

**MEASURING OPERATIONAL RESILIENCE OF BANKING  
SECTOR IN MALAYSIA**

***MENGUKUR KETAHANAN OPERASIONAL SEKTOR  
PERBANKAN DI MALAYSIA***

UNDERGRADUATE THESIS



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**INTERNATIONAL PROGRAM OF ISLAMIC ECONOMICS AND  
FINANCE (IPIEF)**

**ECONOMICS STUDY PROGRAM**

**FACULTY OF ECONOMICS AND BUSINESS**

**MUHAMADIYYAH UNIVERSITY YOGYAKARTA**

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In partial fulfillment for the requirement for the degree of Bachelor of Economics at International Program for Islamic Economics and Finance



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**UNIVERSITAS MUHAMMADIYAH YOGYAKARTA**

**2024**

## DECLARATION

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I hereby declare that this undergraduate thesis entitled: "MEASURING OPERATIONAL RESILIENCE OF BANKING SECTOR IN MALAYSIA" does not consists of any content that ever being proposed for any degree in order university, ideas of any study and publication of others, in exception all quotes and ideas which are purposely taken are considered as the research references and listed in the reference list. Therefore, if any violation of intellectual right is found in this research, I agree to accept any relevant academic consequences.

Yogyakarta, 22 Agustus 2024



Baarik Ariba

## MOTTO

لَيْسَ الْفَتَىُ مِنْ يَقُولُ كَانَ أَبِيهِ وَلَكِنَّ الْفَتَىُ مِنْ يَقُولُ هَا أَنَّا ذَا

*Pemuda sejati bukanlah yang berkata "ayahku dulu begini," tetapi pemuda sejati adalah yang berkata "inilah aku sekarang."*

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In closing, this undergraduate thesis there are still many errors and shortcomings, therefore it takes criticism and suggestions that build for better results again.

Yogyakarta, 28 July 2024



Baarik Ariba

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