# Automated reverse engineering of security protocols Learning to fuzz, fuzzing to learn

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# Fuzzing

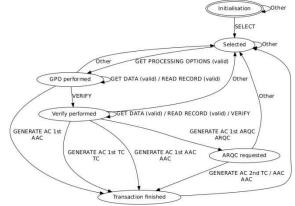
- 1. Plain fuzzing, with long inputs to trigger seg-faults and find hence find buffer overflows
- 2. Protocol fuzzing based on known *protocol format*, fuzzing interesting fields [eg SNOOZE]

Command APDU									
H	eader (1	require	Body (optional)						
CLA	INS	P1	P2	Lc	Data Field	Le			

3. State-based fuzzing to reach interesting states in the *protocol statemachine*, and then fuzz there

essentially model-based testing

[eg Peach, jTor]



# Example: protocol fuzzing to crash things

- Bearer Repl eleservice Identifier ... Bearer Data GSM is a very "rich" protocol Option leport Message / SMS Submit Report Messac CDMA SMS De (SMS Teleservice Laver TP-Failure Multiple Encoding Message Identifier Success User Data anguag Cause User Data Supple-Group Broadcast Short Call Location Message mentary Call Call TP-Failure Msg\_ Message Num\_ CHARi Encoding \_Type Fields CM Padding Cause Value Control Services SMS-Submit-Report TPDU to Service Services Control Control SMS Submit Benort M (CC)(LCSs) (SMS) (SSs) (GCC) MM (BCC) SMS Deliver Report Messar to SMS-Deliver-Report TPD RR TP-FCS TP-DCS TP-UDI TP-UD ••• (Failure-Cause Data-Coding-Schem User-Data-Lengt (User-Data)
- Fuzzing protocol fields quickly reveals weird behaviour
  - using USRP as GSM cell tower



 no SMS-of-death found, but lots of phones crashing in weird ways



(SMS Transport Layer)

# Example: protocol fuzzing for information leakage

- e-passport implements protocol to prevent "skimming"
  - correct protocols runs don't leak info to an eavesdropper

Command APDU									
H	eader (1	equire	Body (optional)						
CLA	INS	P1	P2	Lc	Data Field	Le			



- But fuzzing "incorrect" instructions leaks a fingerprint, unique per implementation and hence (almost) unique per country
  - for Australian, Belgian, Dutch, French, German, Greek, Italian, Polish, Spanish, Swedish passports

### In the other direction:

Instead of using protocol knowledge when testing, we can also use testing to gain protocol knowledge

or to gain knowledge about protocol *implementation* 

In order

- to analyse your own code and hunt for bugs, or
- to reverse-engineer someone else's unknown protocol, eg a botnet, to fingerprint or analyse (and attack) it

## What to reverse engineer?

Different aspects that can be learned:

- timing/traffic analyis
- protocol formats [eg Discoverer, Dispatcher, Tupni,....]
- protocol state-machine [eg LearnLib]

or both protocol format & state-machine [eg Prospex]

# *How* to reverse engineer?

• *passive* vs *active* learning

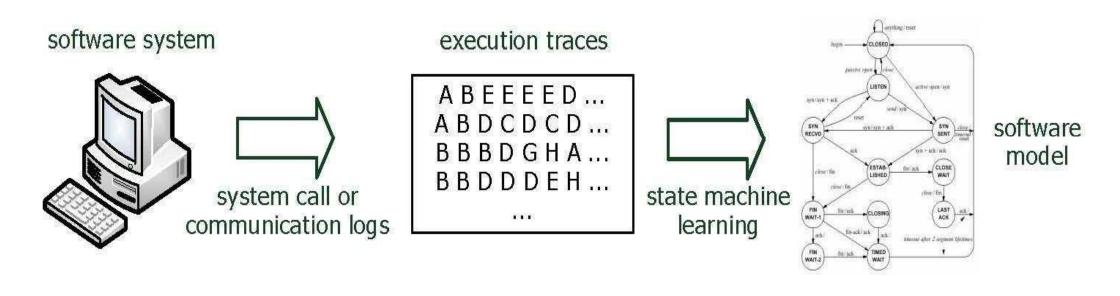
ie passive observing or active testing

- active learning involves a form of fuzzing
- active learning is harder, as it requires more software in test harness that produces meaningful data
- these approach learns different things;
  passive learning uses & produces statistics
- black box vs white box

