J., Wang, P. and Guo, Q. (2016) 'Measuring beach profiles along a low-wave energy microtidal coast, West-Central Florida, USA'. *Geosciences*, 6(4), p.44.
- Church, J.A., Monselesan, D., Gregory, J.M. and Marzeion, B. (2013) 'Evaluating the ability of process based models to project sea-level change'. *Environmental Research Letters*, 8(1), p.014051.
- Cogo, N.P.; Moldenhauer, W.C.; and Foster, G.R. (1984) 'Soil loss reductions from conservation tillage practices'. *Soil Science Society America Journal* 48: 368-373.

- Connell, B.A. (2012) 'GIS-Based Streambank Video Mapping to Determine Erosion Susceptible Areas', *Master Thesis*, University of Tennessee.
- Conti, L.A, Araujo, C.A.S and Lignon, M.C. (2016) 'Spatial database modeling for mangrove forest mapping; example of two estuarine system in Brazil', *Modeling Earth System and Environment*, Vol.2, Issue.73.
- Coppin, P.R. and Bauer, M.E. (1996) 'Digital change detection in forest ecosystems with remote sensing imagery'. *Remote sensing reviews*, 13(3-4), pp.207-234.
- Couper, P.R. and Maddock, I.P. (2001) 'Subaerial river bank erosion processes and their interaction with other bank erosion mechanisms on the River Arrow, Warwickshire, UK'. *Earth Surface Processes and Landforms: The Journal of the British Geomorphological Research Group*, 26(6), pp.631-646.
- Dahdouh - Guebas, F. (2002) 'The Use of Remote Sensing and GIS in Sustainable Management of Tropical Coastal Ecosystem', *Environment, Development and Sustainability*, Vol.4, Issue.2, pp 93-112.
- Dasgupta, S., Laplante, B., Meisner, C., Wheeler, D. and Yan, J. (2007) 'The impact of sea level rise on developing countries: a comparative analysis.' The World Bank.
- Dasgupta, R and Shaw, R. (2013) 'Cumulative Impact of Human Intervention and Climate Change on Mangrove Ecosystem of South and Southeast Asia: An Overview', *Journal of Ecosystem*, pp.3-13.
- DiBiase, D. (2008) 'Nature of geographic information' (Vol. 9). Chapter.
- Duijsings, J.J.H.M. (1987) 'A sediment budget for a forested catchment in Luxembourg and its implications for channel development'. *Earth Surface Processes and Landforms*, 12(2), pp.173-184.
- Ehlers, M. and Welch, R. (1987) 'Stereo-correlation of Landsat TM images'.
- Ehlers, M. (1991) 'Multisensor image fusion techniques in remote sensing.' *ISPRS Journal of Photogrammetry and Remote Sensing*, 46(1), pp.19-30.
- Ehlers, M., Klonus, S., Johan Åstrand, P. and Rosso, P. (2010) 'Multi-sensor image fusion for pansharpening in remote sensing'. *International Journal of Image and Data Fusion*, 1(1), pp.25-45.
- Elfick, M. (1994) *Elementary Surveying*, 8th Edition., New York: Harper Collins
- Engel, F.L.; Bertol, I.; Ritter, S.R.; Paz González, A.; Paz-Ferreiro, J., and Vidal Vázquez, E. (2009) 'Soil erosion under simulated rainfall in relation to

- phenological stages of soybeans and tillage methods in Lages, SC, Brazil'. *Soil & Tillage Research* 103: 216- 221.
- El-Rabbany, A. (2002) 'Introduction to GPS: the global positioning system'. Artech house.
- FAO, "Global Forest Resources Assessment," *Country Report- Myanmar*, 2010.
- Fauzi, N.S.M., Misni, A., Kamaruddin, S.M. and Ahmad, P. (2017) 'The Content Analysis Study of Geo-Heritage Conservation: Kilim Karst Geoforest Park', Langkawi. *Environment-Behaviour Proceedings Journal*, 2(5), pp.255-262.
- Feller, I. C., & Sitnik, M. (1996). Mangrove ecology: a manual for a field course. *Smithsonian Institution, Washington, DC*, 1-135.
- Feng, Y., Li, Z., & Tokola, T. (2010). Estimation of stand mean crown diameter from high-spatial-resolution imagery based on a geostatistical method. *International Journal of Remote Sensing*, 31(2), 363-378.
- Flanigan, N.R (2004) 'People cause more soil than all-natural processes'. Retrieved from <https://news.umich.edu/people-cause-more-soil-erosion-than-all-natural-processes/>
- Flener, C., Vaaja, M., Jaakkola, A., Krooks, A., Kaartinen, H., Kukko, A., Kasvi, E., Hyypä, H., Hyypä, J. and Alho, P. (2013) Seamless mapping of river channels at high resolution using mobile LiDAR and UAV-photography. *Remote Sensing*, 5(12), pp.6382-6407.
- Florsheim, J.L, Mount, J.F and Chin A. (2008) 'Bank Erosion as a Desirable Attribute of Rivers', *Bioscience*, Vol. 58, No.6, pp 519-529. Available from: <www.biosciencemag.org>. [June 2008].
- Foody, G. M., Muslim, A. M., & Atkinson, P. M. (2005). Super-resolution mapping of the waterline from remotely sensed data. *International Journal of Remote Sensing*, 26(24), 5381-5392.
- Fonseca, M. and A. Malhotra. (2012) 'Boat wakes and their influence on erosion in the Atlantic Intracoastal Waterway, North Carolina'. *NOAA Technical Memorandum NOS NCCOS #143*. 24 p.
- Foster, G.R. and L.D. Meyer. (1972) 'Transport of soil particles by shallow flow'. *Transactions of the American Society of Agricultural Engineers* 15: 99-102.
- Foster, W. (2010) 'The Relationship of Streambank Angles and Shapes of Streambank Erosion Rates in the Little River Watershed, Tn, University of Tennessee, Trace':*Tennessee Research and Creative Exchange*.

