

# CUT-THE-ROPE: A Game of Stealthy Intrusion

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## ① CUT-THE-ROPE

- Motivation and Introduction
- Invisible Intrusion
- Asynchronicity of Moves
- Game Model and Results



Characteristics of contemporary cyber attacks:

- stealthy
- no noticeable start (often by a harmlessly looking email, malicious USB device, ...)
- adapted to the victim system (defender's "usual" moves, ...)

→ Conventional game theoretic models are difficult to apply for practitioners

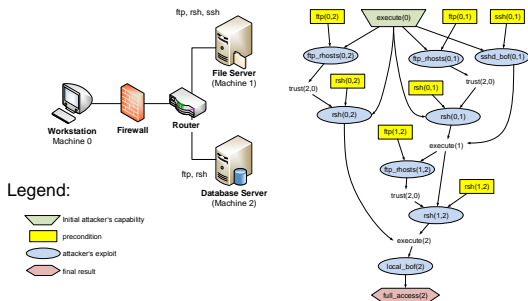


Why conventional game theoretic models are difficult to apply for practitioners:

- the game is not round based
- it has no defined start, but a defined finish (the loss of the target asset)
- defender cannot cope with an arbitrary lot of losses → average loss often makes no sense to optimize, since **losses** normally **don't average**, but **accumulate**!
- accurate models often come with too many parameters (that are hard to understand and even harder to instantiate)



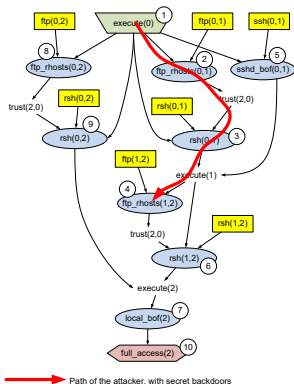
- our challenge is to defend an infrastructure from intruders, seeking to access a database server (**machine 2**) with sensitive personal information on it (e.g., customer data).
- Such attacks usually start from some workstation (here **machine 0**) (initial access established by social engineering)





The **playground** is an **attack graph**, on which the attacker (inspectee) tries to hiddenly get to the target node, here ⑩, from a starting node ①, while the defender (inspector) tries to prevent that.

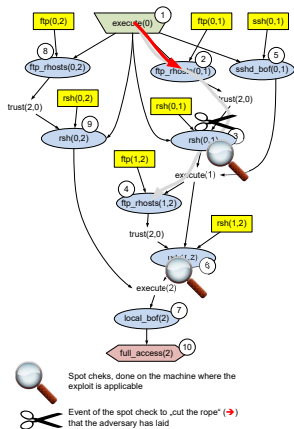
- Along the way, the attacker installs backdoors for an easy comeback to learn how to get over to the next node (closer to the target).





The **playground** is an **attack graph**, on which the attacker (inspctee) tries to hiddenly get to the target node, here ⑩, from a starting node ①, while the defender (inspector) tries to prevent that.

- Along the way, the attacker installs backdoors for an easy comeback to learn how to get over to the next node (closer to the target).
- The defender spot-checks the system, and – even unknowingly – cleans a machine from a backdoor, e.g., by patching, updating, changing passwords, etc.





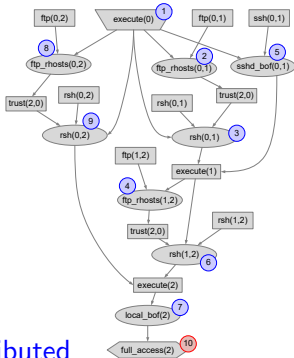
A central characteristic of APTs is their stealthiness, so the defender has...

- no idea from where the attacker may start, or how far it has already made it into the system.
- **no means of knowing when the game originally started** (even if it started already), or for **how many rounds** it has been played.
- The only noticeable event is the attacker having reached the target → by then, the inspector is "effectively dead", and the game is lost.
- typically **fixed schedules** of becoming active (during daily working hours), while the **attacker can move at any point in time** (the game is **round-based for the defender**, while it is in **continuous time for the attacker** → this "asynchronicity" is usually not found in most game theoretic models.