ie only observing in/output or also looking inside running code

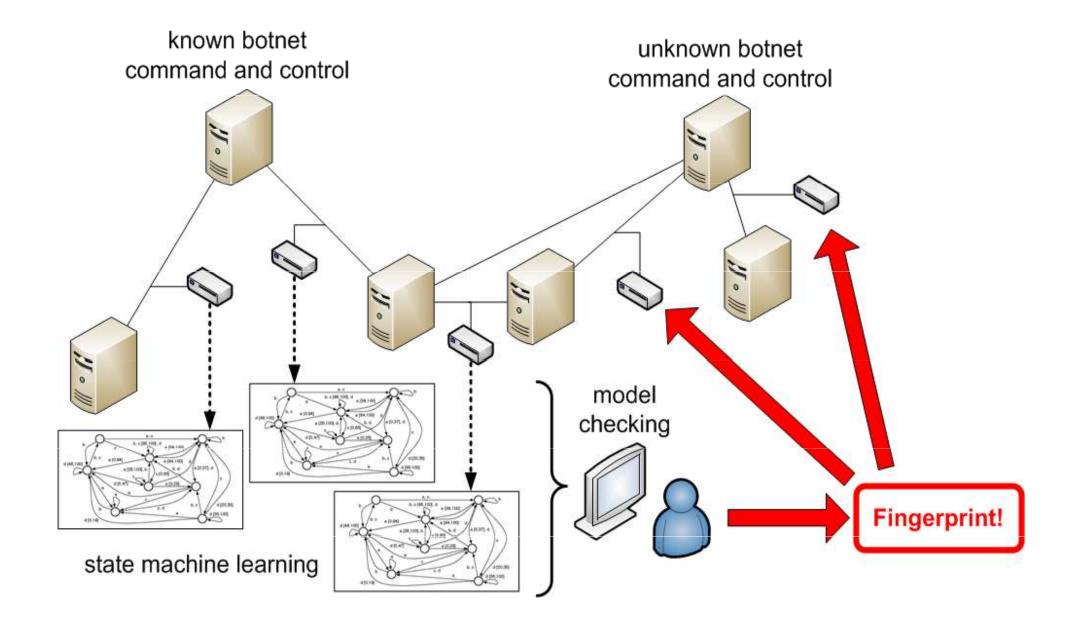
 white-box analysis for eg encypted traffic, by looking at handling of data after decryption [eg ReFormat, TaintScope]

