

# Automated Intrusion Response

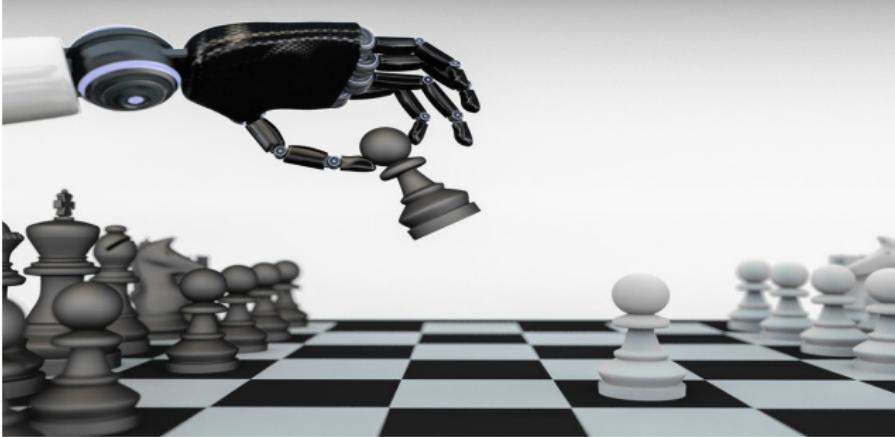
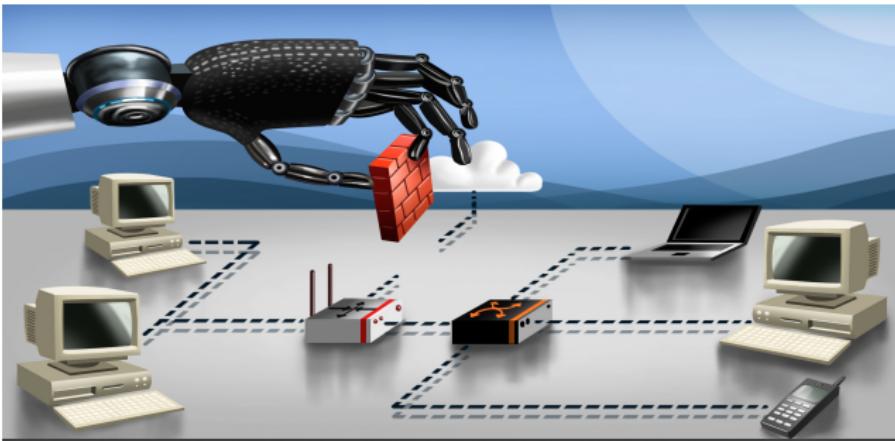
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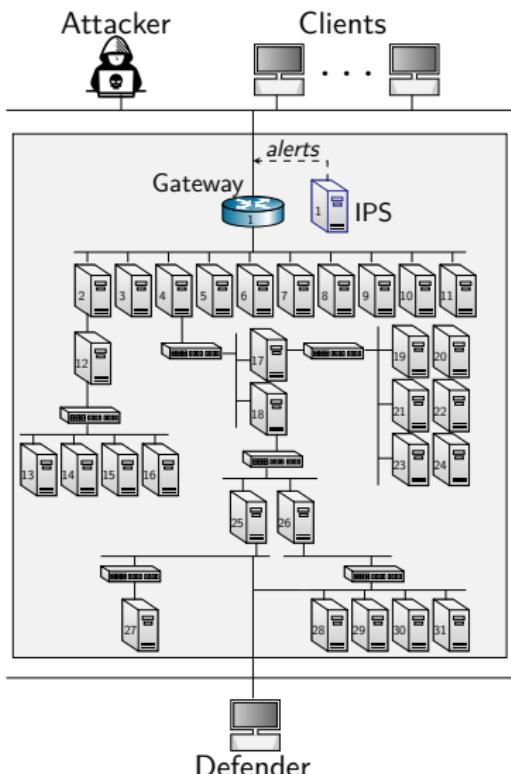


