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Leveraging AI Tools for Enhanced GST Compliance and Fraud Detection in the Indian Taxation System

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Article History: Received: 25 April 2025 Accepted: 18 May 2025 Published: 05 June 2025	Abstract: The Goods and Services Tax (GST) reform in India marked a significant shift towards a unified and transparent indirect tax regime. However, with increasing transactional complexity, the system has been plagued by compliance challenges and fraudulent practices such as fake invoicing and input tax credit (ITC) misuse. In recent years, Artificial Intelligence (AI) has emerged as a transformative tool in enhancing GST compliance, automating data reconciliation, and identifying anomalies indicative of fraud.
Keywords:	impact of AI tools on GST fraud detection using real-world data from
GST, Taxation System, GST Compliance, Artificial Intelligence.	2018 to 2023. A statistical analysis, including a one-way ANOVA test, reveals a significant reduction in reported fraud cases following the adoption of AI-based monitoring and analytics by tax authorities. The study underscores the potential of AI to strengthen tax enforcement
DOI:	mechanisms, reduce administrative burden, and foster greater
10.62823/EXRE/2025/02/02.51	provided for policymakers to promote wider AI adoption, ensure ethical deployment, and enhance data infrastructure within the GST framework.

Introduction

The Goods and Services Tax (GST), introduced in India in July 2017, represents one of the most significant tax reforms in the country's fiscal history. (Garg, 2024) Designed to unify a complex web of indirect taxes, GST aims to simplify tax administration, enhance transparency, and improve compliance. (Das-Gupta, 2021) Despite these intentions, the implementation has brought forth challenges in enforcement, fraud detection, and real-time compliance, especially given the large volume of transactional data generated across sectors (Ministry of Finance, 2023).

With the growing digitization of tax processes, Artificial Intelligence (AI) has emerged as a promising enabler for tax administration globally. AI tools such as machine learning (ML), natural language processing (NLP), and robotic process automation (RPA) are now being deployed to automate repetitive tasks, identify patterns in taxpayer behaviour, and predict fraudulent activities before they escalate (OECD, 2022).

The Indian GSTN (Goods and Services Tax Network) is already leveraging basic analytics; however, the scale and complexity of data in GST filings demand more advanced AI-driven interventions

to improve efficiency, reduce compliance costs, and curtail fraudulent practices like fake invoicing, input tax credit (ITC) fraud, and circular trading. (Bezditnyi, 2024).

- This paper explores the intersection of AI tools and GST compliance, focusing on how AI can:
- Improve the accuracy and speed of invoice reconciliation
- Identify and prevent tax fraud through predictive modelling
- Offer intelligent assistance to taxpayers and tax administrators

The objective is to propose a roadmap for integrating AI into India's GST ecosystem, drawing insights from global case studies and current practices in the Indian tax tech industry. (Pomeranz, 2015)

Overview of GST Framework in India

The GST system is a comprehensive, destination-based indirect tax levied on the supply of goods and services. It replaces multiple cascading taxes levied by the central and state governments. The three main types of GST are Central GST (CGST), State GST (SGST), and Integrated GST (IGST). (Modi, 2024)

GST compliance involves various filings, including GSTR-1 (outward supplies), GSTR-2B (ITC statement), and GSTR-3B (monthly summary return). Businesses must also undertake annual reconciliations and file GSTR-9 (annual return). (Garg R. &., 2024) (Garg R. &., 2024)

Key features include:

- Unified tax structure
- Input Tax Credit (ITC) mechanism to avoid cascading taxes
- E-way bill and e-invoicing systems

Despite the simplicity in theory, GST implementation has posed challenges such as filing errors, delays, difficulty in invoice matching, and lack of real-time compliance, especially for MSMEs. (Agarwal, 2020)

Challenges in GST Compliance

Several issues impact GST compliance:

- Volume and Complexity of Data: Businesses generate millions of invoices monthly, making manual processing and reconciliation inefficient and error-prone.
- Delayed Return Filings: Mismatched invoices often lead to ITC rejections and penalties.
- **Fraudulent Practices:** Cases of fake invoicing, shell companies, and circular trading schemes to claim ineligible ITC are on the rise (Sharma & Iyer, 2021).
- **Integration Issues:** Disparate accounting software and lack of API integration with GSTN complicate data flow.

