

SEAFLOOR MAPPING USING MULTIBEAM SONAR

SHHRIN AMIZUL BIN SAMSUDIN

UNIVERSITI TEKNOLOGI MALAYSIA

SEAFLOOR MAPPING USING MULTIBEAM SONAR

SHHRIN AMIZUL BIN SAMSUDIN

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

Razak Faculty of Technology and Informatics
Universiti Teknologi Malaysia

DECEMBER 2020

DEDICATION

This thesis is dedicated to my parents and my beloved family,

Zerin, Ayra, Afia...

ACKNOWLEDGEMENT

I would like to express my deepest appreciation to my main thesis supervisor, Dr Rozaimi Che Hasan, for his encouragement, guidance, critics and friendship. I am also indebted to Centre for Coastal and Ocean Engineering (COEI), Universiti Teknologi Malaysia (UTM) for their support, guidance, and advice throughout this study.

I would also like to thank the National Hydrographic Centre (NHC) and the Department of Survey and Mapping Malaysia (DSMM) for the acoustic data collection. Thanks to Universiti Teknologi Malaysia for sponsoring the research fund through Research University Grant (RUG) vot. no. 11H41- 'Acoustic Classification Tool for Automatic Seabed Segmentation'. Last but not least, I would also like to thank Acburn Marine Automations Sdn. Bhd. and Kongsberg Maritime for providing the multibeam echosounder system. Thanks to First Admiral Dr. Najhan Md Said RMN for giving us the opportunity to join the acoustic mapping research expedition and to all crews of Bot Hidrografi 2 (BH2) for their help during the acoustics data acquisition.

ABSTRACT

Seafloor habitat and its marine community have greatly affected by anthropogenic pressures from various human activities. Efforts to conserve and manage the marine habitat are challenging due to the difficulty to get the details of the seafloor data. Attention has been focused towards the multibeam echo sounder system (MBES), a tool in mapping the seafloor habitats, due to its ability to produce a detailed seafloor map. The aim of this study is to utilize MBES output, namely the bathymetry, backscatter, and its derivatives in order to produce a seafloor habitat map using automated classification technique in Malaysian water. The objectives are: (i) to investigate the correlation between MBES backscatter image and signal-based method for seafloor sediment classification; (ii) to evaluate the importance of bathymetry and its derivatives in producing coral reef classification map; (iii) to perform automated technique in producing the coral reef classification map, and finally (iv) to assess the accuracy of the coral reef classification maps constructed from the techniques above. The study was conducted in two different locations: Sembilan Island, Perak and Tawau, Sabah. The results of the data reduction analysis using the Principal Component Analysis (PCA), Linear Pearson Correlation, and variable importance analysis showed four most significant derivative layers for the production of coral reef classification map were identified: (i) bathymetry, (ii) benthic position index (BPI), (iii) slope, and (iv) grey level co-occurrence matrices (GLCM) mean. The classification map constructed with the selected MBES derivatives using four different techniques (Support Vector Machine, Neural Network, QUEST decision trees, and CRUISE decision trees) had shown an encouraging results with two classifiers achieved the accuracy of more than 70% (Support Vector Machine with 73.61% and Neural Network with 70.14%). In sum, this classification seafloor habitat map has enhanced coral reef spatial distribution information, and this finding has an important contribution to the seafloor habitat mapping in Malaysia.

ABSTRAK

Habitat dasar laut dan komuniti marin sangat dipengaruhi oleh tekanan antropogenik dari pelbagai aktiviti manusia. Usaha untuk memulihara dan mengurus habitat laut sangat mencabar kerana kesukaran untuk mendapatkan perincian data dasar laut. Perhatian telah tertumpu pada sistem pemerum gema berbilang alur (MBES), alat untuk memetakan habitat dasar laut, kerana kemampuannya untuk menghasilkan peta dasar laut yang terperinci. Tujuan kajian ini adalah untuk menggunakan data MBES iaitu batimetri, *backscatter* serta derivatifnya untuk menghasilkan peta habitat dasar laut menggunakan kaedah klasifikasi secara automatik di perairan Malaysia. Objektif kajian ini adalah: (i) untuk mengkaji korelasi antara kaedah imej *backscatter* MBES dan kaedah *signal-based* dalam menghasilkan klasifikasi sedimen dasar laut; (ii) untuk menilai kepentingan data batimetri dan derivatifnya dalam menghasilkan peta klasifikasi terumbu karang; (iii) untuk menggunakan teknik automatik dalam menghasilkan peta klasifikasi terumbu karang, dan yang terakhir (iv) untuk menilai ketepatan peta klasifikasi terumbu karang yang dihasilkan melalui kaedah di atas. Kajian ini dijalankan di dua lokasi berbeza; Pulau Sembilan, Perak dan Tawau, Sabah. Hasil analisis pengurangan data menggunakan *Principal Component Analysis* (PCA), *Linear Pearson Correlation* dan *variable importance analysis* menunjukkan empat lapisan derivatif yang paling signifikan dalam penghasilan peta klasifikasi terumbu karang telah dikenal pasti: (i) batimetri, (ii) *benthic position index* (BPI), (iii) cerun, dan (iv) *grey level co-occurrence matrices* (GLCM) *mean*. Peta klasifikasi terumbu karang yang dihasilkan dengan derivatif MBES yang terpilih menggunakan empat teknik yang berbeza (*Support Vector Machine*, *Neural Network*, *QUEST decision tree's* dan *CRUISE decision trees*) telah menunjukkan hasil yang memberangsangkan dengan dua jenis teknik klasifikasi mencapai ketepatan melebihi 70% (*Support Vector Machine* dengan 73.61% dan *Neural Network* dengan 70.14%). Secara keseluruhannya, peta klasifikasi habitat dasar laut ini telah meningkatkan maklumat taburan spatial terumbu karang, dan penemuan ini mempunyai sumbangan penting dalam pemetaan habitat dasar laut di Malaysia.

TABLE OF CONTENTS

	TITLE	PAGE
	DECLARATION	iii
	DEDICATION	iv
	ACKNOWLEDGEMENT	v
	ABSTRACT	vi
	ABSTRAK	vii
	TABLE OF CONTENTS	viii
	LIST OF TABLES	xi
	LIST OF FIGURES	xii
	LIST OF ABBREVIATIONS	xv
CHAPTER 1	INTRODUCTION	1
1.1	Introduction	1
1.2	Background of Problem	1
1.3	Problem Statement	5
1.4	Research Objectives	7
1.5	Research Question	8
1.6	Significance of the Research	9
1.7	Scope and Limitation of the Research	9
1.8	Organization of the Thesis	10
CHAPTER 2	LITERATURE REVIEW	11
2.1	Introduction	11
2.2	Marine Habitat	11
2.2.1	Coral Reef	12
2.3	Habitat Mapping	13
2.4	Multibeam Echosounder System	14
2.4.1	Bathymetry Data	15
2.4.2	Backscatter Data	15