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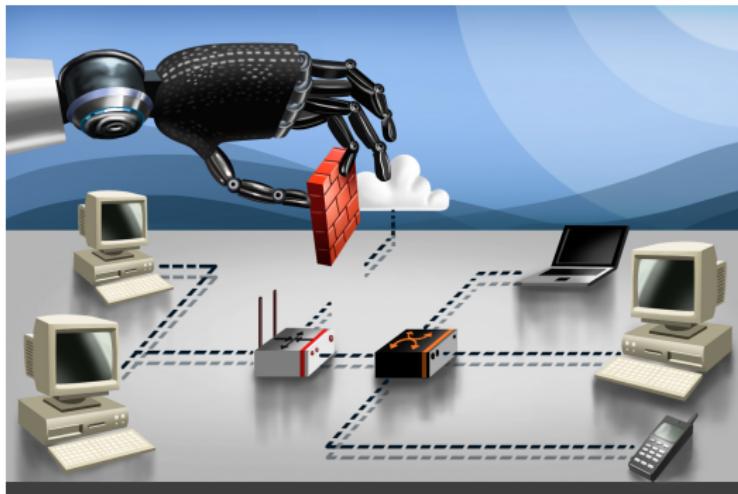


# Use Case: Intrusion Response

- ▶ A **defender** owns an infrastructure
  - ▶ Consists of connected components
  - ▶ Components run network services
  - ▶ Defender defends the infrastructure by monitoring and active defense
  - ▶ Has partial observability
- ▶ An **attacker** seeks to intrude on the infrastructure
  - ▶ Has a partial view of the infrastructure
  - ▶ Wants to compromise specific components
  - ▶ Attacks by reconnaissance, exploitation and pivoting



# Automated Intrusion Response



**Levels of security automation**



**No automation.**

Manual detection.

Manual prevention.

No alerts.

No automatic responses.

Lack of tools.



**Operator assistance.**

Manual detection. System has automated functions

Manual prevention. for detection/prevention

Audit logs.

Security tools.



**Partial automation.**

but requires manual

updating and configuration.

Intrusion detection systems.

Intrusion prevention systems.



**High automation.**

System automatically

updates itself.

Automated attack detection.

Automated attack mitigation.

# Automated Intrusion Response



Can we find effective security strategies through decision-theoretic methods?

## Levels of security automation



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### High automation.

System automatically

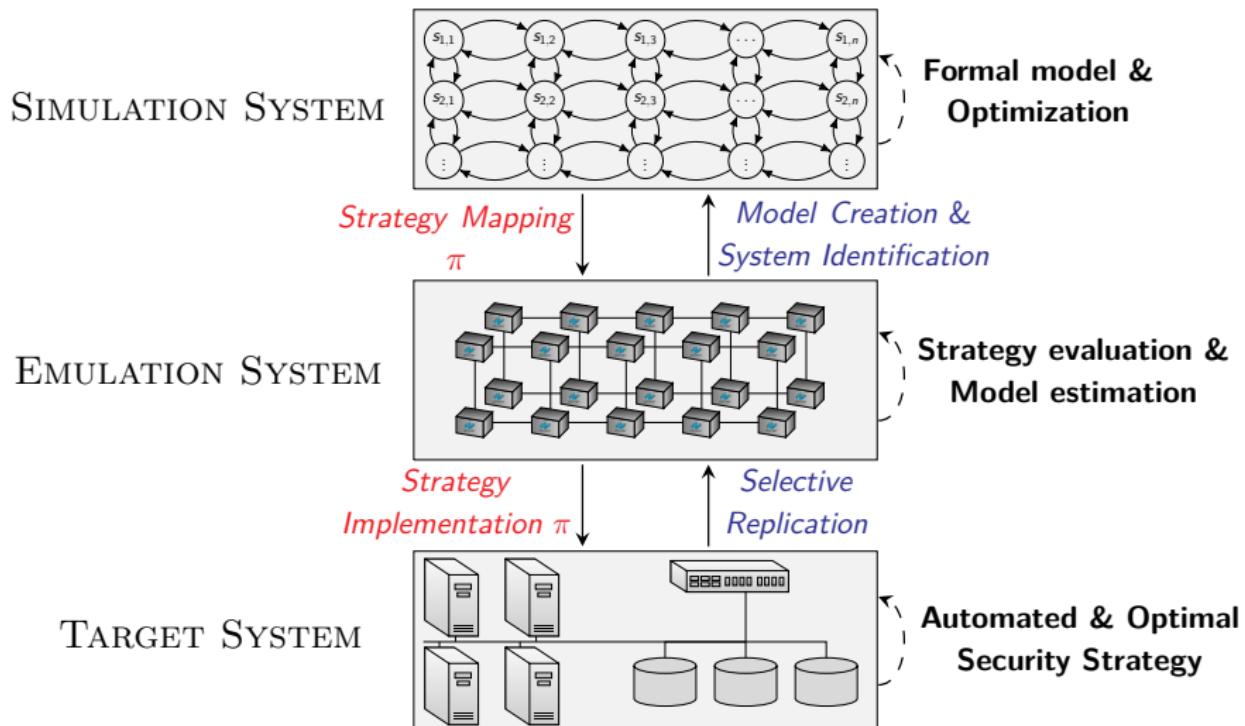
updates itself.