- Ganasri, B.P and Ramesh, H. (2016) 'Assesment of soil erosion by RUSLE model using remote sensing and GIS- A case study of Nethravathi Basin', *Journal of Geoscience Frothiers* 7, pp. 953- 961.
- Geoimage (2017) 'Quickbird', Available from <<http://www.geoimage.com.au>> [19 May 2017].
- GGN. (2006). 'Guidelines and Criteria for National Geopark seeking UNESCO's assistance to join the Global Geopark Network'. UNESCO, *Division of Ecological and Earth Sciences*, 115 - 118.
- GGN. (2010). 'Guideline and Criteria for Canadian sites seeking Geopark designation within the Global Geopark Network (GGN)'. *Canadian Federation of Earth Science*.
- Ghimire, S.K., Higaki, D. and Bhattarai, T.P. (2013) 'Estimation of soil erosion rates and eroded sediment in a degraded catchment of the Siwalik Hills, Nepal'. *Land*, 2(3), pp.370-391.
- Green, T.R., Beavis, S.G., Dietrich, C.R. and Jakeman, A.J. (1999) 'Relating stream-bank erosion to in-stream transport of suspended sediment'. *Hydrological Processes*, 13(5), pp.777-787.
- Gourlay, T. (2011) 'Notes on shoreline due to boat wakes and wind waves', Centre for Marine Science and Technology (CMST), *Research Report* 2011-16.
- Guite, L.T.S and Bora, A. (2016) 'Impact of Riverbank Erosion on Land Cover in Lower Subansiri River Flood Plain', *International Journal of Scientific and Research Publications*, Vol.6, Issue.5, pp.480-486.
- Hackeloeer, A., Klasing, K., Krisp, J.M. and Meng, L. (2014) 'Georeferencing: a review of methods and applications'. *Annals of GIS*, 20(1), pp.61-69.
- Harrison, L.R., Legleiter, C.J., Wydzga, M.A. and Dunne, T. (2011) 'Channel dynamics and habitat development in a meandering, gravel bed river'. *Water Resources Research*, 47(4).
- Hassan, M.S, and Islam, S. M. (2016) 'Quantification of River Bank Erosion and Bar Deposition in Chowhali Upazila, Sirajgani District of Bangladesh: A Remote Sensing Study', *Journal of Geoscience and Environment Protection*, Vol. 4, pp.50-57.
- Hastaoglu, K.O. and Sanli, D.U. (2011) 'Monitoring Koyulhisar landslide using rapid static GPS: a strategy to remove biases from vertical velocities'. *Natural hazards*, 58(3), pp.1275-1294.

- Hastuti, E. D., & Budihastuti, R. (2016). Analysis on the Absolute Growth Rate of *Rhizophora mucronata* Seedling in Silvicultural Pond Canals by the Influence of Initial Condition and Changes of Environment Quality. *Biosaintifika: Journal of Biology & Biology Education*, 8(1), 56-63.
- Heenkenda, M. K., Joyce, K. E., & Maier, S. W. (2015). Mangrove tree crown delineation from high-resolution imagery. *Photogrammetric Engineering & Remote Sensing*, 81(6), 471-479.
- Hemery, G. E., Savill, P. S., & Pryor, S. N. (2005). Applications of the crown diameter–stem diameter relationship for different species of broadleaved trees. *Forest ecology and management*, 215(1-3), 285-294.
- Herbei, M.V., Ciolac, V., Şmuleac, A., Nistor, E. and Ciolac, L. (2010) ‘Georeferencing of topographical maps using the software ARCGIS’. *Research Journal of Agricultural Science*, 42(3), pp.595-606.
- Heshmati, M, Majid, N.M and Jusop, S. (2013) ‘Effects of Soil and Rock Mineralogy on Soil Erosion Features in the Merek Watershed, Iran’, *Journal of Geographic Information System*, Vol.5, Issue.3, pp. 248-257.
- Hirata, Y., Tabuchi, R., Patanaponpaiboon, P., Pongpam, S., Yoneda, R., & Fujioka, Y. (2014). Estimation of aboveground biomass in mangrove forests using high-resolution satellite data. *Journal of Forest Research*, 19(1), 34-41.
- Hofmann-Wellenhof, B., Lichtenegger, H. and Collins, J. (2012) ‘Global positioning system: theory and practice’. *Springer Science & Business Media*.
- Hogarth, P.J. (2001) ‘Mangroves and Global Climate Change’. *Ocean YB*, 15, p.331.
- Hooke, J.M. (1979) ‘An analysis of the processes of river bank erosion’. *Journal of Hydrology*, 42(1-2), pp.39-62.
- Houghton and Charman (1986) P.D. Houghton, P.E.V. Charman *Glossary of terms used in soil conservation Soil Conservation Service of N.S.W, USA* (1986)
- Holz, D.J., Williard, K.W., Edwards, P.J. and Schoonover, J.E. (2015) ‘Soil erosion in humid regions: a review’. *Journal of Contemporary Water Research & Education*, 154(1), pp.48-59.
- Horritt, M. S., Mason, D. C., Cobby, D. M., Davenport, I. J., & Bates, P. D. (2003). Waterline mapping in flooded vegetation from airborne SAR imagery. *Remote Sensing of Environment*, 85(3), 271-281.
- Hossam, M. A. (2015) ‘High Performance Hyperspectral Image Classification using Graphics Processing Units.’ *Master Degree Thesis*. Monash University.

