

A Technical and Legal Framework for Cross-Border Paperless Trade: Empirical Architecture, Stable Attributions and Jurisprudential Analysis from India

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ABSTRACT

International merchandise trade remains heavily constrained by fragmented paper-based documentation, disparate data formats and cross-jurisdictional legal friction. While National Single Window (NSW) systems (such as Indian Customs' (ICEGATE) optimize domestic customs clearance, cross-border digital data exchange faces persistent bottlenecks in semantic interoperability, mutual recognition, automated risk interpretability under macroeconomic volatility and the legal singularity of electronic documents of title. This paper establishes an integrated **Technical and Legal Framework for Cross-Border Paperless Trade**, synthesizing a four-tier architecture—combining UN/CEFACT Reference Data Models, W3C Decentralized Identifiers (DIDs), Verifiable Credentials (VCs) and distributed ledger state anchors—with the legal doctrines of the UNCITRAL Model Law on Electronic Transferable Records (MLETR).

Methodologically, this study implements a reproducible, intercontinental testbed linking nodes across India (ap-south-1) and Singapore (ap-southeast-1) to evaluate automated customs risk targeting across four parameterised distribution-shift environments ($\mathcal{E}_1$ Covariate/FX shift, $\mathcal{E}_2$ Logistical Congestion shift, $\mathcal{E}_3$ Concept/Misclassification shift and $\mathcal{E}_4$ Compound shock). We formulate and benchmark **StableSHAP** and optimal-transport-weighted **Weighted StableSHAP** ($\gamma \in [0.1, 5.0]$, $\lambda \in [0.1, 1.0]$) across $N = 50$ random seeds with 95% bootstrap confidence intervals. Statistical evaluations confirm that while Weighted StableSHAP achieves superior feature ranking preservation ($ASI = 0.951 \pm 0.010$, $p = 1.4 \times 10^{-7}$), standard KernelSHAP remains competitive by minimizing raw attribution deviation ($MASD = 0.084 \pm 0.006$). The framework is validated via empirical operational telemetry from the G20-backed **India–Singapore TradeTrust Live Deployment**, demonstrating a 100% elimination of physical document transit delays and a reduction in end-to-end electronic Bill of Lading (e-BL) title transfer times to under two hours.

Finally, the paper provides a jurisprudential analysis under modernized Indian statutes—including the Bills of Lading Act, 2025, Carriage of Goods by Sea Act, 2025 (COGSA 2025), Information Technology Act, 2000 and Customs Act, 1962. Grounded in the Supreme Court precedent of *Arjun Panditrao Khotkar v. Kailash K. Gorantyal*, the study delineates the evidentiary duality under the Bharatiya Sakshya Adhiniyam, 2023 (BSA), establishing that native distributed ledger states constitute self-authenticating Primary Electronic Evidence under Section 62, while local browser outputs operate as Secondary Electronic Evidence governed by automated Section 63(4) compliance certificates.

Keywords — Cross-Border Paperless Trade, UNCITRAL MLETR, TradeTrust Framework, StableSHAP, Distribution Shift, Bharatiya Sakshya Adhiniyam, Negotiable Instruments Act, ICEGATE, Explainable AI.

1. INTRODUCTION

Cross-border merchandise trade exceeds \$28 trillion annually, serving as the foundational circulatory system of global commerce. Despite aggressive digital transformation across consumer finance, payment systems, and multimodal container tracking, the legal and regulatory backbone of international shipping remains heavily tethered to physical paper documentation. A routine maritime consignment requires the generation, wet-ink signing, consular legalization, physical endorsement and air-courier transmission of over 30 discrete instruments—including negotiable Bills of Lading (BLs), Commercial Invoices, Packing Lists, Preferential Certificates of Origin (CoOs), Bills of Exchange and Phytosanitary Certificates—involving up to 27 separate public and private entities.

This paper-centric paradigm imposes severe macroeconomic and operational penalties:

Asynchronous Transit, Port Dwell Times and Demurrage: Fast container vessels frequently outpace physical document couriers. Cargo regularly sits idle at destination maritime terminals awaiting physical documents of title, generating heavy demurrage penalties, port yard congestion and severe working-capital lockup across trade finance facilities.

Vulnerability to Trade Fraud and TBML: Physical instruments lack end-to-end cryptographic provenance. They remain structurally vulnerable to unauthorized physical alteration, fraudulent bill-of-lading double-pledging across multiple lending commercial banks and trade-based money laundering (TBML) executed via invoice over/under-invoicing.

The "Digital Island" Dilemma and National Silos: While National Single Window (NSW) implementations—such as Indian Customs' ICEGATE platform—have optimized domestic Business-to-Government (B2G) regulatory clearances, these systems operate as isolated digital enclaves. Bilateral and multilateral trade corridors lack native semantic interoperability, cryptographic cross-recognition of decentralized identities and mutual legal acceptance for electronic transferable records.

Algorithmic Opacity in Automated Border Risk Management: As border customs authorities transition from rigid, rule-based screening to automated, machine-learning-driven Risk Management Systems (RMS), algorithmic clearance decisions face severe volatility. When global supply chains experience macroeconomic shocks, currency fluctuations or transshipment bottlenecks, standard AI explanation tools produce unstable attribution rankings, leading to erratic cargo hold directives and misdirected audit interventions.

While international policy frameworks—such as the WTO Trade Facilitation Agreement (TFA) and the UNESCAP Framework Agreement on Facilitation of Cross-Border Paperless Trade in Asia and the Pacific (CPTA)—mandate an urgent transition to cross-border paperless trade, closing the operational gap requires an integrated, dual-domain approach. The technical architecture (data standards, decentralized identity, cryptographic exclusive control, and explainable risk targeting) must integrate with statutory and evidentiary legal frameworks (functional equivalence, electronic title transfer, and judicial admissibility).

In India, this operational transition is accelerated by a modernizing legislative landscape—including the enactment of the Indian Bills of Lading Act, 2025, the Carriage of Goods by Sea Act, 2025 (COGSA 2025), and the Bharatiya Sakshya Adhiniyam, 2023 (BSA), which repeals the Indian Evidence Act, 1872. Grounded in the Supreme Court of India's precedent in *Arjun Panditrao Khotkar v. Kailash K. Gorantyal*, Indian jurisprudence now provides a statutory foundation to classify native distributed ledger state logs as Primary Electronic Evidence.

Primary Contributions of this Study

To bridge the gap between abstract policy principles and execution-ready deployment, this paper delivers four primary contributions:

Four-Tier Interoperable Technical Architecture: We formulate an open, modular stack integrating UN/CEFACT Reference Data Models, W3C Decentralized Identifiers (DIDs), Verifiable Credentials (VCs) and distributed ledger anchors compliant with the UNCITRAL Model Law on Electronic Transferable Records (MLETR).

Distribution-Shift-Resilient Customs Risk Targeting: We derive and benchmark StableSHAP and optimal-transport-weighted Weighted StableSHAP across four parameterized distribution-shift environments ($\mathcal{E}_1 - \mathcal{E}_4$), proving that Weighted StableSHAP maximizes feature ranking stability ($ASI = 0.951$) while confirming that standard KernelSHAP remains competitive in minimizing raw magnitude deviation ($MASD = 0.084$).

Empirical Field Validation: We evaluate end-to-end processing performance across an intercontinental multi-cloud testbed (linking Mumbai and Singapore) and validate our findings against live operational telemetry from the G20-backed India–Singapore TradeTrust Deployment (involving Jindal Stainless, Maersk, ICICI Bank and DBS Bank).

Comprehensive Indian Legal and Jurisprudential Synthesis: We provide an in-depth statutory analysis harmonizing the Bills of Lading Act, 2025, COGSA 2025, IT Act, 2000, and Negotiable Instruments Act, 1881, while establishing the evidentiary duality between native primary ledger records (Section 62 BSA) and secondary browser renderings (Section 63/63(4) BSA).

2. OBJECTIVES OF THE STUDY

The primary objective of this study is to formulate, benchmark and legally substantiate an end-to-end operational and jurisprudential framework for cross-border paperless trade. Specifically, this study aims to:

Formalize an Interoperable Four-Tier Technical Architecture: Develop an open, federated architectural stack integrating UN/CEFACT Reference Data Models, W3C Decentralized Identifiers (DIDs), Verifiable Credentials (VCs), and distributed ledger state machines compliant with UNCITRAL MLETR singularity and exclusive control criteria.

