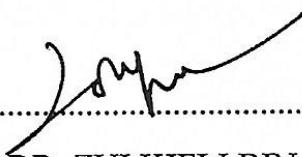


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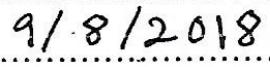
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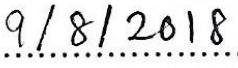
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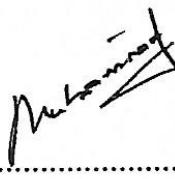
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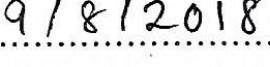
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## **BAHAGIAN A – Pengesahan Kerjasama\***

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Nama : .....

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FLOOD DAMAGE AND RISK ASSESSMENT FOR URBAN AREA IN  
SEGAMAT

NOOR SURAYA BINTI ROMALI

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

School of Civil Engineering

Faculty of Engineering

Universiti Teknologi Malaysia

August 2018

I declare that this thesis entitled "*Flood Damage and Risk Assessment for Urban Area in Segamat*" is the result of my own research except as cited in the references. The thesis has not been accepted for any degree and is not concurrently submitted in candidature of any other degree.

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Name : NOOR SURAYA BINTI ROMALI  
Date : .....  
.....  
9/8/2018

## **DEDICATION**

To my beloved parents  
Romali Bin Jusoh and Fatimah Binti Mohamad

To my pillar of strength  
Aimi Ilmar Bin Ramli

To the love of my life  
Muhammad Aiman Bin Aimi Ilmar  
Noor Aina Sofia Binti Aimi Ilmar

To me  
Thank you for not giving up!

## ACKNOWLEDGEMENT

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## ABSTRACT

In recent years, risk-based flood mitigation approach received more attention compared to conventional or structural approach. However, in developing countries, literatures on flood vulnerability assessment are limited especially on flood damage. In Malaysia, the assessment of flood damages is challenging due to data scarcity. Hence, an attempt has been made to establish a flood damage assessment framework for an urban area of Segamat town, Johor. The concept of flood risk involved the elements of hazard, exposure, and vulnerability. The combination of hydrological characteristics, exposed elements, value of exposed elements, and flood damage function curve was used for estimation of flood damages. The flood depth and areal extend were obtained from flood modeling and mapping using HEC-HMS/RAS and Arc GIS. A site-specific flood depth–damage curve was developed based on land use category, socio-economic status of the flood victims and property characteristics. Due to data scarcity, synthetic method was applied to generate flood damage data based on the 2011 major flood event. Damage percentage was calculated by dividing the replacement cost by the market value of the properties and plotted against the observed flood depth. In addition to flood depth, the flood damage was also influenced by household income and property's price. Therefore, the residential category was further divided into three sub-categories; low price house (LPH), medium price house (MPH) and high price house (HPH). Using  $R^2$  of 0.76 for commercial area and from 0.80 to 0.85 for various residential categories, the flood depth-damage curves obtained in this study were good enough and comparable with other studies. The estimated total damages for residential and commercial categories during the 2011 flood were RM456 mil and RM143 mil respectively. The expected annual damage (EAD) for residential areas (50,112 units) and commercial areas (9,318 premises) were RM12.59 million and RM2.96 million respectively. Generalized Pareto (GP) distribution model was used to estimate peak discharge of 10, 25, 50, 100, 200, 500 and 1000 ARI which were subsequently applied for deriving flood maps. Based on the GP distribution, the 2011 flood was equivalent to 42 years average recurrence interval (ARI). Flood hazard map shows that Bandar Seberang area (46,184 properties) was the most affected by flood. The flood damage risk map illustrates similar patterns where the distribution of damages were concentrates at the Bandar Seberang area with some properties suffered damages of more than RM15,000 per unit. Although it is a site-specific study, the framework can be applied to assess the potential future damages and serve as a basis for future studies on flood risk assessment in Malaysia.

