

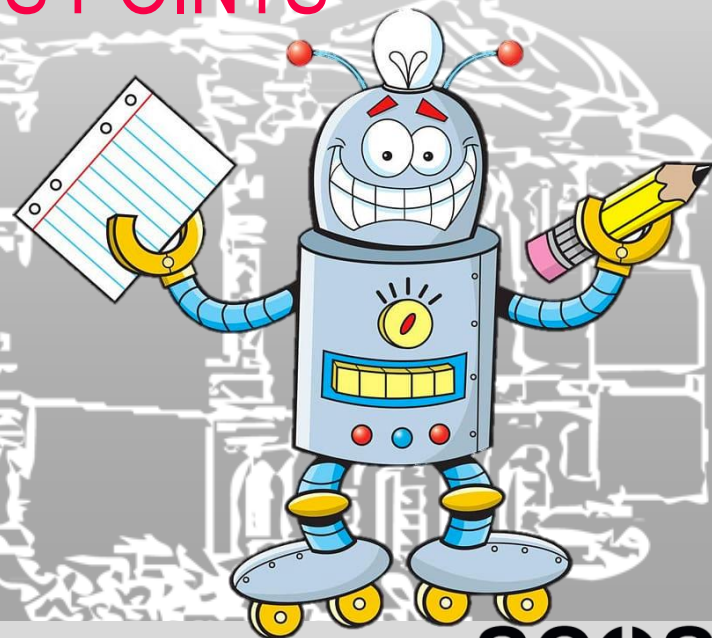
# MACHINE LEARNING

## LEARNING IEEE802.11 ACCESS POINTS

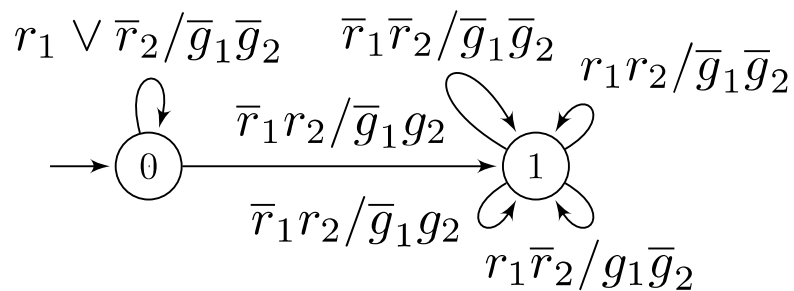
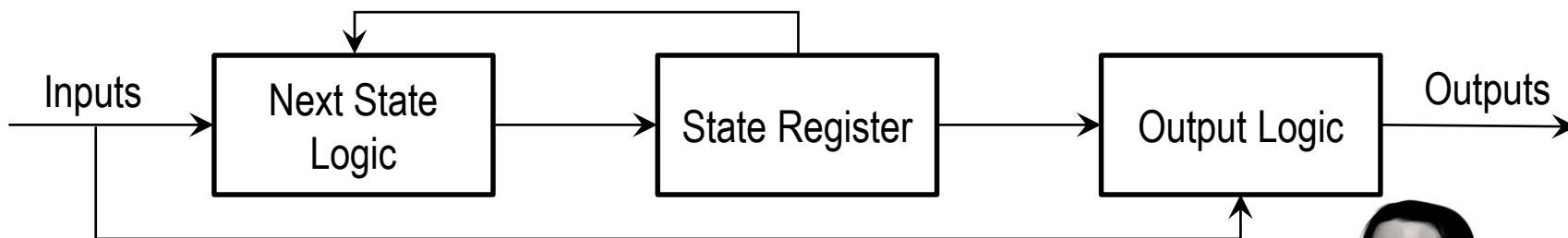
Masoud Ebrahimi

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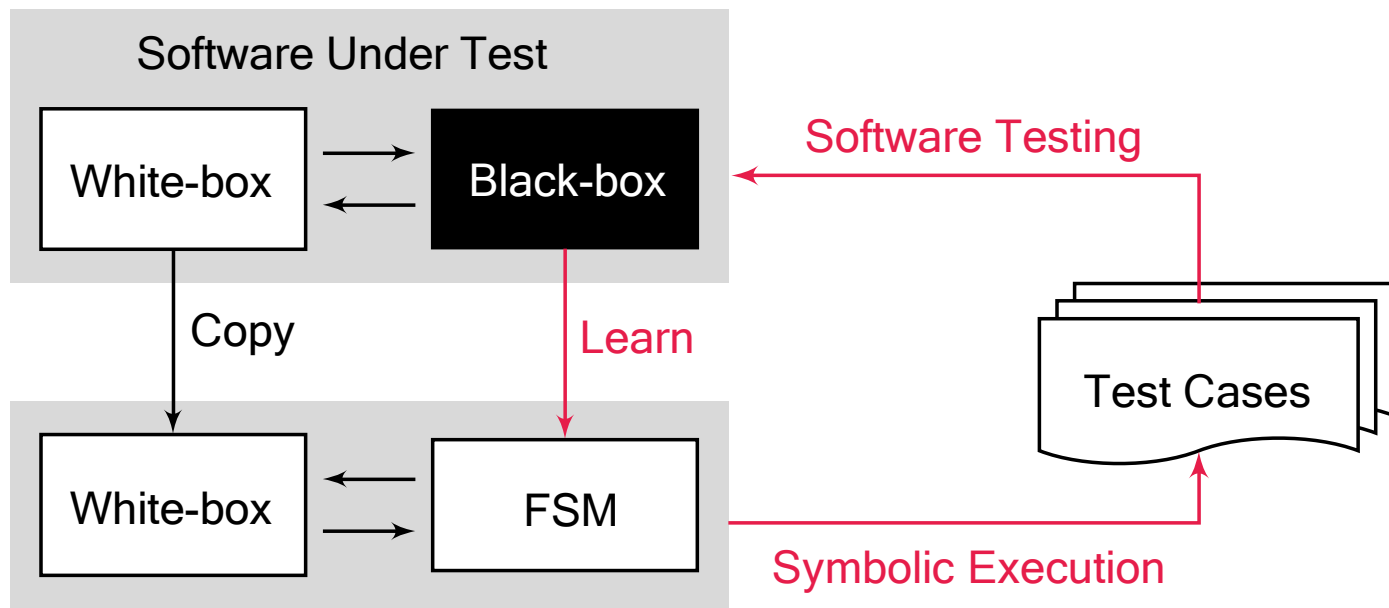
27.01.2020