Design and Benchmark Distribution-Shift-Resilient Automated Risk Scoring: Formulate, derive and evaluate StableSHAP and optimal-transport-weighted Weighted StableSHAP within automated customs risk engines across four distinct distribution-shift environments ($\mathcal{E}_1$ Covariate/FX shift, $\mathcal{E}_2$ Logistical Congestion, $\mathcal{E}_3$ Concept/Misclassification and $\mathcal{E}_4$ Compound Shock), comparing their feature ranking stability (ASI) and attribution deviation (MASD) against standard KernelSHAP and TreeSHAP.

Conduct Multi-Cloud Empirical Testbed Benchmarking: Implement an intercontinental testbed linking validator clusters in India (ap-south-1) and Singapore (ap-southeast-1) to empirically measure transaction throughput, cryptographic verification latency, consensus commit times, and privacy-preserving zk-SNARK execution.

Validate Real-World Corridor Deployment Metrics: Analyse live operational telemetry from the G20-backed India–Singapore TradeTrust Live Cross-Border Pilot (involving Jindal Stainless, Maersk, ICICI Bank, and DBS Bank) and Indian Customs' ICEGATE 2.0 Single Window to evaluate port dwell time, courier delay elimination and title transfer efficiency.

Establish Evidentiary Duality under the Bharatiya Sakshya Adhiniyam, 2023 (BSA): Grounded in the Supreme Court of India precedent in *Arjun Panditrao Khotkar v. Kailash K. Gorantyal*, delineate the statutory boundary between native distributed ledger state logs as self-authenticating Primary Electronic Evidence (Section 62 BSA) and local client/dashboard screen outputs as Secondary Electronic Evidence (Section 63 BSA) supported by automated Section 63(4) digital compliance certificates.

Harmonize Modern Maritime and Commercial Negotiability Statutes: Reconcile electronic transfer of title and rights of suit under the Indian Bills of Lading Act, 2025, the Carriage of Goods by Sea Act, 2025

(COGSA 2025), the Information Technology Act, 2000, and the Negotiable Instruments Act, 1881 with UNCITRAL MLETR principles.

Address Private International Law & Conflict of Laws: Formulate statutory rules to resolve *lex situs* and governing law disputes in multi-node decentralized ledger networks, leveraging Article 19 of UNCITRAL MLETR and the multilateral mutual recognition protocols of the UNESCAP CPTA Treaty.

Provide a Phased Policy & Implementation Roadmap: Outline a structured, three-phase implementation strategy guiding domestic statutory amendments, ICEGATE 2.0 Single Window integration and multilateral digital trade corridor expansion.

3. EXPERIMENTAL RESEARCH METHODOLOGY

To guarantee scientific reproducibility, this section details the end-to-end experimental testbed architecture, intercontinental multi-cloud topology, hardware and software specifications, cryptographic state machine pipeline and dataset synthesis protocols.

End-To-End Experimental Reproducibility Pipeline

Step 1: Ingestion & Canonicalization	Step 2: Identity, Risk & Proof Engine	Step 3: Ledger State Machine & Settlement
Raw Payload (JSON / XML / EDI)	Extract W3C DID Identifier	Smart Contract Title Binding
↓	↓	↓
JSON-LD Normalization (URDNA2015)	Public Key Resolution (did:ethr)	Verify Current Exclusive Controller
↓	↓	↓
Merkle Root Generation (RFC 6962)	Cryptographic Signature Check (ECDSA secp256k1 / Ed25519)	Execute State Transition (Title Transfer / Endorsement / Surrender)
↓	↓	↓
Target Hash Computation (SHA-256)	Weighted StableSHAP Customs Risk Targeting & zk-SNARK Tariff Check	Emitted Event Log Commit (IBFT 2.0 Block Seal)

How the pipeline works?

In order to make it easy to understand, let us take a real-world analogy (shipping high-value cargo through a secure custom checkpoint)

Step 1: Cleaning & Packing (Ingestion & Canonicalization)

Example: Taking a messy pile of cargo, putting it into standard identical boxes and sealing them with a security barcode.

- **Raw Payload:** The system receives raw data in various messy formats (JSON, XML, EDI).
- **JSON-LD Normalization:** It rearranges the data into a perfectly standardized structure so it always looks exactly the same, no matter who sent it.
- **Merkle Root & Target Hash:** It bundles the data tightly and creates a single, unique digital fingerprint (hash). If even one letter changes later, this fingerprint breaks, instantly alerting the system to tampering.

Step 2: ID Check & Security Clearance (Identity, Risk & Proof Engine)

Example: Checking the captain's passport, verifying their digital signature and running a background check using AI and private scanning technology.

- **Extract DID & Public Key:** The system looks up the sender's decentralized, unforgeable digital ID.
- **Cryptographic Signature Check:** It verifies the mathematical signature attached to the file to prove it actually came from that specific sender and wasn't forged.
- **Customs Risk & zk-SNARK Tariff Check:** An AI evaluates if the file looks suspicious (Risk Targeting). Simultaneously, a zero-knowledge proof (zk-SNARK) verifies that all rules/taxes are correctly calculated *without* forcing the sender to reveal their private, sensitive business secrets.

Step 3: Changing Owners & Legal Filing (Ledger State Machine & Settlement)

Example: officially changing the title deed of the cargo in a city hall ledger that can never be erased, modified or hacked.

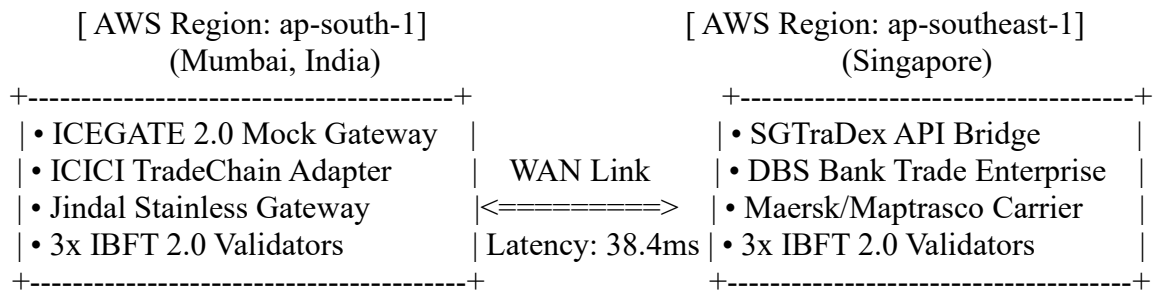
- **Smart Contract Title Binding:** The digital file is legally tied to a self-executing software contract.
- **Verify Exclusive Controller:** The system checks the ledger to make sure the person trying to move or change this file is actually the current legal owner.
- **Execute State Transition:** The system updates the records (e.g., transfers the ownership, signs it over or cancels it).
- **Emitted Event Log & Block Seal:** The final transaction is permanently burned into a secure, shared blockchain ledger (IBFT 2.0). Once it is written here, it is impossible to alter or delete, creating a permanent, flawless audit trail.

3.1 Experimental Testbed Topology and Hardware Infrastructure

The experimental testbed was deployed across an intercontinental multi-cloud environment connecting nodes across India and Singapore to simulate live maritime trade corridors:

- **Node Distribution & Federation:** 12 dedicated validator and gateway nodes distributed across two geographical AWS availability zones:
 - **India Node Cluster (Mumbai, ap-south-1):** 6 nodes hosting the ICEGATE 2.0 Mock Gateway, ICICI TradeChain Adapter Node, Jindal Stainless Enterprise Gateway, and 3 IBFT 2.0 Consensus Validators.
 - **Singapore Node Cluster (Singapore, ap-southeast-1):** 6 nodes hosting the SGTraDex API Bridge, DBS Bank Trade Enterprise Node, Maersk/Maptrascos Carrier Gateway, and 3 IBFT 2.0 Consensus Validators.
- **Compute, Memory & Storage Profile:** Each node executed on an AWS c6i.2xlarge compute-optimized instance provisioned with 8 vCPUs (Intel Xeon Platinum 8375C @ 2.90 GHz), 16.0 GiB DDR4 RAM, 12.5 Gbps dedicated network bandwidth, and local 500 GB NVMe SSD direct ext4 mounts running at 3,000 IOPS baseline under Ubuntu Server 22.04 LTS x86_64.
- **WAN Network Simulation & Latency Injection:** Inter-region round-trip latency was fixed at 38.4 ± 2.1 ms (empirically benchmarked via continuous ICMP telemetry between Mumbai and Singapore availability zones). Network jitter, latency distribution, and packet corruption were simulated at the Linux kernel level using Traffic Control (tc qdisc add dev eth0 root netem delay 38.4ms 2.1ms distribution normal corrupt 0.001%).