	2.4.3 Advantages of MBES compared other techniques and equipment	17
2.5	Seafloor Habitat Mapping Classification technique	20
	2.5.1 Supervised Classification technique	21
2.6	Summary	23
CHAPTER 3	RESEARCH METHODOLOGY	24
3.1	Introduction	24
3.2	Study Area	26
3.3	Acoustic Data	27
	3.3.1 Acoustic Data Collection	28
	3.3.2 Acoustic Data Processing	30
	3.3.3 Secondary dataset/derivatives	31
3.4	Ground truth data collection	34
	3.4.1 Grab Sampler (Sediment)	35
	3.4.2 Underwater Video	36
	3.4.3 Sediment and Video Classification	37
3.5	Data Reduction analysis	37
	3.5.1 Principal component analysis (Backscatter)	38
	3.5.2 Linear Pearson correlation and Variable Importance (Bathymetry)	38
	3.5.3 Cross tabulation analysis	38
3.6	Production of coral reef habitat map (Supervised classification)	39
3.7	Accuracy Assessment	39
CHAPTER 4	DATA ANALYSIS AND DISCUSSION	42
4.1	Introduction	42
4.2	Multibeam backscatter data analysis	42
	4.2.1 Image based method	42
	4.2.1.1 GLCM texture extraction	43
	4.2.1.2 Data reduction using PCA	44
	4.2.1.3 Clustering	45
	4.2.2 Signal based method	49

4.2.2.1	Generating random ground truth points inside the study area	51	
4.2.3	Cross tabulation analysis	52	
4.3	Multibeam bathymetry data analysis	56	
4.3.1	Statistical analysis (data reduction)	58	
4.4	Coral reef habitat mapping and acoustic seafloor classification	60	
4.5	Accuracy assessment	65	
4.6	Discussion	67	
CHAPTER 5	CONCLUSION AND RECOMMENDATIONS	71	
5.1	Introduction	71	
5.2	Conclusion	71	
5.3	Recommendations for Future Work	72	
	REFERENCES		73
	LIST OF PUBLICATION		85

LIST OF TABLES

TABLE NO.	TITLE	PAGE
Table 2.1	Research Gap for Overall Mapping Equipment	19
Table 2.2	Research Gap for Multibeam Echosounder System	22
Table 3.1	General specification of WASSP WMB-3250 Multibeam Echosounder	28
Table 3.2	General specification of Kongsberg EM2040c Multibeam Echosounder	30
Table 3.3	Seafloor morphological variables from multibeam bathymetry grid	32
Table 3.4	Haralick texture layers from multibeam backscatter data	33
Table 3.5	Summary of Data Collection and Data Analysis	41
Table 4.1	The contributions of all principal component analysis (PCA) bands to total variance.	45
Table 4.2	Component matrix showing a correlation between rotated PCs and the original variables. Highest factor loads in each PC were highlighted in bold	45
Table 4.3	Cross tabulation between the GLCM Entropy cluster map and ground truth observations	53
Table 4.4	Cross tabulation between the GLCM Contrast cluster map and ground truth observations	53
Table 4.5	Cross tabulation between the GLCM Correlation cluster map and ground truth observations	54
Table 4.6	Cross tabulation between the GLCM Mean cluster map and ground truth observations	54
Table 4.7	Correlation of determination (R ²) using the linear Pearson correlation measure between all variables used in this study.	59

LIST OF FIGURES

FIGURE NO.	TITLE	PAGE
Figure 1. 1	(left) Abandoned anchor; (Right) Discarded net smothering corals in Pulau Sembilan (ReefCheck, 2012b)	7
Figure 2.1	Types of Coral Reef (www.coral-reef-info.com)	13
Figure 2.2	Figure illustrated simultaneous acquisition of (left) bathymetric data; (right) co-registered sonar imagery using MBES (Lurton, 2002)	15
Figure 2.3	Examples of surface scatter patterns at oblique incidence. (a) A smooth surface reflecting coherently the incidence wave; (b) A rough surface with a large fraction of acoustic energy scattered incoherently (Díaz, 2000)	16
Figure 2.4	Survey site in Pulau Agas: Left – MBES bathymetric data; Right – MBES backscatter mosaic	17
Figure 3.1	Overall Flow Chart	25
Figure 3.2	Map of first study area (Pulau Agas, Perak)	26
Figure 3.3	Map of the second study area (Tawau, Sabah). The inset map showed the location of the study area relative to the location of Malaysia	27
Figure 3.4	WASSP WMB-3250 Multibeam Echosounder Transducer	29
Figure 3.5	Kongsberg EM2040c Multibeam Echosounder Transducer	29
Figure 3.6	ARA sediment classes regroup into 4 major classes	31
Figure 3.7	Ground truth point locations in Pulau Sembilan	34
Figure 3.8	Van Veen Sediment Grab Sampler	35
Figure 3.9	Underwater Video Camera System	36
Figure 3.10	A Folk triangle classification (1954) of gravel-free sediments and sedimentary rocks (Folk, Andrews, & Lewis, 1970)	37

Figure 3.11	A number of training and validate ground truth dataset for each sediment types	40
Figure 4.1	Eight (8) Haralick texture layers derived from Multibeam Backscatter	44
Figure 4.2	GLCM Contrast Cluster Map	46
Figure 4.3	GLCM Correlation Cluster Map	47
Figure 4.4	GLCM Entropy Cluster Map	48
Figure 4.5	GLCM Mean Cluster Map	49
Figure 4.6	Classification map from FMGT software with 20 sediment classes	50
Figure 4.7	From 20 sediment classes regrouped into 4 major classes	51
Figure 4.8	Random ground truth point inside the study area	52
Figure 4.9	Per cluster sediment composition percentage for GLCM Correlation texture layer	54
Figure 4.10	Per cluster sediment composition percentage for GLCM Entropy texture layer	55
Figure 4.11	Per cluster sediment composition percentage for GLCM Contrast texture layer	55
Figure 4.12	Per cluster sediment composition percentage for GLCM Mean texture layer	56
Figure 4.13	Bathymetry data and derivatives used to characterise seafloor: a) bathymetry (depth), b) standard deviation of depth, c) slope, d) aspect, e) Sine of aspect (easting), f) Cosine of aspect (northing), g. terrain ruggedness (VRM), and h) curvature.	57
Figure 4.14	Bathymetry data and derivatives used to characterise seafloor: i. profile curvature, j. plan curvature, k. rugosity, l. bathymetric position index at 25 m, m. bathymetric position index at 35 m, and n. bathymetric position index at 45 m.	58
Figure 4.15	Variable importance analysis (result)	59
Figure 4.16	Four significance Multibeam derivatives for coral reef classification map	60
Figure 4.17	Coral reef classification map using Support Vector Machine (SVM)	61

Figure 4.18	Coral reef classification map using Neural Network Classifier (NNC)	62
Figure 4.19	Coral reef classification map using Quick, Unbiased and Efficient Statistical Tree (QUEST)	63
Figure 4.20	Coral reef classification map using Classification Rule with Unbiased Interaction Selection and Estimation (CRUISE)	64
Figure 4.21	Accuracy of coral reef classification map produced from each type of classifier	65
Figure 4.22	Kappa coefficient of coral reef classification map produced from each type of classifier	66
Figure 4.23	Individual class accuracy per classifier	66

LIST OF ABBREVIATIONS

MBES	-	Multibeam Echo Sounder System
PCA	-	Principal Component Analysis
GLCM	-	Grey Level Co-Occurrence Matrices
SVM	-	Support Vector Machine
NNC	-	Neural Network Classifier
QUEST	-	Quick, Unbiased and Efficient Statistical Tree
CRUISE	-	Classification Rule with Unbiased Interaction Selection and Estimation
UTM	-	Universiti Teknologi Malaysia
GIS	-	Geographic Information System
FMGT	-	Fledermaus Geocoder Tools
GPS	-	GPS Global Positioning
MRU	-	Motion Reference Unit
GIS	-	Geographic Information System
SBES	-	Single Beam Echo Sounder
WGS 84	-	World Geodetic System 1984

CHAPTER 1

INTRODUCTION

1.1 Introduction

The first chapter gave an outline of the objectives and general approach of this study, followed by a short literature review of the background of study related to similar topics. It gave a complete summary to the state of the art in the science of seafloor habitat mapping, ecosystem-based management, marine protected areas, and current technology to produce a seafloor habitat map. More specifically, this chapter also presented the statement of research problem, research question, scope of study and organization of the thesis.