#### Passive learning

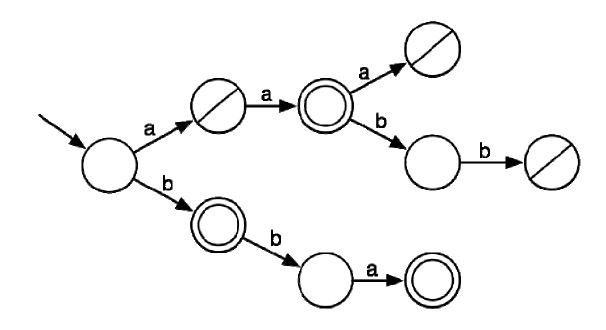


eg (timed) state machine

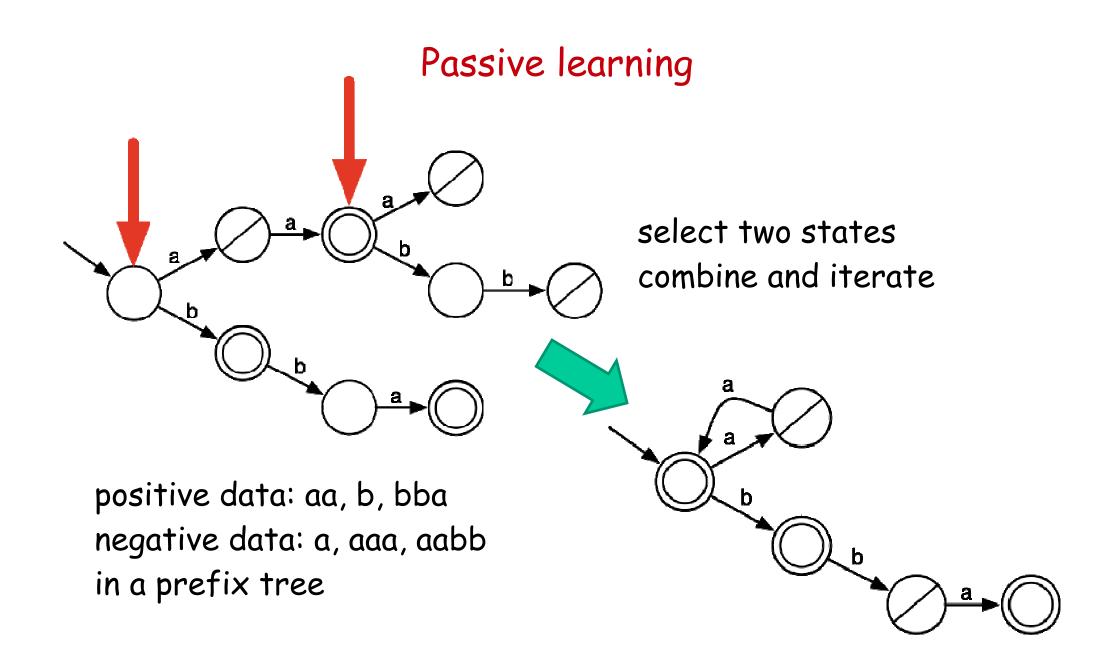
#### Learning malware models



#### Passive learning



positive data: aa, b, bba negative data: a, aaa, aabb in a prefix tree

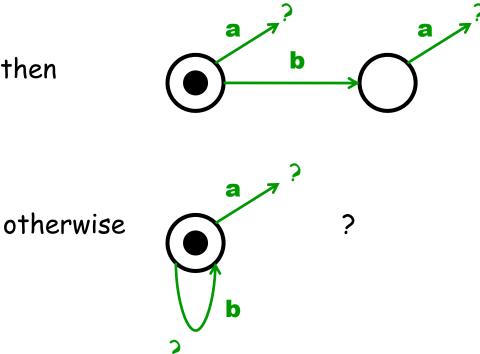


# Active learning with Angluin's L\* algorithm

Basic idea: compare a deterministic system's response to

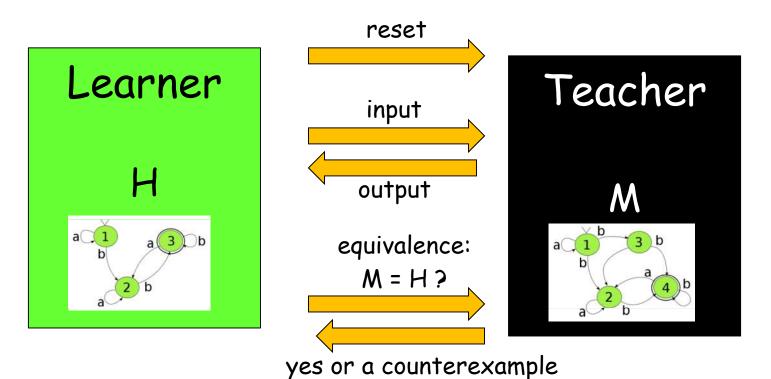
- a
- **b**;a

If response is different, then



# Active learning with L\*

Implemented in LearnLib library



Equivalence can only be approximated in a black box setting

Learning set-up for banking cards

abstract instructions concrete instructions and response and response Learner instruction Teacher INS M INS + args test 2 byte a 📜 1 a 3 b status word SW harness data + SW

# Test harness for EMV

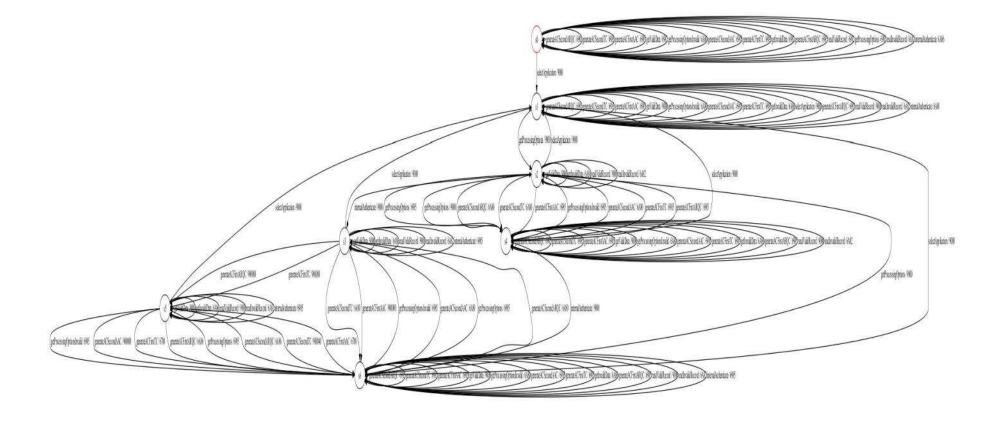
Our test harness implements standard EMV instructions