# Mealy Machine Learning



# Motivation: Integration Testing

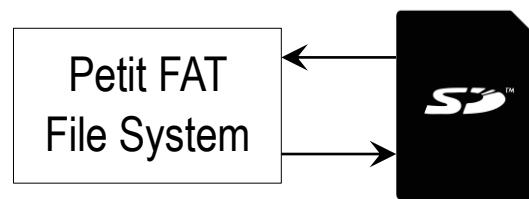


- Learn **black-box** by automata learning.
- Execute learned setup symbolically.
- Test software under test automatically.

# Does it Work? Really!?



- We build file systems on top of **disks (controller, content).**
- We found the following **bug** automatically.



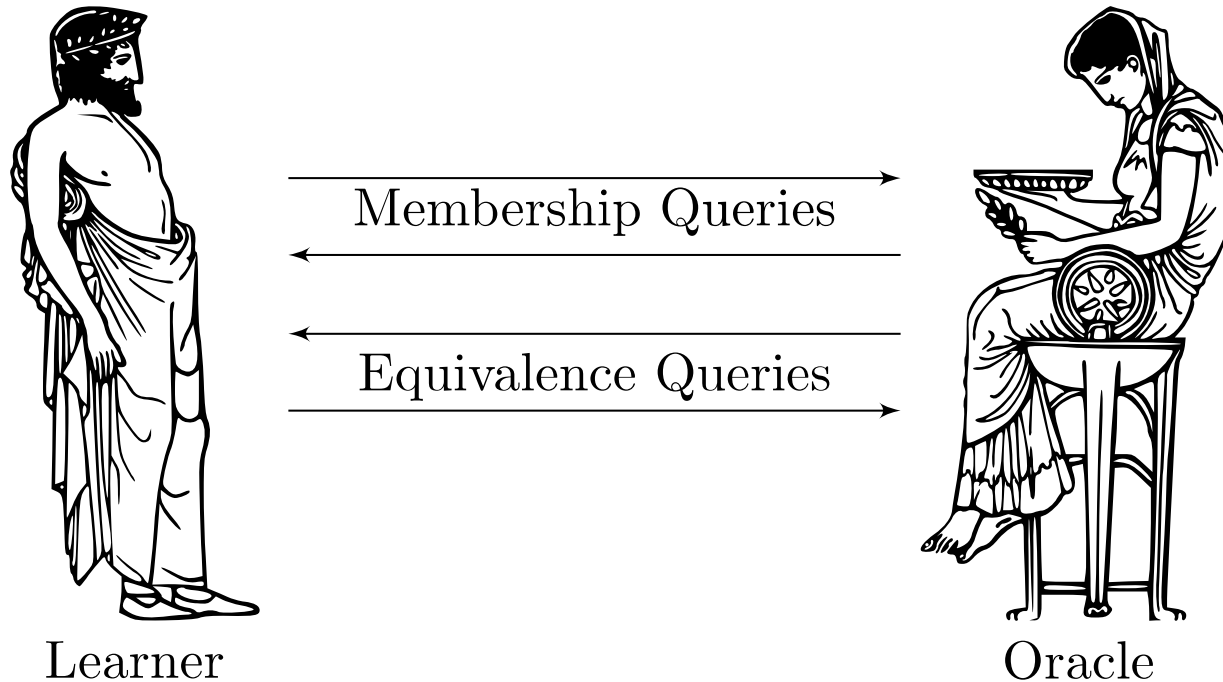
```

x unsigned char ← type
                type → y symbolic buffer

fs->csize = buf [ BPB_SecPerClus - 13 ];
fs->nrootdir = LD_WORD(buf + BPB_RootEntCnt - 13);
tsect = LD_WORD(buf + BPB_TotSec16 - 13);
if (!tsect) tsect = LD_DWORD(buf + BPB_TotSec32 - 13);
mclst = (tsect
        - LD_WORD(buf + BPB_RsvdSecCnt - 13) - fsize
        - fs->nrootdir / 16) / fs->csize + 2;
fs->nfatent = (CLUST)mclst;
    
```

