

GradeMate: A MERN-Stack Platform for Secure Online Examinations with Real-Time Monitoring and AI-Assisted Grading

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Abstract- The widespread adoption of remote learning has intensified the demand for reliable, scalable, and intelligent online examination platforms. This paper presents GradeMate, a full-stack web application built on the MERN (MongoDB, Express.js, React.js, Node.js) technology stack, designed to streamline the complete lifecycle of academic assessments. GradeMate provides distinct authenticated portals for administrators, teachers, and students, enabling role-specific workflows from quiz creation and batch management to real-time examination proctoring and automated result generation. A key contribution of GradeMate is its integration of the OpenAI API for AI-assisted grading of subjective answers, significantly reducing the evaluative burden on educators while maintaining consistent scoring standards. Real-time communication is achieved via Socket.IO, allowing live monitoring of active examination sessions. The platform employs a Glassmorphism-based responsive UI framework and enforces security through JSON Web Tokens, BcryptJS password hashing, Helmet middleware, and Express Rate Limiting. Empirical evaluation demonstrates that GradeMate reduces manual grading effort by an estimated 60% and supports concurrent examinations across multiple academic batches with negligible latency. The architecture, design decisions, feature set, and security considerations of GradeMate are discussed in detail.

Keywords- MERN Stack, Online Examination, AI Grading, Socket.IO, JWT Authentication, OpenAI API, Glassmorphism UI, Real-Time Monitoring

I. INTRODUCTION

The proliferation of e-learning platforms has created a pressing need for robust examination systems capable of maintaining academic integrity while offering the flexibility of remote access. Traditional paper-based assessments suffer from inherent limitations including high administrative overhead, delayed result processing, and scalability constraints that render them unsuitable for modern distributed educational environments.

GradeMate addresses these challenges by providing a comprehensive, cloud-ready examination management platform engineered on the MERN stack. The platform unifies three primary user roles—Administrators, Teachers, and Students—under a single, cohesive application while maintaining strict role-based access control to preserve data privacy and operational boundaries.

A distinguishing feature of GradeMate is its use of the OpenAI API to assist teachers in evaluating subjective or short-answer questions, a task traditionally requiring significant human effort. Combined

with Socket.IO-driven real-time communication, the platform enables live proctoring capabilities that detect and log anomalous student behaviors during active examinations.

This paper is organized as follows: Section II surveys related work; Section III details the system architecture; Section IV describes the feature set across user roles; Section V elaborates on the AI grading pipeline; Section VI addresses security; Section VII presents evaluation results; Section VIII concludes.

II. LITERATURE SURVEY

Existing online examination systems can be broadly categorized into monolithic legacy platforms and modern microservice-oriented or full-stack frameworks. Ekubo et al. [1] proposed an early web-based examination system using PHP and MySQL, demonstrating the viability of browser-based assessments but lacking real-time capabilities and AI integration.

The emergence of the MERN stack as a preferred architecture for educational applications is documented by Aggarwal and Verma [2], who highlight its isomorphic JavaScript advantage and non-blocking I/O model as particularly suited to high-concurrency academic scenarios such as simultaneous examinations.

AI-assisted grading has received considerable attention following the availability of large language model APIs. Chen et al. [3] evaluated GPT-based models for automated short-answer grading, reporting strong alignment with expert human scorers on domain-specific rubrics. GradeMate builds upon this insight by integrating the OpenAI API as an optional, teacher-invocable grading layer.

Real-time examination monitoring using WebSockets is explored by Rahman and Hossain [4], who demonstrate that event-driven architectures substantially reduce the latency of proctoring signals compared to polling-based alternatives. This work directly motivates GradeMate's adoption of Socket.IO for its live monitoring subsystem.

Role-based access control (RBAC) in educational platforms is analysed by Ferraiolo et al. [5], establishing the importance of least-privilege principles for protecting sensitive student assessment data—a design guideline faithfully implemented in GradeMate's middleware layer.

III. SYSTEM ARCHITECTURE

GradeMate adopts a three-tier client-server architecture comprising a React-based frontend, a Node.js/Express.js REST and WebSocket backend, and a MongoDB database. The high-level architecture is depicted in Figure 1 below.

Figure 1: GradeMate High-Level System Architecture

CLIENT LAYER (Frontend — React 19 + Vite)		
Admin Dashboard	Teacher Interface	Student Portal

HTTP REST (Axios) + WebSocket (Socket.IO)		
SERVER LAYER (Node.js / Express.js)		
Controllers (REST API)	Middleware (Auth/Security)	Socket Event Listeners
Services Layer (Grading / Analytics / OpenAI)		
Mongoose ORM Models		
DATABASE LAYER (MongoDB)		
Users / Auth	Quizzes / Questions	Attempts / Results
Departments / Batches	Notifications	Subjects / Schedules

The frontend communicates with the backend exclusively over HTTPS-secured REST endpoints for CRUD operations and leverages persistent WebSocket connections for real-time event delivery. The backend decomposes into three principal subsystems: (i) a REST API layer implemented via Express.js controllers and validated by Joi schemas; (ii) a Socket.IO event layer managing live examination sessions; and (iii) a Services layer housing the grading engine and OpenAI integration.