- SELECT (to select application)
- INTERNAL AUTHENTICATE (for a challenge-response)
- VERIFY (to check the PIN code)
- READ RECORD
- GENERATE AC (to generate application cryptogram)

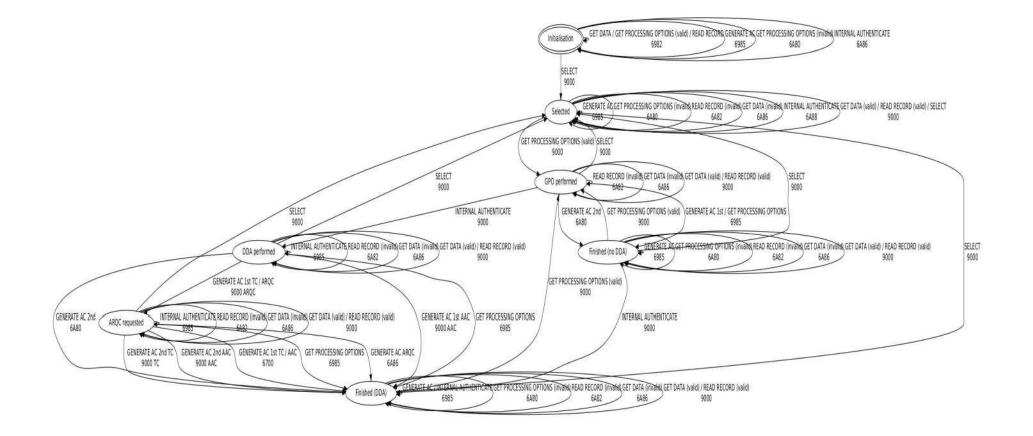
LearnLib then tries to learn all possible combinations

• Most commands with fixed parameters, but some with different options

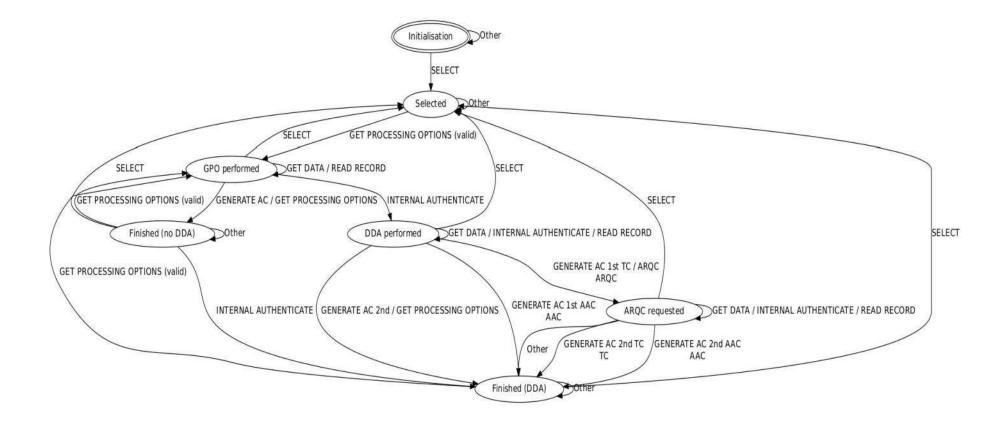
#### Maestro application on Volksbank bank card *raw result*