Automated attack detection.

Automated attack mitigation.

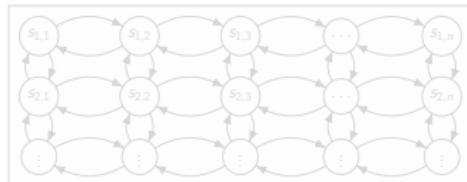
Intrusion prevention systems.

# Our Framework for Automated Intrusion Response



# Our Framework for Automated Intrusion Response

SIMULATION SYSTEM



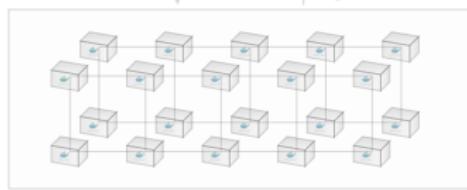
Formal model & Optimization

Strategy Mapping

$\pi$

Model Creation & System Identification

EMULATION SYSTEM

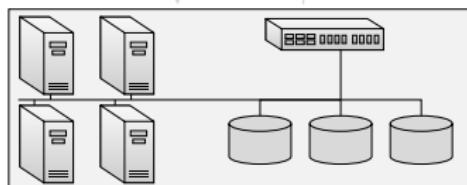


Strategy evaluation & Model estimation

Strategy Implementation  $\pi$

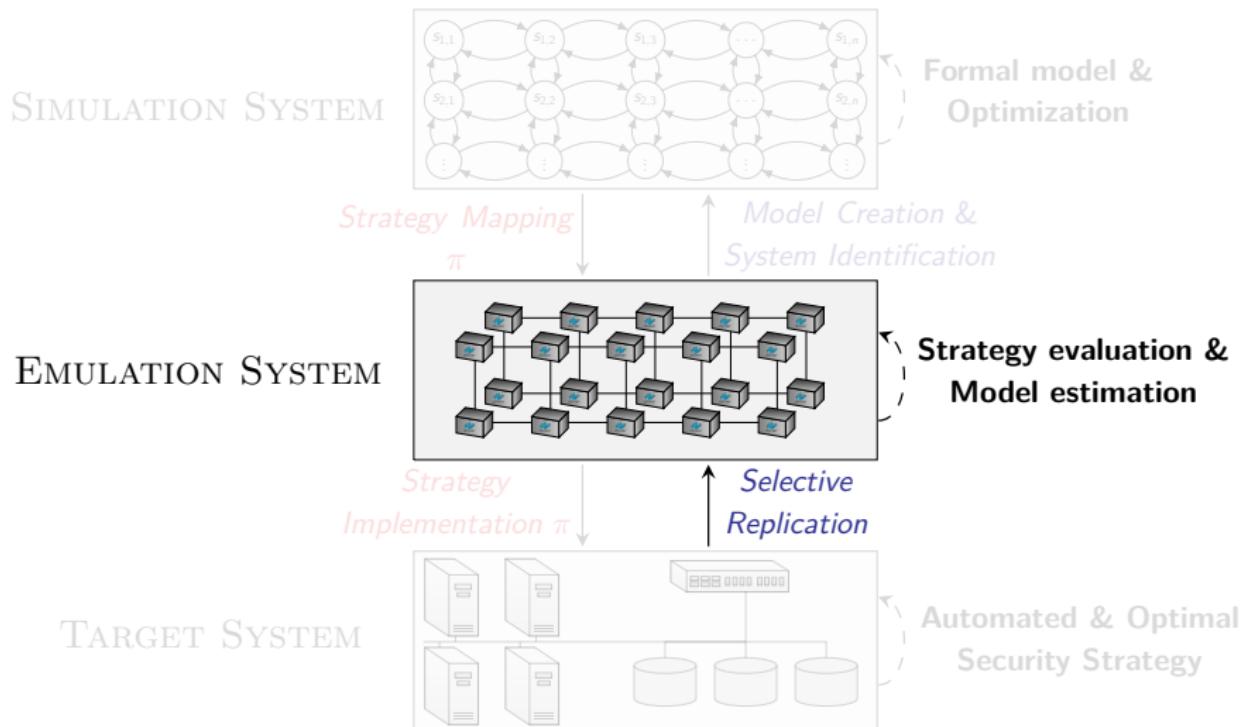
Selective Replication

TARGET SYSTEM

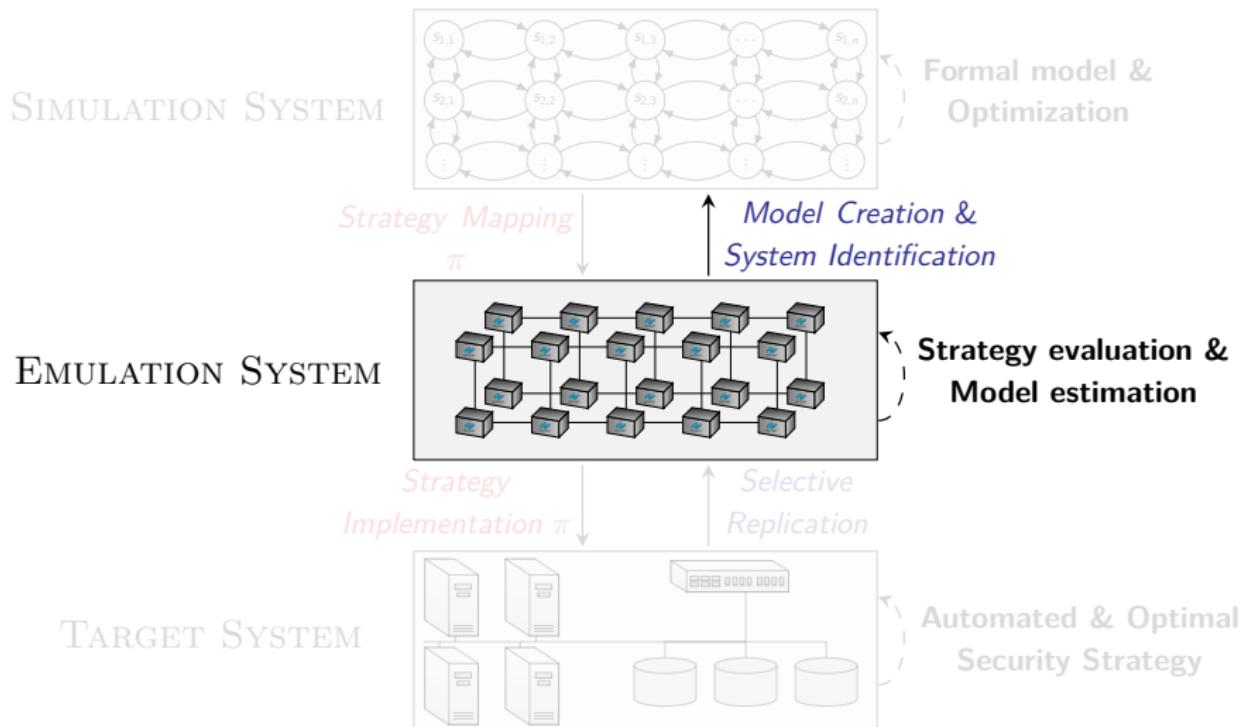


Automated & Optimal Security Strategy

# Our Framework for Automated Intrusion Response

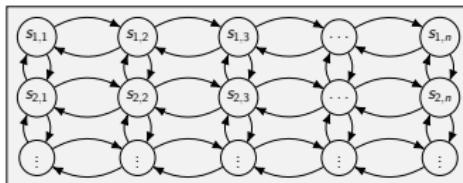


# Our Framework for Automated Intrusion Response



# Our Framework for Automated Intrusion Response