1.2 Background of Problem

Habitat is generally defined as any places that can provide shelter and resources for living to survive. According to Davies and Young (2008), habitat can be identified as both physical and ecological environments that maintained a specific biological community within the society itself. The International Council for the Exploration of the Seas (ICES, 2006), had classified marine habitats as “particular environments differentiated by their abiotic features and related biological joints operating at specific but dynamic spatial and temporal ranges in an identifiable geographical field”. This definition obviously indicated that abiotic features and biotic assemblages were the two primary components in outlining a habitat. Abiotic features can be referred as non-living components that could affect the ecosystem such as substrate type, geomorphic features, spatial structure, and their hydrodynamic properties. Eventually, the species and the living organisms that inhabited a particular zone were recognised as biotic assemblages (Ismail, 2016). For instance, forests, swamps, and grazing land were some habitats on terrestrial land. On the contrary, marine habitats can be classified into four

categories which were coral reef, seagrass bed, mangrove, and seaweed meadow (Komatsu, 2011).

Seafloor habitat or commonly known as benthic habitat referred to marine communities that inhabiting the seafloor. Seafloor habitat varied largely relying upon their depth and area; frequently typified by primary structural characteristics and biological populations (LaFrance *et al.*, 2010). Seafloor habitats were crucial in sustaining a large diversity of life for many reasons. Their commonly known function was to provide spawning and nursery grounds for various fish species. Furthermore, they also played a crucial part in maintaining the quality of seawater by recycling the nutrient and eliminating the waste product from the water column. They also performed an essential role in each stage of marine ‘food-chain’ such as consuming phytoplankton and other small organisms, acting as food source for higher-level eaters or robustly preying on other species (Schelfaut, 2005).

To date, seafloor habitat and its community were significantly experiencing the anthropogenic tension from human activities for instance, the commercial uncontrolled fisheries, aggregated extraction, offshore oil and gas activities, marine shipping and vessel traffic, and the laying of submarine cables. Meanwhile, the awareness on seafloor conservation was increasing and management plans were being established accordingly, even outside the national waters (Barbier *et al.*, 2014; Ismail, 2016). According to Schmiing (2013), effective conservation and resource management were mandatory in maintaining the marine ecosystem services. In this standpoint, the ecosystem-based management (EBM) was the ideal strategy which integrated all the features and relationships within and among the ecosystems, coupled with human activities, rather than reviewing them separately (Leslie and McLeod, 2007; Katsanevakis *et al.*, 2011). Marine protected areas (MPAs) were the crucial elements of EBM and played an essential part in complementing the habitats and biodiversity, safeguarding threatened species, administering a sustainable usage of natural resources, and preserving significant historical sites (McNeely and Harrison, 1994). Hence, in order to geographically handle the ocean related activities and assign marine protected areas at crucial sites (Van Lancker and Van Heteren, 2013), a proper

seafloor habitat map was needed so as to supervise and restrain human activities from disturbing and altering the seafloor habitat.

Mapping seafloor habitat had become a dependable method in defining topography of the seafloor environment and distribution of the main features. It had turned into an essential tool to recognize the areas that required special marine management involvements such as the formation of marine protected areas and identification of significant fisheries habitats. According to Davies and Young (2008), ‘*habitat mapping*’ can be defined as: “*Plotting the dispersal and degree of habitats in order to build a comprehensive coverage map of the seabed with clear borders dividing adjoining habitats.*” Furthermore, it also emphasized that a habitat map is “*an assertion of our finest estimation of habitat dispersal at one point in time, utilizing the best available knowledge we had at that period of time*” (Verfaillie, 2008). Designation of the new marine protected areas (MPAs), marine spatial planning, along with the implementation of national and international legislation and guidelines were some examples of seafloor habitat map utilisation (Blæsbjerg *et al.*, 2009). Furthermore, the development of regional framework for marine planning demanded crucial inputs such as High-resolution bathymetric maps along with the seafloor characterisation habitats distribution.

Conventionally, data collection during marine survey only involved limited quantity of collected points. Conversely, the fast advancement of seafloor mapping technologies, geographic information system (GIS) methods, and data visualization have increasingly improved its efficiency. Numerous approaches had been established in order to utilise the information and provide as much accurate characterisation of the seafloor environment as possible, varying from immediate observations to remote sensing techniques (Hamana and Komatsu, 2016). Immediate observations were obtained from the in-situ methodologies such as scuba diving, sampling, coring, underwater photography, and video (Schimel *et al.*, 2010). It allowed the efficient local illustration of the seabed, albeit laborious and lengthy (Komatsu, 2003; Hamana and Komatsu, 2016). On the other hand, remote sensing approach can save more time with less manpower employed. Optical-based and hydro acoustics-based were the two sub classes obtained from remote sensing methodology which was adopted for seafloor

mapping purpose (Hamana and Komatsu, 2016). High-resolution satellite footage (Sagawa *et al.*, 2010; Yahya *et al.*, 2014), compact airborne spectrographic footage (e.g., airborne Portable Remote Imaging Spectrometer (PRISM)) (Phinn *et al.*, 2008), or Light Detection and Ranging (LiDAR) (Kotchenova *et al.*, 2004; Maltamo *et al.*, 2004; Hamana and Komatsu, 2016) were some models of optical remote sensing methodology that have been adopted in mapping the seafloor habitat. Similarly, the hydroacoustic remote sensing methods for instance, the single beam echo sounder, side scan sonars, and multibeam sonar utilised the transmission of acoustic sound wave above the water column and their reflected signals from the seafloor surface to map a wide-ranging seafloor area in the water up to several thousand metres deep (Dartnell and Gardner, 2004; McGonigle *et al.*, 2009; Brown *et al.*, 2011a; Huang *et al.*, 2012). Although optical remote sensing fitted the job of large-scale mapping, it had a restriction in which it was not applicable in the deep bottom or turbid waters, due to the decreased light in the water column. Albeit having the advantages for huge area mapping, the ability of the optical remote sensing was limited to shallow and clear water area as the light decreased within the water column. In addition, this methodology also possessed restrictions in identifying tiny, dispersed, or low-populated seafloor habitat caused by its territorial and radiometric resolution of the satellite visuals (Komatsu, 2003). On the contrary, hydroacoustic remote sensing has no restriction to be utilised in deeper or highly turbid waters (Komatsu, 2003).

In Comparison with all the hydroacoustic seafloor mapping systems available nowadays, a rising attention had recently been narrowed down towards the multibeam echosounder system (MBES). With its capability to produce diversified outputs such as bathymetry, backscatter, water-column data, and angular response which led to multiple methods available for producing the habitat and seafloor classification mapping (Schimel, 2011). A manifold classification methods fell into two wide classes which were the manual and automated classification (Stephens and Diesing, 2014). Each method demanded a distinct set of hydro-acoustic data in order to generate the classification habitat map. Recently, the requirements for computerized technologies had been emerging so as to speed up the analysis of geographical data from wide-ranging areas (Galparsoro *et al.*, 2015; Lucieer, 2008). The purpose of this study was to utilise the MBES acoustic data such as bathymetry, backscatter and its

derivatives in order to construct the seafloor habitat maps using automated classification techniques.