- Defender never “sees” the attacker (or knows its location)
- We consider **one adversary type per possible location** (excluding the target ⑩), each of which induces its own strategies (paths towards ⑩ and exploits thereon)
- Bayesian game to capture the invisibility



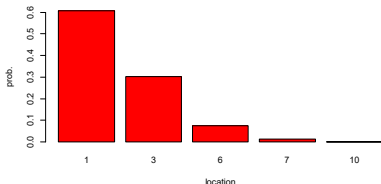
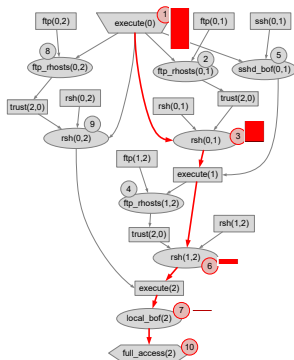
→ payoff = **distance** to  $v_0$ , **Poisson distributed**

→ stochastically ordered (keep the attacker away from  $v_0$ , optimizing an average distance is **meaningless** here).

# Defining the Payoffs 1



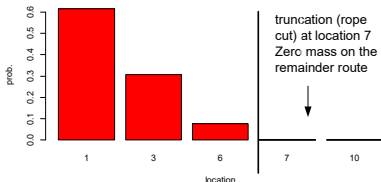
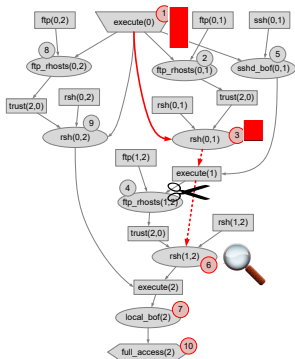
- For example, taking attack path #5, the attacker will move a random number of  $N$  steps further down on the **red route**  $\rightarrow$
- The payoff is thus a random variable, putting a probability mass on each upcoming location according to the Poisson distribution.
- This is a payoff for a type  $\theta = 1$  adversary, taking its pure strategy (attack path #5), conditional on the defender **not intercepting this path yet**.



# Defining the Payoffs 2



- If the defender, however, **intercepts** the route, say by spot-checking at location ⑥, which is one of the defender's pure strategies, then the path gets cut,
- and the payoff distribution becomes truncated ↘





- Game model: “simple” matrix game
  - defender’s actions: all nodes (in the attack graph) that admit spot checking
  - adversary’s actions: all attack paths
- payoffs: determined by truncating distributions
- optimization of tail mass = probability to hit target asset  $v_0$
- equilibrium: perfect Bayesian (here, equivalent to a multi-criteria security strategy, by fictitious play)
- easy to implement (taking  $\approx 30$  lines of code)
  - implemented in R, with the HyRiM package
  - for the example, take  $\lambda = 2$ , i.e., an average of two penetration steps being accomplished per time unit.
  - The full code is available for free download from <https://www.syssec.at/de/downloads/papers>



CUT-THE-ROPE features:

- asynchronous movement, **discrete time player** vs. **continuous time opponent**
- strong asymmetry: only one out of two players knows when the game starts
- ease of implementation (takes only a few lines of code to run)
- ease of **generalization**, like:
  - randomized defense actions
  - probabilistic success (of the defender and/or attacker)
  - multiple target assets

all amount to humble changes of the Poisson distribution (into something else), i.e., **effectively only 1 line of code needs to be changed**

More to see, try, discuss at the poster session!

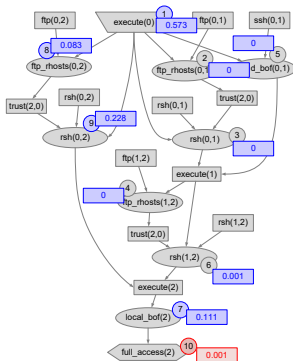


Example 1: Defender can spot-check on  $V' = \{1, 2, \dots, 9\}$  (i.e., everywhere)

- The PBE obtained is in pure strategies, prescribing the defender to periodically patch potential local buffer overflows at machine 2 (optimal pure strategy being `local_bof(2)`), while the attacker is best off by choosing the attack path `execute(0) → ftp_rhosts(0,2) → rsh(0,2) → full_access(2)`.
- This matches the intuition of the best strategy being the defense of the target, by avoiding exploits thereon.
- Since all attack paths intersect at the node `local_bof(2)`, this equilibrium is not surprising.



- The equilibrium utility for the attacker is it to be located at positions  $V = \{1, 2, \dots, 10\}$  with probabilities  $U^* \approx (0.573, 0, 0, 0, 0, 0.001, 0.111, 0.083, 0.228, 0.001)$





Example 2: Defender can spot check only on  $V' = \{2, 3, 5, 6, 8\}$ , i.e., can fix FTP and RSH connections, as well as buffer overflows.

- The equilibrium utility for the attacker is it to be located at positions  $V = \{1, 2, \dots, 10\}$  with probabilities  $U^* \approx (0.545, 0.017, 0.030, 0.022, 0.012, 0.034, 0.128, 0.021, 0.045, 0.146)$