- Huang, C., L.K. Wells, and L.D. Norton. (1999) 'Sediment transport capacity and erosion processes: Model concepts and reality'. *Earth Surface Processes and Landforms* 24: 503-516.
- McHarg, I. (1971). 'Man, Planetary Disease'. Vital Speeches of the Day (October). p. 634-640.
- Ibrahim, S.L and Ariffin, J. (2017) 'Riverbank Erosion Rates Prediction Incorporating Soil Erodibility and Soil Properties Relationship: Bernam River, Malaysia Case Study, 13th International Symposium on River Sedimentation, ISRS 2016.
- Im, J. and Jensen, J.R. (2005) 'A change detection model based on neighborhood correlation image analysis and decision tree classification'. *Remote Sensing of Environment*, 99(3), pp.326-340.
- Islam, M, S and Hoque, F. (2014) 'River Bank Erosion of the Surma River Due to Slope Failure', *International Journal of Research and Innovation in Earth Science*, Vol.1, Issue.2, pp.54-58.
- Jennings, S. B., Brown, N. D., & Sheil, D. (1999). Assessing forest canopies and understorey illumination: canopy closure, canopy cover and other measures. *Forestry: An International Journal of Forest Research*, 72(1), 59-74.
- Joy, T.J., G.R. Foster, and K.G. Renard (2002) 'Soil Erosion: Processes Prediction Measurement and Control'. *John Wiley and Sons Inc.*, New York, NY. Chap. 3. pp 55-77.
- JPS. (2018) 'Function of Department of Irrigation and Drainage'. Retrieved from [http:// www.water.gov.my/](http://www.water.gov.my/)
- Jusoff, K. (2013) 'Malaysian Mangrove Forest and Their Significance to the Coastal Marine Environment', *Pol. J. Environ. Stud*, Vol. 22, No. 4, pp. 979-1005.
- Kang, T., Kimura, I. and Shimizu, Y. (2018) 'Responses of Bed Morphology to Vegetation Growth and Flood Discharge at a Sharp River Bend'. *Water*, 10(2), p.223.
- Karnatak, H.C, Saran S, Bhatia.K and Roy, P. S. (2017) 'Multimedia Spatial decision analysis in web GIS environment', *Journal of Geoinformatica*, Vol.11, Issue.4, pp.407-429.

- Karthik A. and Brindha G. (2016) 'Green revolution conversion of offline education to online education', *International Journal of Pharmacy and Technology*, v-8, i-3, pp-15393-15407
- Katz, D. (2016) 'What a Surveyor Needs to know to Start Mapping by Drone: Making Value from Drone Deliverables', Available from :<<http://www.aerotas.com>>. [20 May 2017].
- Keuchel, J., Naumann, S., Heiler, M. and Siegmund, A. (2003) 'Automatic land cover analysis for Tenerife by supervised classification using remotely sensed data'. *Remote sensing of environment*, 86(4), pp.530-541.
- Khadir, N.A.A. (2015) 'Investigation on the Impact of Boat Wakes to Mangrove Degradation', *Bachelor Degree Dissertation*, Universiti Teknologi Petronas.
- Khan, I, Ahammad, M and Sarker. S. (2014) 'A study on River Bank Erosion of Jamuna River using GIS and Remote Sensing Technology', *International Journal of Engineering Development and Research*, Vol.2, Issue.4, pp.3365-3371.
- Khorsandi, H, Faghiri, G, A and Asadzadeh, A. (2002) 'The Rate of Bank Erosion of Mendearing Rivers', *Water Resource Research*, Volume.38, Issue.9, pp.2-21.
- Kitaya, Y., Jintana, V., Piriyaiotha, S., Jaijing, D., Yabuki, K., Izutani, S., ... & Iwasaki, M. (2002). Early growth of seven mangrove species planted at different elevations in a Thai estuary. *Trees*, 16(2-3), 150-154.
- Klibbe, C. A. (2010). An investigation on the high water mark as a land boundary.
- Korhonen, L., Korhonen, K. T., Rautiainen, M., & Stenberg, P. (2006). Estimation of forest canopy cover: a comparison of field measurement techniques.
- Kuhn, N.J., Armstrong, E.K., Ling, A.C., Connolly, K.L. and Heckrath, G. (2012) 'Interrill erosion of carbon and phosphorus from conventionally and organically farmed Devon silt soils'. *Catena* 91: 94–103.
- LADA (2014). 'Geopark'. Retrieved from <http://www.lada.gov.my/v2/en/product/geopark.html>
- LADA. (2018). 'LADA Profile.' Retrieved from <https://www.lada.gov.my/index.php/mengenai-kami/produk/langkawi-unesco-global-geopark>.
- Laderoute, L. and Bauer, B. (2013) 'River Bank Erosion and Boat Wakes Along the Lower Shuswap River, British Columbia'. *Final project report submitted to the Regional District of North Okanagan Fisheries and Oceans Canada*.