1.3 Problem Statement

A recent study showed that the research that adopted the Multibeam echosounder backscatter as the instrument in generating the habitat maps were still lacking in Malaysia (Mustajap *et al.*, 2015; Abdullah *et al.*, 2016). Moreover, data on the distribution of marine species and habitats were frequently limited, generally due to the complexity, surveying costs, and the time-consuming sampling as the sea areas covered were wide-ranging. Based on the literature (Salm *et al.*, 2000; ReefCheck, 2012a), majority of the seafloor habitat distribution mapping specifically the coral reef area still depended on the in-situ measurement techniques such as line intercept transect technique, sampling, underwater photography, and video (Brown and Coggan, 2007; Schimel *et al.*, 2010). The in-situ measurement techniques allowed the effective localised illustration of the seafloor, but it possessed restriction in covering the broad-scale map, thus putting high risks to the diver, despite being time-consuming and costly.

Conversely, present technology such as optical and hydroacoustic remote sensing offered a better alternative in terms of coverage for the broad-scale mapping compared to the in-situ measurement method, but the optical remote sensing technique was subjected to water transparency and irrelevant in highly turbid waters (Komatsu, 2003; Zoffoli *et al.*, 2014; Pandian *et al.*, 2009). Moreover, this technique was only efficient in the shallow water with the depth ranging between 0 to 15 m (Zoffoli *et al.*, 2014). Whilst the optical remote sensing was restricted to depth and water transparency, a hydroacoustic system such as the single beam echosounder, side scan sonar, and multibeam echosounder system provided another option to resolve this restriction. Single beam echosounder system was considered as the cheapest and simplest technique among hydro acoustic systems but it delivered low spatial resolution of depth data (Parnum *et al.*, 2009) and the output needed substantial interpolation as to produce seafloor maps with 100 % coverage (Kenny *et al.*, 2003).

Compared to the single beam echosounder system, side scan sonar system offered an improved alternative in terms of coverage for seafloor habitat mapping as it could provide an extensive and comprehensive area coverage with high resolution footages of the seafloor (Kenny *et al.*, 2003; Pandian *et al.*, 2009; Schimel, 2011), but this system only generated the seafloor image, without bathymetry data which was a crucial component in generating a complete seafloor habitat map. Among all the methodologies and mechanisms available for seafloor habitat mapping, multibeam echosounder system had shown significant strengths compared to the others. According to Micallef *et al.* (2012), in comparison with an in-situ methodology which was limited to small scale seafloor habitat mapping, multibeam echosounder system could offer continuous acoustic coverage of wide hallway of seafloor. In addition, multibeam echosounder system was similar to any other hydroacoustic systems which were not restricted by water depth and turbidity. The rapid development of marine acoustic technology for seafloor habitat mapping had enabled the echosounder system to match the other hydro acoustic mapping systems (e.g., single beam echosounder and side scan sonar system) as a preferable seafloor habitat mapping tool (Brown and Blondel, 2009; Micallef *et al.*, 2012). This was due to its ability in obtaining high-resolution bathymetric and backscatter data concurrently (Brown *et al.*, 2011b; Micallef *et al.*, 2012) which was an essential component of the seafloor habitat mapping production.

With the advancement in devices available for seafloor habitat mapping today, one of the primary coral reef areas in the West coast of Peninsular Malaysia, known as Pulau Sembilan had experienced a huge anthropogenic pressure as a result of tourism activities which required careful consideration and a complete seafloor habitat mapping so as to supervise the anthropogenic pressure on that valuable biodiversity area (Razak *et al.*, 2014). With unprotected status (ReefCheck, 2012b), tourism and fishing activities kept pressuring this area, which in future, would give negative effects on the health of the coral reefs within the islands, thus daunting their economic potential and ecological value. The latest seafloor habitat map of Pulau Sembilan was contributed by Reef Check Malaysia through the in-situ measurement approach conducted in January 2012. The purpose of this study was to utilise the multibeam echosounder acoustic data: bathymetry, backscatter, and its derivative in order to

construct the seafloor habitat maps for coral reef areas in Pulau Sembilan using the automated classification method.

The latest seafloor habitat maps of this area were required in order to monitor the changes in seafloor habitat caused by anthropogenic pressure. Figure 1.1 showed fishing activities that harmed the coral reefs in Pulau Sembilan.

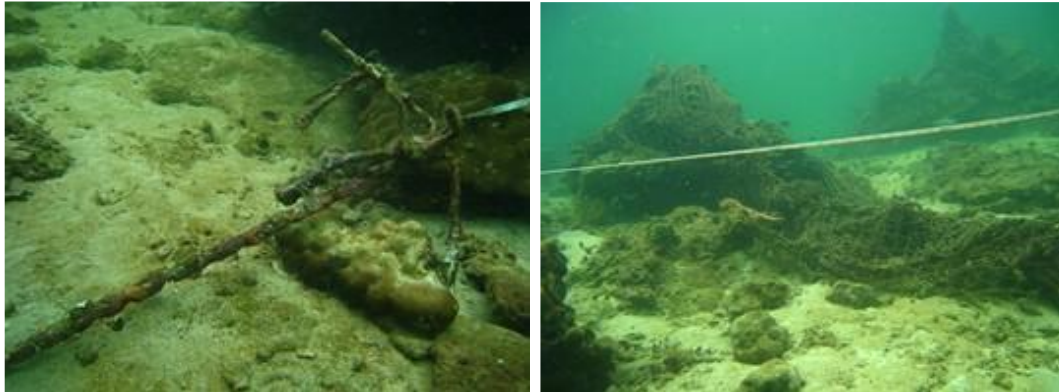


Figure 1. 1 (left) Abandoned anchor; (Right) Discarded net smothering corals in Pulau Sembilan (ReefCheck, 2012b)

1.4 Research Objectives

The aim of this study is to utilise MBES output which are bathymetry, backscatter, and its derivative in order to produce seafloor habitat maps by using automated classification technique in Malaysian water. For this study, there are a few objectives that needed to be accomplished:

- 1) To investigate the correlation between MBES backscatter image and signal-based method for seafloor sediment classification
- 2) To evaluate the importance of bathymetry and its derivatives in producing coral reef classification map
- 3) To perform an automated technique in producing coral reef classification map

- 4) To assess the accuracy of the coral reef classification maps constructed from all the techniques above.

1.5 Research Question

To achieve the above research objectives, the following research questions (RQ) were used:

Objective 1: To investigate the correlation between MBES backscatter image and signal-based method for seafloor sediment classification

RQ1. What are the correlations between MBES backscatter image and signal-based method for seafloor sediment classification?

Objective 2: To evaluate the importance of bathymetry and its derivatives in producing coral reef classification map

RQ2. What are the importance of bathymetry data and its derivatives and their contributions towards producing a high accuracy of coral reef classification map?

Objective 3: To perform an automated technique in producing coral reef classification map

RQ3. What is the best method that can be adopted to produce a coral reef classification map?

Objective 4: To assess the accuracy of the coral reef classification maps constructed from the techniques above.

RQ4. What are the levels of accuracy among the coral reef classification maps constructed from the techniques above?

1.6 Significance of the Research

This classification of seafloor habitat map could be one of the useful approaches in enhancing the seafloor habitats distribution database in Malaysia, especially for the coral reef distributions. Other than that, this classification map can also provide the current status of seafloor habitats distribution in Malaysian water with the reduction in cost and time. In response to that, it can also be an alternative method besides transect survey in providing complete large scale coral reef mapping in Malaysia. This classification map can also be used to assess the areas with greatest prospective for coral reef conservation and monitoring purposes in Malaysia. Moreover, it can be significant to the Department of Marine Park Malaysia, scientists, and students for future research of seafloor habitat in Malaysian water.

