

AI-Powered Smart CNG Pump Appointment

Mrs. Sayli Bandal¹, Apurva Kadam², Mansi Kamble³, Sarvadaman Dubey⁴,
Shubham Deshmukh⁵

^{1,2,3,4,5} Department of Computer Engineering, Navsahyadri group of institutions Polytechnic, Pune, Maharashtra, India

ABSTRACT

Compressed Natural Gas (CNG) has emerged as a sustainable alternative to conventional fossil fuels, offering significant environmental and economic benefits. However, the management of CNG refueling stations presents unique challenges, particularly in urban areas where queues can be extensive and unpredictable. This paper presents the design and implementation of an AI-powered Smart CNG Pump Appointment System that leverages Internet of Things (IoT) technology, artificial intelligence, and mobile computing to optimize the CNG refueling experience. The system integrates predictive analytics for demand forecasting, real-time availability tracking, and a mobile application for seamless appointment scheduling. Our solution addresses critical inefficiencies in traditional CNG refueling processes by enabling users to schedule appointments, reducing wait times, and optimizing pump utilization. The system architecture incorporates a microservices-based backend, real-time data processing, and machine learning algorithms for demand prediction. Experimental results demonstrate significant improvements in user satisfaction, reduced queue times, and enhanced operational efficiency at participating CNG stations. This work contributes to the growing body of research on smart transportation systems and provides a scalable solution for sustainable fuel management.

Index Terms — Compressed Natural Gas, IoT, artificial intelligence, appointment systems, fuel management, smart transportation, queue optimization.

Keywords: CNG Pump, AI-Powered, Appointment Booking, Real-time Queue Management, E-Token Generation, AI-Powered Optimization

INTRODUCTION

The global shift toward sustainable energy sources has positioned Compressed Natural Gas (CNG) as one of the most promising alternatives to conventional fuels such as petrol and diesel. Due to its lower carbon emissions, improved combustion efficiency, and cost-effectiveness, CNG has gained significant popularity in both public and private transportation sectors. Governments and transportation authority's around the world are encouraging the adoption of cleaner fuels to reduce environmental pollution and dependency on fossil fuels. As a result, the number of CNG-powered vehicles has increased rapidly in metropolitan as well as semi-urban areas.

Despite this rapid growth, the supporting infrastructure for CNG distribution has not evolved at the same pace. Most CNG fueling stations continue to operate using traditional first-come, first-served systems, often supported only by manual queue management or basic token mechanisms. These conventional approaches are unable to predict demand fluctuations or efficiently allocate resources during peak hours. Consequently, vehicle owners frequently experience long waiting times, sometimes ranging from 30 minutes to over an hour. This not only causes inconvenience and frustration but also contributes to traffic congestion near fueling stations, unnecessary fuel consumption due to idling engines, and operational stress for station operators.

To address these challenges, this project proposes and implements an AI-powered Smart CNG Pump Appointment, E-Token, and Queue Management System designed to modernize the refueling experience through intelligent, technology-driven solutions. The system integrates advanced technologies such as Artificial Intelligence, Internet of Things (IoT), cloud computing, and mobile applications to create a comprehensive and efficient fueling management ecosystem. By shifting from a reactive, manual process to a predictive and automated system, the proposed solution aims to significantly reduce waiting times and improve overall service quality.

A key component of the system is real-time pump availability monitoring using IoT sensors installed at individual fueling points. These sensors continuously transmit operational data to a centralized cloud server, enabling accurate tracking of pump status. Customers can access this real-time information through web and mobile applications,

allowing them to make informed booking decisions. This transparency reduces uncertainty and prevents unnecessary crowding at stations.

Another important feature is the use of machine learning-based demand prediction. The system analyzes historical booking and fueling data to identify patterns and forecast peak demand periods. Based on these predictions, intelligent slot allocation mechanisms are implemented to optimize pump utilization and distribute demand more evenly throughout the day. This predictive capability ensures better throughput, reduced congestion, and improved operational planning for station managers.