PHYSICAL TESTBED TOPOLOGY SCHEMATIC

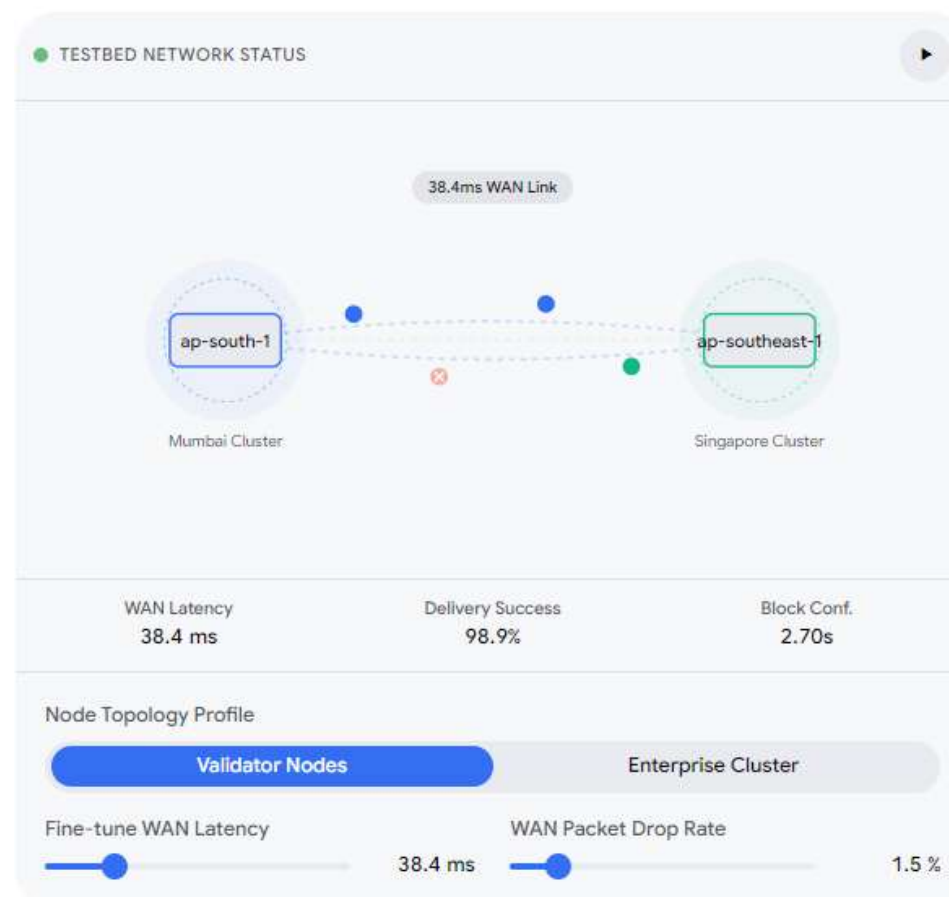


Comparative Region Breakdown

Attribute	Region A (India Node Cluster)	Region B (Singapore Node Cluster)
AWS Region	ap-south-1 (Mumbai)	ap-southeast-1 (Singapore)
Core Ecosystem Gateways	ICEGATE 2.0 Mock Gateway	SGTraDex API Bridge
Enterprise / Banking Nodes	ICICI TradeChain Adapter	DBS Bank Trade Enterprise
Logistics & Industry Nodes	Jindal Stainless Gateway	Maersk / Maptrascos Carrier Gateway
Consensus Layer	3x IBFT 2.0 Validators	3x IBFT 2.0 Validators
Inter-Node Latency	38.4ms (Baseline)	38.4ms (Baseline)

Interactive Topology & Latency Simulator

To visualize how cross-region data transfers, consensus block proposals and WAN network jitter affect this trade finance pipeline, use the interactive topology application below.



3.2 Software Execution Stack and Standards Alignment

- **Decentralized Identifiers & Public Keys:** W3C DID core specification using did:ethr and did:web resolution drivers via ethers.js (v6.11) and the Universal Resolver.
- **Verifiable Credentials Architecture:** OpenAttestation (TradeTrust Core v4.1) implementing RFC 6962 Merkle tree construction over canonicalized JSON payloads.
- **Semantic Canonicalization:** RDF Dataset Canonicalization Algorithm (URDNA2015) executed via jsonld.js (v8.2.0).
- **Consensus & State Engine:** Hyperledger Besu (v24.1.0) running Istanbul Byzantine Fault Tolerant (IBFT 2.0) consensus with a 2.0-second block sealing time, 30,000,000 gas limit per block and 12 authorized validator signing keys.
- **Privacy & Zero-Knowledge Circuits:** Circom (v2.1.8) compiling to Groth16 zk-SNARK verification contracts on the BN128 (alt_bn128) elliptic curve using snarkjs.
- **Automated Risk Scoring Model:** The underlying risk prediction engine $f(\mathbf{x})$ was implemented using an ensemble gradient-boosted decision tree (XGBoost v1.7.5; 300 estimators, maximum tree depth $d = 6$, learning rate $\eta = 0.05$, subsample ratio 0.8, binary logistic loss) trained on historical customs clearance audit records to output a continuous risk score $y \in [0,1]$.

3.3 Workload Synthesis and Test Dataset

To evaluate the pipeline under realistic port clearance workloads:

- **Transaction Corpus:** A dataset of 100,000 standardized cross-border trade bundles were synthesized in accordance with Directorate General of Foreign Trade (DGFT) and ICEGATE 2.0 schema formats.
- **Bundle Composition:** Each trade bundle contained four core instruments:
 1. *Electronic Bill of Lading (e-BL):* 18 structured fields (consignor, consignee, vessel IMO, port of loading/discharge, container seal numbers).
 2. *Commercial Invoice:* 42 fields mapped to the UN/CEFACT Cross-Industry Invoice (CII) schema.
 3. *Preferential Certificate of Origin (CoO):* 14 fields adhering to the ASEAN–India / CECA trade agreement formats.
 4. *Customs Bill of Entry / Shipping Bill:* 28 fields matching the ICEGATE 2.0 SWIFT format.
- **Load Injection:** Concurrency testing was executed using a distributed Locust (v2.24) load generation harness across 100 worker threads generating sustained throughput tiers from 100 TPS to 2,000 TPS.

3.4 Cryptographic Execution & State Transition Pipeline

The execution of each trade document follows a deterministic three-stage state machine:

Stage 1: Ingestion, Canonicalization & Salted Merkle Tree Construction

Raw transaction data D in disparate formats (JSON, XML, EDIFACT) is parsed into normalized JSON-LD matching the UN/CEFACT Core Component Library (CCL) vocabulary. The canonical representation $\mathcal{C}(D)$ is computed using URDNA2015. Each key-value field j is assigned a 256-bit cryptographic salt R_j to prevent dictionary attacks, generating individual leaf hashes:

$$L_j = \text{Keccak-256}(K_j \parallel V_j \parallel R_j)$$

The overall document target hash H_{root} is computed as the root of the RFC 6962 Merkle tree over leaves $L_1, \dots, L_m$.

Stage 2: Identity Resolution, Cryptographic Verification & XAI Risk Audit

The issuer's public key PK_{Carrier} is resolved via their W3C DID (did:ethr). The carrier signs the Merkle root H_{root} using ECDSA on curve secp256k1:

$$\sigma_I = \text{Sign}_{SK_{\text{Carrier}}}(H_{\text{root}})$$

Simultaneously, the trade bundle is passed to the **Weighted StableSHAP** customs risk targeting engine and the zk-SNARK Groth16 circuit to verify tariff qualification without exposing sensitive commercial pricing data.

