



Customs Administration of the  
Netherlands  
*Ministry of Finance*

# Automated X-ray image interpretation

ALERT CBP-ADEPT 05

Tuesday, July 25, 2023 - Day 1





# Summary

- “... to work smartly and adequately to protect our society... and to optimally facilitate legitimate trade”
- Fraud, drugs, dual-use, precursors, weapons, goods under sanction, CITES, cultural goods, IPR, liquidity, etc.
- Challenges
  - Developments in declarations prompting change to IT systems and inspections
    - a. Increasing amounts of declarations/ inspections
    - b. Increased need for real-time processing
  - Staff shortage and staff background
- Effective and efficient solutions are sought in a.o. the use of a wider array of technology, automation and external data
- Automated X-ray image interpretation delivered some promising Customs applications we will bring to the field, but requires international cooperation to make it more widely applicable





# Automated X-ray image interpretation, our journey

## ■ Enforcement vision 2014

- Do more per time unit, automation in support of Customs inspections (“autodetection”)

## European funded (FP7) research and innovation project ACXIS 2013-2017

- Close cooperation between industry, academia, institutes and end-users
- 1<sup>st</sup> X-ray image interpretation on containers

## ■ Internal innovation project, since 2020

- Collecting and annotating X-ray images
- Training algorithms for X-ray image interpretation
- Deploy algorithms in non-operational test environments

## ■ Multi-annual strategic plan 2022-2025

- Making sure internal and external requirements for a just, secure and robust operational deployment are met
- Autumn 2023: semi-operational testing of working with models planned



# Automated X-ray image interpretation, our results

- Algorithms trained on
  - Recognition of general goods/ items
    - a. High energy (containers): top 300 goods
    - b. Low energy (parcels): 6 often under-valuated items
  - Recognition of threat items/ materials
    - a. Low energy (post, parcels): pills
    - b. High energy (containers): low prevalence threat material in cargo
  - Anomaly detection
    - a. High energy (reefer containers): drug associated anomaly
  - Preparations for required IT infrastructure

“When it’s visible in the image, it can be trained into an algorithm”,  
provided you have sufficient well-annotated image data



# Automated X-ray image interpretation, our needs

- Sharing and standardisation
  - Sharing of annotated X-ray images (seizures!), preferably in unified file format (WCO UFF)
  - Sharing or co-production of models, common pre- and post processing, preferably in a common format
  - Common approach deployment of algorithms, stemming from different sources, by Customs
  - Unified dossier for European AI regulation and national compliancy
- IT infrastructure support
  - Availability of images at multiple positions in the infrastructure
  - Interconnected algorithm development environment (image, declaration, and inspection result data)
  - Ability to process image data in combination with declaration data in operation
  - Options to use fully automated, partly automated and human interpretation in one user interface
- Cooperation with vendors, through European tender procedures



# Automated X-ray image interpretation, cooperation

- Since November 2022 a cooperation between American, Australian, Belgian, British, Canadian, New Zealand and Dutch administrations
  - Come to share relevant data
    - What level of restrictedness does annotated X-ray image data have with the participating administrations?
    - What existing information security routines and products facilitate secure sharing of large image data volumes?
    - In what format should we make X-ray images available?
    - How do we annotate X-ray images in a widely usable way?
    - What should uniform X-ray image metadata look like?
    - How do we know what administration has what available?
  - Structure work/ co-production to train algorithms
  - Commonalities in deployment of trained models