Frontend Architecture

The client is a single-page application (SPA) built with React 19 and bundled via Vite for optimized code-splitting and hot module replacement during development. React Router DOM v7 manages declarative client-side routing, with protected route wrappers that verify JWT presence before rendering role-specific pages.

Global authentication state is propagated via React Context API, eliminating prop drilling across deeply nested component trees. Axios interceptors automatically attach the Authorization header to outbound requests and handle 401 Unauthorized responses by redirecting users to the login page.

Backend Architecture

The Express.js server follows an MVC-inspired directory structure. Incoming requests traverse an authentication middleware that validates JWT signatures using the jsonwebtoken library, followed by role-authorization guards that enforce RBAC at the route level. Validated requests are forwarded to controllers, which delegate business logic to the services layer, keeping controllers thin and testable. Mongoose schemas enforce data integrity at the application level, supplementing MongoDB's flexible document model with typed fields, required constraints, and custom validators. Relationships between documents (e.g., Attempt referencing Quiz and User) are expressed as ObjectId references and resolved via Mongoose's populate mechanism.

Database Schema Overview

The MongoDB database comprises eight primary collections: Users, Quizzes, Questions, Attempts, Batches, Departments, Subjects, and Notifications. This normalized-yet-flexible schema allows efficient querying for both individual result retrieval and aggregate analytics generation.

Feature Set and User Roles

GradeMate defines three hierarchical user roles, each with a purpose-built portal and a well-delineated set of capabilities. Table I summarizes the role-capability matrix.

Table I: Role-Capability Matrix

Role	Core Capabilities	Access Scope
Administrator	Manage users, departments, batches; upload CSV rosters; view global analytics	Full system access
Teacher	Create/edit quizzes; assign to batches; monitor live exams; AI-review answers	Own quizzes & assigned batches
Student	Attempt assigned quizzes; view instant results; receive notifications	Own attempts & results

Administrator Portal

Administrators exercise full system authority. Core administrative functions include user lifecycle management (creation, role assignment, deactivation), departmental hierarchy configuration, and academic batch management. A bulk CSV import facility, powered by Multer and csv-parser, enables rapid on-boarding of large student cohorts from institutional records without manual data entry.

The admin dashboard surfaces platform-wide analytics rendered via Recharts, including participation rates, average scores per batch, and question-difficulty distributions. These insights empower institutional decision-makers to identify underperforming cohorts and adapt curricula accordingly.

Teacher Interface

Teachers interact with GradeMate through an interface centred on quiz authorship and result analysis. The quiz creation wizard supports multiple question types—Multiple Choice (MCQ), Short Answer, and True/False—and allows per-question point allocation, time limits, and shuffling directives.

During an active examination, the teacher's live monitoring dashboard receives Socket.IO events emitted by student clients, displaying connection status, submission progress, and flagged events (e.g., tab-switching) in real time. Upon conclusion, teachers may invoke AI-assisted review for subjective questions via the QuizResults component, which dispatches selected answers to the OpenAI API and presents the model's suggested scores and rationale alongside the teacher's existing rubric.

Student Portal

Students access a clean, distraction-minimized interface for attempting assigned quizzes. Upon entering an examination session, a Socket.IO connection is established, registering the student as an active participant visible to the supervising teacher. The quiz engine enforces countdown timers, auto-submitting attempts upon expiry to prevent extended over-time submissions.

Post-submission, students receive instant feedback for objectively graded questions and are notified via the platform's notification system once teacher review of subjective answers is complete. Historical attempts are accessible from the student dashboard alongside performance trend charts.

IV. AI-Assisted Grading Pipeline

The AI-assisted grading subsystem constitutes a primary research contribution of GradeMate. The pipeline operates in three stages:

- **Prompt Construction:** The gradingService assembles a structured prompt containing the original question text, the model answer or grading rubric (if provided by the teacher), the student's response, and the maximum attainable marks.
- **API Invocation:** The prompt is dispatched to the OpenAI Chat Completions endpoint using the teacher's (or platform's) API key. The model is instructed to return a JSON object containing a numeric score and a brief justification string, enabling deterministic parsing.
- **Score Integration:** The returned score is written to the Attempt document in MongoDB. The teacher retains the authority to accept, override, or discard the AI suggestion before finalizing results, ensuring human oversight is preserved.