These challenges create opportunities for AI to enhance automation and data accuracy in the system. (Kumar, 2019)

Role of AI in Modern Tax Systems

Around the world, tax administrations are increasingly embracing Artificial Intelligence (AI) to modernize enforcement mechanisms, reduce revenue leakages, and streamline taxpayer services. With the explosion of digital data, conventional tax enforcement strategies—reliant on audits and manual scrutiny—are no longer sufficient to deal with complex and high-volume transactional ecosystems. (Rao, 2021) AI offers tax authorities the ability to shift from a reactive to a proactive model of governance by identifying risks, anomalies, and fraudulent behaviours before they cause substantial fiscal harm. (Thakur, 2019)

Globally, tax authorities have begun adopting AI to tackle issues of fraud and compliance. For example:

- Her Majesty's Revenue and Customs (HMRC), United Kingdom: Uses machine learning (ML) algorithms to detect anomalies in taxpayer behaviour, automate compliance risk scoring, and flag potential underreporting or tax evasion in real time (Allingham, 1972). HMRC's "Connect" system reportedly analyzes over 1 billion items of data from government and public sources to profile taxpayers and detect inconsistencies.
- Australian Taxation Office (ATO): Utilizes Natural Language Processing (NLP) to parse written communication such as emails, declarations, and support documents submitted by

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taxpayers. NLP helps in detecting intent, inconsistency, or even potential fraud in complex narratives, improving case triaging and resolution times.

• Internal Revenue Service (IRS), United States: Applies AI and predictive analytics to optimize audit selection processes. By analyzing patterns across vast tax return datasets, the IRS identifies high-risk cases more accurately and improves enforcement efficiency. AI has also been used in detecting refund fraud and duplicate filings (OECD, 2022).

Core Applications of AI in Taxation

The integration of AI in tax systems supports several operational and strategic functions:

Automation of Routine Tasks

Al-driven systems can automate data extraction, return filing, document verification, and invoice matching—drastically reducing manual errors and operational costs.

Fraud Detection & Anomaly Identification

AI models, especially supervised learning algorithms, can detect outliers in tax declarations, identify abnormal transaction patterns, and spot shell companies or fake invoices with high precision.

Risk Profiling and Predictive Compliance

Using predictive analytics, authorities can develop risk profiles for taxpayers based on their filing history, transaction volume, and business network. This enables targeted audits and early intervention strategies.

Taxpayer Assistance through AI Chatbots

Many jurisdictions have introduced AI-powered virtual assistants to guide users through filing procedures, clarify regulations, and provide 24/7 support. These systems also reduce the workload of call centers and compliance officers.

Sentiment and Behavioral Analysis

Advanced AI tools analyze taxpayer sentiment in communication (emails, feedback, appeals) to detect dissatisfaction, intent to evade, or potential legal issues. This has helped improve service delivery and compliance culture.

Application of AI in GST Operations

AI has several direct applications within the GST system:

Automated Invoice Matching

One of the most error-prone and labor-intensive tasks in GST compliance is the matching of purchase and sales invoices between buyers and suppliers. Discrepancies often lead to the denial of Input Tax Credit (ITC), penalties, and compliance burdens.

AI-powered ML models can:

- Automatically compare and validate invoices from GSTR-1 (supplier's return) and GSTR-2A/2B (recipient's auto-populated return).
- Flag mismatches in tax amounts, GSTIN numbers, and item classifications.
- Adaptively learn from past corrections to improve matching accuracy over time.
- This significantly reduces human intervention, processing time, and risks associated with ITC claims.

Risk Profiling and Predictive Analytics

Al can enhance the enforcement capabilities of tax authorities by developing **risk scores** for individual taxpayers or entities. These scores are based on:

- Filing history and return accuracy
- Frequency and scale of mismatches or delays
- Network relationships with high-risk entities
- Volume and diversity of transactions

Al models use both structured data (returns, invoices) and unstructured data (communications, behavior) to assign compliance risk levels. Authorities can then prioritize audits and interventions, optimizing enforcement resources.

Fraud Detection

A major area of GST fraud involves shell companies, circular trading, and fake invoice chains. Traditional methods struggle to detect such complex, multi-party arrangements.

Al-based graph analytics can:

- Map transactions across businesses to identify unusual patterns.
- Detect closed-loop trading, where goods/services are cycled through fake firms to claim illegitimate ITC.
- Uncover fraud rings using link prediction and anomaly detection.

These models are trained on labeled fraud cases and improve continuously with more data, enabling authorities to prevent fraud before ITC is credited.

Reconciliation Tools

Reconciliation between books of accounts and GST returns is critical but often overlooked by small and medium enterprises. Errors in this process can lead to ITC loss, penalties, and litigation.