- Lamaro, E., Stokes, R., & Taylor, M. P. (2007). Riverbanks and the law: The arbitrary nature of river boundaries in New South Wales, Australia. *The Environmentalist*, 27(1), 131-142.
- Lane E W. (1957) 'A study of the shape of channels formed by natural streams flowing in erodible material'. M. R. D. Sediment Series No. 9, U. S. Army Engineering Division, Missouri River, *Corps of Engineers*.
- Langley, S.K., Cheshire, H.M. and Humes, K.S. (2001) 'A comparison of single date and multitemporal satellite image classifications in a semi-arid grassland'. *J Arid Environ* 49:401–11.
- Lawler, D. M. (1992) 'Design and installation of a novel automatic erosion monitoring system', *Earth Surface Processes and Landforms*, 17 (5): 455, Bibcode:1992ESPL...17..455L, doi:10.1002/esp.3290170505.
- Lawler, D. M. (1993) 'The measurement of river bank erosion and lateral channel change: A review" (PDF). *Earth Surface Processes and Landforms*. 18: 777–821 – via Research Gate.
- Lawler, D.M., Couperthwaite, J., Bull, L.J. and Harris, N.M. (1997) 'Bank erosion events and processes in the Upper Severn basin'. *Hydrology and Earth System Sciences Discussions*, 1(3), pp.523-534.
- Lee, P. (2015) 'Mangrove Forest Disappearing'. The Star Online 14 March. Available from: <<http://www.thestar.com.my>>. [18 March 2017].
- Lee, I.S. and Ge, L. (2006) 'The performance of RTK-GPS for surveying under challenging environmental conditions'. *Earth, planets and space*, 58(5), pp.515-522.
- Legat, K., (2006) 'Approximate direct geo-referencing in national coordinates'. *ISPRS Journal of Photogrammetry and Remote Sensing*, 60(4), pp.239-255.
- Leman, M. S. (2010) 'Geo-heritage Conservation in Langkawi Geopark, Malaysia', *Akademika* 80 (December) 2010, pp.19-30.
- Le Moigne, J., Netanyahu, N.S. and Eastman, R.D. eds. (2011) 'Image registration for remote sensing'. *Cambridge University Press*.
- Leopold, L.B. and Wolman, M.G. (1957) 'River channel patterns: braided, meandering, and straight'. US Government Printing Office.
- Leopold, L.B., Wolman, M.G. & Miller, J.P. (2012) 'Fluvial processes in geomorphology'. Courier Corporation.

- Lewin, J. and Brewer, P.A. (2001) 'Predicting channel patterns'. *Geomorphology*, 40(3-4), pp.329-339.
- Li, Y. and Briggs, R. (2012) 'An automated system for image-to-vector georeferencing'. *Cartography and Geographic Information Science*, 39(4), pp.199-217.
- Li, M., Chen, Z., Finlayson, B., Wei, T., Chen, J., Wu, X., Xu, H., Webber, M., Barnett, J. and Wang, M. (2015) 'Water diversion and sea-level rise: potential threats to freshwater supplies in the Changjiang River estuary'. *Estuarine, Coastal and Shelf Science*, 156, pp.52-60.
- Lillesand, T.M. and Kiefer, R.W. (1994) 'Remote sensing and photo interpretation'. *John Wiley and Sons: New York*, p.750.
- Lillesand, T.M. and Kiefer, R.W. (2000) 'Remote Sensing and Image Interpretation', *Wiley & Sons. New York*, p.724.
- Liu, X., Xia, J. C., Wright, G., & Arnold, L. (2014). A state of the art review on high water mark (HWM) determination. *Ocean & Coastal Management*, 102, 178-190.
- Longoni, L, Papini, M, Brambilla, D, Barazetti, L, Roncoroni, F, Scaioni, M and Ivanov, V.I. (2016) 'Monitoring Riverbank Erosion in Mountain Catchment Using Terrestrial Laser Scanning', *Remote Sensing*, Vol.8, Issue.241.
- Lufafa, A., Tenywa, M.M., Isabirye, M., Majaliwa, M.J.G. and Woomer, P.L. (2003) 'Prediction of soil erosion in a Lake Victoria basin catchment using a GIS-based Universal Soil Loss model'. *Agricultural systems*, 76(3), pp.883-894.
- Marfai, M.A, King, L, Sartohadi, J, Sudrajat, Budiani, S.R and Yulianto, S.R (2008) 'The impact of tidal flooding on a coastal community in Semarang, Indonesia', *The Environment*, Vol. 28, Issue.3, pp.237-248.
- Mason, D. C., & Garg, P. K. (2001). Morphodynamic modelling of intertidal sediment transport in Morecambe Bay. *Estuarine, Coastal and Shelf Science*, 53(1), 79-92.
- Maynard, S. (2001) 'Boat waves on Johnson Lake and Kenai River, Alaska'. *Technical Report U.S. Army Corps of Engineers*. (No. ERDC/CHL-TR-01-31).
- McCloskey, T.A. and Liu, K.B. (2013) 'Sedimentary history of mangrove cays in Turneffe Islands, Belize: evidence for sudden environmental reversals'. *Journal of Coastal Research*, 29(4), pp.971-983.