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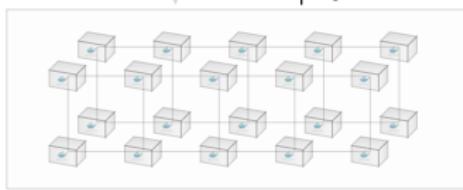
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Model Creation &  
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EMULATION SYSTEM



Strategy evaluation &  
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Strategy  
Implementation  $\pi$

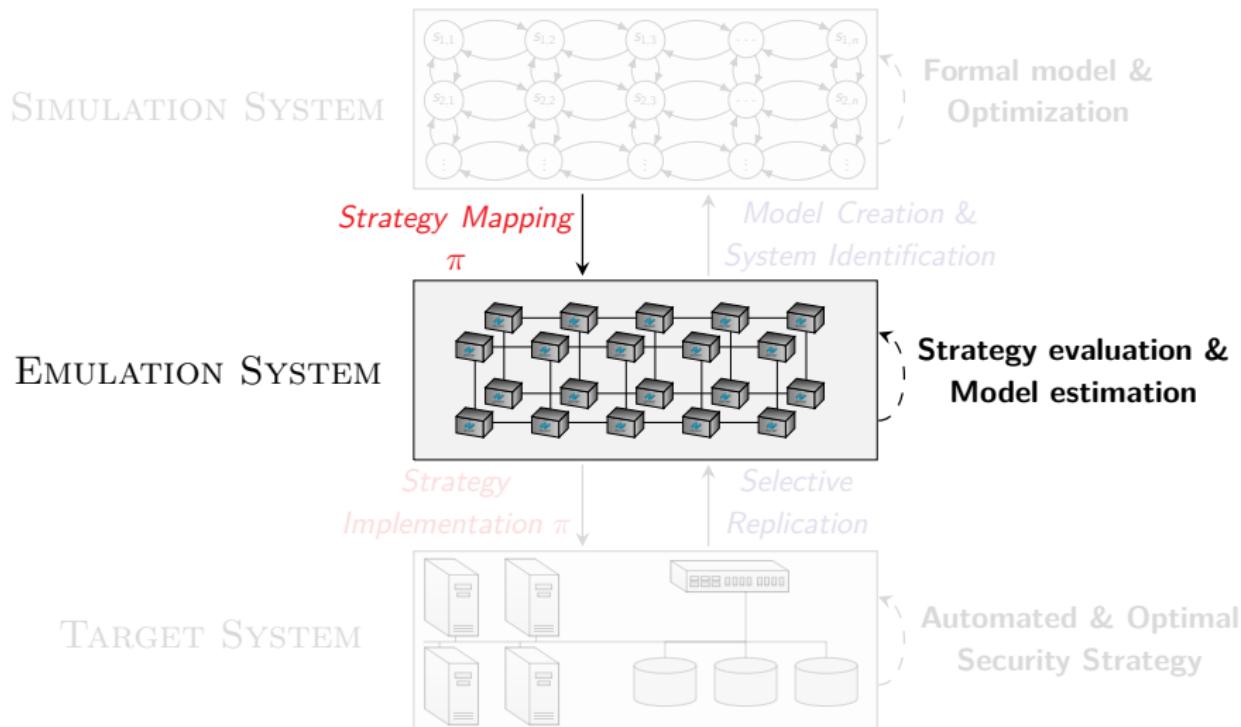
Selective  
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TARGET SYSTEM



