# A Structural Approach to Modeling Encrypted Connections

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#### Overview

- Sequence of Lengths (SOL) Background
- Zeek Background
- Applications of SOL using Zeek (pictures and graphs)
  - SSH
  - RDP
  - SSL
- Future work





# Sequence of Lengths (SOL) Background

- Inspired by
  - SPLT feature in Deciphering Malware's use of TLS (without Decryption) [1]
  - Implementation of feature extraction Joy [2]
- Generalizes across protocols works on encrypted ones, too
  - Lengths of data
  - Order of data
  - Direction of data
- Combines well with rule based expert systems maybe ML, too





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## Zeek Background

**Zeek** : "a powerful network analysis framework that is much different from the typical IDS you may know."

- SDN approach to network security monitoring
  - Event-driven scripting language
- Protocol parsing
  - Analyzers detach once encryption begins to save resources
  - SOL can be used instead of full parsing
- Logging, file extraction, intel matching, and more





Within Zeek, sequences can be represented as vectors

**vector** : "An associate array that maps from one set of values to another... its indices are non-negative integers, starting from zero"<sup>[4]</sup>

- Originator message lengths are positive
- Responder message lengths are negative
- Order is preserved using vector indices





v: vector of int =  $\{24, -24, 48, -12, 36, -42, 24, -124, -12, 96, -48, -48, 48\}$ 





v: vector of int = {24, -24, 48, -12, 36, -42, 24, -124, -12, 96, -48, -48, 48}

#### First message length First originator message length







v: vector of int = {24, -24, 48, -12, 36, -42, 24, -124, -12, 96, -48, -48, 48}

#### Second message length First responder message length







v: vector of int = {24, -24, 48, -12, 36, -42, 24, -124, -12, 96, -48, -48, 48}







v: vector of int = {24, -24, 48, -12, 36, -42, 24, -124, -12, 96, -48, -48, 48}







Useful vector operations for rule building:

- Index slicing (heads and tails)
- Summary statistics (max, min, mean, range, etc)
- "Runs"
  - Increasing
  - Decreasing
  - Repeating
- PCR [7]
- Find first, second, third occurrence of...
  - Positive
  - Negative
  - "run"



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- SSH consists of 3 sub-protocols
  - Transport
  - Authentication
  - Connection
- SSH cleartext handshake/negotiations
- SSH PDUs are called messages
  - One or more messages are formatted in an SSH "packet" struct





Cleartext (negotiations)

v: vector of int







Cleartext (negotiations) Transport (encryption)

v: vector of int =  $\{24, -24,$ 







Cleartext (negotiations) Transport (encryption) Authentication

v: vector of int = 
$$\{24, -24\}$$







Cleartext (negotiations) Transport (encryption) Authentication Connection

$$: vector of int = \left\{ 24, -24, 48, -12, 36, -42, 24, -124, -12, 96, -48, -48, 48 \right\}$$





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- Authentication
  - Bruteforce guessing
  - Interactive vs automated authentication
    - Password vs pubkey
- Mode of use
  - File transfers vs keystrokes
    - Timing profiles
    - Counting keystrokes
      - Root password lengths, oh my!
- State machine transitions
  - Authentication bypass exploits
    - do not pass authentication, do not collect \$200
  - Protocol is SSH in the clear and something different once encrypted

































- non-NLA
  - native crypto
  - Unauthenticated clients can do things
  - Channels opened before authentication + encryption
    - Can monitor for Ms\_T120 (Bluekeep) channel opens
- NLA
  - TLS
  - Authenticate client before anything else
  - Channels opened after authentication + encryption
    - Bluekeep exploits
      - Requires valid creds
      - Occurs after encryption begins





## Applications of SOL using Zeek: RDP Connection Sequence







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#### Applications of SOL using Zeek: RDP (NLA - TLS, ~10)







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## Applications of SOL using Zeek: RDP over SSH (NLA - TLS, 1)





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#### Applications of SOL using Zeek: RDP (non-NLA - native, ~70)







SPLT can be used to identify malware communications over TLS.

Can it conceptually be applied to identify other application layer protocols?





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Can it conceptually be applied to identify other application layer protocols?

I think so. DNS has intrinsic size ceilings/floors and expected PCRs 77





## Applications of SOL using Zeek: TLS (DoH POSTs and GETs)





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[9]

#### Future Work

- Apply LSTM RNNs to investigate application layer protocols' SOLs
- Incorporate timing deltas (sequence of times/deltas)
  - Timing of specific pkts or states of a protocol can be insightful
- Generically identifying TCP proxies:
  - Align sequences of two connections (within a time window)
  - If one sequence is a multiple of the other, it may be a tunnel





### **References and Resources**

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