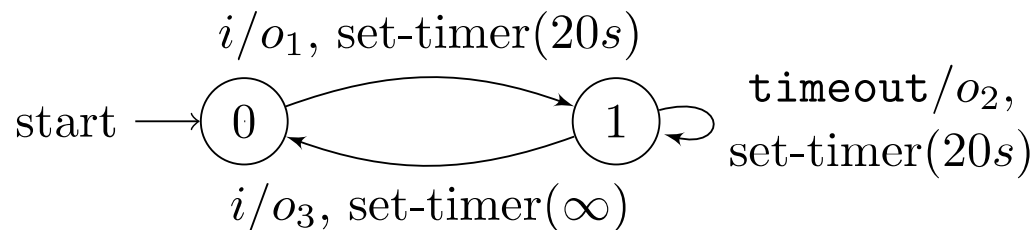
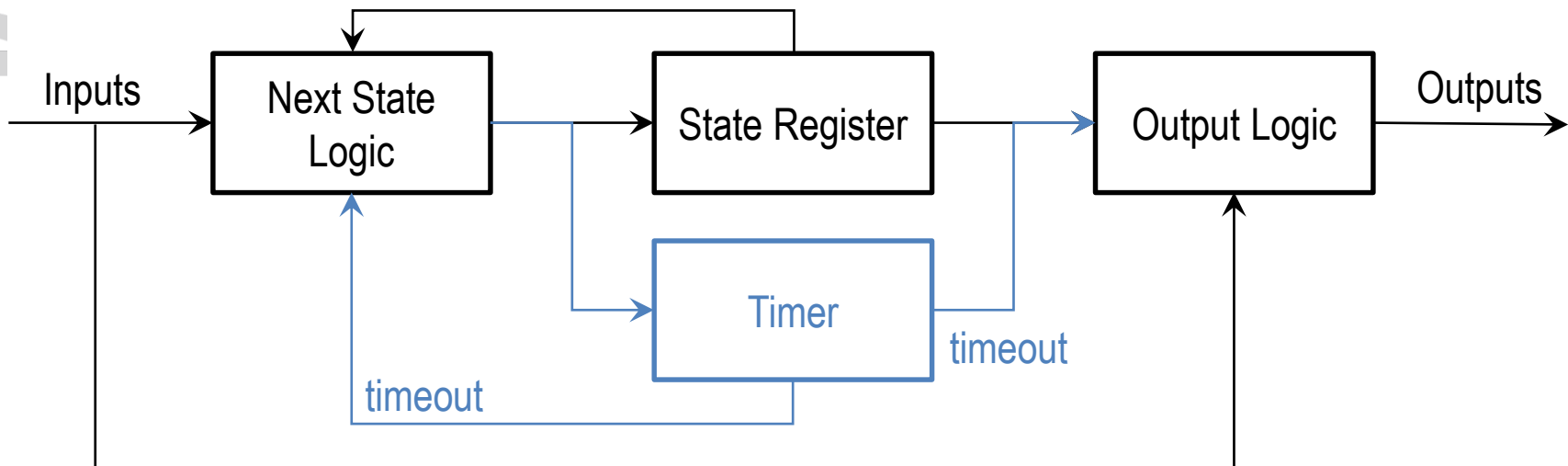
{ **division by zero** ←      ↓      **z overflow**

# Minimally Adequate Teacher



- Membership Queries
  - What is the reaction of **black-box** to an input word?
- Equivalence Queries
  - Did I learn the **right model**? If not what is a **counterexample**?

# Mealy Machines with One Timer

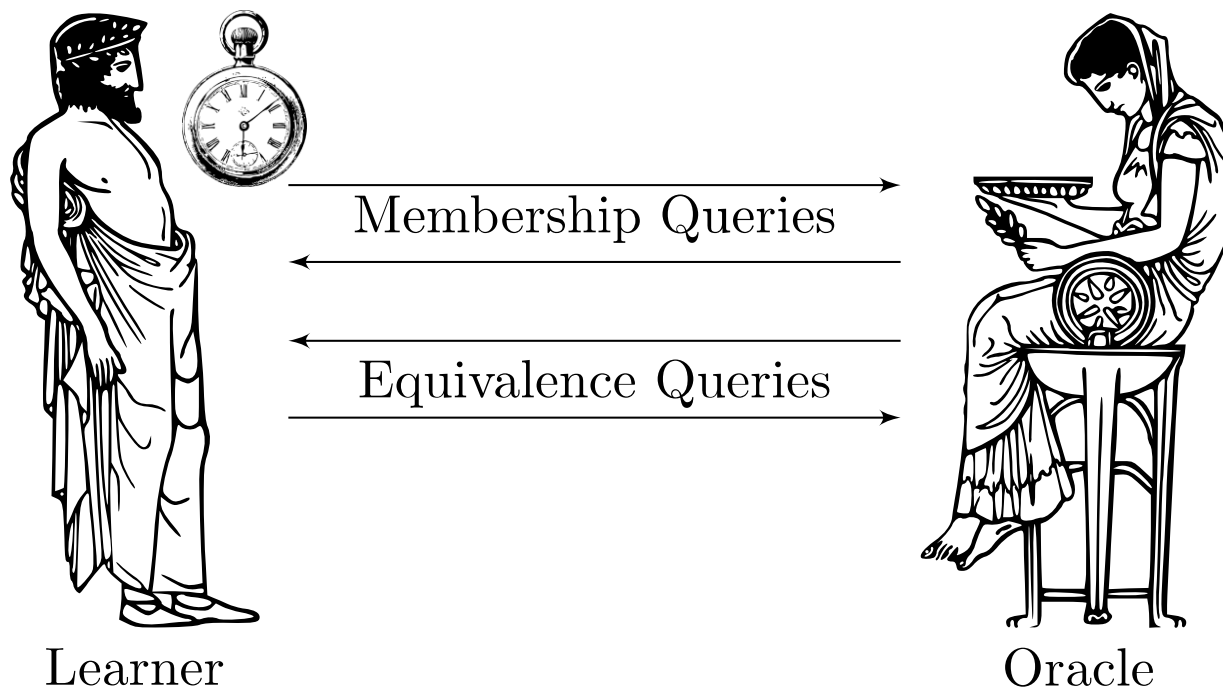


# Learning Mealy Machines with One Timer

Extending Active Automata Learning



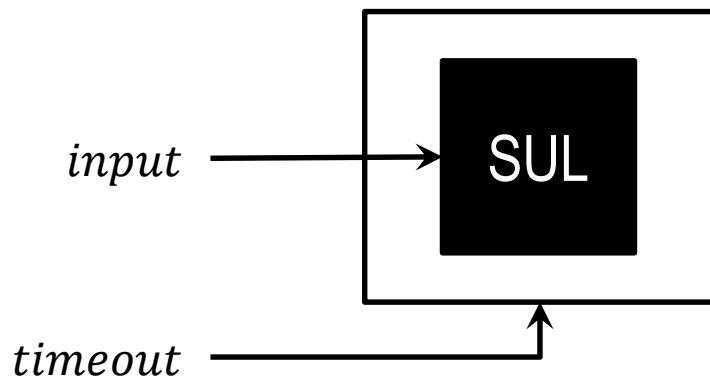
# Timed Learner



- Membership Queries
  - How long does it take for the **black-box** to react an input word?
- Equivalence Queries
  - Did I learn the **right model**? If not what is a **counterexample**?

