

**XLM-ROBERTA-BASED DETECTION OF HATE SPEECH IN
INDONESIAN-ENGLISH CODE-MIXED TEXT**



PUBLICATION THESIS

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**INFORMATICS STUDY PROGRAM
FACULTY OF ENGINEERING AND INFORMATICS
UNIVERSITAS MULTIMEDIA NUSANTARA
TANGERANG
2025**

**XLM-ROBERTA-BASED DETECTION OF HATE SPEECH IN
INDONESIAN-ENGLISH CODE-MIXED TEXT**



Submitted as one of the requirements to obtain the degree of Bachelor of
Computer Science (S.Kom.)

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**INFORMATICS STUDY PROGRAM
FACULTY OF ENGINEERING AND INFORMATICS
UNIVERSITAS MULTIMEDIA NUSANTARA
TANGERANG
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By

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PREFACE

All praise and gratitude to God Almighty for His blessings and grace, through which this Publication report entitled: XLM-RoBERTa-Based Detection of Hate Speech in Indonesian-English Code-Mixed Texts has been successfully completed. This report was prepared as one of the requirements to obtain a Bachelor of Computer Science degree in the Informatics Study Program at the Engineering and Informatics Faculty of Universitas Multimedia Nusantara.

Without the help and guidance from various parties throughout my studies and during the preparation of this Publication it would have been difficult for me to complete this report. Therefore, I would like to express my sincere gratitude to:

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I sincerely hope that this publication report will be useful both as a source of information and inspiration for future readers.

Tangerang, 20 May 2025



Farrel Dinarta

XLM-ROBERTA-BASED DETECTION OF HATE SPEECH IN INDONESIAN-ENGLISH CODE-MIXED TEXT

Farrel Dinarta

ABSTRACT

The prevalence of hate speech on digital platforms presents significant challenges, particularly in multilingual communities where code-switching complicates detection. This study explores the use of XLM-RoBERTa, a transformer-based model with robust multilingual capabilities, to detect hate speech within mixed-language texts, focusing on Indonesian-English code-switching. Traditional hate speech detection models rely on single-language datasets, limiting their effectiveness in such environments. We employ a dataset consisting of Indonesian, English, and code-mixed Indonesian-English language to evaluate XLM-RoBERTa's performance, comprised 24.844 training samples, 2.760 test samples, and 100 supplementary samples additionally. Key hyperparameters included batch size of 16 and 32, with learning rate spanning from $1e-5$ to $5e-5$. The model achieved near-perfect accuracy (99.6%) on the primary test set and strong generalization across realistic supplementary data with an F1-score of 90.94%. These findings underscore the model's potential for application in complex linguistic contexts, contributing to the development of effective multilingual hate speech detection.

Keywords: *code-switching, hate speech detection, mixed-language texts, XLM-RoBERTa*



DETEKSI UJARAN KEBENCIAN DALAM TEKS CAMPURAN BAHASA INDONESIA-INGGRIS MENGGUNAKAN XLM-ROBERTA

Farrel Dinarta

ABSTRAK

Prevalensi ujaran kebencian di platform digital menimbulkan tantangan besar, terutama di komunitas multibahasa di mana praktik alih kode (*code-switching*) mempersulit proses deteksi. Studi ini mengeksplorasi penggunaan XLM-RoBERTa, sebuah model berbasis *transformer* dengan kemampuan multibahasa yang kuat, untuk mendeteksi ujaran kebencian dalam teks campuran bahasa, dengan fokus pada konteks alih kode bahasa Indonesia-Inggris. Model deteksi ujaran kebencian tradisional umumnya bergantung pada *dataset* satu bahasa, sehingga efektivitasnya terbatas dalam konteks multibahasa. Kami menggunakan *dataset* yang terdiri dari bahasa Indonesia, bahasa Inggris, dan campuran Indonesia-Inggris untuk mengevaluasi performa XLM-RoBERTa, yang mencakup 24.844 sampel pelatihan, 2.760 sampel pengujian, dan 100 sampel tambahan. Beberapa hiperparameter utama meliputi ukuran *batch* 16 dan 32, serta laju pembelajaran antara $1e-5$ hingga $5e-5$. Model ini mencapai akurasi hampir sempurna (99,6%) pada *set* pengujian utama dan menunjukkan kemampuan generalisasi yang kuat pada data tambahan realistis dengan skor F1 sebesar 90,94%. Temuan ini menegaskan potensi model dalam konteks linguistik yang kompleks, serta kontribusinya terhadap pengembangan deteksi ujaran kebencian multibahasa yang efektif.

Kata Kunci: alih kode, deteksi ujaran kebencian, teks campuran bahasa, XLM-RoBERTa

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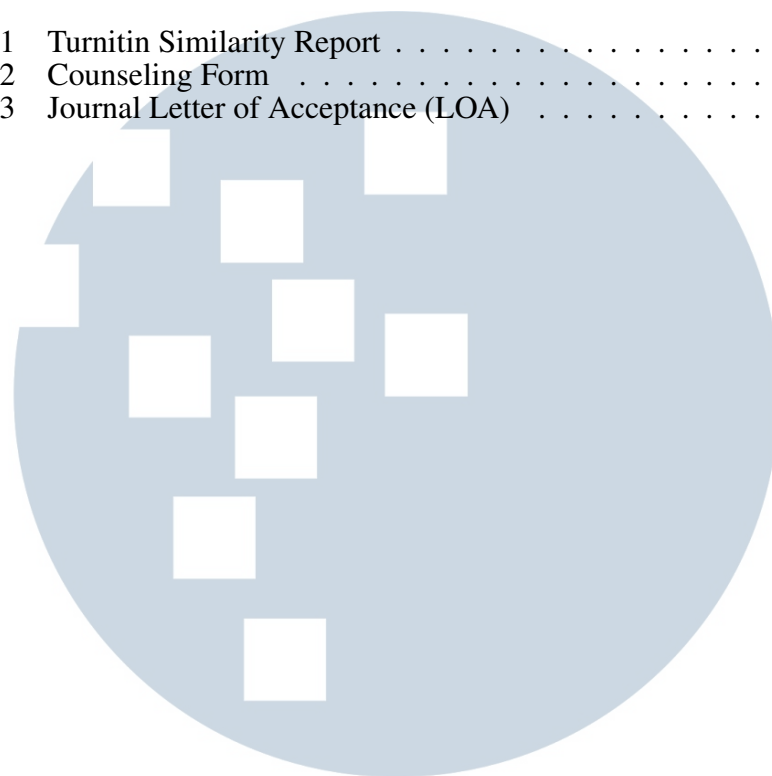
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