# Black-box security analysis of state machine implementations

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- 1. Why are state machines interesting?
- 2. How do we know that the state machine is implemented correctly?
- 3. What can go wrong if the implementation is incorrect?

## What are state machines?

- Almost every protocol includes some kind of state
- State machine is a model of the different states and the transitions between them
- When receiving a messages, given the current state:
  - Decide what action to perform
  - Which message to respond with
  - Which state to go the next



# Why are state machines interesting?

- State machines play a very important role in security protocols
- For example:
  - Is the user authenticated?
  - Did we agree on keys? And if so, which keys?
  - Are we encrypting our traffic?
- Every implementation of a protocol has to include the corresponding state machine
- Mistakes can lead to serious security issues!



#### State machine example





# State machines in specifications

- Often specifications do not explicitly contain a state machine
  - Mainly explained in lots of prose
- Focus usually on happy flow
  - What to do if protocol flow deviates from this?

Client		Server
ClientHello	>	ServerHello Certificate* ServerKeyExchange* CertificateRequest*
Certificate* ClientKeyExchange CertificateVerify* [ChangeCipherSpec] Finished	<>	ServerHelloDone
Application Data	<>	[ChangeCipherSpec] Finished Application Data



# Implementation of state machines

- How do we know that a state machine is implemented correctly?
  - Often state is implicitly included
- Test whether it works against other implementations?
  - Typically only tests the happy flow
- What about invalid sequences that might lead to security vulnerabilities?
- Can we somehow extract the state machine from an implementation?
  - State machine inference



## State machine inference

- Black-box technique to extract state machines from implementations
  - Only communication with the system
  - All we need to know is how to construct messages
- Fuzzing of message order
- Useful for security analysis
  - Discover vulnerabilities and bugs
  - Provides interesting insights in the code
  - Will not find carefully hidden backdoors
- Analysis can be done either manually of automated







 $\rightarrow$  ClientHello



← ServerHello



- $\rightarrow$  ClientHello
- $\leftarrow ServerHello$
- $\rightarrow$  Other messages
- $\leftarrow$  Fatal alert / Connection close





- $\rightarrow$  ClientHello
- $\leftarrow ServerHello$
- → Other messages← Fatal alert / Connection close

Other messages Fatal alert / Connection close



- $\rightarrow$  ClientHello
- $\leftarrow ServerHello$
- $\rightarrow$  Other messages
- $\leftarrow$  Fatal alert / Connection close
- → ClientHello, ClientHello
  ← Fatal alert / Connection close





- $\rightarrow$  ClientHello
- $\leftarrow ServerHello$
- → Other messages← Fatal alert / Connection close
- → ClientHello, ClientHello
  ← Fatal alert / Connection close





# State machine inference - theory

- Deterministic Mealy machine
- Learner
  - Tries to learn the state machine of an implementation
  - Constructs a hypothesis of the state machine
- Teacher
  - Knows the state machine of the implementation
  - Answers questions about the implementation
  - Determines whether provided hypothesis is correct





## State machine inference - practice

- Convert abstract input symbols used in the algorithms to bytes
- Convert responses back to abstract symbols
- Need some way to reset the system
- Equivalence checking needs to be approximated
- Basically, you need a stateless implementation of the protocol you want to analyse









# Analysed systems

- Bank cards (EMV)
- ABN-AMRO's e.dentifier2
- TLS
  - Collection of well-known implementations
  - OpenSSL versions from a 14 year period
- Wi-Fi (4-way handshake)
- OpenVPN, IPsec, TLS1.3, DTLS, and more









#### StateLearner

- Tool to infer state machines from implementations
- Uses LearnLib developed at TU Dortmund
  - Implementation of several learning and equivalence algorithms
- Built-in support for TLS and smart cards
- Can easily be extended to analyse other protocols



## ABN-AMRO's e.dentifier2

- Handheld reader used for online banking
- Provides what-you-see-is-what-you-sign functionality
- In theory a good idea...
- However, in previous manual analysis we found a serious flaw
- Can we automatically find this type of flaws?





# Analysing the e.dentifier2

- Problem: the protocol involves pressing buttons
- Solution: LEGO!
- Push buttons on e.dentifier2 using a Lego robot
- Controlled by Raspberry Pi
  - 3 motors: OK, Cancel, digit
  - Power USB line
- Programmed own bank card
- https://youtu.be/hyQubPvAyq4



# Lego robot





# Lego robot





# Lego robot











LABS









### Results e.dentifier2



# Analysing TLS

- (Almost) stateless TLS implementation in StateLearner
- Minimal state needed to support crypto operations
- Tested both clients and servers
- All regular TLS messages, as well as Heartbeat extension
  - RSA and DH key exchange
  - Client authentication
  - Some special symbols that correspond with exceptions in the test harness



## Refreshing TLS





# Analysing well-known TLS implementations

- Many different TLS implementations
  - OpenSSL, BoringSSL, LibreSSL
  - GnuTLS
  - Java Secure Socket Extension
  - mbed TLS (previously PolarSSL)
  - NSS
  - RSA BSAFE for C
  - RSA BSAFE for Java
  - miTLS
  - Nqsb-TLS
- Every learned model different!



# Analysing TLS

- Used demo application when available
- 6 to 16 states
- State machine learned in 6 minutes to 8 hours
  - Depends on implementation specific time-outs (100ms to 1.5s)
  - Under 1 hour if connections are properly closed
- Discovered flaws in different implementations



#### TLS models



### GnuTLS

- Shadow path after sending HeartbeatRequest during handshake
- Buffer reset that contains all handshake messages to provide integrity
- Same problem present in the client





## Java Secure Socket Extension

- Possible to skip ChangeCipherSpec message
- Server will accept plaintext data
- Problem also present in client
- At the same time discovered by the Prosecco group at INRIA, France



# Large scale analysis of OpenSSL

- Learned 145 versions of OpenSSL and LibreSSL
- Number of unique state machines
  - Server-side: 15 for OpenSSL, 2 for LibreSSL
  - Client-side: 9 for OpenSSL, 1 for LibreSSL
- Number of states
  - Server-side: between 6 and 17
  - Client-side: between 7 and 12
- Several CVEs could be detected in older state machines
  - For example, EarlyCCS vulnerability



# OpenSSL 0.9.7 (2002)





## OpenSSL 0.9.7 (2002)









# Conclusion

- State machine inference is an effective technique to discover security issues and other bugs
- Everybody interprets specifications differently
  - Including a state machine in specifications would help
- Can also be interesting to fingerprint implementations
- StateLearner is available from: https://github.com/jderuiter/statelearner

# Thanks for your attention!

