



Formalizing Agent's Beliefs for Cyber-Security Defense Strategy Planning

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Introduction

- ▶ **Proactive** measures sometimes not possible.
e.g. proactive removal of known vulnerabilities
Critical infrastructure remains exposed.
- **Reactive** strategies at a last stage of an attack.
- maintain a model of an intruder's belief state
formalized using Probabilistic Doxastic Temporal (**PDT**) Logic.



Considerations and Assumptions

- ▶ We start at a **last point of defense**.
- ▶ **Highly skilled** attacker with extensive knowledge about our network.
- ▶ **Two stages** of an attack.
 - Stage of escalated privileges (“Shell”).
 - Code execution of (handcrafted) malware (“Exec”).



Shell

- ▶ “From stock”
 - ▶ Obtained through (standard, **known**) **patterns**.
 - ▶ Can be detected through an IDS: $Obs_D(attack(X))$.
 - ▶ Does not expose attacker’s identity.
- Can be **defended()**. OR
- If **monitored**, can allow observation of executed code.



Code execution

- ▶ Will be **handcrafted**.
 - ▶ Might allow **identification** of attacker.
 - ▶ Might reveal **intention** of attack.
 - ▶ Can seriously *harm* our system.
 - ▶ If not immediately observed, **no traces left**.
- So we should **always defend?** but



Always defend?

- ▶ **No.** No IDS is perfect.
- ▶ Would perfectly tell the attacker if **she is undetected.**
- ▶ Defense might be dangerous as well.



Minimal Example - Introduction

- ▶ We have two devices.
- ▶ **Productive** system and **Backup** system.
- ▶ Backup can be **sacrificed**.
- ▶ Only defend productive?



Minimal Example - Introduction

- ▶ We have two devices.
- ▶ **Productive** system and **Backup** system.
- ▶ Backup can be **sacrificed**.
- ▶ Only defend productive?
No. We perfectly tell her which device to attack.



We can belief...

- ▶ At every timestep one attack (maybe).
 - ▶ **Observe nothing** at t → **missed an attack** at t or at $t - 1$.
 - ▶ **Observe attack** at t , → missed a previous attack at $t - 1$.
- We consider multiple *worlds* possible.



Attacker can also belief...

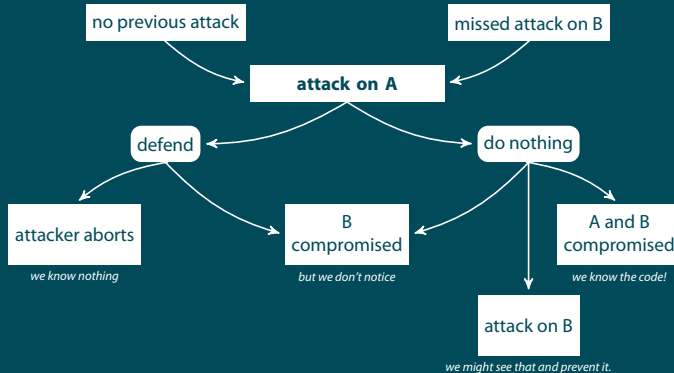
- ▶ Wants to execute her code stealthy, but wants to execute it.
- ▶ If she gains a shell, she can be...
 - (i) Stealthy: Execute directly and **disappear**.
 - (ii) Aggressive: Gain another shell to **broaden** attack.
 - (iii) Lure: **Distract** with attack to other host



PDT Logic

- ▶ **PDT logic** can **formalize** all considerations into one model.
- ▶ Reason about beliefs in **ranges**.
- ▶ World: *sequence of actions + associated probabilities*.
- ▶ Agents consider *multiple* worlds possible.
- ▶ Beliefs might *divulge*.

Minimal example - IDS says "attack on A"





Minimal example - PDT applied

- ▶ **Worst Case:** $\varphi = \text{exec}(B) \wedge \neg \text{Obs}_D(\text{exec}(B))$

$$\neg \text{defend}(A) \models B_D(\varphi) : [0, 0.05], \text{ and}$$

$$\text{defend}(A) \not\models B_D(\varphi) : [0, 0.05].$$

- ▶ I.e. we are better off not defending.

Minimal example - PDT applied

- ▶ Say, we don't defend $\neg defend(A)$.
- ▶ Opportunities to **analyze** the intruder's malicious **code**, i.e.,
 $\varphi = Obs_D(exec(A)) \vee Obs_D(exec(B))$

$$\neg defend(A) \models B_D(\varphi) : [0.9, 1].$$

- ▶ I.e. our belief is rather high, that we will be able to get a grasp at her code.
- ▶ Nested beliefs allow even deeper understanding.



Contributions

- ▶ Well-defined theory to formalize multi-agent beliefs.
- ▶ Formal analysis of an adversary's belief evolution.
- ▶ Enables advanced defense strategies.