- McConcie, J.A and Toleman, I.E.J (2003) 'Boat wakes as a cause of riverbank erosion: A case study from the Waikato River, New Zealand', *Journal of Hydrology* (NZ), Vol.42, Issue.2, pp.163-179.
- Miall, A.D. (1981) 'Analysis of fluvial depositional systems'.
- Mitra, S.K. (1999) 'Digital signal processing laboratory using MATLAB'. WCB/McGraw-Hill.
- Mohamad, N., Khanan, M.F.A., Musliman, I.A., Kadir, W.H.W., Ahmad, A., Rahman, M.Z.A., Jamal, M.H., Zabidi, M., Suaib, N.M., and Zain, R.M. (2017) 'Riverbank erosion mapping using high resolution satellite image and unmanned aerial vehicle (UAV) approach'. In *Proceeding of the 1st International Undergraduate and Postgraduate Students Conference on Marine Science, Technology and Management, Kuala Terengganu*, pp. 211-222.
- Mohamad, N., Khanan, M.F.A., Musliman, I.A., Kadir, W.H.W., Ahmad, A., Rahman, M.Z.A., Jamal, M.H., Zabidi, M., Suaib, N.M. and Zain, R.M. (2018) 'Spatio-temporal analysis of river morphological changes and erosion detection using very high resolution satellite image', In *IOP Conference Series: Earth and Environmental Science* (Vol. 169, No. 1, p. 012020). IOP Publishing.
- Mohd Ekhwan, T. (2003) 'Channel geometry change response to flow regulation on the Langat River', In *Proceedings Seminar on Society, Space and Environment in a Globalised World* (pp. 29-30).
- Mollah, T.H and Ferdaush, J. (2015) 'Riverbank Erosion, Population Migration and Rural Vulnerability in Bangladesh: A Case Study on Kazipur Upazila at Siragonj District', *Environment and Ecology Research*, Vol.3, Issue.5, pp.125-131.
- NAHRIM, and NRE. (2015). 'The Study on Riverbank Erosion Due to Shipwake at Kilim Geoforest Park, Langkawi. Malaysia': NAHRIM.
- Nancy D. G. (2004) 'Erosion and Scour', *Stream hydrology: an introduction for ecologists*, ISBN 978-0-470-84357-4
- Nath, B, Naznin, S.N and Alak, P. (2013) 'Trend Analysis of River Bank Erosion at Chandpur, Bangladesh: A Remote Sensing and GIS Approach', *International Journal of Geomatics and Geoscience*, Vol.3, No.3.
- Natural Resources and Water. (2006) 'What causes bank erosion?' Government of Australia, Available from: <<https://www.qld.gov.au>>. [20 May 2017].

- Neuendorf, K. K. E., J. P. Mehl Jr., and Jackson, J.A. (2005), 'Glossary of Geology', Am. Geol. Inst., Alexandria, Va.
- Oh, J., Lee, W.H., Toth, C.K., Grejner-Brzezinska, D.A. and Lee, C. (2010) 'A piecewise approach to epipolar resampling of pushbroom satellite images based on RPC', *Photogrammetric Engineering & Remote Sensing*, 76(12), pp.1353-1363.
- Oltmanns, S.O, Marzloff, I, Peter, K.D and Ries. (2012) 'Unmanned Aerial Vehicle (UAV) for Monitoring Soil Erosion in Morocco', *Remote Sensing*, Vol.4, pp.3391-2316.
- Onrizal, Ahmad, AG and Mansor, M. (2017) 'Assessment of Natural Regeneration of Mangrove Species at Tsunami Affected Areas in Indonesia and Malaysia', *Proceeding of 1st Annual Applied Science and Engineering Conference*, pp 1-6.
- Padminii K., Venkatramaraju D., and Brindha G. (2016) 'A Study on Quality of Women Employees in Medical Transcription', *Journal of Health Management*, v-18, i-1, pp-13-20
- Paliwal, M.C. and Katiyar, S.K. (2015) 'Accuracy Assessment of Land Cover/Land Use Mapping Using Medium Resolution Satellite Imagery'.
- Pandey, A., Chowdary, V.M. and Mal, B.C. (2007) 'Identification of critical erosion prone areas in the small agricultural watershed using USLE, GIS and remote sensing'. *Water resources management*, 21(4), pp.729-746.
- Parnell, K.E, Mcdonald, S.C and Burke, A. E. (2007), 'Shoreline Effect of Vessel Wakes, Marlborough Sounds, New Zealand, *Journal of Coastal Research*, Vol.50, pp.502- 506.
- Parua, R. (2002) 'Fluvial geomorphology of the river Ganga around Farakka.' *Journal of the Institution of Engineers. India. Civil Engineering Division*, 82(FEV), pp.193-196.
- Peggion, M, Masera, M and Atzori, A. (2008) 'Publish GIS map on the web: The Implementation of the ArcGIS Server', *JRC Sceintific and Technical Reports*, pp.1- 47.
- Prasannakumar, V., Vijith, H., Abinod, S. and Geetha, N. (2012) 'Estimation of soil erosion risk within a small mountainous sub-watershed in Kerala, India, using Revised Universal Soil Loss Equation (RUSLE) and geo-information technology'. *Geoscience Frontiers*, 3(2), pp.209-215.