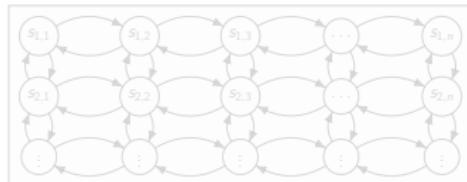
Automated & Optimal  
Security Strategy

# Our Framework for Automated Intrusion Response



# Our Framework for Automated Intrusion Response

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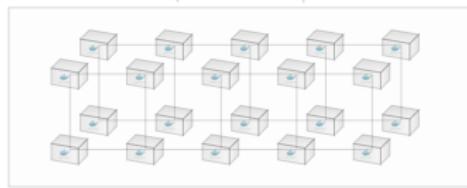


Formal model & Optimization

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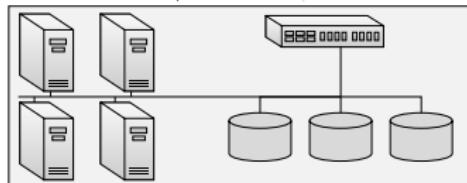


Strategy evaluation &  
Model estimation

Strategy  
Implementation  $\pi$

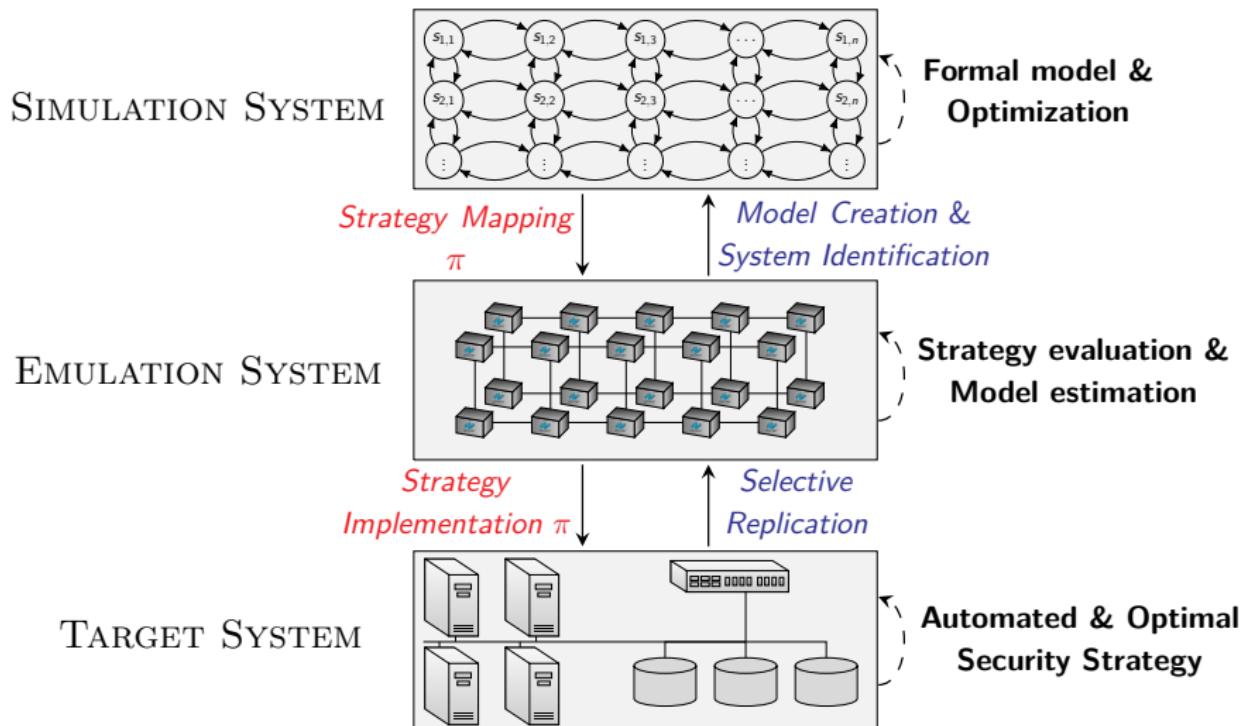
Selective  
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TARGET SYSTEM