## ABSTRAK

Kebelakangan ini, pendekatan tebatan banjir berdasarkan risiko menerima lebih banyak perhatian berbanding pendekatan konvensional yang menggunakan pendekatan struktur. Walau bagaimanapun, di negara-negara membangun, literatur berkaitan penilaian risiko banjir dari segi kesan kepada masyarakat dan harta benda adalah terhad terutama berkaitan penilaian kerosakan banjir. Di Malaysia, penilaian kerosakan banjir sukar dilakukan kerana kekangan data. Oleh itu, kajian ini bertujuan untuk menghasilkan satu rangka kerja penilaian kerosakan banjir untuk kawasan bandar Segamat, Johor. Konsep risiko banjir merangkumi unsur ancaman, pendedahan dan kerentanan akibat banjir. Gabungan ciri-ciri hidrologi, unsur terdedah, nilai unsur terdedah, nilai anggaran kerosakan disebabkan banjir dan lengkung fungsi kerosakan banjir digunakan bagi menganggarkan kerosakan banjir. Maklumat aras banjir dan kawasan litupan banjir diperolehi daripada permodelan dan pemetaan banjir menggunakan HEC-HMS/RAS dan Arc GIS. Lengkung kedalaman-kerosakan banjir yang khusus untuk kawasan kajian telah dihasilkan berdasarkan kategori guna tanah, status sosio-ekonomi mangsa banjir dan ciri-ciri harta benda. Disebabkan kekurangan data, kaedah sintetik digunakan untuk menghasilkan data kerosakan banjir berdasarkan peristiwa banjir besar 2011. Peratusan kerosakan (dikira dengan membahagikan kos baik pulih dengan nilai pasaran hartanah) di plot melawan kedalaman banjir. Selain daripada kedalaman banjir, tahap kerosakan banjir adalah dipengaruhi oleh pendapatan isi rumah dan harga kediaman. Oleh itu, kerosakan bagi kategori kediaman dibahagikan kepada tiga sub-kategori iaitu rumah harga rendah (LPH), rumah harga sederhana (MPH) dan rumah harga tinggi (HPH). Dengan  $R^2$  0.76 untuk kategori komersil dan 0.80 hingga 0.85 bagi pelbagai kategori penempatan, lengkung kerosakan banjir yang diperolehi adalah baik dan setara dengan kajian-kajian lepas. Anggaran jumlah kerosakan kategori kediaman dan komersil akibat banjir tahun 2011 adalah RM456 juta dan RM143 juta. Jangkaan kerugian tahunan (EAD) untuk kawasan kediaman (50,112 unit) dan kawasan komersil (9,318 premis) adalah RM12.59 juta dan RM2.96 juta. Model taburan Generalized Pareto (GP) telah digunakan untuk menganggar aliran puncak bagi 10, 25, 50, 100, 200, 500 and 1000 ARI, yang seterusnya digunakan bagi menghasilkan peta ancaman banjir. Berdasarkan model taburan GP, banjir 2011 bersamaan dengan 42 tahun purata selang pengulangan (ARI). Peta ancaman banjir menunjukkan bahawa kawasan Bandar Seberang (46,184 harta) adalah yang paling terjejas semasa banjir 2011. Peta risiko kerosakan banjir menggambarkan pola taburan kerosakan yang sama di mana taburan kerosakan tertumpu di Bandar Seberang dengan sebahagian asset mengalami kerosakan lebih daripada RM15,000 per unit. Walaupun fokus kajian ini hanya terhad kepada kawasan kajian, rangka kerja ini dapat digunakan bagi menilai potensi kerugian pada masa akan datang dan boleh dijadikan asas untuk kajian penilaian risiko banjir di Malaysia pada masa-masa akan datang.

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## **LIST OF ABBREVIATIONS**

AM	- Annual Maximum
ARI	- Average Recurrence Interval
CBA	- Cost Benefit Analysis
Cum.	- Cumulative
DID	- Drainage and Irrigation Department
DEM	- Digital Elevation Model
DF	- Damage factor
EAD	- Expected Annual Damage
e.g.	- Example given
EM-DAT	- Emergency Disasters Database
FB	- Food and Beverage
FDAP	- Flood Damage Analysis Package
FHAM	- Flood Hazard Assessment Model
GEV	- Generalized Extreme Value
GIS	- Geographic Information System
GOF	- Goodness of Fit
GP	- Generalized Pareto
GS	- Good and Services
GUI	- Graphical User Interface
HEC-HMS	- Hydrologic Engineering Center's Hydraulic Modeling System
HEC-RAS	- Hydrologic Engineering Center's River Analysis System
HPH	- High Price House

ICPR	- International Commission for the Protection of the River Rhine
IPF	- Iterative Proportional Fitting
ISFAR	- Interferometric Synthetic Aperture Radar
K-S	- Kolmogorov-Smirnov
KTA	- Kumarasivam, Tan & Ariffin
LOOCV	- Leave-One-Out Cross-Validation
LPH	- Low Price House
MAE	- Mean Absolute Error
MAR	Missing at Random
MBE	- Mean Bias Error
MCAR	- Missing Completely at Random
ME	- Model Efficiency
Mil.	- Million
MNAR	- Missing Not at Random
MPH	- Medium Price House
MRE	- Minimum relative error
MURL	- Ministerium für Umwelt, Raumordnung und Landwirtschaft des Landes Nordrhein-Westfalen
NAHRIM	- National Hydraulic Research Institute of Malaysia
OFAT	- One Factor at a Time
PD	- Partial Duration
POT	- Peaks Over Threshold
RM	- Ringgit Malaysia
RMSE	- Root Mean Square Error
Sg.	- Sungai (river)
TIN	- Triangular Model Network
TS	- Time Series
USACE	- The United States Army Corps of Engineers

## LIST OF SYMBOLS

$\Sigma$	Summation of
%	Percentages
$X_T$	T-year quantile
$k$	Shape parameters
$\alpha$	Shape parameters
$\sigma$	Continuous scale parameters
$\beta$	Continuous scale parameters
$\mu$	Continuous location parameters
$\gamma$	Continuous location parameters
$Q$	Flow
$R^2$	Coefficient of determination
<	Less than
$\geq$	Greater than or equal to
>	Greater than
$m^3/s$	Cubic metres per second
$mm/hr$	Millimetre per hour
hr	Hour
m	Metre

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