- Pouliot, D. A., King, D. J., Bell, F. W., & Pitt, D. G. (2002). Automated tree crown detection and delineation in high-resolution digital camera imagery of coniferous forest regeneration. *Remote sensing of environment*, 82(2-3), 322-334.
- Prenzel, B. (2004) 'Remote sensing-based quantification of land-cover and land-use change for planning'. *Progress in planning*, 4(61), pp.281-299.
- Punwong, P., Marchant, R. and Selby, K. (2013) 'Holocene mangrove dynamics and environmental change in the Rufiji Delta, Tanzania'. *Vegetation history and archaeobotany*, 22(5), pp.381-396.
- Qain, N. (1985) 'On the classification and causes of formation of different channel patterns'. *Acta Geographica Sinica*, 40(1): 1-10
- Qian N, Zhang R, and Zhou Z. (1987) 'Channel Bed Evolution'. *Beijing: Science Press*, 584.
- Rahman, M.A.A. and Asmawi, M.Z., 2016. Local residents' awareness towards the issue of mangrove degradation in Kuala Selangor, Malaysia. *Procedia-Social and Behavioural Sciences*, 222, pp.659-667.
- Richards, J.A. and Jia, X. (2006) 'Image classification methodologies'. *Remote Sensing Digital Image Analysis: An Introduction*, pp.295-332.
- Rinaldi, M and Darby, S.E. (2008) 'Quantification of riverbank erosion and application in risk analysis', *Natural Hazards*, Vol.69, Issue.1, pp.869-887.
- Robinson, D.A. and Blackman, J.D. (1990) 'Some costs and consequences of soil erosion and flooding around Brighton and Hove, autumn 1987. In Soil erosion on agricultural land'. *Proceedings of a workshop sponsored by the British Geomorphological Research Group, Coventry, UK, January 1989*. (pp. 369-382). John Wiley & Sons Ltd.
- Rose, C.W., 1960. 'Soil detachment caused by rainfall'. *Soil Science*, 89(1), pp.28-35.
- Roslan, Z.A, Naimah, Y and Roseli, A. (2013) 'River Bank Erosion Risk Potential With Regard to Soil Erodibility', *WIT Transaction of Ecology and the Environment*, Vol.172, pp. 289-297.
- Ryu, J. H., Won, J. S., & Min, K. D. (2002). Waterline extraction from Landsat TM data in a tidal flat: a case study in Gomso Bay, Korea. *Remote sensing of Environment*, 83(3), 442-456.

- Savat, J. Poesen. (1981) 'Detachment and transport of loose sediments by raindrop splash. Part I. The calculation of absolute data on detachability and transportability'. *Catena* 8: 1–17.
- Schowengerdt, R.A. (2006) 'Remote sensing: models and methods for image processing'. Elsevier.
- Schumm, S.A. and Khan, H.R. (1972) 'Experimental study of channel patterns'. *Geological Society of America Bulletin*, 83(6), pp.1755-1770.
- Shahbudin, S.A and Kamaruzzaman, B.Y. (2011) 'Impact of Coastal Development on Mangrove Cover in Kilim River, Langkawi Island, Malaysia', *Journal of Forestry Research*, pp:185-190.
- Singer, M.J. and Munns, D.N. (1991) 'Soils: an introduction' (No. Ed. 2). Macmillan Publishing Company.
- Sisman, Y. (2014) 'The optimization of GPS positioning using response surface methodology'. *Arabian Journal of Geosciences*, 7(3), pp.1223-1231.
- Sisodia P.S, Tiwari V and Kumar A. (2014) 'Analysis of Supervised Maximum Likelihood Classification for Remote Sensing Image', *In Recent Advances and Innovations in Engineering (ICGRE)*, 2014 May 9 (pp 1-4). IEEE.
- Skaloud, J. and Legat, K. (2008) 'Theory and reality of direct geo-referencing in national coordinates'. *ISPRS Journal of Photogrammetry and Remote Sensing*, 63(2), pp.272-282.
- Song, C., Dickinson, M. B., Su, L., Zhang, S., & Yaussey, D. (2010). Estimating average tree crown size using spatial information from Ikonos and QuickBird images: Across-sensor and across-site comparisons. *Remote sensing of environment*, 114(5), 1099-1107.
- Sorenson, R.M. (1973) 'Water waves produced by ships'. *Journal of the Waterways Harbors and Coastal Engineering Division: proceedings of the American Society of Civil Engineers* 99: 245-256.
- Stumbo, S., K. Fox, F. Dvorak, and L. Elliot. (1999) 'The prediction, measurement, and analysis of wake wash from marine vessels'. *Marine Technology* 36: 248-260.
- Suhardiman, A., Tsuyuki, S., & Setiawan, Y. (2016). Estimating mean tree crown diameter of mangrove stands using aerial photo. *Procedia Environmental Sciences*, 33, 416-427.