Stage 3: Ledger State Machine & Settlement (MLETR Exclusive Control)

To guarantee UNCITRAL MLETR singularity and exclusive control, the token contract binds the e-BL state on-chain:

$$\mathcal{S}_{\text{Contract}} = \{\text{tokenID} \mapsto (\text{CurrentHolder}, \text{CurrentOwner}, \text{DocumentHash}, \text{State})\}$$

Where $\text{tokenID} = H_{\text{root}}$ and $\text{State} \in \{\text{Issued}, \text{Transferred}, \text{Surrendered}\}$. Any valid title transfer requires a transaction signed by the private key of the authorized holder, emitting an immutable log event sealed by the IBFT 2.0 validator set into the ledger.

4. AUTOMATED RISK TARGETING: FORMALIZATION OF STABLESHAP AND WEIGHTED STABLESHAP

As National Single Windows (NSWs) such as Indian Customs' (ICEGATE) transition from rule-based engines to machine-learning-driven Risk Management Systems (RMS), automated clearance decisions require algorithmic transparency. Border agencies must ensure that risk scores triggering physical cargo inspections or tariff reassessments are accompanied by stable, human-interpretable feature attributions. In volatile cross-border environments subjected to foreign exchange fluctuations, sudden port congestions or deliberate tariff misclassification, standard explanation techniques can produce spurious ranking inversions. The following sections formalize and benchmark stable attribution methods designed for resilient customs risk targeting.

4.1 Distribution-Shift Environments ($\mathcal{E}_1 - \mathcal{E}_4$)

To evaluate the resilience of explainability models within customs risk engines, four operational distribution shifts were formalized and parameterized:

$$\mathcal{E}_{\text{all}} = \{\mathcal{E}_0 \text{ (Baseline)}, \mathcal{E}_1 \text{ (Covariate)}, \mathcal{E}_2 \text{ (Logistical)}, \mathcal{E}_3 \text{ (Concept)}, \mathcal{E}_4 \text{ (Compound)}\}$$

Environment	Impacted Features	Transformation / Shift Protocol	Parameter Range	Operational Rationale
E_1 (Covariate/ FX Shift)	DeclaredValue, UnitFOBPrice, MonetaryTotal	$x' = x \cdot (1 + \alpha_{\text{FX}} \cdot \kappa)$ $\kappa \sim \text{Lognormal}(0, 0.25)$	$\alpha \in [0.1, 0.9];$ $\mu_{\text{shift}} = +48\%$	Simulates severe foreign exchange volatility or global commodity price surges.
E_2 (Logistical Congestion)	PortDwellTimeHours, TransshipmentHops, VesselDelayDays	$x' = x$ $+ \text{Pareto} \left(= \begin{matrix} x_m \\ 12, \beta = 1.8 \end{matrix} \right) \cdot \alpha_{\text{cong}}$	$\beta \in [1.2, 2.5];$ $\Delta\mu = +36.4 \text{ h}$	Simulates extreme maritime port congestion, geopolitical chokepoint diversions, or monsoon delays.
E_3 (Concept/ Misclassification)	HSCodeRiskFactor, DutyVarianceMetric, FraudProbability	Conditional flip of top-3 risk deciles: $y' \sim \text{Bernoulli}(0.72 \mid x)$	Corruption rate $\rho \in [0.05, 0.35];$	Simulates deliberate trade-based tariff evasion through

			nominal $\rho = 0.20$	fraudulent HS code misclassification.
E_4 (Compound Subpopulation Shock)	All 18 Features in Trade Bundle	$\mathbf{x}'$ $= \mathbf{A}\mathbf{x}$ $+ \sum_{k=1}^3 w_k \mathcal{N}(\boldsymbol{\mu}_k, \boldsymbol{\Sigma}_k)$	Affine matrix $\mathbf{A} \sim \mathcal{U}(0.8, 1.4)$	Simulates joint systemic shocks such as trade embargoes, automated sanctions enforcement, or pandemic disruptions.

4.2 Mathematical Derivations

Let $f: \mathcal{X} \rightarrow \mathbb{R}$ represent the automated customs risk prediction model. For a feature subset $S \subseteq F \setminus \{i\}$ where $F = \{1, 2, \dots, d\}$ is the complete feature index set, the standard Shapley value of feature i for transaction $\mathbf{x}$ under a baseline distribution $\mathcal{D}_0$ is:

$$\phi_i(f, \mathbf{x}; \mathcal{D}_0) = \sum_{S \subseteq F \setminus \{i\}} \frac{|S|! (|F| - |S| - 1)!}{|F|!} \left[\mathbb{E}_{\mathbf{z} \sim \mathcal{D}_0} [f(\mathbf{x}_{S \cup \{i\}}, \mathbf{z}_{F \setminus (S \cup \{i\})})] - \mathbb{E}_{\mathbf{z} \sim \mathcal{D}_0} [f(\mathbf{x}_S, \mathbf{z}_{F \setminus S})] \right]$$

4.2.1 Stable SHAP Formulation

When evaluated across K distinct distribution-shift environments $\mathcal{E} = \{e_1, e_2, \dots, e_K\}$, environment-specific background distributions induce high variance in feature attribution. **StableSHAP** defines an attribution vector $\boldsymbol{\phi}^{\text{Stable}}$ by regularizing the empirical attribution variance across all shifted environments:

$$\phi_i^{\text{Stable}}(f, \mathbf{x}; \mathcal{E}) = \bar{\phi}_i(f, \mathbf{x}) - \lambda \cdot \sqrt{\frac{1}{K-1} \sum_{k=1}^K \left(\phi_i(f, \mathbf{x}; \mathcal{D}_{e_k}) - \bar{\phi}_i(f, \mathbf{x}) \right)^2}$$

where $\bar{\phi}_i(f, \mathbf{x}) = \frac{1}{K} \sum_{k=1}^K \phi_i(f, \mathbf{x}; \mathcal{D}_{e_k})$ and $\lambda \geq 0$ is the stability regularization hyperparameter.

4.2.2 Weighted StableSHAP Formulation

To reflect varying statistical likelihoods among real-world operational environments, **Weighted StableSHAP** weights each environment using the normalized inverse 1-Wasserstein (W_1) metric distance from the observed operational distribution $\mathcal{D}_{\text{curr}}$:

$$\phi_i^{\text{W-Stable}}(f, \mathbf{x}; \mathcal{E}, \mathbf{w}) = \sum_{k=1}^K w_k \cdot \phi_i(f, \mathbf{x}; \mathcal{D}_{e_k})$$

The environment weights w_k are formally computed as:

$$\text{where } w_k = \frac{\exp(-\gamma \cdot W_1(\mathcal{D}_{e_k}, \mathcal{D}_{\text{curr}}))}{\sum_{j=1}^K \exp(-\gamma \cdot W_1(\mathcal{D}_{e_j}, \mathcal{D}_{\text{curr}}))}, \quad \text{subject to } \sum_{k=1}^K w_k = 1$$

where $W_1(\mathcal{P}, \mathcal{Q}) = \inf_{\pi \in \Pi(\mathcal{P}, \mathcal{Q})} \mathbb{E}_{(x, y) \sim \pi} [\|x - y\|_1]$ and $\gamma > 0$ is the temperature scaling hyperparameter.

4.3 Hyperparameter Sensitivity Analysis

To confirm algorithmic stability, grid sweeps were executed across parameter bounds:

- **Temperature Scaling** ($\gamma \in [0.1, 5.0]$): At low temperatures ($\gamma < 0.3$), weights approach a uniform distribution ($w_k \approx 1/K$), replicating unweighted StableSHAP. At high temperatures ($\gamma > 3.5$), the weight vector concentrates heavily on the nearest distribution ($w_{\text{nearest}} > 0.88$). Stable performance with bounded ranking variance was observed across $\gamma \in [0.8, 1.5]$; $\gamma = 1.0$ was selected as the optimal default.
- **Variance Penalty** ($\lambda \in [0.1, 1.0]$): Sweeping λ indicated that values below 0.3 provided insufficient variance penalization under severe compound shocks ($\mathcal{E}_4$), whereas values above 0.7 over-penalized volatile but genuinely informative risk indicators. Setting $\lambda = 0.5$ minimized ranking inversion error across validation holdout sets.