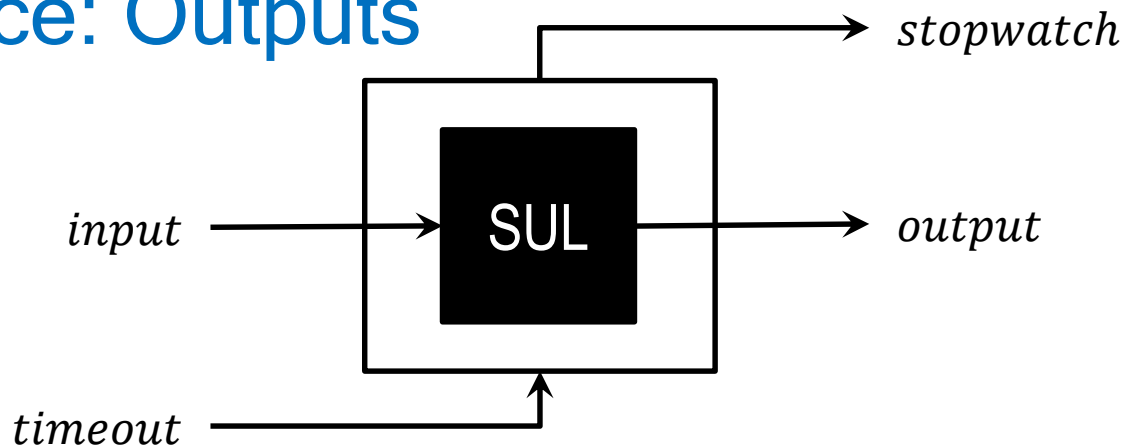


# Interface: Inputs and Timeout



- Input Symbols
  - Explicit inputs to the SUL
- Timeout Symbol
  - An implicit input to the SUL
  - Observe SUL's output for maximum  $\Delta$  time units
  - If an output happens then a timeout has occurred

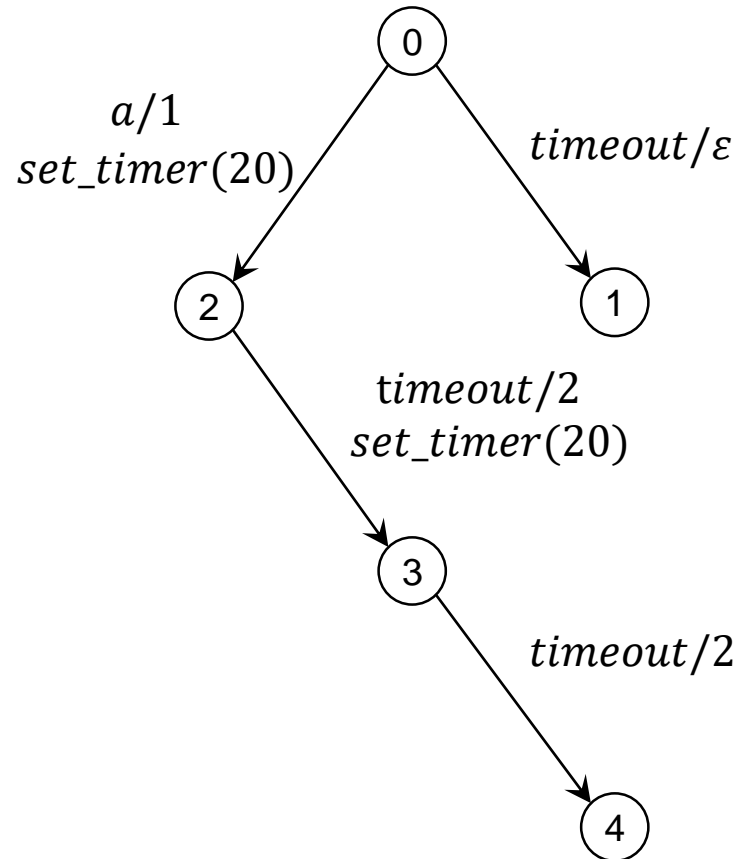
# Interface: Outputs



- In Response to Inputs with a time measure of zero.
- In Response to Timeout Symbol
  - No output seen in  $\Delta$  time units.
  - *output* with a time measure  $\delta \leq \Delta$  indicates a timeout occurred after  $\delta$  time units.