- Sui-ji, W. and Jin-ren, N. (2002) 'Straight river: its formation and specialty'. *Journal of Geographical Sciences*, 12(1), pp.72-80.
- Sulaiman M.S, Sinnakaudan S.K, and Shukor M.R (2013) 'Near bed turbulence measurement with acoustic doppler velocimeter' (ADV). *KSCE J Civ Eng* 17(6):1515–1528
- Takebayasyi, H, Fujita, M and Harsanto, P. (2010) 'Bank Erosion Model along Banks Composed of both Cohesive and Non-Cohesive Material Layers', *Annual of Disaster Previous Research Institute of Kyoto University*, Vol.53.
- Tampanya, U, Vermaat, J.E, Sinsakul, S and Panapitukkul, N. (2006) 'Coastal erosion and mangrove propagation of Southern Thailand', *Estuarine Coastal and Shelf Science*, pp.75-85.
- Tampubolon, W and Reinhardt, W. (2015) 'UAV Data Processing for Rapid Mapping Activities', *The International Archives of the Photogrammetry, Remote Sensing and Spatial Information Sciences*, Volume XL-3/W3, 2015, pp.371-377.
- Thakur, P.K., Laha, C. and Aggarwal, S.P. (2012) 'River bank erosion hazard study of river Ganga, upstream of Farakka barrage using remote sensing and GIS'. *Natural Hazards*, 61(3), pp.967-987.
- The Cooperative of Kilim Village Community Langkawi Limited. (2017) 'Kilim Geoforest Park'. Available from: < <https://kilimgeoforestpark.com> >. [19 May 2017].
- The Green Blue. (2009), 'Boat Wash and Boat Erosion'. Pamphlet. Retrieved from <http://www.the.greenblue.org.uk>.
- Thomas, C., Ranchin, T., Wald, L. and Chanussot, J. (2008) 'Synthesis of multispectral images to high spatial resolution: A critical review of fusion methods based on remote sensing physics'. *IEEE Transactions on Geoscience and Remote Sensing*, 46(5), pp.1301-1312.
- Thorne, C.R. (1978) 'Historical Research: An Observation'. *Journal of History of Behavioral Science*. Vol.14, 55-56.
- Thorne, C.R. (1981) 'Field measurements of rates of bank erosion and bank material strength'. *Erosion and sediment transport measurement*, pp.503-512.
- Thorne, C.R. (1982) 'Processes and mechanisms of river bank erosion'. In 'Gravel-Bed Rivers: Fluvial Processes', *Engineering and Management*'. (Eds RD Hey, JC Bathurst and CR Thorne.) pp. 227–272.

- Trush, W.J., McBain, S.M. and Leopold, L.B. (2000) 'Attributes of an alluvial river and their relation to water policy and management'. *Proceedings of the National Academy of Sciences*, 97(22), pp.11858-11863.
- Torikul, M.H., Farjana, S. and Mujtaba, S.M. (2015) 'Climate Change, Natural Disaster and Vulnerability to Occupational Changes in Coastal Region of Bangladesh'. *J Geogr Nat Disast*, 5(134), pp.2167-0587.
- Toriman, M.E, Yusop, Z. M, M and Juahir, H. (2006) 'Application of GIS for Detecting Changes of Sungai Langat Channel', *Malaysian journal of Civil Engineering*, Vol.18, No.1.
- Toriman, M. E, Abdullah, M. Pauzi and Mokhtar, M. (2010) 'Surface Erosion and Sediment Yield Assessment from Small Ungauged Catchment of Sungai Anak Bangi', *The Malaysian Journal of Analytical Sciences*, Vol.14, Issue.1, pp.12-23.
- Tou, J.T. and Gonzalez, R.C. (1974) 'Pattern recognition principles.'
- Tsui, J.B.Y. (2005) 'Fundamentals of global positioning system receivers: a software approach' (Vol. 173). *John Wiley & Sons*.
- Tusat, E. (2018) 'A Comparison of the Accuracy of VRS and Static GPS Measurement Results for Production of Topographic Map and Spatial Data: A Case Study on CORS-TR'. *Tehnički vjesnik*, 25(1), pp.158-163.
- Tyler, L. (2014) 'Trouble in Paradise: Langkawi struggles to hold onto UNESCO Geopark status', *Post Megazine*, 23 August. Available from: <<http://www.scmp.com>>. [19 May 2017].
- Umitsu, M., Tanavud, C. and Patanakanog, B. (2007) 'Effects of landforms on tsunami flow in the plains of Banda Aceh, Indonesia, and Nam Khem, Thailand'. *Marine geology*, 242(1-3), pp.141-153.
- UNESCO. (2016) 'UNESCO Global Geoparks. Earth Science'. Retrieved from <http://www.unesco.org/new/en/natural-sciences/environment/earth-sciences/unescoglobal-geoparks/>
- Uddin, K., Shrestha, B. and Alam, M.S. (2011) 'Assessment of morphological changes and vulnerability of river bank erosion alongside the river Jamuna using remote sensing.' *Journal of Earth Science and Engineering*, 1(1).
- Venkatraman S and Anitha K. (2017) 'Application of GIS and GPS in Civil Engineering.' *International Journal of Pure and Applied Mathematics*. Vol.116, No.14 1-7