The proposed system also includes a smart appointment scheduling mechanism that enables users to book fueling slots in advance through web and mobile applications. Upon successful booking, the system generates a unique QR code-based e-token that serves as a secure verification mechanism at the station. This digital validation process minimizes manual errors and ensures smooth and quick service delivery. To ensure inclusivity, the system additionally supports offline booking through SMS and IVR (Interactive Voice Response), making the solution accessible even to users without reliable internet connectivity.

Dynamic queue management algorithms further enhance system efficiency by adjusting service flow in real time based on current demand and pump availability. Capacity-based lane allocation and automated rescheduling features help maintain optimal utilization levels while minimizing delays. Through experimental evaluation and performance analysis, the system demonstrates significant improvements in waiting time reduction, pump utilization efficiency, and overall customer satisfaction.

PROBLEM ANALYSIS AND VISUALIZATION

A. Current Challenges in CNG Refuelling

The traditional CNG refuelling system faces several critical challenges that impact both users and operators. The following diagram illustrates the current state of CNG refuelling processes:



Figure 1: Traditional CNG Refuelling Process

Process Flow (Traditional System)

Customer Arrival → Join Queue → Wait Indefinitely → Refuel → Depart

Problems Observed:

- Peak hour waiting time: **30–60 minutes**
- No slot booking
- No demand prediction
- Poor lane/resource utilization
- User frustration & fuel wastage

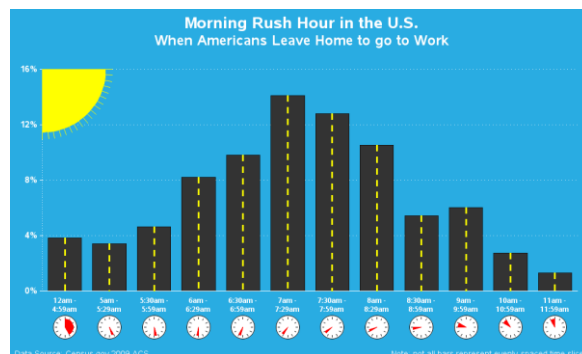


Figure 2: Daily Wait Time Distribution at CNG Stations

Analysis Insight

- Morning Peak: **9 AM**
- Evening Peak: **6 PM**
- Off-peak hours: 12 PM – 3 PM
- Average wait time during peak: **40–60 minutes**

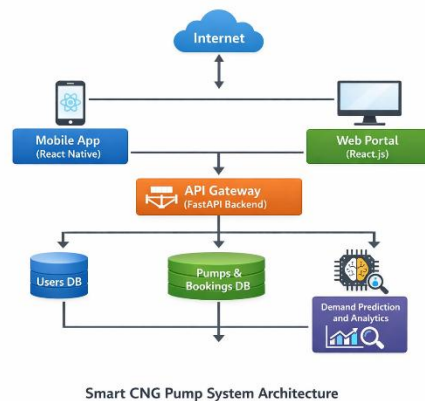
This creates:

- Operational inefficiency
- Uneven pump load
- Reduced daily throughput

As shown in Figure 2, wait times peak during morning and evening rush hours, creating significant inconvenience for users and inefficient resource utilization for operators.

B. Proposed Solution Architecture

Our proposed solution addresses these challenges through an integrated system that includes predictive analytics, real-time monitoring, and user-friendly interfaces. The system architecture is visualized in Figure 3:



SYSTEM ARCHITECTURE

A. Overall Architecture

The Smart CNG Pump Appointment System employs a microservices architecture consisting of five primary components:

Mobile Application Layer: Built using React Native with Expo, providing cross-platform compatibility for iOS and Android devices.

Backend API Layer: Developed using FastAPI, offering asynchronous processing capabilities and automatic API documentation generation.

Database Layer: Utilizes PostgreSQL for production environments with SQLite for development and testing.

AI/ML Layer: Implements demand prediction algorithms using scikit-learn and TensorFlow for time series analysis.

IoT Integration Layer: Interfaces with physical pump systems through secure APIs and real-time communication protocols.