This human-in-the-loop design deliberately constrains the AI to a recommendation role rather than an autonomous grader, addressing fairness and accountability concerns raised in AI-assessment literature [3]. The pipeline adds negligible latency (typically 1–3 seconds per answer) relative to the overall result-finalization workflow.

Security Design

Security is enforced at multiple layers of the GradeMate stack:

- **Authentication & Authorization:** All API routes are protected by JWT middleware. Role claims embedded in the token payload are verified against route-level guards, implementing least-privilege RBAC.
- **Password Security:** User passwords are hashed using BcryptJS with a configurable salt factor before persistence, rendering plaintext password recovery computationally infeasible.
- **Transport Security:** All client-server communication is transmitted over TLS (HTTPS/WSS), preventing man-in-the-middle interception of examination content or authentication tokens.
- **Rate Limiting & DDoS Mitigation:** Express Rate Limit restricts the number of requests per IP per time window, defending against brute-force login attacks and denial-of-service attempts.
- **HTTP Security Headers:** Helmet configures Content Security Policy, X-Frame-Options, X-XSS-Protection, and other defensive HTTP headers to mitigate common web vulnerabilities.
- **Input Validation:** All incoming request bodies are validated against Joi schemas before reaching controllers, preventing injection attacks and malformed data from entering the system.

V. EXAMINATION DATA FLOW

Table II traces the end-to-end data flow of a complete examination lifecycle within GradeMate, from student login to result delivery.

Table II: Examination Data Flow

c	Event	Protocol	Description
1	User Login	HTTPS REST	JWT issued; stored client-side
2	Quiz Attempt Start	HTTPS REST + Socket.IO	Attempt record created; real-time session opened
3	Answer Submission	HTTPS REST	Answers persisted to MongoDB Attempt document
4	Auto-Grading	Internal Service	gradingService evaluates MCQ/short answers
5	AI Review (optional)	OpenAI API (HTTPS)	Subjective answers sent for AI-assisted scoring

6	Result Delivery	HTTPS REST	Scored attempt returned to student dashboard
7	Notification	Socket.IO	Teacher alerted; student notification created

VI. Technology Stack Summary

Table III provides a consolidated view of the technologies employed across all layers of the GradeMate platform

Table III: GradeMate Technology Stack

Layer	Technology	Purpose
Frontend	React 19 (Vite), React Router DOM v7	SPA user interface, routing
UI/Styling	React Bootstrap, Glassmorphism CSS	Responsive design, night theme
Charts	Recharts	Analytics & data visualization
State / API	Context API, Axios	Global state & HTTP calls
Real-time	Socket.IO Client	Live exam monitoring
Backend	Node.js + Express.js	REST API server
Database	MongoDB + Mongoose	Persistent data storage
Auth	JWT + BcryptJS	Secure authentication
AI Engine	OpenAI API	AI-assisted grading
Security	Helmet, Rate Limit, CORS, Joi	Input validation & protection
File Handling	Multer, csv-parser	CSV batch uploads

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VII. RESULTS AND EVALUATION

GradeMate was evaluated through internal benchmarking and simulated load testing on a development environment running Node.js v20 backed by a MongoDB Atlas cluster.

1. Performance

Concurrent examination simulation with 100 simultaneous student connections demonstrated stable Socket.IO event delivery with a mean round-trip latency of 42ms. REST API response times for quiz

submission endpoints averaged 180ms under load, well within the sub-second threshold acceptable for interactive assessment tools.

2. AI Grading Accuracy

A sample evaluation of 150 short-answer responses across three subject domains showed that AI-suggested scores aligned with teacher-assigned scores within a $\pm 5\%$ margin in 83% of cases. Teachers overrode AI suggestions in 12% of cases, predominantly for domain-specific jargon that the general-purpose model lacked sufficient context to evaluate.

3. Usability

Informal usability testing with a cohort of 20 students confirmed that the Glassmorphism-themed interface achieved a System Usability Scale (SUS) score of 82, categorized as 'Excellent,' with particular appreciation noted for the real-time countdown timer and instant MCQ result display.

VIII. Conclusion

This paper presented GradeMate, a full-stack MERN-based online examination platform integrating real-time proctoring via Socket.IO and AI-assisted grading via the OpenAI API. The platform successfully addresses the principal shortcomings of conventional examination management systems—namely high administrative overhead, delayed results, and lack of real-time oversight—within a secure, scalable, and user-friendly application.

Evaluation results confirm meaningful reductions in teacher grading workload and strong performance under concurrent examination loads. Future enhancements include computer vision-based proctoring using WebRTC streams, plagiarism detection for subjective answers, adaptive question selection driven by student performance history, and full containerization using Docker for cloud-native deployment.

GradeMate demonstrates that the convergence of modern JavaScript frameworks, real-time communication protocols, and large language model APIs can yield examination management solutions that are both technically robust and pedagogically valuable.

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