1.7 Scope and Limitation of the Research

The scope of this study will cover multibeam data acquisition in Tawau, Sabah and Pulau Agas, Perak coupled with several ground truth data using the Van Veen Grab Sampler and underwater video camera. The raw multibeam acoustic data was processed to produce a bathymetry and backscatter. Next, the sediment sample will be analysed in lab to get the percentage of sediment types for each ground truth station and underwater video will be observed to identify the seafloor habitat occurrence for each ground truth station. A set of multibeam bathymetry and backscatter derivatives will then be generated using Benthic Terrain Modeler software for classification purpose. A coral reef classification map will be produced using four automated supervised classification techniques namely the Support Vector Machine (SVM), Neural network classifier (NNC), Quick Unbiased Efficient Statistical Tree (QUEST) decision tree, and Classification Rule with Unbiased Interaction Selection and Estimation (CRUISE).

Accuracy for each map will be assessed by computing an error matrix, producer accuracies and user accuracies metrics using the ground truth data (Galparsoro *et al.*, 2015). An accuracy assessment from each classification technique would be carried out by computing the error matrix , producer accuracy (PA) and user accuracy (UA); for the total classification, and for each of the classes (Stehman, 1997; Galparsoro *et al.*, 2015; Congalton and Green, 2009).

1.8 Organization of the Thesis

Chapter 1 gave an overview of this research work by presenting the background of the study, statement of problem, research questions, research objectives, scope and limitation of the study, significance of research, and lastly, thesis organization

Chapter 2 would be presenting the literature review. This comprises reviews of literatures from previous researches and related topics associated with the production of seafloor habitat map using conventional methods until current technologies were developed.

Chapter 3 would focus on the research methods and data acquisition. It would include a brief description of the study area, equipment used for data acquisition, multibeam echosounder system description, methods for data analysis, and accuracy assessment.

Chapter 4 comprised results and data analysis conducted for this study, consisting of multibeam backscatter and bathymetry data analysis, and production of coral reef habitat mapping from the automated supervised classification technique. This chapter would also provide discussions for each objective of this study.

Chapter 5 gave a conclusion and recommendations for future research related to this study.

REFERENCES

- Abdullah, A. L., Anscelly, A. A., Mohamed, J. & Yasin, Z. (2016). Conservation of Pulau Payar Marine Park and Optical Remote Sensing Models.
- Amolo, R. C. (2010). Habitat mapping and identifying suitable habitat of Redfish Rocks pilot marine reserve, Port Orford, Oregon.
- Anderson, J. T., Gregory, R. S. & Collins, W. T. (2002). Acoustic classification of marine habitats in coastal Newfoundland. *ICES Journal of Marine Science: Journal du Conseil*, 59, 156-167.
- Barbier, E. B., Moreno-Mateos, D., Rogers, A. D., Aronson, J., Pendleton, L., Danovaro, R., Henry, L.-A., Morato, T., Ardron, J. & Van Dover, C. L. (2014). Protect the deep sea. *Nature*, 505, 475-477.
- Barrett, N. S., Sanderson, J., Lawler, M., Halley, V. & Jordan, A. (2001). Mapping of inshore marine habitats in south-eastern Tasmania for marine protected area planning and marine management.
- Becker, N. C. (2005). Painting by numbers: A GMT primer for merging swath-mapping sonar data of different types and resolutions. *Computers & geosciences*, 31, 1075-1077.
- Blæsbjerg, M., Vestergaard, O., Pawlak, J. & Sorensen, T. K. 2009. *Marine spatial planning in the Nordic region*, Nordic Council of Ministers.
- Blondel, P., Prampolini, M. & Foglini, F. (2015). Acoustic textures and multibeam mapping of shallow marine habitats-Examples from Eastern Malta.
- Brown, C. & Coggan, R. (2007). Verification of acoustic classes. *Acoustic seabed classification of marine physical and biological landscapes. ICES Co-operative Research Report*, 286, 127-144.
- Brown, C. J. & Blondel, P. (2009). Developments in the application of multibeam sonar backscatter for seafloor habitat mapping. *Applied Acoustics*, 70, 1242-1247.
- Brown, C. J. & Collier, J. S. (2008). Mapping benthic habitat in regions of gradational substrata: an automated approach utilising geophysical, geological, and biological relationships. *Estuarine, Coastal and Shelf Science*, 78, 203-214.

- Brown, C. J., Smith, S. J., Lawton, P. & Anderson, J. T. (2011a). Benthic habitat mapping: A review of progress towards improved understanding of the spatial ecology of the seafloor using acoustic techniques. *Estuarine, Coastal and Shelf Science*, 92, 502-520.
- Brown, C. J., Todd, B. J., Kostylev, V. E. & Pickrill, R. A. (2011b). Image-based classification of multibeam sonar backscatter data for objective surficial sediment mapping of Georges Bank, Canada. *Continental Shelf Research*, 31, S110-S119.
- Calvert, J., Strong, J. A., McGonigle, C. & Quinn, R. (2015). An evaluation of supervised and unsupervised classification techniques for marine benthic habitat mapping using multibeam echosounder data. *ICES Journal of Marine Science: Journal du Conseil*, 72, 1498-1513.
- Che Hasan, R. 2014. Multibeam backscatter for benthic biological habitat mapping. Deakin University.
- Che Hasan, R., Ierodiaconou, D., Laurenson, L. & Schimel, A. (2014). Integrating multibeam backscatter angular response, mosaic and bathymetry data for benthic habitat mapping. *PLOS ONE*, 9, e97339.
- Che Hasan, R., Ierodiaconou, D. & Monk, J. (2012). Evaluation of four supervised learning methods for benthic habitat mapping using backscatter from multibeam sonar. *Remote Sensing*, 4, 3427-3443.
- Clements, A. J., Strong, J. A. & Flanagan, C. (2010). Objective stratification and sampling-effort allocation of ground-truthing in benthic-mapping surveys. *ICES Journal of Marine Science: Journal du Conseil*, 67, 628-637.
- Congalton, R. & Green, K. 2009. *Assessing the Accuracy of Remotely Sensed Data*, Boca Raton, CRC Press.
- Cutter, G. R., Rzhanov, Y. & Mayer, L. A. (2003). Automated segmentation of seafloor bathymetry from multibeam echosounder data using local Fourier histogram texture features. *Journal of Experimental Marine Biology and Ecology*, 285, 355-370.
- Dartnell, P. & Gardner, J. V. (2004). Predicting seafloor facies from multibeam bathymetry and backscatter data. *Photogrammetric Engineering & Remote Sensing*, 70, 1081-1091.
- Davies, J. & Young, S. (2008). MESH Guide to Habitat Mapping: a synopsis February 2008.