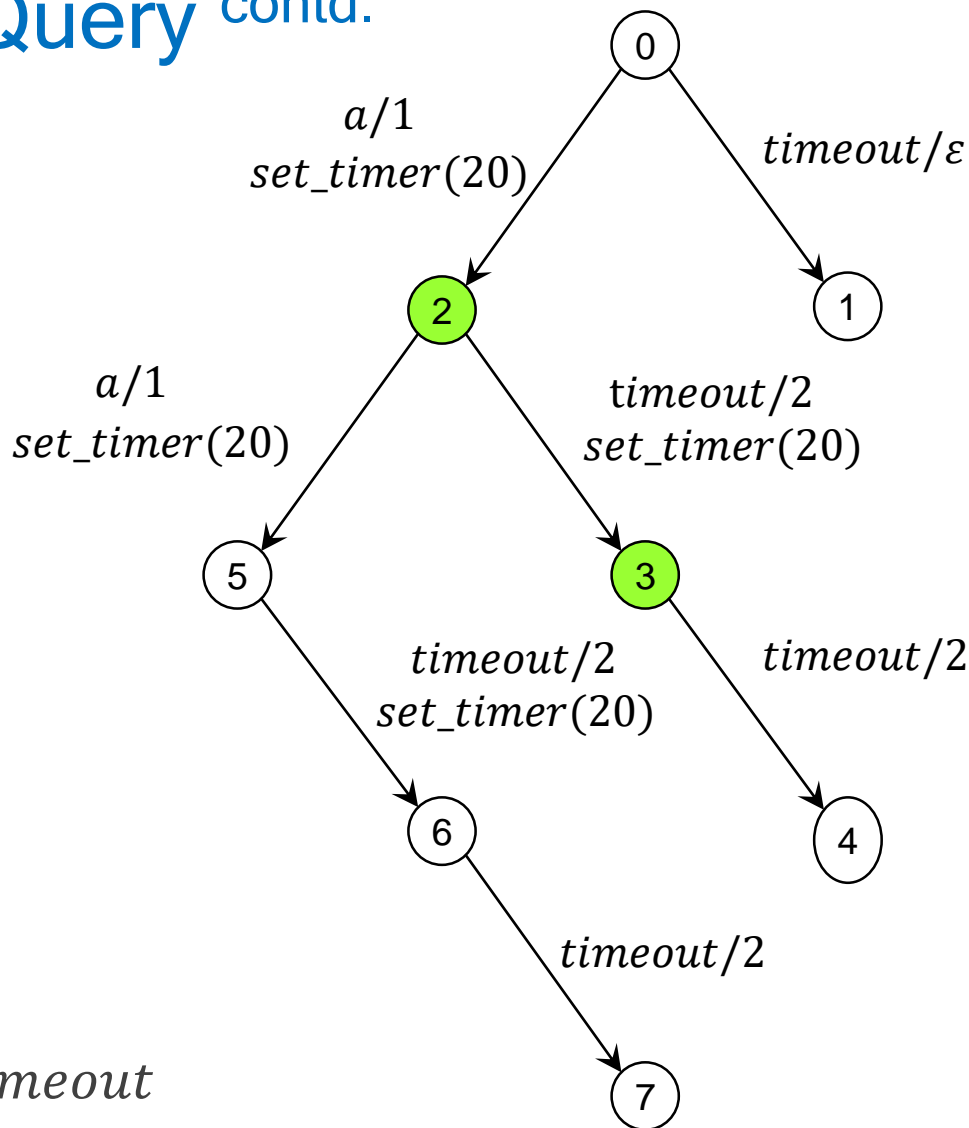
# Membership Query

- Input Word
  - $a, timeout$
- Prefixes
  - $\epsilon$
  - $a$
  - $a, timeout$
- Queries
  - $\epsilon, timeout$
  - $a, timeout$
  - $a, timeout, timeout$

