

# CREATING ALGORITHMS FOR USER-INDEPENDENT MANIFEST VERIFICATION IN CONTAINER NON-INTRUSIVE INSPECTION (NII)

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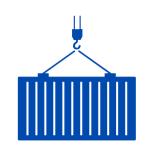


### SO WHAT? WHO CARES?

**Goal:** Automatically verify Manifest and Container Cargo Loads at a high volume and velocity without impacting inspection quality

**Issue:** Object detection algorithms perform "analysis in a vacuum", relying primarily on NII Images without taking into account the full context of the shipment, limiting their ability to perform accurate Manifest Verification.

**Sub-Issue:** Training sets based on real tagged images are scarce, oftentimes leading to algorithmic bias and false positives



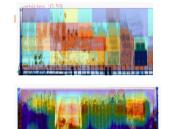
**SPACE:** Artificial Intelligence for Non-Intrusive Inspection (AI-NII)

TRL 4: Technology validated in lab



PROBLEM: DATA AVAILABILITY

Cargo X-Ray Scan "analysis in a vacuum" and lack of high-quality training sets



**SOLUTION:** PATTERN BASED MODEL

Use historical Manifest & NII Data to uncover patterns, which serve as a high-quality training set, calibrated by and to local trade cadences



**RESULTS: TRAINED EFFECTIVE ALGORITHM** 

Comprehensive localized training set 7.5s Total analysis time 650% NII Performance Increase

**200,000 IMAGES, 167,374 PARAMETERS, 263 HS CODES** 

### BUILDING A PATTERN BASED DATA MODEL

RELATIONSHIP BASED GRAPH

TARGETING RULES METHOD

UFF 1.0/2.0 COMPLIANT

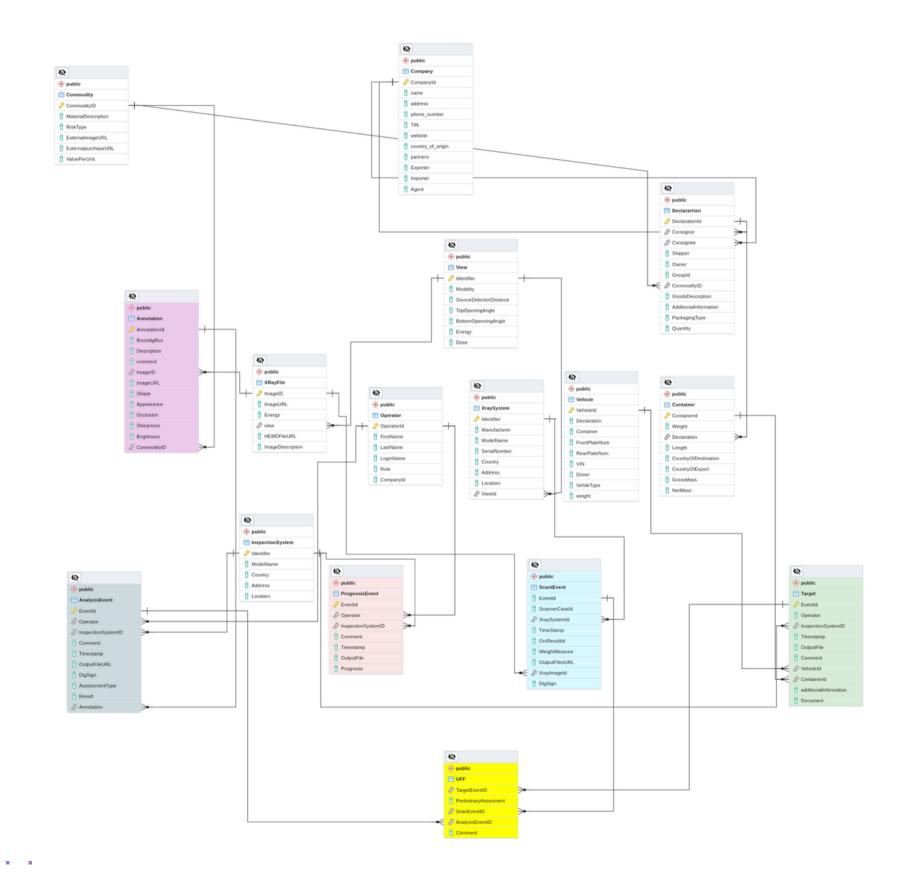
MULTI-IMAGE FORMAT

SUPPORT FOR WCO DATA MODEL

AUTOMATIC EXTERNAL ENRICHMENT
VIA CONNECTED DATA SOURCES
(I.E. FUTURE MARKETPLACE PHOTOS OF GOODS)

SCALABLE FOR ADDITIONAL SENSORS

AUTOMATIC/MANUAL INPUT



## BUILDING A PATTERN BASED TRAINING SET

90% of a Nations trade has the same cadence, which is fully documented in Customs Inspections.