Al-powered tools:

- Automatically reconcile accounting data with GSTR-2A/2B.
- Detect inconsistencies in HSN codes, invoice numbers, and GST amounts.
- Suggest corrective actions and alert businesses before filing.

Such tools are now offered by platforms like ClearTax, Zoho, and Tally, making reconciliation more accurate and user-friendly.

Chatbots and NLP

Given the complexity of GST law and filing procedures, many taxpayers struggle with interpretation and compliance. Al-driven chatbots offer 24/7 support in natural language to:

- Explain GST return procedures and deadlines
- Help taxpayers identify applicable tax rates, codes, and forms
- Assist in responding to notices or departmental queries

Using NLP, these bots can also understand user intent, suggest relevant help documents, and reduce dependency on tax consultants for basic tasks.

Risks, Limitations and Ethical Concerns

While Artificial Intelligence (AI) offers transformative potential for tax systems, its integration into the GST framework must be approached with caution. The use of AI in public financial systems, especially in areas involving compliance, surveillance, and fraud detection, raises significant ethical, legal, and operational risks. Ensuring a balance between automation and accountability is essential to maintain trust, fairness, and transparency in the tax ecosystem.

Data Privacy and Security

Al systems in GST operate on vast amounts of taxpayer data, including invoice-level details, transaction histories, and business relationships. This data is extremely sensitive and, if compromised, could lead to:

- Identity theft or financial fraud
- Exposure of proprietary business information
- Loss of public trust in government systems

Strict data protection protocols, encryption standards, and adherence to India's Digital Personal Data Protection Act, 2023 are essential to secure taxpayer information. (Bhatia, 2021)

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Algorithmic Bias and Misclassification

Al models learn from historical data, which may itself be biased or unrepresentative. This can lead to:

- Misclassification of compliant taxpayers as high-risk
- Unfair scrutiny or audits of small businesses due to limited data
- Reinforcement of existing systemic biases (e.g., industry type, location)

If not regularly audited and calibrated, biased AI systems can undermine fairness and erode taxpayer confidence in automated compliance systems.

Legal and Admissibility Issues

Al-generated outputs, such as fraud flags, risk scores, or anomaly alerts, may **lack transparency** or explainability, especially if based on complex neural networks. This raises questions like:

- Can such insights be used as legal evidence?
- Is the taxpayer entitled to an explanation?
- How can one challenge an AI-generated classification?

Legal frameworks need to evolve to accommodate **explainable AI (XAI)** and establish standards for **auditability and accountability** in algorithmic decision-making.

• Over-Reliance on AI and De-skilling

Excessive dependence on AI can:

- Reduce the skillset of human tax professionals
- Create blind spots where AI fails (e.g., interpreting context or intent)
- Lead to automation bias, where human agents accept AI decisions without question
- Sustainable deployment should focus on Al-human collaboration, not substitution.

Lack of Regulatory and Ethical Oversight

As of now, India lacks a comprehensive AI governance framework specifically for public finance. Without proper oversight, the following risks increase:

- Use of black-box models with no transparency
- Data being used beyond its original consented purpose
- Lack of redressal mechanisms for taxpayers affected by AI errors

According to NASSCOM (2022), ethical AI in governance must follow principles of fairness, accountability, transparency, and human oversight.

Recommendations for Ethical AI Use in GST

- To ensure safe and responsible adoption of AI in GST, the following steps are recommended:
- Implement periodic audits of AI models for fairness and accuracy
- Establish explainable decision-making frameworks
- Train tax officers and developers in AI ethics and compliance law
- · Set up independent oversight bodies to monitor AI deployments in tax administration

Review Literature

The integration of Artificial Intelligence (AI) into tax systems has become a global trend, driven by the need for proactive fraud detection, enhanced compliance, and operational efficiency. The foundational work by Allingham and Sandmo (1972) emphasized that taxpayer behavior is influenced by the likelihood of detection and penalties, laying the theoretical basis for data-driven enforcement strategies. Globally, tax authorities have begun leveraging AI to modernize their systems—such as the UK's HMRC using machine learning for risk profiling, the IRS in the U.S. optimizing audits through predictive analytics, and the Australian Tax Office using NLP for document review (OECD, 2020; OECD, 2022). In the Indian context, the implementation of the Goods and Services Tax (GST) has led to growing concerns around invoice fraud, fake input tax credit claims, and shell firms. Projects like "Insight" by the Central Board of Direct Taxes (CBDT, 2018) and AI-powered analytics by the GST Network (GSTN, 2023) are examples of digital initiatives aimed at enhancing compliance. Empirical studies by Das-Gupta et al. (2021) and Tandon and Kapoor (2022) have shown how AI and predictive analytics have improved compliance by identifying fraud patterns within GST filings. However, scholars such as Schreiber and Ozturan (2022) and institutions like NASSCOM (2022) and MeitY (2023) raise ethical concerns related to data privacy, bias, and transparency in algorithmic governance. While global and Indian literature highlight the potential of AI in tax administration, few studies combine quantitative validation (e.g., statistical testing) with ethical and operational analysis, creating a gap that this research aims to address.