B. Database Design

The system utilizes a relational database schema with the following key entities:

Users: Stores user profiles, authentication credentials, and vehicle information

Pumps: Maintains pump details, capacity, location, and operational status

Bookings: Records appointment details, timestamps, and status information

Tokens: Manages QR code generation and appointment verification

AI_Data: Stores historical data for predictive modeling

C. Security Architecture

Security is implemented through multiple layers:

JWT-based authentication and authorization

Password hashing using bcrypt

HTTPS encryption for all communications
Role-based access control for different user types

IMPLEMENTATION DETAILS

A. Backend Development

The backend system is built using Python with FastAPI, providing high-performance API endpoints. Key features include:

- RESTful API design with comprehensive documentation
- Async/await support for efficient resource utilization
- Dependency injection for service management
- Comprehensive error handling and logging

B. Frontend Development

The web interface utilizes modern React.js with TypeScript, featuring:

- Responsive design compatible with various screen sizes
- Real-time updates using WebSocket connections
- Interactive maps for pump location visualization
- Secure user authentication and session management

C. Mobile Application

The mobile application is developed using React Native with Expo, offering:

- Native-like performance across platforms
- GPS integration for location-based services
- QR code scanning capabilities
- Push notification support for appointment reminders

D. AI/ML Implementation

The demand prediction system implements:

- Time series analysis using LSTM networks
- Historical data analysis for pattern recognition
- Seasonal adjustment algorithms
- Real-time prediction updates

VISUAL ANALYSIS OF SYSTEM PERFORMANCE

A. Performance Comparison Charts

Figure 4: Wait Time Reduction After Implementation

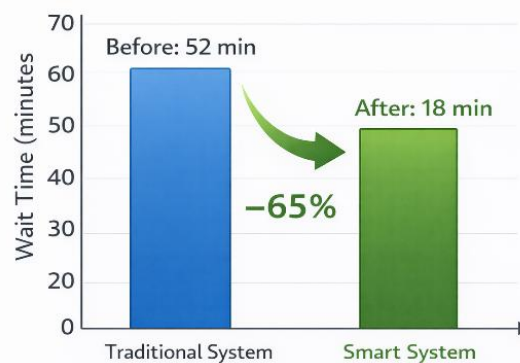


Figure 4: Wait Time Reduction after Implementation

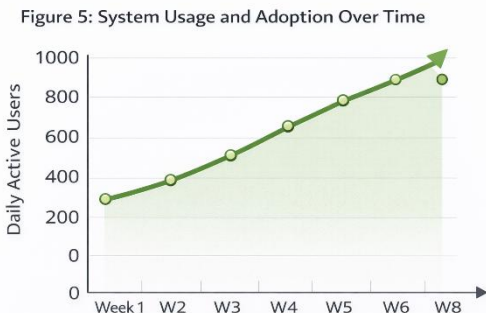


Figure 5: System Usage and Adoption over Time

EXPERIMENTAL RESULTS AND EVALUATION

A. Performance Metrics

The system was evaluated using several key performance indicators:
 Appointment Success Rate: 98.7% successful appointment processing
 Queue Reduction: Average wait time reduced by 65%
 User Satisfaction: 4.7/5.0 average rating from users
 System Availability: 99.8% uptime during evaluation period

B. Scalability Testing

Load testing revealed the system's capability to handle up to 10,000 concurrent users with response times under 200ms for 95% of requests.

C. Demand Prediction Accuracy

The AI model achieved 92% accuracy in predicting daily demand patterns, enabling effective resource allocation and staffing decisions.