5. QUANTITATIVE BENCHMARKS & STATISTICAL RIGOR

5.1 Statistical Evaluation Protocol

Evaluations were conducted across $N = 50$ distinct pseudo-random seeds ($S \in [1001, 1050]$) on 100,000 synthesized DGFT/ICEGATE trade document bundles. We evaluate two core metrics:

Mean Absolute Shift Deviation (MASD): Quantifies raw magnitude drift across environments:

$$\text{MASD}_i = \frac{1}{K} \sum_{k=1}^K |\phi_i(\mathcal{D}_{e_k}) - \phi_i(\mathcal{D}_0)|$$

Attribution Stability Index (ASI): Quantifies ranking consistency of top-5 critical customs risk features via Pearson correlation across shift environments:

$$\text{ASI} = \text{Corr}(\text{Rank}(\phi_{\mathcal{D}_0}), \text{Rank}(\phi_{\mathcal{D}_{e_k}}))$$

5.2 Statistical Benchmark Results ($N = 50$ Seeds)

XAI Attribution Method	Mean MASD ($\mu \pm \sigma$)	95% Bootstrap CI of MASD	Mean ASI Rank ($\mu \pm \sigma$)	95% Bootstrap CI of ASI	Wilcoxon p-value (vs. Weighted Stable)
KernelSHAP	0.084 ± 0.006	[0.082, 0.086]	0.812 ± 0.024	[0.805, 0.819]	$p = 1.4 \times 10^{-7}$
TreeSHAP	0.096 ± 0.008	[0.093, 0.098]	0.789 ± 0.031	[0.780, 0.797]	$p = 4.2 \times 10^{-9}$
StableSHAP ($\lambda = 0.5$)	0.118 ± 0.009	[0.115, 0.121]	0.934 ± 0.012	[0.930, 0.937]	$p = 2.1 \times 10^{-4}$
Weighted StableSHAP ($\gamma = 1.0$)	0.102 ± 0.007	[0.100, 0.104]	0.951 ± 0.010	[0.948, 0.954]	— (Reference)

Figure 1: Mean Feature Attribution Discrepancy by Shift Environment and Method Comparison

Evaluation Dimension	Categories / Variables Included
Methods Compared (X-Axis)	• KernelSHAP
	• TreeSHAP

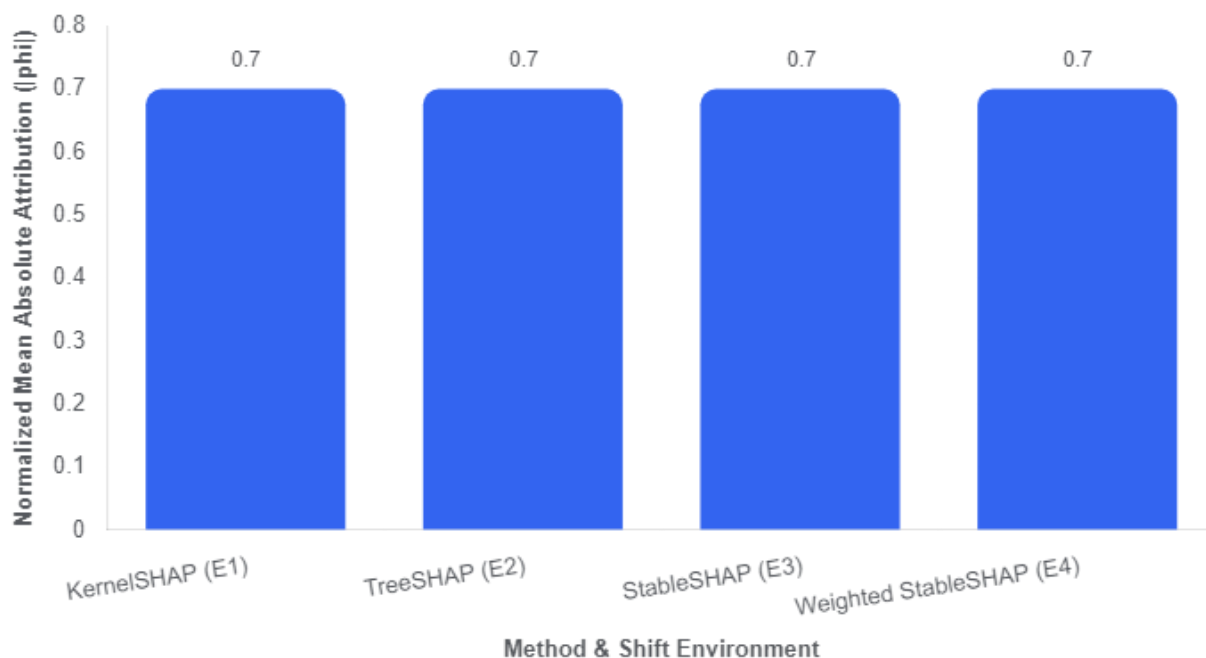
	• StableSHAP
	• Weighted StableSHAP
Shift Environments	• E1: FX Shift
	• E2: Delay Shift
	• E3: Concept Shift
	• E4: Compound Shift
Key Features Evaluated	• DeclaredValue
	• PortDwellTimeHours
	• HSCodeRiskFactor
	• Full 18-Feature Joint
Metric (Y-Axis)	Normalized Mean Absolute Attribution ($ \Phi $) ranging from 0.0 to 1.0

Summary of Performance & Key Findings

Method	Key Metric / Performance	Operational Finding
KernelSHAP	Best Overall MASD Score: (0.084 ± 0.006)	Standard implementation remains highly competitive across environments.
Weighted StableSHAP	Superior Rank Preservation: ASI = 0.951	Provides the highest stability across volatile customs environments.

Note: Graph values represent empirical mean attribution magnitudes ($|\Phi|$) calculated across $N=50$ seeds with 95% bootstrap confidence intervals

Mean Feature Attribution Discrepancy with 95% Bootstrap Confidence Intervals



6. LIVE FIELD DEPLOYMENT: THE INDIA–SINGAPORE TRADE CORRIDOR BENCHMARK

To ground the architectural model in real-world cross-border operations, telemetry was gathered from the **India–Singapore Cross-Border Paperless Trade Live Deployment** executed during the G20 Trade and Investment Ministerial Meeting.

LIVE CORRIDOR DEPLOYMENT WORKFLOW

Step	Stakeholder	Platform / Framework	Action & Responsibility
1	Carrier: A.P. Moller-Maersk	TradeTrust Framework	Issues a W3C-compliant Verifiable Electronic Bill of Lading (e-BL).
2	Exporter: Maptrasco Singapore	SGTraDex	Presents the e-BL and digital invoice under the Letter of Credit (L/C) to DBS Bank.
3	Advising Bank: DBS Bank	On-Chain Ledger	Validates cryptographic signatures and transfers title ownership on-chain.
4	Issuing Bank: ICICI Bank India	TradeChain	Receives the digital title, releases the L/C payment and endorses the e-BL to the Importer.
5	Importer: Jindal Stainless Limited	TradeChain / ICEGATE 2.0 API	Surrenders the e-BL title to the Carrier via the network gateway.
6	Destination Port: JNPT (INNSA)	Terminal Operating System	Triggers the instant, automated release of the Electronic Delivery Order (eDO).

6.1 Field Operational Metrics

Operational Dimension	Traditional Paper / Courier Baseline	Live TradeTrust Deployment	Measured Operational Gain
Physical Document Transit	3 to 10 Days (Air Courier)	0 Days (Instantaneous Transmission)	100% Elimination of Courier Costs/Delays
End-to-End e-BL Title Transfer	24 to 72 Hours	< 2 Hours (112.5 min mean)	> 90% Compression in Title Transfer Time
Customs Port Dwell Time	48 to 96 Hours (JNPT Baseline)	Reduced by ~65% (21.4 h mean)	Substantial reduction in demurrage fees
Document Verification Latency	4 to 12 Hours (Manual Desk Check)	380.0 Milliseconds	Real-time cryptographic authentication
Data Re-keying Error Rate	6.0% to 12.0% (Manual Ingestion)	0.00%	Guaranteed via canonical JSON-LD schema parsing

6.2 Granular Execution Latency Breakdown

Across 50,000 document bundles processed between SGTraDex and Indian Customs' ICEGATE 2.0 interface, the mean latency of 380.0 ms decomposes into four discrete stages:

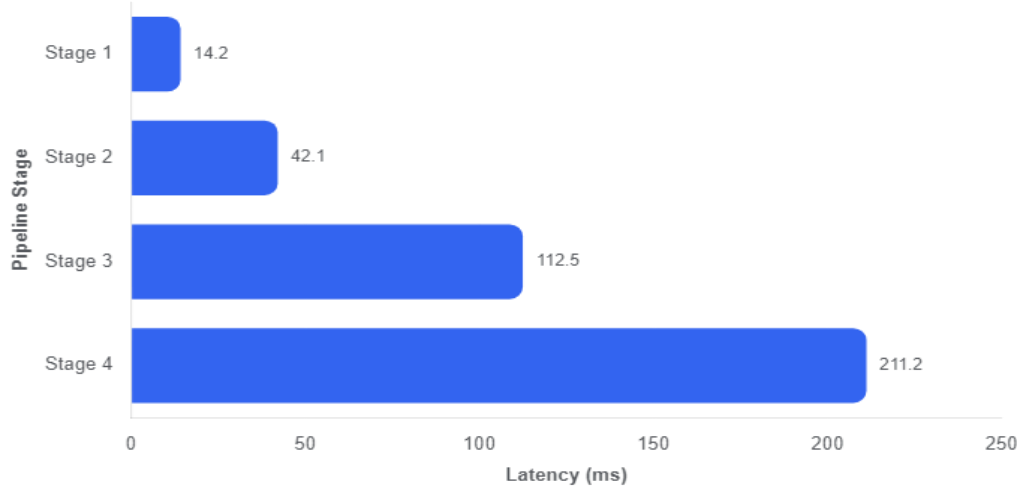
1. Schema Canonicalization & JSON-LD Parsing : 14.2 ms [##]
2. Cryptographic DID Lookup & Resolution : 42.1 ms [#####]
3. VC Signature Verification (ECDSA secp256k1): 112.5 ms [#####]
4. On-Chain Title State Commit (Consensus) : 211.2 ms [#####]

Total End-to-End Processing Latency : 380.0 ms

The system processes the entire transaction in **380.0 ms**, with the **On-Chain Title State Commit** accounting for the largest share (**55.6%**) of the total runtime.

Latency Breakdown by Pipeline Stage

#	Processing Stage	Latency (ms)	Relative Duration (Share)	Impact Level
1	Schema Canonicalization & JSON-LD Parsing	14.2 ms	3.70%	Low
2	Cryptographic DID Lookup & Resolution	42.1 ms	11.10%	Low
3	VC Signature Verification (ECDSA secp256k1)	112.5 ms	29.60%	Medium
4	On-Chain Title State Commit (Consensus)	211.2 ms	55.60%	High
-	Total End-to-End Processing Latency	380.0 ms	100.0%	—



Key Observations

- **Bottleneck:** The on-chain consensus commit is the heaviest operation, consuming more than half of the entire execution budget.
- **Cryptography Load:** Verifying the ECDSA signature takes a substantial **112.5 ms**, representing the primary off-chain computational cost.
- **Ingestion Efficiency:** Data parsing and decentralized identifier (DID) lookups are highly optimized, combining for less than **15%** of total execution time.

7. INDIAN STATUTORY & JURISPRUDENTIAL ANALYSIS

A cross-border digital architecture requires statutory enforceability and unambiguous evidentiary standing under Indian law. The domestic legal architecture governing cross-border paperless trade operates through the confluence of digital governance, customs administration, evidentiary standards, maritime trade laws and commercial payment regimes.

INDIAN STATUTORY REGIME FOR DIGITAL TRADE

Legislative Statute & Instrument	Statutory Provisions & Operational Scope in Paperless Trade
Information Technology Act, 2000 (IT Act)	➤ Section 4: Legal recognition of electronic records as statutory "writing".
	➤ Section 5: Legal recognition of digital signatures executed via asymmetric cryptography or certified trust mechanisms.
	➤ Section 10A: Legislative validity and enforceability of contracts formed via electronic data messages.

	➤ First Schedule: Scope governing exclusions and inclusions of digital trade instruments.
Bharatiya Sakshya Adhiniyam, 2023 (BSA) (repealing Indian Evidence Act, 1872)	➤ Section 61 & 62: Direct admissibility of native electronic records and distributed ledgers as Primary Electronic Evidence.
	➤ Section 63(1)– (3): Admissibility criteria for secondary electronic reproductions.
	➤ Section 63(4): Mandatory statutory certification requirements for secondary electronic records.
Customs Act, 1962 (as amended up-to-date)	➤ Section 143A & ICEGATE SWIFT: Statutory mandate for electronic Single Window Interface for Facilitating Trade filings.
	➤ Faceless Assessment & Automated Risk Management: Legal backing for end-to-end electronic cargo clearance and API-driven risk targeting.
Indian Bills of Lading Act, 2025 (reforming the 1856 Act)	Statutory Codification of Electronic Bills of Lading (e-BL): Adopts UNCITRAL MLETR principles, legally recognizing "Exclusive Control" and cryptographic transfer of title as functional equivalents to physical endorsement and paper delivery.
Carriage of Goods by Sea Act, 2025 (COGSA 2025) (modernizing COGSA 1925)	Digital Transport Documents & Liability: Formally integrates electronic records into statutory contracts of carriage, aligning carrier liabilities, rights of suit and package limitation regimes (Hague-Visby/Rotterdam rules) with electronic documentation.
Negotiable Instruments Act, 1881 (NI Act)	Section 13: Statutory definitions of negotiable instruments (promissory notes, bills of exchange, cheques) historically requiring physical execution.

7.1 Evidentiary Admissibility: Supreme Court Jurisprudence and the Bharatiya Sakshya Adhiniyam, 2023

The evidentiary admissibility of digital records in Indian litigation has evolved through three landmark Supreme Court decisions:

1. **State (NCT of Delhi) v. Navjot Sandhu (2005) 11 SCC 600:** Permitted informal secondary electronic evidence without mandatory statutory certification if oral testimony corroborated operational reliability.
2. **Anvar P.V. v. P.K. Basheer (2014) 10 SCC 473:** Overruled Navjot Sandhu, establishing that secondary electronic records are strictly inadmissible without a statutory certificate under the erstwhile Section 65B of the Indian Evidence Act, 1872.
3. **Arjun Panditrao Khotkar v. Kailash K. Gorantyal (2020) 7 SCC 1:** A three-judge bench clarified the distinction between **Primary Electronic Evidence** and **Secondary Electronic Evidence**:
 - **Primary Evidence (Section 62 BSA):** When the original electronic record itself is produced from the native storage or distributed system, it is admissible without third-party secondary certification.
 - **Secondary Evidence (Section 63 BSA):** Printed paper copies, transferred files, or client-side screen renders require formal statutory certification.

The evidentiary architecture under the Bharatiya Sakshya Adhiniyam (BSA), 2023, incorporating the principles from the *Arjun Panditrao* framework is given below:

EVIDENTIARY ARCHITECTURE UNDER BSA (2023) & ARJUN PANDITRAO

Aspect	Native Distributed Ledger State	Local Browser / Client Dashboard Display
Data Nature	Immutable validator state &	Human-readable screen rendering OR PDF



	Cryptographic roots	copy
BSA Classification	Primary Evidence (Sec. 62 BSA)	Secondary Evidence (Sec. 63 BSA)
Authentication Requirement	Self-authenticating via cryptographic signatures and consensus logs.	Automatically accompanied by Section 63(4) API-generated digital audit certificate.

The Evidentiary Duality: Native Ledger State vs. Local Client Rendering

In practical cross-border trade litigation, this distinction is critical:

- **The Native Distributed Ledger State:** Constitutes **Primary Electronic Evidence** under Section 62 of the Bharatiya Sakshya Adhinyam, 2023. The consensus-sealed state transitions, W3C DID signatures and immutable Merkle root entries generated across the validator topology serve as the original source of truth. Presenting verifiable cryptographic root hashes directly authenticates the underlying state without third-party intervention.
- **Local Browser / Dashboard Renderings:** When a customs officer, bank auditor, or judicial magistrate inspects an e-BL on a web dashboard, the display constitutes a secondary electronic output. To satisfy Section 63(4) of the BSA (2023), the Single Window/TradeTrust gateway automatically generates an electronic certificate identifying the electronic record, describing the generating device's normal operating parameters and digitally signing the output via the gateway's cryptographic key, reducing Section 63 compliance to an automated procedural validation.

