

# Benchmarking OCR Engines and VLMs for Automated Evaluation of Handwritten Scanned Answer Scripts

Summary of Undergraduate Thesis under the guidance of Dr. Uttam Kumar Sarkar, Associate Professor,  
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## Abstract

Handwritten academic answer scripts pose persistent challenges for optical character recognition due to high variability in handwriting styles, inconsistent layouts, scan artifacts, and the frequent presence of non-textual elements such as mathematical expressions, diagrams, and tables. Despite recent advances in transformer-based OCR architectures and large-scale multimodal vision-language models (VLMs), their reliability on full-length handwritten examination scripts remains insufficiently studied.

This undergraduate research project investigates the performance of classical OCR engines (Tesseract, EasyOCR), transformer-based models (TrOCR), and contemporary VLMs on a curated dataset of real handwritten university answer sheets. A unified evaluation framework is developed using Word Error Rate, Character Error Rate, ROUGE-L, BLEU, and embedding-based semantic similarity measures to assess both transcription accuracy and contextual fidelity. Model performance is analyzed across diverse content types, including continuous prose, mathematical notation, labeled diagrams, and structured tabular layouts.

By systematically benchmarking these models under identical preprocessing and evaluation conditions, the study identifies key limitations of existing OCR and multimodal approaches for handwritten document understanding. The findings provide a reproducible foundation for downstream applications such as grader-assist systems and automated educational assessment, while highlighting the need for controlled and auditable NLP pipelines in high-stakes academic contexts.

## Project Status and Outcomes

This work is an ongoing undergraduate thesis scheduled for completion in June 2026. The project has resulted in a curated dataset of handwritten examination scripts, a reproducible evaluation pipeline, and comparative analysis of OCR and vision-language models. The outcomes are intended to inform future work on automated academic assessment systems.

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