- Vijayalatha S., and Brindha G. (2016) 'Emerging employee retention strategies in it industry', *International Journal of Pharmacy and Technology*, v-8, i-2, pp-12207-12218
- Vinh, B.T and Truong, N.H (2012) 'Erosion Mechanism of Nga Bay Riverbanks, Ho Chi Minh City, Vietnam', *ASEAN Engineering Journal Part C*, Vol.3, No.2, pp. 132-141.
- Waycott, M., McKenzie, L., Mellors, J. E., Ellison, J. C., Sheaves, M. T., Collier, C., ... & Payri, C. E. (2011). Vulnerability of mangroves, seagrasses and intertidal flats in the tropical Pacific to climate change. Secretariat of the Pacific Community.
- Wei, W., Chen, L., Fu, B., Huang, Z., Wu, D. and Gui, L. (2007) 'The effect of land uses and rainfall regimes on runoff and soil erosion in the semi-arid loess hilly area, China'. *Journal of hydrology*, 335(3-4), pp.247-258.
- Wolman, M.G. (1959) 'Factors influencing erosion of a cohesive river bank'. *American Journal of Science*, 257(3), pp.204-216.
- Wong, A. and Clausi, D.A. (2007) 'ARRSI: Automatic registration of remote-sensing images'. *IEEE Transactions on Geoscience and Remote Sensing*, 45(5), pp.1483-1493.
- Wu, Y and Cheng, H. (2005) 'Monitoring of gully erosion on the Loess Plateau of China using a global positioning system', *Catena*, Vol.63, pp.154-166.
- Wynn, T. (2006) 'Streambank Retreat: A Primer', *AWRA Hydrology and Watershed Management Technical Committee*, Vol.4, Issue 1, pp. 1-14.
- Yue-Qing, X., Xiao-Mei, S., Xiang-Bin, K., Jian, P. and Yun-Long, C. (2008) 'Adapting the RUSLE and GIS to model soil erosion risk in a mountains karst watershed, Guizhou Province, China'. *Environmental monitoring and assessment*, 141(1-3), pp.275-286.
- Yuksel, A., Gundogan, R. and Akay, A.E. (2008) 'Using the remote sensing and GIS technology for erosion risk mapping of Kartalkaya dam watershed in Kahramanmaras, Turkey'. *Sensors*, 8(8), pp.4851-4865.
- Yousefi, S., Mirzaee, S., Keesstra, S., Surian, N., Pourghasemi, H.R., Zakizadeh, H.R. and Tabibian, S. (2018) 'Effects of an extreme flood on river morphology (case study: Karoon River, Iran)'. *Geomorphology*, 304, pp.30-39.

- Yusoff, N and Abidin, R. Z. (2013) 'Riverbank Erosion Risk with Regard to Rainfall Erosivity', *Infrastructure University Kuala Lumpur Research Journal*, Vol.1, Issue.1, pp. 46-5.
- Yusuf, Y., Sri Sumantyo, J.T. and Kuze, H. (2013) 'Spectral information analysis of image fusion data for remote sensing applications'. *Geocarto International*, 28(4), pp.291-310.
- Zabawa, C. & C. Ostrom. (1980) 'The role of boat wakes in shoreline erosion in Anne Arundel County, Maryland'. *Final Report to the Coastal Resources Division, Maryland Department of Natural Resources*.
- Zhao, B., Guo, H., Yan, Y., Wang, Q., & Li, B. (2008). A simple waterline approach for tidelands using multi-temporal satellite images: a case study in the Yangtze Delta. *Estuarine, Coastal and Shelf Science*, 77(1), 134-142.
- Zhang, T. & Xu, X. (2012) 'A new method of seamless land navigation for GPS/INS integrated system'. *Measurement*, 45(4), pp.691-701.
- Zhang, X., Jin, S. & Lu, X. (2017) 'Global Surface Mass Variations from Continuous GPS Observations and Satellite Altimetry Data'. *Remote Sensing*, 9(10), p.1000.