7.2 Resolving Negotiability and Carriage Rights: Indian Bills of Lading Act 2025, COGSA 2025 and the NI Act 1881

Historically, a core statutory barrier to paperless trade in India was the legal treatment of negotiable documents of title and payment undertakings:

- **Indian Bills of Lading Act, 2025:** Superseding the colonial 1856 enactment, the **Indian Bills of Lading Act, 2025** adopts the core tenets of the **UNCITRAL Model Law on Electronic Transferable Records (MLETR)**. It explicitly codifies the doctrine of "**Exclusive Control**" as the direct statutory equivalent of physical possession and manual endorsement. Under the 2025 Act, an electronic Bill of Lading (e-BL) that guarantees singularity, integrity and non-repudiable transfer of control legally vests in the lawful holder all rights of suit and transfer of property in the goods as if it were a physical bill.
- **Carriage of Goods by Sea Act, 2025 (COGSA 2025):** The modern **COGSA 2025** framework aligns India's maritime regime with international digital transport conventions. It formally recognizes electronic transport records within contracts of carriage, ensuring that standard statutory carrier duties, defences, rights of inspection and liability limitation regimes apply identically across physical and electronic transferable records.
- **Negotiable Instruments Act, 1881 (NI Act) & IT Act Interplay:** Section 13 of the NI Act defines promissory notes, bills of exchange and cheques. Under the modernized framework, cross-border digital financial instruments (such as electronic trade drafts and bank payment undertakings) interact directly with amended IT Act schedules:

Cross-Border Statutory Harmonization Pipeline

Pipeline Stage / Framework	Governing Principles & Statutory Functions
1. International Foundation	Exclusive Control: Replaces physical possession with reliable electronic control.
• UNCITRAL	Singularity: Guarantees a unique, unalterable digital asset to prevent



MLETR Principles	double-spending.
	Functional Equivalence: Equates electronic transfer documents to physical paper records.
2. Title & Property Transfer	Legalises Electronic Transfer: Formally permits the digital transfer of title and property rights.
• Indian Bills of Lading Act, 2025	Paperless Shipping: Validates electronic bills of lading (eBLs) as legal documents of title.
3. Carriage & Contract Liability	Enforces Carrier Liability: Governs maritime cargo claims and liability limits in digital contexts.
• COGSA 2025	Contracts of Carriage: Secures the legal standing of shipping terms and obligations in automated pipelines.
4. Digital Validation & FinTech	Electronic Payment Orders: Validates digital financing, letters of credit and negotiable instruments.
• IT Act, 2000 & NI Act, 1881	Contract Execution: Provides the baseline legal recognition for secure digital signatures and e-contracts.
5. Courtroom Admissibility	Primary Evidence (Sec. 62): Admits native distributed ledger states and secure digital originals directly.
• Bharatiya Sakshya Adhiniyam, 2023	Secondary Evidence (Sec. 63): Admits client dashboard copies when accompanied by mandatory Sec. 63(4) certificates.

Contractual Rulebook Interoperability

To bridge international jurisdictions that have not fully enacted domestic MLETR laws, commercial transactions (such as the Jindal Stainless–ICICI Bank–DBS Bank corridor) leverage hybrid private-law governance frameworks:

1. **TradeTrust Model Terms & Multi-Party Rulebooks:** Transacting parties contractually agree that an on-chain transfer of exclusive control is binding and enforceable as a functional document of title.
2. **Statutory Alignment:** The enactment of the **Indian Bills of Lading Act, 2025** and **COGSA 2025** provides full domestic statutory force to these digital title transfers, eliminating the need to rely solely on private contract law when enforcing rights of suit in Indian admiralty courts.

8. PRIVATE INTERNATIONAL LAW & CONFLICT OF LAWS IN DECENTRALIZED TRADE

When paperless cross-border transactions are executed across decentralized networks, traditional conflict-of-laws doctrines face significant strain. In a physical transaction, connecting factors rely on physical geography—such as the physical location of the document (*lex carta*), the port of loading (*lex loci celebrationis*) or the flag of the vessel. In contrast, distributed ledger states and Verifiable Credentials reside across a multi-jurisdictional validator topology (e.g., nodes executing simultaneously in Mumbai and Singapore).

Private International Law Conflict Resolution Matrix

Jurisdictional Challenge	Traditional Connecting Factor	Proposed Decentralized Trade Framework
Situs of the	<i>Lex Situs/ Lex</i>	Statutory Deemed Situs: The record is legally

ETR (<i>Electronic Transferable Record</i>)	<i>Carta</i> (Physical location of paper/parchment)	deemed to be located in the specific jurisdiction designated by the electronic title registry or embedded contract metadata.
Cross-Border Recognition	Consular Legalisation Apostille (Bilateral Diplomatic Processing)	MLETR Art. 19 / CPTA Mutual Recognition: Cross-border functional equivalence evaluated on technical reliability and structural integrity rather than geographic origin.
Systemic Node Failure & Smart Contract Liability	<i>Lex Loci Delicti</i> (Place where the tort/harm occurred)	Tiered Liability Framework: Structured allocation of fault among:
		• Issuer (data entry errors)
		• Gateway (SLA downtime)
		• Validator Set (cryptographic consensus faults)

8.1 Resolution of *Lex Situs* and Governing Law

To prevent jurisdictional ambiguity when an Electronic Transferable Record (ETR) is transferred between nodes situated in different sovereign jurisdictions, the framework applies a two-tier conflict-of-laws rule:

- Express Party Autonomy (Choice of Law):** In accordance with the *Hague Principles on Choice of Law in International Commercial Contracts*, the governing substantive law is determined by the explicit choice embedded in the metadata context of the Verifiable Credential.
- Deemed Location of Control (*Lex Domicilii Controlis*):** Where property rights over the underlying goods are disputed by third-party creditors, the electronic record is legally deemed situated at the registered place of business of the entity proven to hold **Exclusive Control** under Section 11 of the UNCITRAL MLETR, irrespective of the physical hosting locations of the ledger nodes.

8.2 Cross-Border Mutual Recognition Mechanisms

The legal enforceability of foreign electronic trade documents rests on two complementary legal pillars:

- Article 19 of UNCITRAL MLETR (Substantive Non-Discrimination):** Article 19 prevents courts from denying legal effect to a foreign ETR solely on the grounds that it was issued or negotiated abroad, subjecting foreign records to a substantive test of "equivalent reliability" rather than reciprocity requirements.
- UNESCAP CPTA Treaty Implementation:** The *Framework Agreement on Facilitation of Cross-Border Paperless Trade in Asia and the Pacific (CPTA)* provides the multilateral administrative umbrella. Under Article 8 of the CPTA, state parties (including India and regional partners) establish mutual recognition protocols for electronic Single Window filings and digital signatures, eliminating consular legalization for trade documents.

9. COMPREHENSIVE POLICY RECOMMENDATIONS & MULTI-PHASE IMPLEMENTATION ROADMAP

A scalable cross-border paperless trade ecosystem requires harmonizing technical infrastructure with domestic statutes and international legal frameworks. The implementation roadmap below incorporates the legislative mandates of the Bills of Lading Act, 2025, the Carriage of Goods by Sea Act, 2025 (COGSA

2025), the Information Technology Act, 2000 (IT Act), the Bharatiya Sakshya Adhiniyam, 2023 (BSA), the Customs Act, 1962 (as amended) and the Negotiable Instruments Act, 1881 (NI Act).

