

COMPARISON OF PIXEL-BASED AND OBJECT-BASED LAND USE LAND COVER CLASSIFICATION USING SATELLITE IMAGERY



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SINGARAJA

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BASED LAND USE LAND COVER CLASSIFICATION
USING SATELLITE IMAGERY**

UNDERGRADUATE THESIS

Submitted to

Universitas Pendidikan Ganesha

**To fulfill one of the requirements in completing
Bachelor of Computer Science Program**



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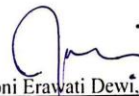
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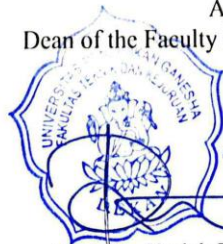
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DECLARATION

I hereby declare that the written work titled "**Comparison of Pixel-Based and Object-Based Land Use Land Cover Classification Using Satellite Imagery**" and its entirety are genuinely my original work, created without engaging in plagiarism or improper citation practices that violate the ethical standards of the scientific community. By making this declaration, I accept full responsibility for any sanctions that may be imposed if any violations of scientific ethics or challenges to the authenticity of my work are later discovered.

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MOTTO

"Dream, strive, achieve"

FOREWORD

The author expresses gratitude to God Almighty for His blessings, as it is by His grace that the author has been able to complete the undergraduate thesis titled "Comparison of Pixel-Based and Object-Based Land Use Land Cover Classification using Satellite Imagery". This undergraduate thesis is written to fulfill the requirements for obtaining a Bachelor's degree in Computer Science from Universitas Pendidikan Ganesha.

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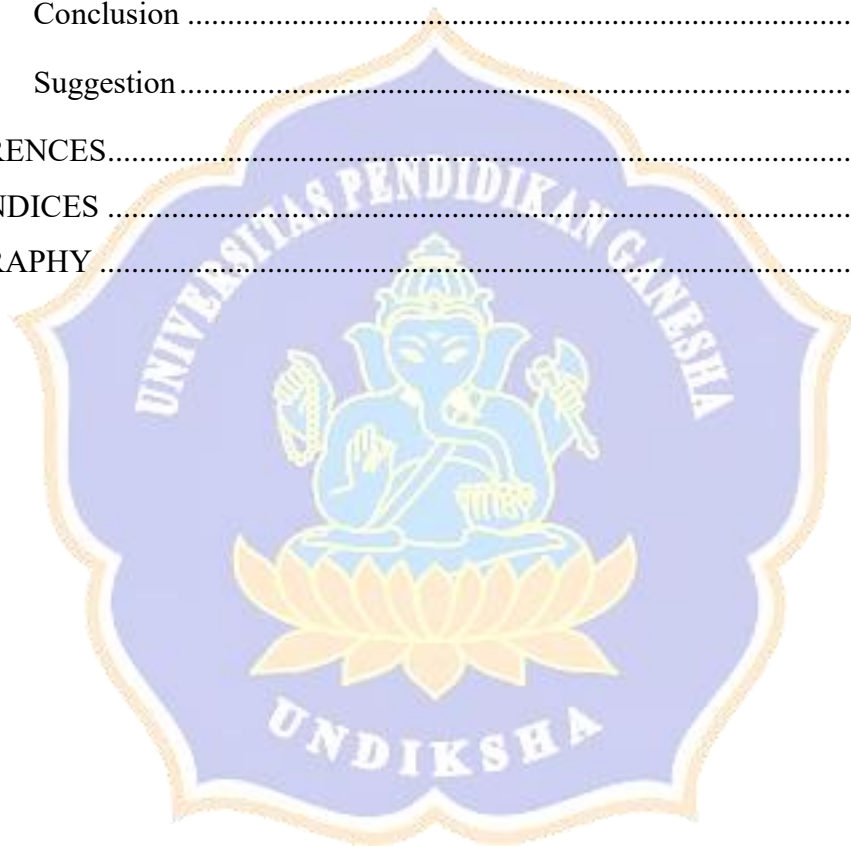
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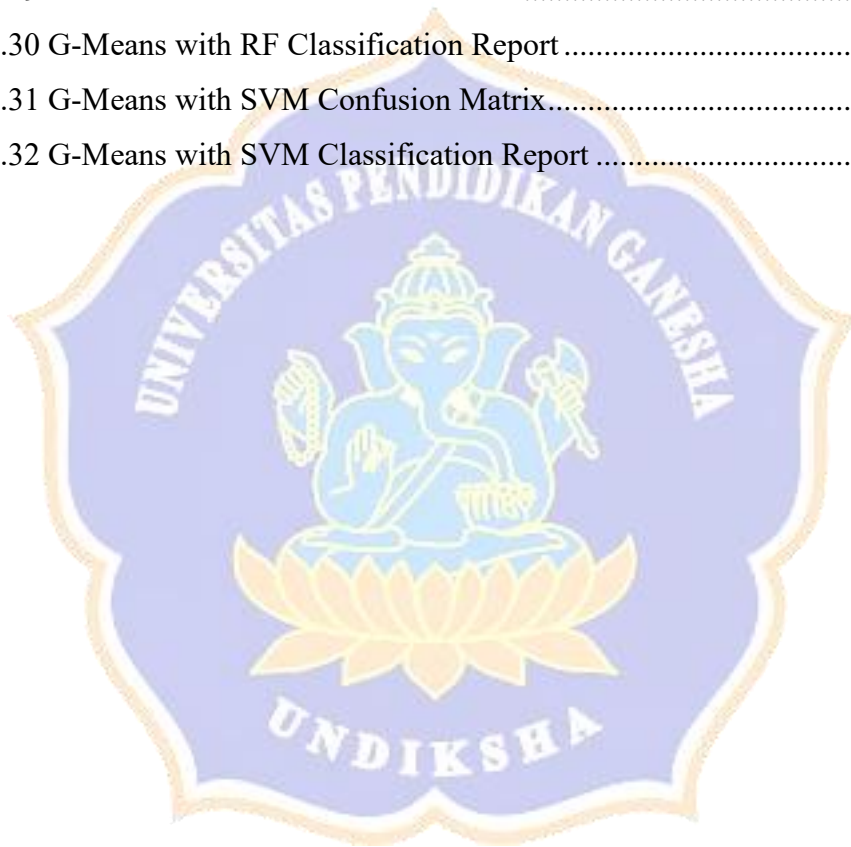
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