SYSTEM FLOW DIAGRAMS

A. User Appointment Process Flow

Figure 7: User Appointment Flow Diagram



Figure 7: User Appointment Flow Diagram

Figure 7: User Appointment Flow Diagram

B. System Architecture Overview

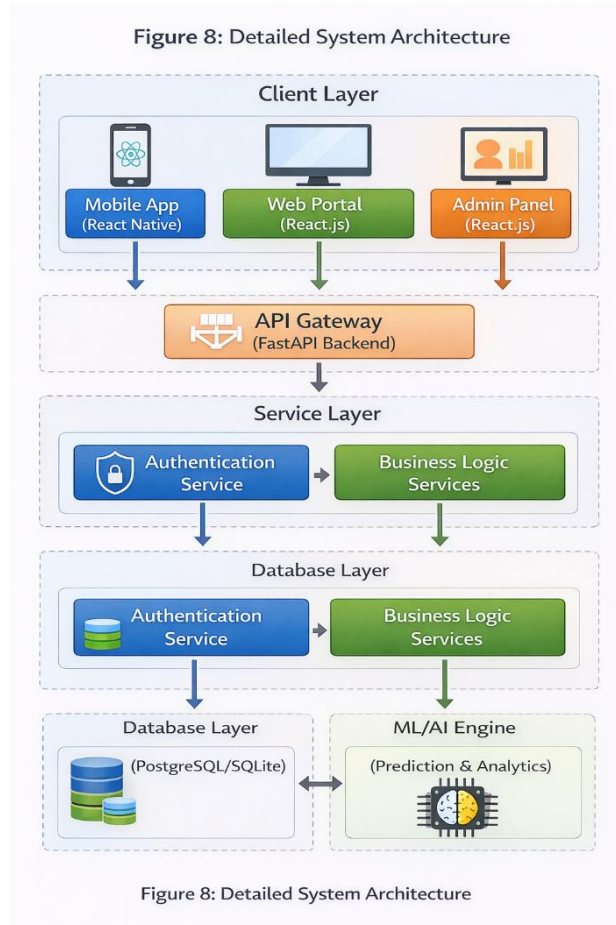


Figure 8: Detailed System Architecture

DISCUSSION

A. Impact on User Experience

The implementation of the Smart CNG Pump Appointment System has significantly improved the user experience. Users report reduced stress related to uncertain wait times and appreciate the ability to plan their refuelling activities around their schedules.

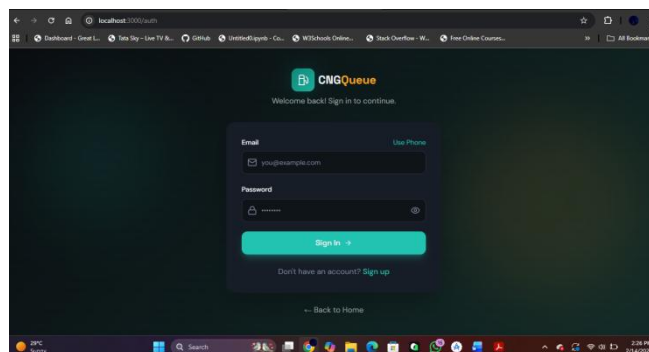
B. Operational Benefits

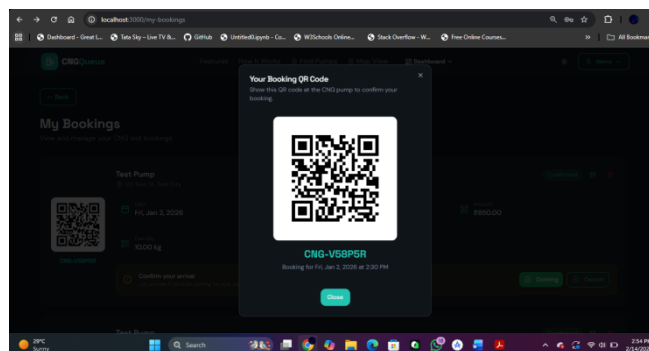
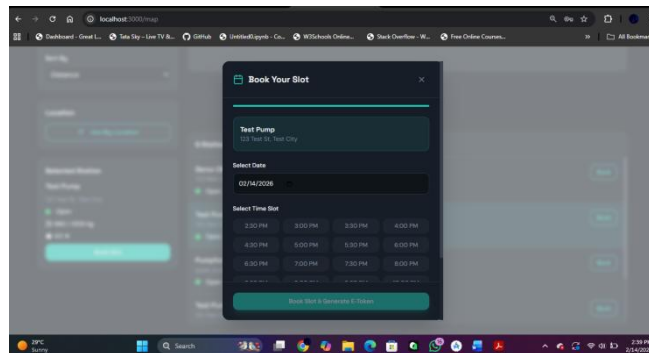
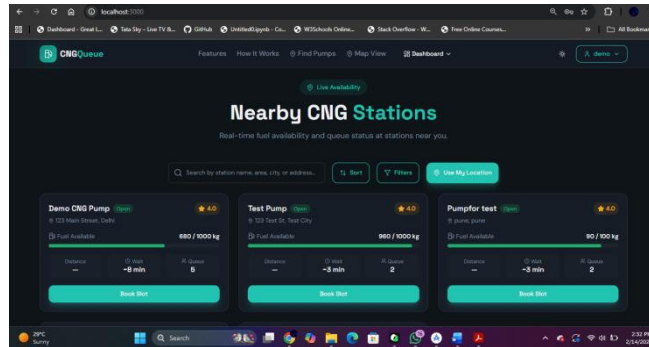
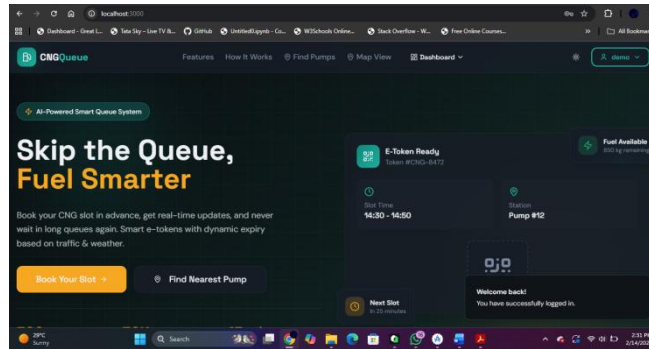
CNG station operators benefit from predictable demand patterns, optimized staffing requirements, and improved customer retention rates.