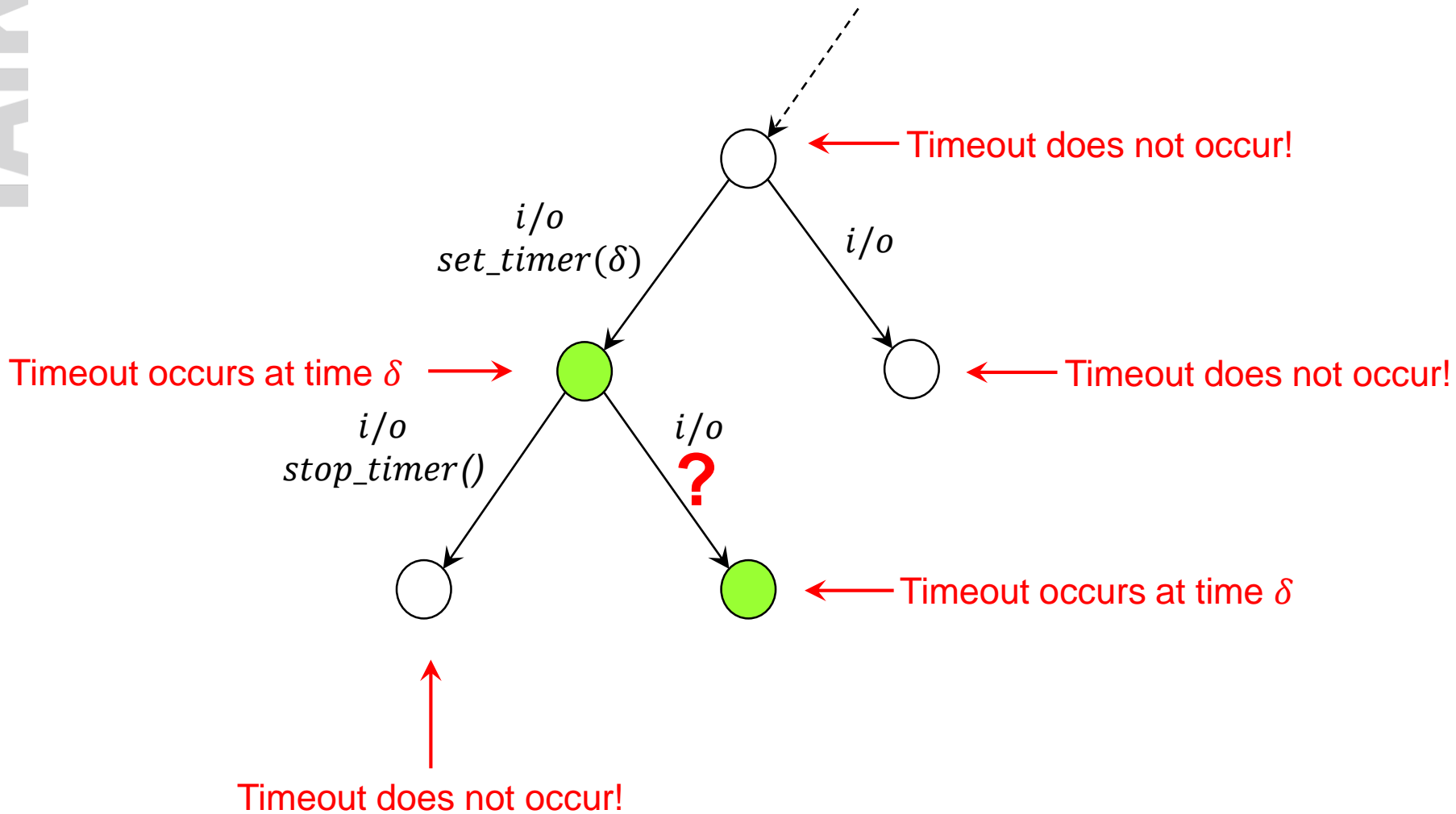


# Membership Query contd.

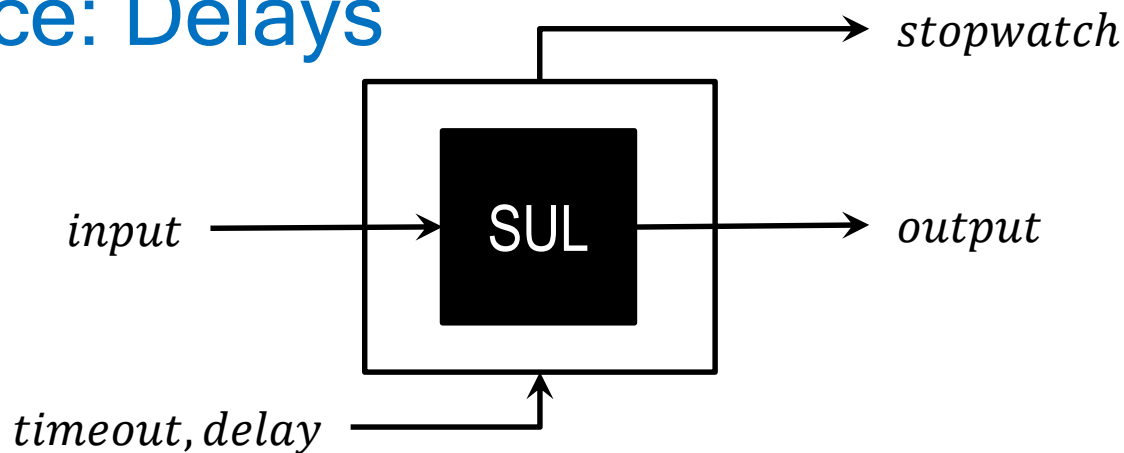
- Input Word
  - $a, a, timeout$
- Prefixes
  - $\epsilon$
  - $a$
  - $a, a$
  - $a, a, timeout$
- Queries
  - $\epsilon, timeout$
  - $a, timeout$
  - $a, a, timeout$
  - $a, a, timeout, timeout$



# Practical Challenges



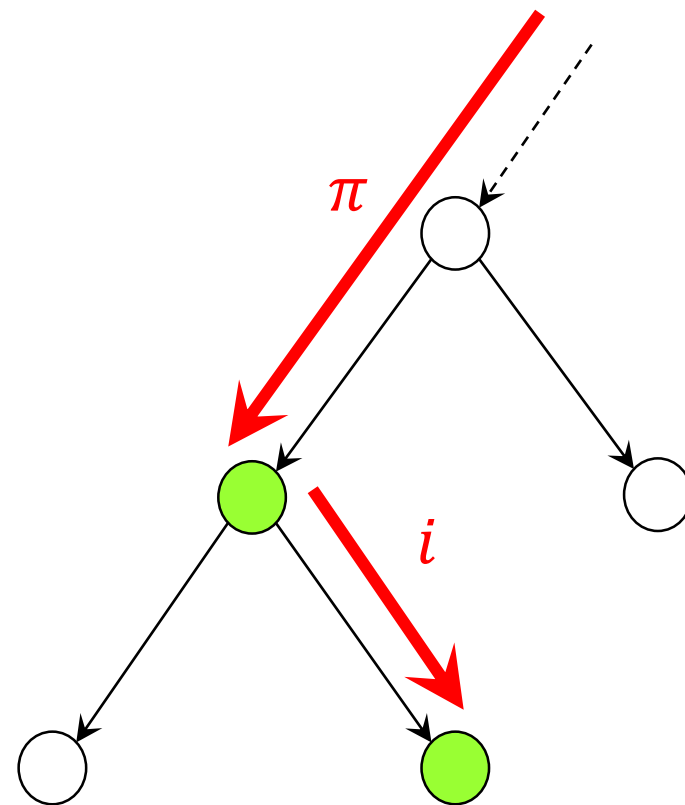
# Interface: Delays



- Delay Symbol
  - Dummy input
  - Learner knows about it.
  - SUL/Oracle knows nothing about it.
  - Whenever delay occurs, learners wait for  $d \leq \Delta$ .

# Practical Challenges contd.

- Query  $\pi.i.timeout$   
Timeout occurs at time  $\delta$
- Query  $\pi.delay.i.timeout$   
Timeout occurs at time  $\delta'$
- If  $\delta' = \delta - d$  then timer reset does not occur, else timer is reset to  $\delta'$ .






# Learning IEEE802.11


Unblocking Uncontrolled Port  
to Initiate 4-Way Handshake



# IEEE802.11 Authenticating State Machine

- IEEE802.11 Standards specifies security mechanisms for Wireless Networks. 

- Often implemented as 4-Way handshake in Access Points.

- No available Implementations
  - Testing authentication step is **access point** specific. 