- de la Torriente, A., González-Irusta, J. M., Aguilar, R., Fernández-Salas, L. M., Punzón, A. & Serrano, A. (2019). Benthic habitat modelling and mapping as a conservation tool for marine protected areas: A seamount in the western Mediterranean. *Aquatic Conservation: Marine and Freshwater Ecosystems*, 29, 732-750.
- Díaz, J. V. M. 2000. *Analysis of multibeam sonar data for the characterization of seafloor habitats*. University of New Brunswick, Department of Geodesy and Geomatics Engineering.
- Diesing, M., Green, S. L., Stephens, D., Lark, R. M., Stewart, H. A. & Dove, D. (2014). Mapping seabed sediments: Comparison of manual, geostatistical, object-based image analysis and machine learning approaches. *Continental Shelf Research*, 84, 107-119.
- Diesing, M., Mitchell, P. & Stephens, D. (2016). Image-based seabed classification: what can we learn from terrestrial remote sensing? *ICES Journal of Marine Science*, 73, 2425-2441.
- Dolan, M., Thorsnes, T., Leth, J., Al-Hamdani, Z., Guinan, J. & Van Lancker, V. (2012). Terrain characterization from bathymetry data at various resolutions in European waters—experiences and recommendations. *NGU Report*, 2012045.
- Dubilier, N. (2016). Trackline map and processing report for navigation sensors from Meteor M126.
- Džeroski, S. & Drumm, D. (2003). Using regression trees to identify the habitat preference of the sea cucumber (*Holothuria leucospilota*) on Rarotonga, Cook Islands. *Ecological Modelling*, 170, 219-226.
- Eugenio, F., Marcello, J. & Martin, J. (2015). High-resolution maps of bathymetry and benthic habitats in shallow-water environments using multispectral remote sensing imagery. *IEEE Transactions on Geoscience and Remote Sensing*, 53, 3539-3549.
- Fakiris, E., Rzhhanov, Y. & Zoura, D. (2012). On importance of acoustic backscatter corrections for texture-based seafloor characterization.
- Folk, R. L., Andrews, P. B. & Lewis, D. (1970). Detrital sedimentary rock classification and nomenclature for use in New Zealand. *New Zealand journal of geology and geophysics*, 13, 937-968.
- Fonseca, L., Brown, C., Calder, B., Mayer, L. & Rzhhanov, Y. (2009). Angular range analysis of acoustic themes from Stanton Banks Ireland: A link between visual

- interpretation and multibeam echosounder angular signatures. *Applied Acoustics*, 70, 1298-1304.
- Fonseca, L. & Mayer, L. (2007). Remote estimation of surficial seafloor properties through the application Angular Range Analysis to multibeam sonar data. *Marine Geophysical Researches*, 28, 119-26.
- Galparsoro, I., Agrafojo, X., Roche, M. & Degrendele, K. (2015). Comparison of supervised and unsupervised automatic classification methods for sediment types mapping using multibeam echosounder and grab sampling. *Italian Journal of Geosciences*, 134, 41-49.
- Gavrilov, A., Siwabessy, P. & Parnum, I. (2005). Multibeam echo sounder backscatter analysis. *Curtin University of Technology*.
- Hamana, M. & Komatsu, T. (2016). Real-Time Classification of Seagrass Meadows on Flat Bottom with Bathymetric Data Measured by a Narrow Multibeam Sonar System. *Remote Sensing*, 8, 96.
- Haralick, R. M., Shanmugam, K. & Dinstein, I. H. (1973). Textural features for image classification. *IEEE Transactions on systems, man, and cybernetics*, 610-621.
- Herkül, K., Peterson, A. & Paekivi, S. (2017). Applying multibeam sonar and mathematical modeling for mapping seabed substrate and biota of offshore shallows. *Estuarine, Coastal and Shelf Science*, 192, 57-71.
- Hiew, K. & Yaman, A. R. G. The Marine Parks of Malaysia: objectives, current issues and initiatives. *Workshop on Impact Management in Marine Parks*, 1996.
- Hill, N. A., Lucieer, V., Barrett, N. S., Anderson, T. J. & Williams, S. B. (2014). Filling the gaps: Predicting the distribution of temperate reef biota using high resolution biological and acoustic data. *Estuarine, Coastal and Shelf Science*, 147, 137-147.
- Huang, Z., Nichol, S. L., Siwabessy, J. P., Daniell, J. & Brooke, B. P. (2012). Predictive modelling of seabed sediment parameters using multibeam acoustic data: a case study on the Carnarvon Shelf, Western Australia. *International Journal of Geographical Information Science*, 26, 283-307.
- Huang, Z., Siwabessy, J., Nichol, S., Anderson, T. & Brooke, B. (2013). Predictive mapping of seabed cover types using angular response curves of multibeam backscatter data: Testing different feature analysis approaches. *Continental Shelf Research*, 61, 12-22.

- Huvenne, V. A., Hühnerbach, V., Blondel, P., Gómez Sichi, O. & LeBas, T. Detailed mapping of shallow-water environments using image texture analysis on sidescan sonar and multibeam backscatter imagery. Proceedings of the 2nd underwater acoustic measurements conference. Heraklion: FORTH, 2007.
- ICES 2006. Report of the Working Group on Marine Habitat Mapping (WGMHM). Galway, Ireland.
- Ierodiconou, D., Monk, J., Rattray, A., Laurenson, L. & Versace, V. (2011). Comparison of automated classification techniques for predicting benthic biological communities using hydroacoustics and video observations. *Continental Shelf Research*, 31, S28-S38.
- IMCA (2006). International Marine Contractors Association (2006) Guidelines for the use of multibeam echosounders for offshore surveys. Rev 1.
- Ismail, K. 2016. *Marine landscape mapping in submarine canyons*. University of Southampton.
- Janowski, L., Trzcinska, K., Tegowski, J., Kruss, A., Rucinska-Zjadacz, M. & Pocwiardowski, P. (2018). Nearshore benthic habitat mapping based on multi-frequency, multibeam echosounder data using a combined object-based approach: A case study from the Rowy site in the southern Baltic sea. *Remote Sensing*, 10, 1983.
- Jerosch, K., Kuhn, G., Krajnik, I., Scharf, F. K. & Dorschel, B. (2016). A geomorphological seabed classification for the Weddell Sea, Antarctica. *Marine Geophysical Research*, 37, 127-141.
- Kagesten, G. (2008). Geological seafloor mapping with backscatter data from a multibeam echo sounder. *Department of Earth Science, Gothenburg University*.
- Katsanevakis, S., Stelzenmüller, V., South, A., Sørensen, T. K., Jones, P. J., Kerr, S., Badalamenti, F., Anagnostou, C., Breen, P. & Chust, G. (2011). Ecosystem-based marine spatial management: review of concepts, policies, tools, and critical issues. *Ocean & Coastal Management*, 54, 807-820.
- Kenny, A., Cato, I., Desprez, M., Fader, G., Schüttenhelm, R. & Side, J. (2003). An overview of seabed-mapping technologies in the context of marine habitat classification. *ICES Journal of Marine Science: Journal du Conseil*, 60, 411-418.

