# Countering DDoS Attacks with Comprehensive ACLs learnt from Blackholing Traffic

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## Motivation

- → Distributed Denial of Service is an ongoing threat to critical network infrastructure
- → Operator's toolbox:





Where networks meet

[1] T. King, C. Dietzel, J. Snijders et al.: "RFC7999: BLACKHOLE Community", 2016.

## Motivation

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We are missing a validated, comprehensive list of ACLs covering the most relevant DDoS vectors

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# **Our Approach**

#### IXPs have a good visibility of RTBH traffic

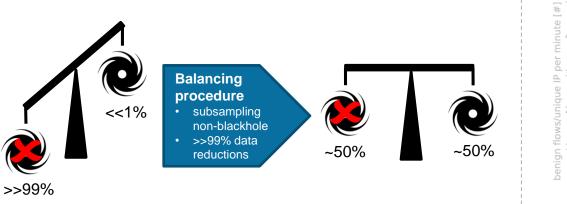
- DE-CIX sees around 3'500 announced blackholes on average on route servers  $\rightarrow$
- Most of this is DDoS and signalled to be unwanted by customers  $\rightarrow$

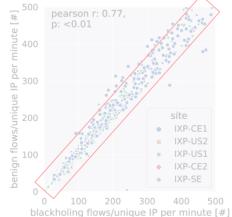
- Collect sampled flow data (e.g. IPFIX) of RTBH traffic 1.
- Prepocess data and apply data mining algorithms 2.
- Generate a comprehensive (>300) list of ACLs for packet headers typically sent 3. to a blackhole by IXP customers
- Publish ACLs on GitHub



4.

### **Preprocessing: Balancing**

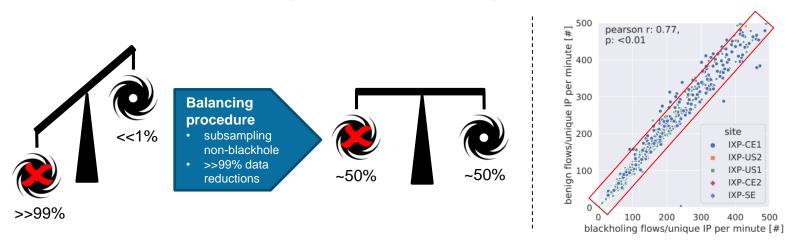




- Blackholing flows are highly underrepresented in overall flow export (<<1%)</li>
- We balance by subsampling non-blackholing flows
- $\rightarrow$  Balanced flow export is <<1% of total flow export
- → Personal data like IPs is not needed and removed (GDPR compliance)



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# Background: Association Rule Mining (ARM)

100% of all baskets

100% of all baskets

50% of all baskets

• **Example:** Brian and Markus are shopping online

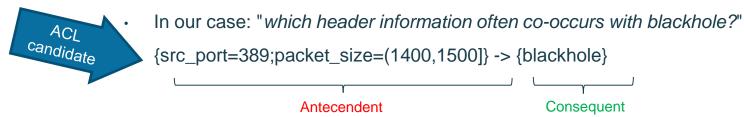
Buyer	Obscenely large TV	Wall mount	Drilling machine
Brian	Yes	Yes	Yes
Markus	Yes	Yes	No

- Recommendations for Matthias shopping online
  - {large TV}  $\rightarrow$  {wall mount}
  - {large TV, drilling machine}  $\rightarrow$  {wall mount}
  - {drilling machine}  $\rightarrow$  {large TV}
- → Rules like these are **called association rules**
- → This is a way to identify clusters of co-occurring items in the data

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# Applying ARM to Traffic Data

Association rule mining to identify (filterable) headers in the data



- Important metrics:
- antecendent support: how often is the antecendent found in the training set? ٠
  - relevance of attack vector
- confidence: how often did the antecendent appear together with the consequent? ٠

Consequent

quality of classification (with 1.0 as the highest confidence)





#### **ACL Definition: Properties**

```
"0a42ee90": {
"protocol":17,
"port src":123, # Source port (NTP)
```

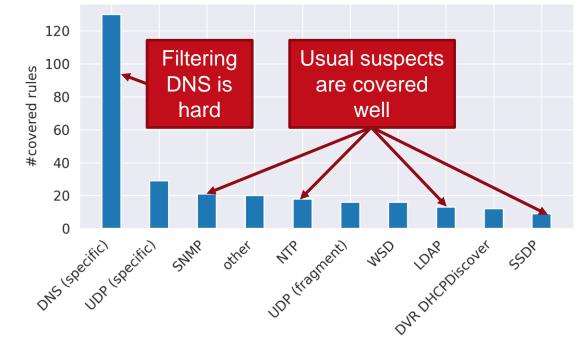
# ID of the filtering rule # Protocol (UDP) "packet size":"(400,500]", # Packet size 400-500 Bytes "confidence":0.99, # 99% of these flow were blackholed "antecedent support":1021, # We have seen 1021 of these flows



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## Analysis of generated ACLs (1/2)

rule statistics per source transport port

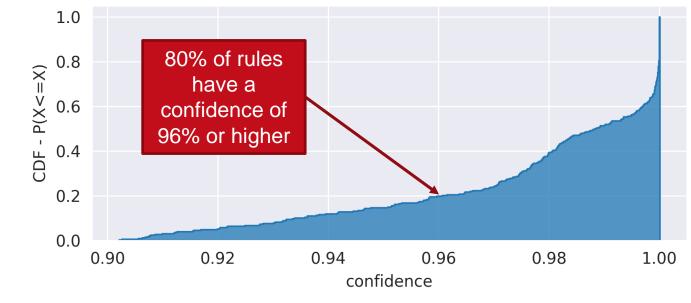




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## Analysis of generated ACLs (2/2)

confidence distribution



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### How to use this ...

→The ACLs are hosted as JSON on github

<u>https://github.com/DE-CIX/ripe84-learning-acls</u>



→Convert the list into a suitable config format for your networking gear

• Anybody here that wants to contribute a script?  $\rightarrow$  Pull Request

→Deploy and apply to a prefix whenever neccessary



Use as an additional escalatory step before blackholing/scrubbing

## **Thank You for Your attention!**



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