#### Maestro application on Volksbank bank card merging arrows with identical outputs



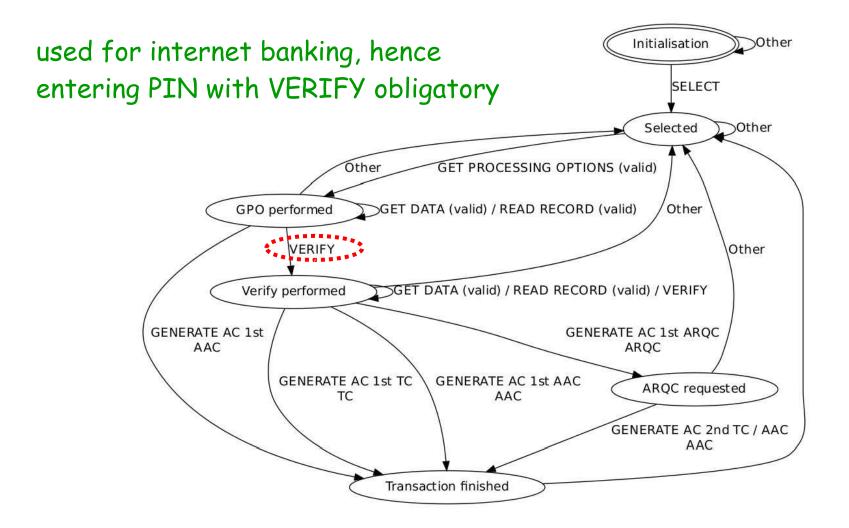
#### Maestro application on Volksbank card merging all arrows with same start & end state



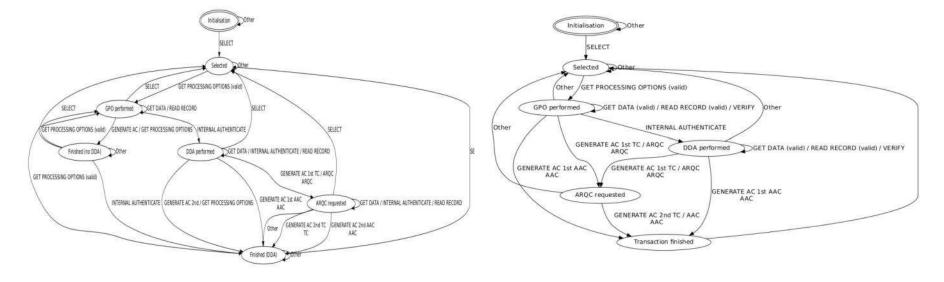
# Formal models for free!

- Experiments with Dutch, German and Swedish banking and credit cards
- Learning takes between 9 and 26 minutes
- Editing by hand to merge arrows and choose sensible names for states
  - could be automated
- Limitations
  - We do not try to learn response to incorrect PIN as cards would quickly block...
  - We cannot learn about one protocol step which requires knowledge of card's secret 3DES key
- No security problems found, but interesting insight in implementations

#### SecureCode application on Rabobank card



## understanding & comparing implementations



Volksbank Maestro implementation Rabobank Maestro implementation

Are both implementations correct & secure? And compatible?

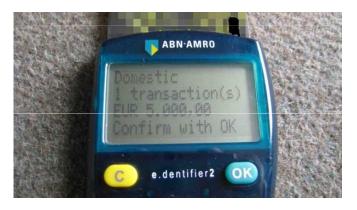
# Using these state-diagrams

- Analysing the models by hand, or with model checker, for flaws
  - to see if *all paths* are correct & secure
- Fuzzing or model-based testing
  - using the diagram as basis for automated fuzz testing
  - fuzzing the order and/or the parameters of commands
- Program verification
  - proving that there is no functionality beyond that in the diagram
- Using it when doing a manual code review

### Case study: analysis of internet banking devices

- Just in case you think that of course there won't be security flaws in banking soft/hardware that could be found using these techniques...
- We analysed a USB-connected smartcard reader for internet banking that provides a trusted display for What-You-Sign-Is-What-You-See





- Reverse engineering reveal a major security protocol flaw
- This was done manually but could have been found by fuzzing USB instructions

[Blom et al., Designed to fail, NORDSEC 2012]

# Conclusions

- Fuzzing (model-based testing) and active learning are closely related
- State machines are a great specification formalism
  - easy to draw on white boards, typically omitted in official specs and you can extract them for free from implementations
  - using very standard, off-the-shelf, tools like LearnLib
- Useful for security analysis of protocol implementations
  - for reverse engineering, fuzz testing, or formal verification
- Future work: learning *extended* finite state machines with variables (eg the internal transaction counter in EMV cards)

#### Questions?