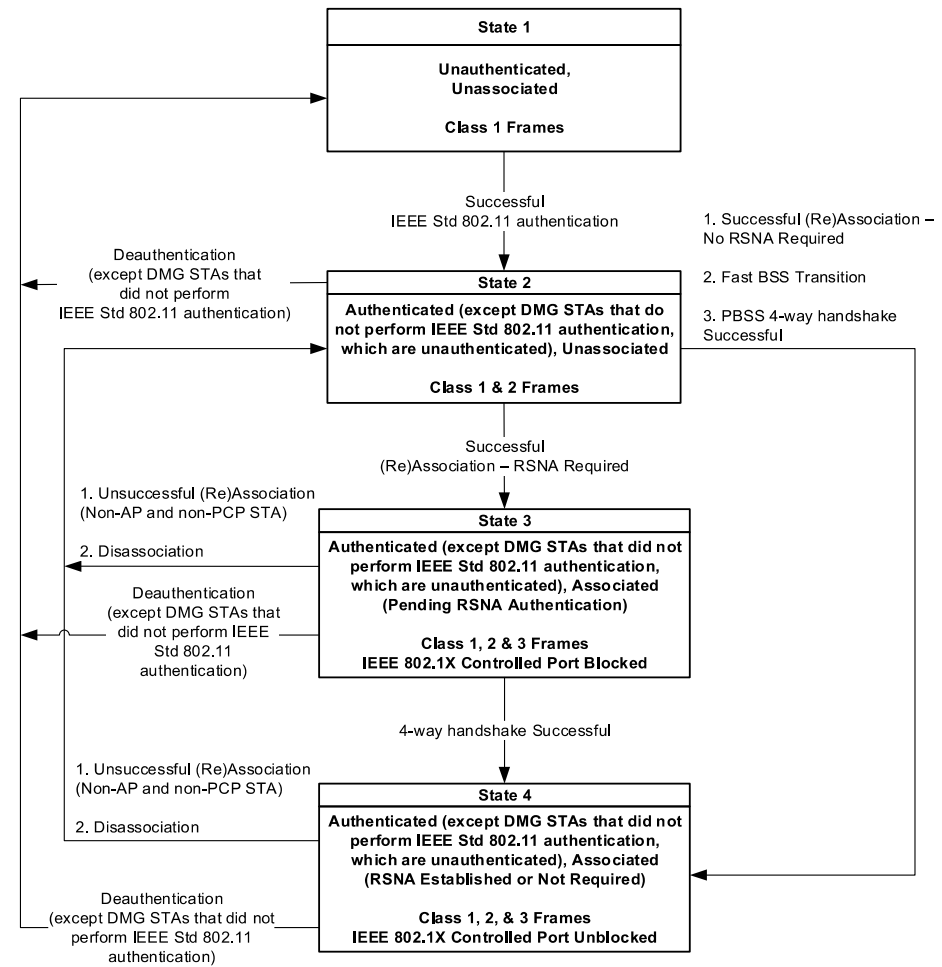


Figure 11-13—Relationship between state and services between a given pair of nonmesh STAs

# Initiating IEEE802.11 4-Way Handshake

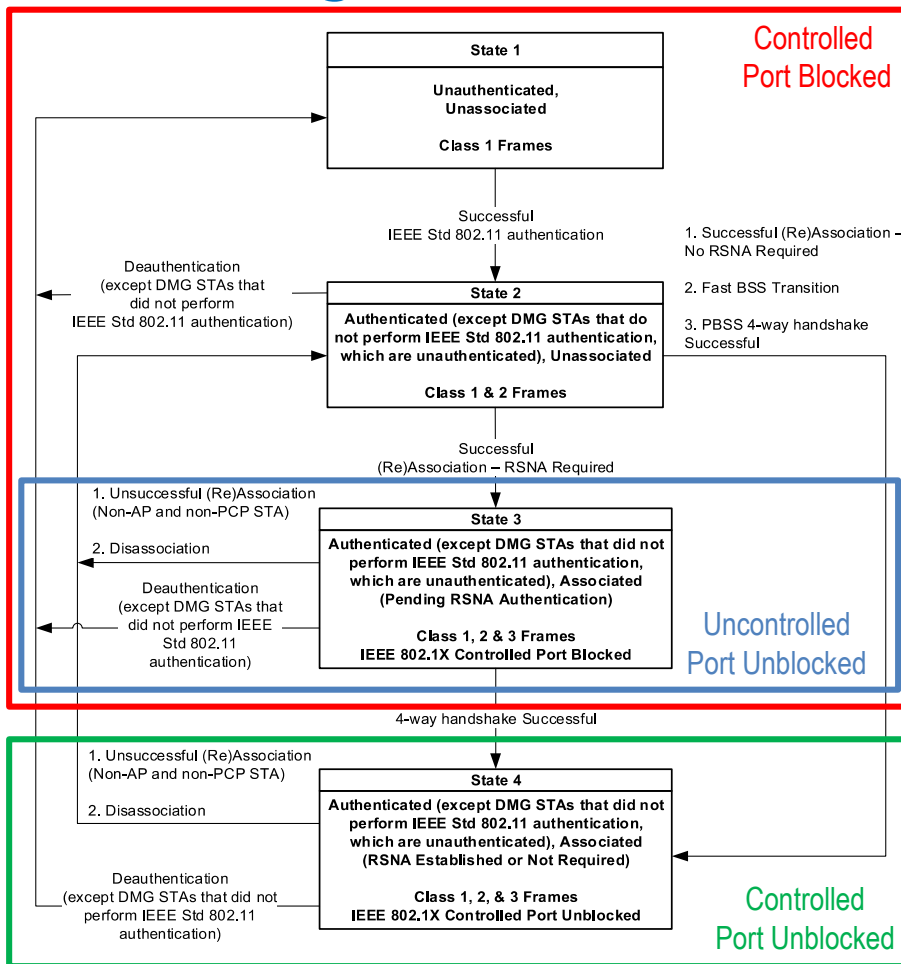


Figure 11-13—Relationship between state and services between a given pair of nonmesh STAs

