Fake web shops: detect them before they do harm

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Summary

- Fake web shops do not deliver, deliver counterfeit products or commit credit card fraud.
- An estimated 20% of all web shops is fake^[1] and these shops form a increasing problem for our online society.
- Our research aims at developing and evaluating an operational fake web shop detector that is adaptive, accurate and proactive.
- A pilot by SIDN Labs and ICS resulted in the detection of 893 fake web shops in the .nl-zone.

Future work

- How to adapt models such that they are robust against changing tactics?
- How to automatically improve the detection method using expert evaluation (active learning)?
- How to get the detector in production and add relevant datasets of other stakeholders in the web shop value chain?
- How to collaborate with other TLDs?

Pilot by SIDN Labs & ICS

Goal

Train and evaluate a classifier that discriminates suspicious from trustworthy web shops. This step towards an operational detector mainly focuses on the accuracy requirement.

Approach

- Train a classifier using 231 shops that are reported by ICS
- Apply the model to all domains in the .nl-zone
- ICS analysts evaluate the suspicious shops
- ICS starts Notice and Take Down (NTD) procedure for the true positives

Insights

- We proactively found 893 fake web shops using this first version of the classifier.
- Expert evaluations are valuable feedback to improve and update the detection model.
- The fake web shops reported by ICS are similar to the ones found by SIDN, Consumentenbond and others in the past.
- The NTD procedure is time consuming.

Classifier evaluation

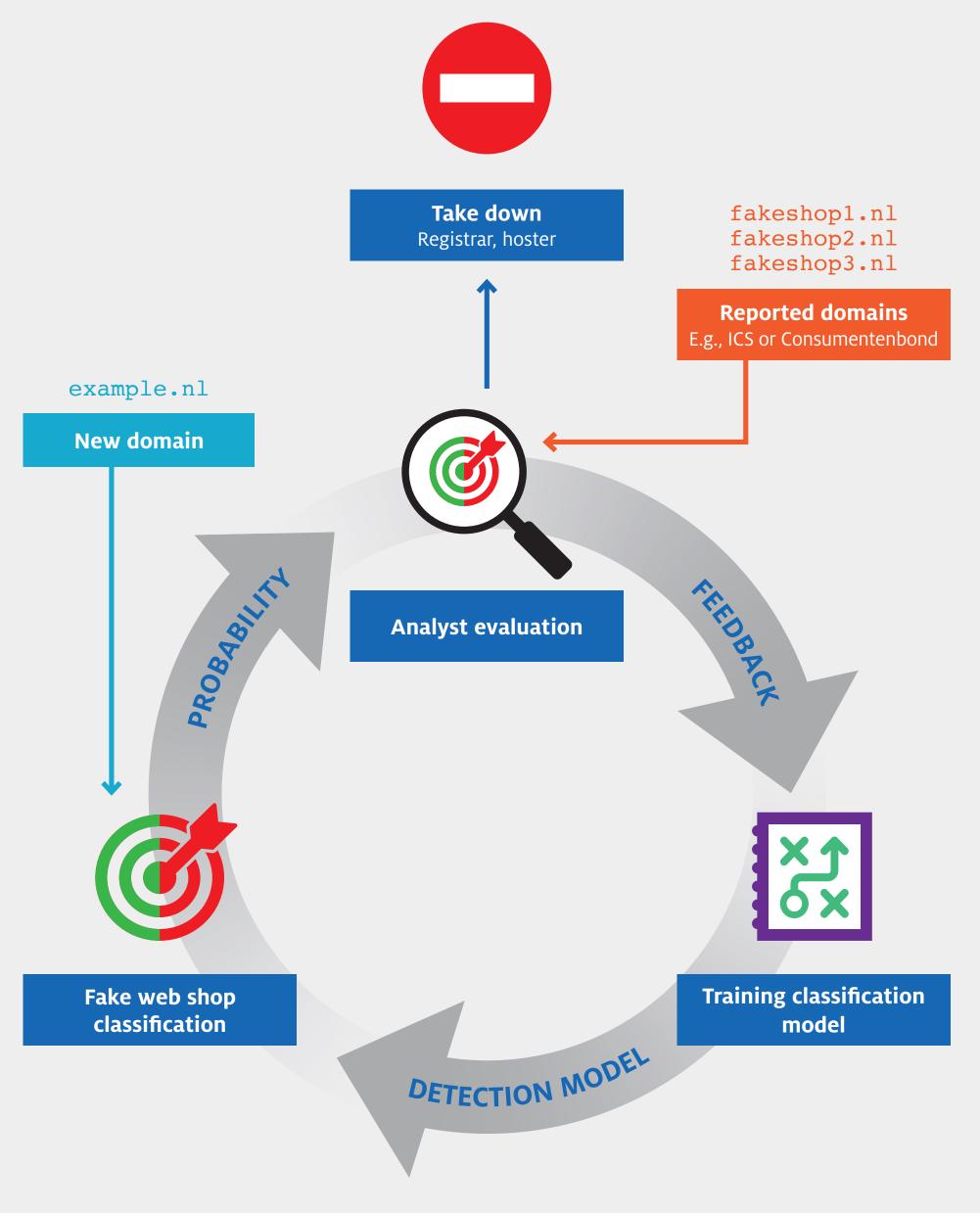
| | Precision | Recall | |
|--------------------------|-----------|--------|--|
| One-Class SVM (test set) | 0.95 | 0.83 | |
| Two-Class SVM (test set) | I.00 | 1.00 | |
| Evaluations by ICS | 0.73 | N/A | |

Feature examples

| WHOIS | Registrar, drop-catch, age |
|-------|----------------------------|
| Web | Web hoster, TLS issuer |
| Mail | Mail hoster |







| Requirement | Implication |
|-------------|---|
| Adaptive | Keep updating models to adapt to changing tactic of adversaries |
| Accurate | Multiple inputs and heterogeneous data sources |
| | Analyst evaluate suspicious shops |
| | Use their feedback to improve the detection model |
| Proactive | • Early detection |
| | Efficient takedown process |