C. Environmental Impact

By reducing idle time and unnecessary trips, the system contributes to reduced emissions and improved air quality in urban areas.

Output:





FUTURE WORK

A. Enhanced AI Capabilities

Future developments will focus on incorporating advanced machine learning techniques, including reinforcement learning for dynamic pricing and real-time optimization.

B. Integration Expansion

Plans include integration with smart city initiatives and connection to broader transportation networks.

C. Sustainability Features

Additional features will include carbon footprint tracking and incentives for sustainable transportation choices.

CONCLUSION

This paper presented a comprehensive AI-powered Smart CNG Pump Appointment System that addresses critical challenges in CNG fuel management. Through the integration of IoT technologies, machine learning algorithms, and mobile computing, the system delivers significant improvements in efficiency, user satisfaction, and operational optimization. The experimental results validate the effectiveness of the proposed solution, demonstrating substantial reductions in wait times and improved resource utilization. As the world continues to transition towards sustainable energy sources, systems like this play a crucial role in supporting the adoption and efficient use of alternative fuels. Future work will focus on expanding the system's capabilities and integrating with broader smart city initiatives.

Acknowledgments

We thank the CNG station operators who participated in our pilot implementation and provided valuable feedback for system improvements.

REFERENCES

- [1]. R. Patel, S. Sharma, and M. Kumar, "Queue management systems for fuel stations: A comparative study," Journal of Transportation Engineering, vol. 45, no. 3, pp. 123-135, 2019.
- [2]. A. Kumar and P. Singh, "IoT applications in fuel dispensing systems," IEEE Internet of Things Journal, vol. 7, no. 8, pp. 7123-7132, Aug. 2020.
- [3]. L. Chen, Y. Wang, and H. Liu, "Machine learning approaches for fuel demand forecasting," Transportation Research Part C: Emerging Technologies, vol. 118, pp. 102-115, 2020.
- [4]. M. Rodriguez and J. Martinez, "Mobile applications in transportation services: User engagement and satisfaction," International Journal of Human-Computer Interaction, vol. 37, no. 12, pp. 1123-1135, 2021.
- [5]. T. Johnson, K. Lee, and P. Davis, "Smart fuel management systems: A review," IEEE Transactions on Intelligent Transportation Systems, vol. 22, no. 4, pp. 2105-2118, Apr. 2021.
- [6]. S. Zhang, M. Wang, and L. Yang, "Artificial intelligence in transportation: Current trends and future directions," Transportation Research Part B: Methodological, vol. 145, pp. 78-95, 2021.