- Komatsu, T. (2003). Use of multi-beam sonar to map seagrass beds in Otsuchi Bay on the Sanriku Coast of Japan. *Aquatic Living Resources*, 16, 223-230.
- Komatsu, T. (2011). Remote sensing for coastal habitat mapping.
- Kongsberg, M. 2016. Data sheet MRU 5 (Ideal Marine Motion Sensor). Norway.
- Kotchenova, S. Y., Song, X., Shabanov, N. V., Potter, C. S., Knyazikhin, Y. & Myneni, R. B. (2004). Lidar remote sensing for modeling gross primary production of deciduous forests. *Remote Sensing of Environment*, 92, 158-172.
- LaFrance, M., Shumchenia, E., King, J., Pockalny, R., Oakley, B., Pratt, S. & Boothroyd, J. (2010). Benthic habitat distribution and subsurface geology: selected sites from the Rhode Island Ocean Special Area Management study area. *Ocean Special Area Management Plan, Technical Report*, 4, 263-332.
- Lamarche, G., Lurton, X., Verdier, A. L. & Augustin, J. M. (2011). Quantitative characterisation of seafloor substrate and bedforms using advanced processing of multibeam backscatter-Application to Cook Strait, New Zealand. *Continental Shelf Research*, 31, S93-S109.
- Le Bas, T. & Huvenne, V. (2009). Acquisition and processing of backscatter data for habitat mapping—comparison of multibeam and sidescan systems. *Applied Acoustics*, 70, 1248-1257.
- Lecours, V., Dolan, M. F., Micallef, A. & Lucieer, V. L. (2016). A review of marine geomorphometry, the quantitative study of the seafloor. *Hydrology and Earth System Sciences*, 20, 3207.
- Leslie, H. M. & McLeod, K. L. (2007). Confronting the challenges of implementing marine ecosystem-based management. *Frontiers in Ecology and the Environment*, 5, 540-548.
- Lewis, D. W. & McConchie, D. 2012. *Analytical sedimentology*, Springer Science & Business Media.
- Lucieer, V., Hill, N., Barrett, N. & Nichol, S. Spatial analysis of multibeam acoustic data for the prediction of marine substrates and benthic communities in temperate coastal waters. ISRSE 2011: International symposium of R 34th International Symposium on Remote Sensing of Environment, 2011. On USB.
- Lucieer, V., Hill, N. A., Barrett, N. S. & Nichol, S. (2013). Do marine substrates ‘look’and ‘sound’the same? Supervised classification of multibeam acoustic data using autonomous underwater vehicle images. *Estuarine, Coastal and Shelf Science*, 117, 94-106.

- Lucieer, V. & Lucieer, A. (2009). Fuzzy clustering for seafloor classification. *Marine Geology*, 264, 230-241.
- Lucieer, V., Nau, A. W., Forrest, A. L. & Hawes, I. (2016). Fine-Scale Sea Ice Structure Characterized Using Underwater Acoustic Methods. *Remote Sensing*, 8, 821.
- Lucieer, V. L. (2008). Object-oriented classification of sidescan sonar data for mapping benthic marine habitats. *International Journal of Remote Sensing*, 29, 905-921.
- Lüdtke, A., Jerosch, K., Herzog, O. & Schlüter, M. (2012). Development of a machine learning technique for automatic analysis of seafloor image data: Case example, Pogonophora coverage at mud volcanoes. *Computers & Geosciences*, 39, 120-128.
- Lundblad, E. R. 2004. *The development and application of benthic classifications for coral reef ecosystems below 30 m depth using multibeam bathymetry: Tutuila, American Samoa.*
- Lurton, X. 2002. *An introduction to underwater acoustics: principles and applications*, Springer Science & Business Media.
- Maltamo, M., Eerikäinen, K., Pitkänen, J., Hyypä, J. & Vehmas, M. (2004). Estimation of timber volume and stem density based on scanning laser altimetry and expected tree size distribution functions. *Remote Sensing of Environment*, 90, 319-330.
- Maritime Institute Malaysia, M. (2006). Malaysia National Coral Reef Report. UNEP-GEF South China Sea Project and Marine Park Section, Ministry of Natural Resources and Environment, Malaysia.
- Marsh, I. & Brown, C. (2009). Neural network classification of multibeam backscatter and bathymetry data from Stanton Bank (Area IV). *Applied Acoustics*, 70, 1269-1276.
- Mazlan, A., Zaidi, C., Wan-Lotfi, W. & Othman, B. (2005). On the current status of coastal marine biodiversity in Malaysia. *Indian Journal of Marine Sciences*, 34, 76-87.
- McGonigle, C., Brown, C., Quinn, R. & Grabowski, J. (2009). Evaluation of image-based multibeam sonar backscatter classification for benthic habitat discrimination and mapping at Stanton Banks, UK. *Estuarine, Coastal and Shelf Science*, 81, 423-437.

- McNeely, J. A. & Harrison, J. 1994. *Protecting nature: regional reviews of protected areas*, IUCN.
- Micallef, A., Le Bas, T. P., Huvenne, V. A. I., Blondel, P., Hühnerbach, V. & Deidun, A. (2012). A multi-method approach for benthic habitat mapping of shallow coastal areas with high-resolution multibeam data. *Continental Shelf Research*, 39-40, 14-26.
- Monteys, X., Hung, P., Scott, G., Garcia, X., Evans, R. L. & Kelleher, B. (2016). The use of multibeam backscatter angular response for marine sediment characterisation by comparison with shallow electromagnetic conductivity. *Applied Acoustics*, 112, 181-191.
- Müller, R. D. & Eagles, S. (2007). Mapping seabed geology by ground-truthed textural image/neural network classification of acoustic backscatter mosaics. *Mathematical Geology*, 39, 575-592.
- Murton, P. B. E. B. 1997. *Handbook of Seafloor Sonar Imagery*. Wiley-Praxis series in Remote Sensing.
- Mustajap, F., Saleh, E., Madin, J. & Hamid, S. A. (2015). Marine habitat mapping at Labuan Marine Park, Federal Territory of Labuan, Malaysia. *Ocean Science Journal*, 50, 291-298.
- Nasby-Lucas, N. M., Embley, B. W., Hixon, M. A., Merle, S. G., Tissot, B. N. & Wright, D. J. (2002). Integration of submersible transect data and high-resolution multibeam sonar imagery for a habitat-based groundfish assessment of Heceta Bank, Oregon.
- O'Keeffe, E. (2011). *GIS Workshop: Habitat Mapping Using ArcGIS Tools*.
- Pal, M. & Mather, P. M. (2003). An assessment of the effectiveness of decision tree methods for land cover classification. *Remote sensing of environment*, 86, 554-565.
- Pandian, P., Ruscoe, J., Shields, M., Side, J., Harris, R., Kerr, S. & Bullen, C. (2009). Seabed habitat mapping techniques: an overview of the performance of various systems. *Mediterranean Marine Science*, 10, 29-44.
- Parnum, I., Siwabessy, J., Gavrilov, A. & Parsons, M. A comparison of single beam and multibeam sonar systems in seafloor habitat mapping. Proc 3rd Int Conf Exhib Underwater Acoustic Measurements: Technologies and Results, 2009. 21-26.
- Parnum, I. M. (2007). *Benthic habitat mapping using multibeam sonar systems*.

- Phinn, S., Roelfsema, C., Dekker, A., Brando, V. & Anstee, J. (2008). Mapping seagrass species, cover and biomass in shallow waters: An assessment of satellite multi-spectral and airborne hyper-spectral imaging systems in Moreton Bay (Australia). *Remote Sensing of Environment*, 112, 3413-3425.
- QPS (2016). FMGeocoder Toolbox Online Manual. Fledermaus 7.7.x Documentation.
- Quas, L., Church, I., O'Brien, S. J., Wiggert, J. D. & Williamson, M. (2017). Application of high-resolution multibeam sonar backscatter to guide oceanographic investigations in the Mississippi Bight.
- Ramli, N., Ahmad, A. & Karim, K. Marine Parks Malaysia: current status and prospect of marine protected areas in Peninsular Malaysia. Proceedings of IUCN/WCPA-EA-4 Taipei conference, 2002.
- Rattray, A., Ierodionou, D., Laurenson, L., Burq, S. & Reston, M. (2009). Hydro-acoustic remote sensing of benthic biological communities on the shallow South East Australian continental shelf. *Estuarine, Coastal and Shelf Science*, 84, 237-245.
- Razak, I. R. b. A., Yusu, K. N. b., Salim, M. A. F. b. M. & Salleh, N. b. M. (2014). Tourism sea activities that cause damages towards coral reefs in Sembilan Islands. *Tourism, Leisure and Global Change 1*, TOC-123.
- ReefCheck, M. (2012a). Status of Coral Reefs in Malaysia, 2014.
- ReefCheck, M. 2012b. Status of the Coral Reefs of the Sembilan Islands.
- Robidoux, L., Fonseca, L. & Wyatt, G. A qualitative assessment of two multibeam echosounder (MBES) backscatter analysis approaches. Canadian Hydrographic Conference and National Surveyors Conference, Thursday, May, 2008.
- Roff, J. C. & Taylor, M. E. (2000). National frameworks for marine conservation—a hierarchical geophysical approach. *Aquatic conservation: Marine and Freshwater ecosystems*, 10, 209-223.
- Roff, J. C., Taylor, M. E. & Laughren, J. (2003). Geophysical approaches to the classification, delineation and monitoring of marine habitats and their communities. *Aquatic Conservation: Marine and Freshwater Ecosystems*, 13, 77-90.
- Sagawa, T., Boisnier, E., Komatsu, T., Mustapha, K. B., Hattour, A., Kosaka, N. & Miyazaki, S. (2010). Using bottom surface reflectance to map coastal marine