The pattern based approach extracts data from Manifest, Declarations and NII Scans and merges it to derive patterns. These patterns serve as a holistic, self-sustaining training set for Manifest Verification algorithms.



Declaration number
Manifest number
Reference number
Consignee name, address, phone number, tax ID
Exporter name, address, phone number, tax ID
Agent name, address, phone number, tax ID
Commodity code
Commodity description
Container ID & type
Packing type
Quantity
Weight
Customs Value and Currency

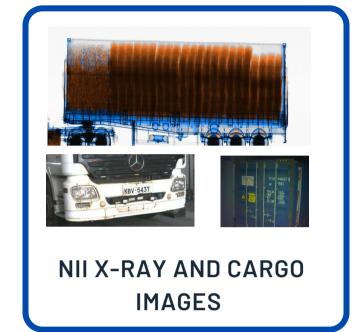
Weight
Customs Value and Currency
Liquidation sum (amount paid)
Country of origin
Country of destination
Vessel
Scanned Image ID

**INPUT 1** 

SHIPMENT

DOCUMENTATION

INPUT 2



TEXT EXTRACT

**VECTOR CONSTRUCT** 

PATTERN CONSTRUCTION

#### **UNIFIED PATTERNS EXAMPLES**

IMPORTER X = EXPORTER T= GOODS Y + GOODS U = IMAGE Z

IMPORTER X = EXPORTER T= TRAILER Y + GOODS U = IMAGE Z

IMPORTER X = EXPORTER T= BROKER I + GOODS U = IMAGE Z

IMPORTER X = EXPORTER T= ORIGIN1 + GOODS U = IMAGE Z

IMPORTER X = BROKERI= VESSEL2 + GOODS U = IMAGE Z

**AVERAGE OF 10,000 PATTERNS PER CONVEYANCE** 

# CARGOSEER PATTERN BASED MANIFEST VERIFICATION ALGORITHM

Technologies developed includes image preprocessing, Container Recognition Module, re-identification module, multiple visual-transformer based encoders & pattern based decision aggregation module with decision explainability output.

PATTERN NEURAL NETWORK
DATABASE

**SCANNED CONSIGNMENT Document** Container **Extractors Detector Neural network encoder Pattern Similarity Assessment** 5 **Channel Assignment User Interface Display Re-training** 6

# PROOF OF TECHNOLOGY ON CUSTOMER DATASET

- 1. All conveyance and inspection data was received from customer
- 2. Pattern Database created from declaration, manifest, and scans
- 3. Data wealth includes: **200,000** images, **263** Unique HS Codes, **167,374** parameters (i.e. importer/broker/weight/pkg), **9,453** Trailers
- 4. Conveyances were filtered according to "operator flagged" and "operator cleared"
- 5. Conveyances were divided into 60% training (including "operator flagged"), 20% validation, and 20% test
- 6. Analysis was calibrated @ 1:0- no tolerance for false positives
- 7. Following training, validation, and test, **all** conveyances were manually verified using a specially developed and enriched operator interface (1s)

Human Operators identified 2% as Fraudulent Conveyances with an avg. analysis time of 5 minutes\*



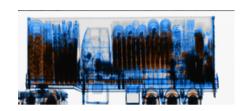
Pattern Based Algorithm identified
15% as Fraudulent Conveyances @ 0%
False Positives with an avg. analysis
time of 7.5 seconds

### AI FLAGGED SHIPMENTS

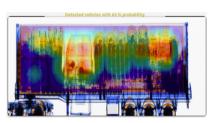
#### 650% ACCURACY PERFORMANCE INCREASE

2% FRAUD DETECTION----> 15% FRAUD DETECTION

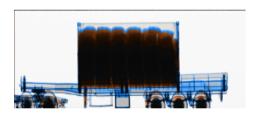
#### DECLARED AS CAR PARTS



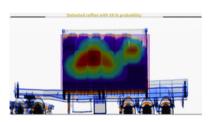
#### VEHICLE IDENTIFIED



#### DECLARED AS BLACK TEA



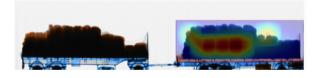
#### IDENTIFIED AS COFFEE



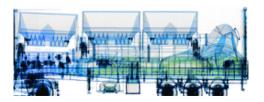
#### **DECLARED AS 25 TONS**



#### **IDENTIFIED AS 50 TONS**



#### DECLARED AS FIRE BRICKS



#### **IDENTIFIED AS MACHINES**





# THANK YOU

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