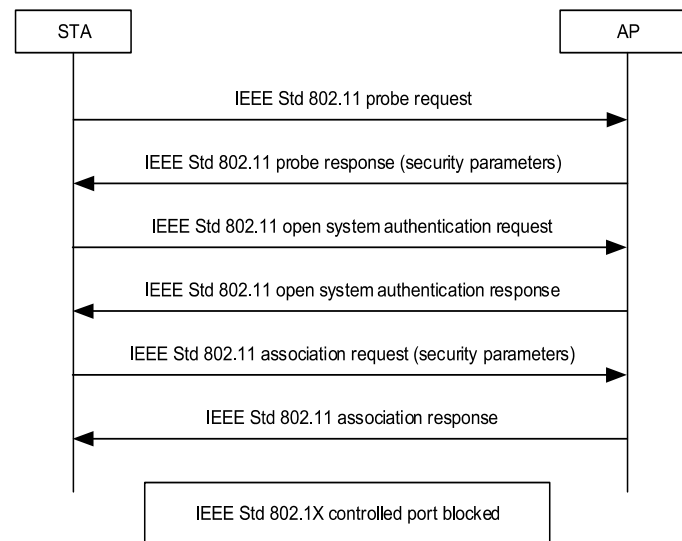


Figure 4-25—Establishing the IEEE 802.11 association

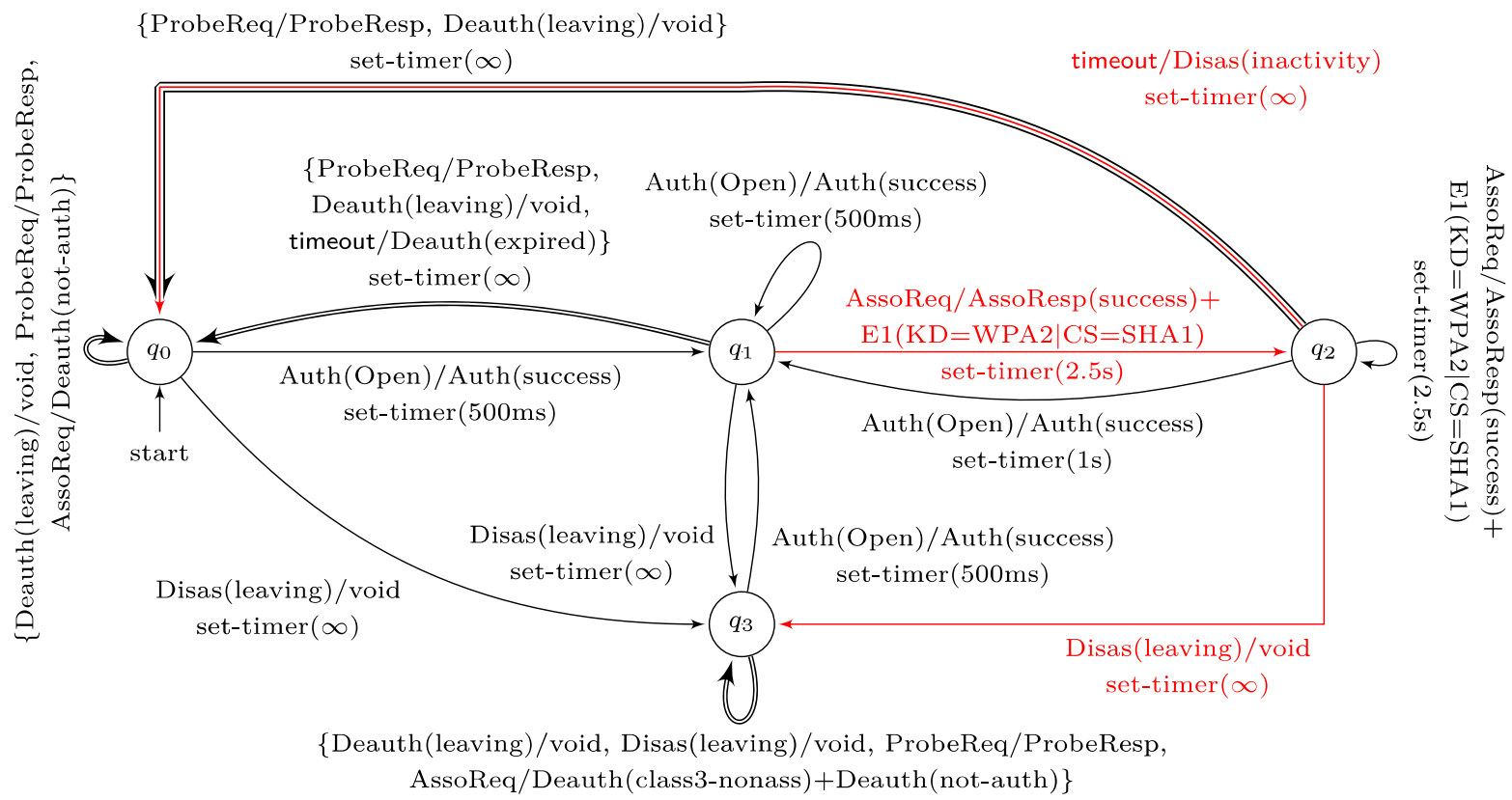


# Feasible? How?

- **Access Point**
  - Reverse Engineer
  
- Transmitter STA
  - Sends inputs to AP
  
- Receiver STA
  - Sniffs outputs of AP



# IEEE802.11 Controller in Huawei's Android



MM1T of a Huawei Mate10-lite that captures granting uncontrolled port. Double and triple edges represent a set of transitions. We rounded timer values to the nearest 500ms and marked specification violations with the color red.

# Bachelor's and Master's Projects

Want to “Learn” More?  
Let's do it!