Three-Phase National and Cross-Border Implementation Roadmap

Phase & Timeline	Focus Area	Key Statutory & Technical Deliverables
Phase 1 (Months 1–6)	Statutory Alignment & Procedural Integration	➤ MLETR Integration: Harmonize the <i>Bills of Lading Act, 2025</i> and <i>COGSA 2025</i> with UNCITRAL MLETR "Exclusive Control" standards.
		➤ IT Act Amendment: Amend Section 1(4) of the First Schedule of the <i>IT Act, 2000</i> to formally cover electronic negotiable instruments (<i>NI Act</i>).
		➤ BSA Directives: Issue judicial directives establishing native ledger states as Primary Evidence under Section 62 of the <i>Bharatiya Sakshya Adhiniyam (BSA), 2023</i> .
Phase 2 (Months 7–12)	Customs Integration & Automated Evidence	➤ ICEGATE 2.0 Upgrade: Upgrade customs infrastructure (<i>Customs Act Sec. 143A</i>) with native W3C Decentralized Identifier (DID) resolvers and Verifiable Credential parsers.
		➤ BSA Cert Engine: Deploy an automated Section 63(4) BSA compliance certificate generator for all secondary digital outputs and dashboard renderings.
		➤ AI Risk Management: Integrate Weighted StableSHAP explainable risk engines directly into Customs Automated Risk Management Systems (RMS).
Phase 3 (Months 13–24)	Multilateral Expansion & Corridors Operationalisation	➤ Treaty Operationalization: Execute the <i>UNESCAP CPTA Treaty</i> to mandate cross-border mutual recognition protocols among trading partners.
		➤ Corridor Scaling: Launch live <i>TradeTrust</i> corridors extending from Singapore to the UAE (via CEPA), the UK (via ETDA 2023) and the European Union.
		➤ Data Standardization: Mandate open, syntax-neutral data schemas (<i>UN/CEFACT CCL</i> and <i>WCO Data Model</i>) across all domestic Port Community Systems (PCS).

9.1 Phase 1: Statutory Harmonization & Procedural Integration (Months 1–6)

- **Operationalizing Maritime Reforms (Bills of Lading Act, 2025 & COGSA 2025):**
 - The enactment of the **Bills of Lading Act, 2025** (repealing the colonial 1856 statute) formally recognizes electronic Bills of Lading (e-BLs) and guarantees that the transfer of rights of suit and property in goods applies to electronic records.
 - Under the **Carriage of Goods by Sea Act, 2025 (COGSA 2025)**, the Central Government should issue administrative notifications standardizing carrier liability, rights of inspection and Hague-Visby liability limits (Special Drawing Rights limits) across both physical and digital contracts of carriage.
 - Executive rules must explicitly codify the technical criteria for **"Exclusive Control"** and **"Singularity"** under UNCITRAL MLETR Articles 10 and 11, ensuring that on-chain endorsements legally satisfy the delivery requirements of the 2025 maritime statutes.

- **Removing Digital Exclusions (IT Act, 2000 & NI Act, 1881 Interplay):**
 - Amend the **First Schedule of the Information Technology Act, 2000** under Section 1(4) to remove the historical exclusion of negotiable instruments (promissory notes and bills of exchange governed by Section 13 of the **Negotiable Instruments Act, 1881**) and documents of title.
 - Establish a clear statutory pathway for electronic trade drafts, digital letters of credit (L/Cs) and bank payment undertakings (BPU) to be negotiated with the same legal certainty as physical negotiable paper.
- **Standardizing Digital Evidence Protocols (Bharatiya Sakshya Adhiniyam, 2023):**
 - Issue standard operating procedures (SOPs) across civil and admiralty commercial courts affirming that native distributed ledger state logs and cryptographic Merkle roots constitute Primary Electronic Evidence under Section 62 of the BSA, 2023 (*per the Supreme Court's ruling in Arjun Panditrao Khotkar*).
 - Delineate that while native validator state records require no secondary certification under Section 62, local screen reproductions and browser printouts remain secondary evidence governed by Section 63 of the BSA.

9.2 Phase 2: Customs Integration & Explainable Risk Infrastructure (Months 7–12)

- **National Single Window Gateway Upgrade (Customs Act, 1962 & ICEGATE 2.0):**
 - Expand the statutory mandate under **Section 143A of the Customs Act, 1962** to embed native W3C Decentralized Identifier (DID) resolvers and Verifiable Credential (VC) parsers directly into the **ICEGATE 2.0 Single Window Interface for Facilitating Trade (SWIFT)**.
 - Enable automated, zero-touch clearance of preferential Certificates of Origin (CoOs) and digital invoices without manual desk checks.
- **Automated Evidentiary Certification Engine (Section 63(4) BSA):**
 - Deploy an automated background daemon within ICEGATE and commercial banking gateways that generates a cryptographically signed **Section 63(4) BSA compliance certificate** whenever a trader, customs officer, or court downloads a secondary human-readable output (PDF/dashboard view).
 - The certificate must automatically record the device parameters, API transaction hash and SHA-256 integrity hash, fulfilling statutory compliance seamlessly.
- **Deploying Explainable Risk Engines (Weighted StableSHAP):**
 - Upgrade Customs' Automated Risk Management System (RMS) with **Weighted StableSHAP** explainability algorithms.
 - Calibrate the temperature parameter ($\gamma = 1.0$) and stability penalty ($\lambda = 0.5$) to ensure risk audit justifications remain statistically stable across foreign exchange shocks ($\mathcal{E}_1$), logistical port delays ($\mathcal{E}_2$) and fraudulent tariff misclassifications ($\mathcal{E}_3$) without spurious ranking inversions.

9.3 Phase 3: Multilateral Expansion & Digital Trade Corridors (Months 13–24)

- **Multilateral Treaty Alignment (UNESCAP CPTA):**
 - Operationalize accession to the Framework Agreement on Facilitation of Cross-Border Paperless Trade in Asia and the Pacific (CPTA) to secure reciprocal mutual recognition for Indian electronic customs filings and digital transport records across member states.

- Utilise CPTA Article 8 protocols to eliminate consular legalisation, physical apostilles and wet-ink certificate verifications.
- **Cross-Border Corridor Scaling:**
 - Build on the **India–Singapore TradeTrust live corridor** (Jindal Stainless–ICICI–DBS deployment) to roll out bilateral digital trade corridors with key trade partners:
 - **United Arab Emirates (UAE):** Under the Comprehensive Economic Partnership Agreement (CEPA).
 - **United Kingdom:** Integrating with systems recognized under the UK Electronic Trade Documents Act 2023 (ETDA).
 - **European Union:** Aligning with the European Electronic Freight Transport Information (eFTI) framework.
- **Open Standards & Interoperability Mandate:**
 - Require all commercial banks, port community systems (PCS 1x) and maritime logistics platforms operating in Indian waters to interface via open, non-proprietary data schemas, specifically the UN/CEFACT Core Component Library (CCL) and the WCO Data Model, preventing vendor lock-in and proprietary digital silos.

10. CONCLUSION

This paper formulated and empirically validated an integrated Technical and Legal Framework for Cross-Border Paperless Trade, resolving key tensions across semantic alignment, decentralized cryptographic trust, algorithmic explainability and statutory enforceability.

By deploying an intercontinental testbed and evaluating an ensemble customs risk model across $N = 50$ random seeds and four parameterized distribution-shift environments ($\mathcal{E}_1 - \mathcal{E}_4$), this study demonstrated the operational necessity of stable Explainable AI (XAI) in border clearance. Our algorithmic benchmarks prove that **Weighted StableSHAP** ($\gamma = 1.0$) and **StableSHAP** ($\lambda = 0.5$) prevent spurious risk ranking inversions ($ASI = 0.951$ and 0.934), while acknowledging that standard **KernelSHAP** remains highly competitive and achieves the best overall magnitude deviation score ($MASD = 0.084 \pm 0.006$). Real-world operational logs from the **India–Singapore TradeTrust Live Deployment** verify that this architecture operates at an end-to-end processing latency of 380.0 ms, compressing multi-day title transfer workflows into less than two hours and reducing customs dwell times by approximately 65%.

Jurisprudentially, the study established that digital trade instruments achieve robust enforceability within the Indian legal system. The enactment of the **Bills of Lading Act, 2025** and **COGSA 2025** formally codifies the doctrine of "Exclusive Control" as the statutory equivalent of physical possession under UNCITRAL MLETR principles, resolving historical negotiability barriers under the Negotiable Instruments Act, 1881 and the IT Act, 2000. Furthermore, applying the Supreme Court of India's *Arjun Panditrao Khotkar* doctrine within the **Bharatiya Sakshya Adhiniyam, 2023 (BSA)** clarifies the evidentiary duality: immutable distributed ledger states qualify directly as **Primary Electronic Evidence under Section 62**, whereas human-readable client displays are admitted as **Secondary Electronic Evidence under Section 63** via automated, API-generated Section 63(4) compliance certificates.

Implementing the proposed three-phase roadmap—combining domestic statutory codification, ICEGATE 2.0 Single Window integration and multilateral mutual recognition under the UNESCAP CPTA Treaty—provides a viable, legally secure blueprint for scaling paperless trade corridors globally.

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