Research Objectives

- To identify and document the current applications of AI in GST operations, including invoice matching, risk profiling, and fraud detection.
- To evaluate the effectiveness of AI tools in detecting and reducing GST fraud, using real-world data and statistical methods.
- To examine the ethical, legal, and operational risks associated with AI adoption in tax administration.
- To propose a policy and implementation roadmap for the scalable and responsible deployment of AI in the GST system.

Research Methodology

This research employs a mixed-methods approach combining qualitative insights with quantitative analysis. The methodology includes:

Data Collection

- Secondary data was collected from credible sources such as the Ministry of Finance, PIB India, GSTN reports, and reputed financial news publications (e.g., Economic Times, Business Standard).
- Data on GST fraud cases (2018–2023), both before and after the adoption of AI tools, was compiled to observe trends and patterns.

Analytical Tools and Techniques

- A One-Way ANOVA (Analysis of Variance) was performed to test whether the reduction in fraud cases after AI implementation is statistically significant.
- A literature review was conducted covering global AI adoption in tax systems, including practices from the UK, USA, and Australia.
- Case studies of Indian tax tech startups (Clear Tax, Tally, Zoho) were analysed to understand practical applications of AI in GST compliance.

Year	Fraud Cases Detected	Approx. Value Involved (INR)	Notes
2018	10,000+	₹10,000+ crore	Initial surge in fake invoicing
2019	12,000+	₹11,500 crore	Govt starts matching GSTRs
2020	13,000+	₹15,000 crore	Increase in shell firm detection
2021	9,000+	₹12,000 crore	Use of data analytics begins
2022	8,200	₹12,300 crore	AI-based analysis expanded
2023	7,800 (till Nov)	₹13,000 crore+	Real-time e-invoicing flagged cases

Table 1: GST Fraud Cases in India (2018–2023)

Sources: PIB India, Economic Times Reports (2021-2023), Ministry of Finance Statements

AI Implementation Timeline in GST

- Pre-Al Phase (2018–2020): Fraud detection primarily manual, via audits.
- Post-Al Phase (2021–2023): Use of Al, data analytics, and e-invoice matching algorithms.

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ANOVA Test Result

We applied a **One-Way ANOVA** to determine if there's a statistically significant difference in the average number of GST fraud cases **before and after AI tools were implemented**.

F-statistic: 12.31

P-value: 0.0247

Interpretation

Since the p-value < 0.05, we reject the null hypothesis, which means:

- There is a statistically significant reduction in fraud cases after AI tools were introduced in the GST system (from 2021 onward).
- This suggests AI-based detection and monitoring systems had a meaningful impact in reducing fraud.

Conclusion

This research highlights the transformative potential of Artificial Intelligence (AI) in enhancing the efficiency, transparency, and integrity of India's Goods and Services Tax (GST) system. As GST continues to evolve into a digitally governed tax regime, the integration of AI tools—such as machine learning, natural language processing, and graph analytics—has played a critical role in addressing key compliance challenges, particularly in areas of invoice matching, fraud detection, and risk profiling.

By analyzing real-world data from 2018 to 2023 and applying statistical methods such as ANOVA, the study provides empirical evidence that AI implementation has led to a significant reduction in fraud cases. This validates the hypothesis that intelligent automation and predictive analytics can bolster the enforcement capabilities of tax authorities and reduce the dependency on manual audits and retrospective scrutiny.

However, the adoption of AI is not without risks. Concerns around data privacy, algorithmic bias, legal admissibility, and over-reliance on automated systems must be addressed through robust governance, regulatory frameworks, and continuous model validation. Furthermore, ethical deployment requires a balance between automation and human oversight to ensure fairness and accountability.

In conclusion, AI is not just a technological upgrade—it represents a strategic shift in how tax systems can operate in the 21st century. For India's GST system, AI offers a pathway toward proactive enforcement, cost-effective compliance, and intelligent public service delivery. Moving forward, a collaborative approach involving the government, private sector, and academia will be essential to scale AI adoption responsibly and sustainably across the taxation landscape.

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