- areas: a new application method for Lyzenga's model. *International Journal of Remote Sensing*, 31, 3051-3064.
- Salm, R. V., Clark, J. R. & Siirila, E. 2000. *Marine and coastal protected areas: a guide for planners and managers*, IUCN.
- Schelfaut, K. (2005). Defining Marine Landscapes on the Belgian continental shelf as an approach to holistic habitat mapping.
- Schimel, A. C., Healy, T. R., Johnson, D. & Immenga, D. (2010). Quantitative experimental comparison of single-beam, sidescan, and multibeam benthic habitat maps. *ICES Journal of Marine Science: Journal du Conseil*, 67, 1766-1779.
- Schimel, A. C. G. (2011). Quantitative comparison of benthic habitat maps derived from Multibeam Echosounder backscatter data.
- Schmiing, M. 2013. *Mapping multi-species habitat use for marine conservation planning*. Universidade dos Açores.
- Silver Spring & Maryland 2003. *MULTIBEAM SONAR DATA ACQUISITION SYSTEMS: A SIMPLIFIED CONCEPTUAL MODEL*, US Department of Commerce, National Oceanic and Atmospheric Administration, National Ocean Service, National Geodetic Survey.
- Siwabessy, P. J. W., Daniell, J., Li, J., Huang, Z., Heap, A. D., Nichol, S., Anderson, T. J. & Tran, M. 2013. *Methodologies for seabed substrate characterisation using multibeam bathymetry, backscatter and video data: A case study from the carbonate banks of the Timor Sea, Northern Australia*.
- Stehman, S. V. (1997). Selecting and interpreting measures of thematic classification accuracy. *Remote sensing of Environment*, 62, 77-89.
- Stephens, D. & Diesing, M. (2014). A comparison of supervised classification methods for the prediction of substrate type using multibeam acoustic and legacy grain-size data. *PLoS One*, 9, e93950.
- Subarno, T., Siregar, V. P., Agus, S. B. & Sunuddin, A. (2016). Modelling complex terrain of reef geomorphological structures in harapan-kelapa island, kepulauan seribu. *Procedia Environmental Sciences*, 33, 478-486.
- Thrush, S. F., Hewitt, J. E., Funnell, G. A., Cummings, V. J., Ellis, J., Schultz, D., Talley, D. & Norkko, A. (2001). Fishing disturbance and marine biodiversity: the role of habitat structure in simple soft-sediment systems. *Marine Ecology Progress Series*, 223, 277-286.

- Van Lancker, V. & Van Heteren, S. 2013. Standardisation and harmonisation in seabed habitat mapping: role and added value of geological data and information. Part A: Sediment characterisation. Geo-Seas report 10.5 A. Retrieved on April, 2013.
- Verfaillie, E. 2008. *Development and validation of spatial distribution models of marine habitats, in support of the ecological valuation of the seabed*. Ghent University.
- Verfaillie, E., Du Four, I., Van Meirvenne, M. & Van Lancker, V. (2009). Geostatistical modeling of sedimentological parameters using multi-scale terrain variables: application along the Belgian Part of the North Sea. *International Journal of Geographical Information Science*, 23, 135-150.
- Wang, M., Wu, Z., Yang, F., Ma, Y., Wang, X. H. & Zhao, D. (2018). Multifeature extraction and seafloor classification combining LiDAR and MBES data around Yuanzhi Island in the South China Sea. *Sensors*, 18, 3828.
- Ward, T., Vanderklift, M., Nicholls, A. & Kenchington, R. (1999). Selecting marine reserves using habitats and species assemblages as surrogates for biological diversity. *Ecological applications*, 9, 691-698.
- Wedding, L. & Yoklavich, M. M. (2015). Habitat-based predictive mapping of rockfish density and biomass off the central California coast. *Marine Ecology Progress Series*, 540, 235-250.
- Wicaksono, P., Aryaguna, P. A. & Lazuardi, W. (2019). Benthic Habitat Mapping Model and Cross Validation Using Machine-Learning Classification Algorithms. *Remote Sensing*, 11, 1279.
- Wilbur, A. R. Fish habitat characterization and assessment: approach to integrate seafloor features and juvenile organisms data. OCEANS 2000 MTS/IEEE Conference and Exhibition. Conference Proceedings (Cat. No. 00CH37158), 2000. IEEE, 1555-1561.
- Williams, A. & Bax, N. J. (2001). Delineating fish-habitat associations for spatially based management: an example from the south-eastern Australian continental shelf. *Marine and Freshwater Research*, 52, 513-536.
- Wright, D., Lundblad, E., Larkin, E., Rinehart, R., Murphy, J., Cary-Kothera, L. & Draganov, K. (2005). ArcGIS Benthic Terrain Modeler [a collection of tools used with bathymetric data sets to examine the deepwater benthic

- environment]. *Oregon State University, Davey Jones' Locker Seafloor Mapping/Marine GIS Laboratory and NOAA Coastal Services Center.*
- Yahya, N. N., Hashim, M. & Ahmad, S. (2014). Remote Sensing of shallow sea floor for digital earth environment. *IOP Conference Series: Earth and Environmental Science*, 18, 012110.
- Yaman, A. R. B. G., Zakariah, Z. M., Ahmad, A. R., Tan Kim Hooi, Barison, M. N. & Yusoff, N. A. (2007). National Report on Coral Reefs in the Coastal Waters of the South China Sea Malaysia.
- Zhang, C. (2015). Applying data fusion techniques for benthic habitat mapping and monitoring in a coral reef ecosystem. *ISPRS Journal of Photogrammetry and Remote Sensing*, 104, 213-223.
- Zhang, C., Selch, D., Xie, Z., Roberts, C., Cooper, H. & Chen, G. (2013). Object-based benthic habitat mapping in the Florida Keys from hyperspectral imagery. *Estuarine, Coastal and Shelf Science*, 134, 88-97.
- Zhi, H., Siwabessy, J., Nichol, S. L. & Brooke, B. P. (2014). Predictive mapping of seabed substrata using high-resolution multibeam sonar data: A case study from a shelf with complex geomorphology. *Marine Geology*, 357, 37-52.
- Zoffoli, M. L., Frouin, R. & Kampel, M. (2014). Water column correction for coral reef studies by remote sensing. *Sensors*, 14, 16881-16931.

LIST OF PUBLICATION

1. Samsudin, S. A. & Hasan, R. C. (2017). Assessment of Multibeam Backscatter Texture Analysis for Seafloor Sediment Classification. *International Archives of the Photogrammetry, Remote Sensing & Spatial Information Sciences*, 42. **(Published)**