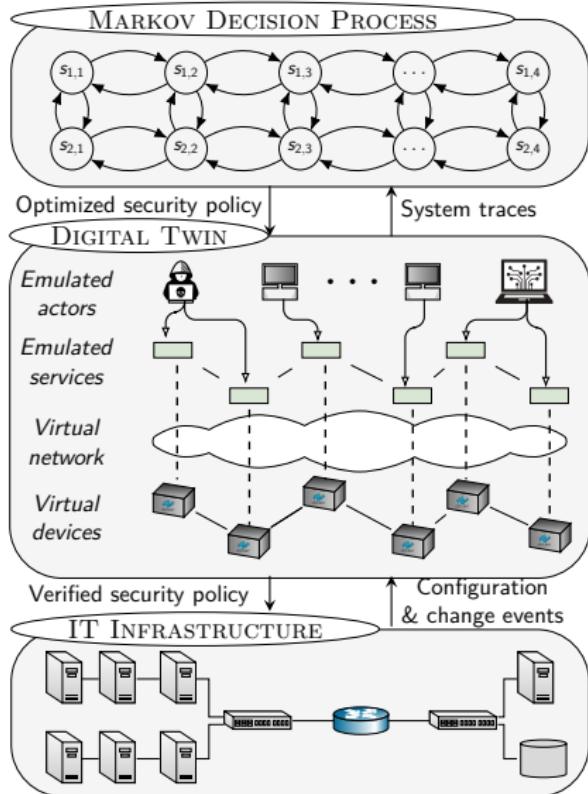
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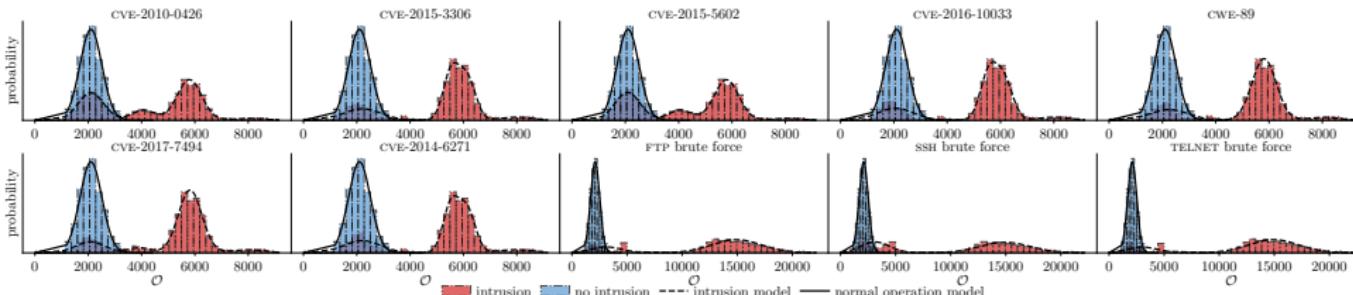


# Step 1: Emulation

- ▶ Emulate servers using **virtual containers**.
- ▶ Emulate connectivity using **virtual networks**.
- ▶ Emulate clients using **traffic generators**.
- ▶ Emulate attacker/defender using **automation API**.
- ▶ Source code: <https://github.com/Limmen/csle>



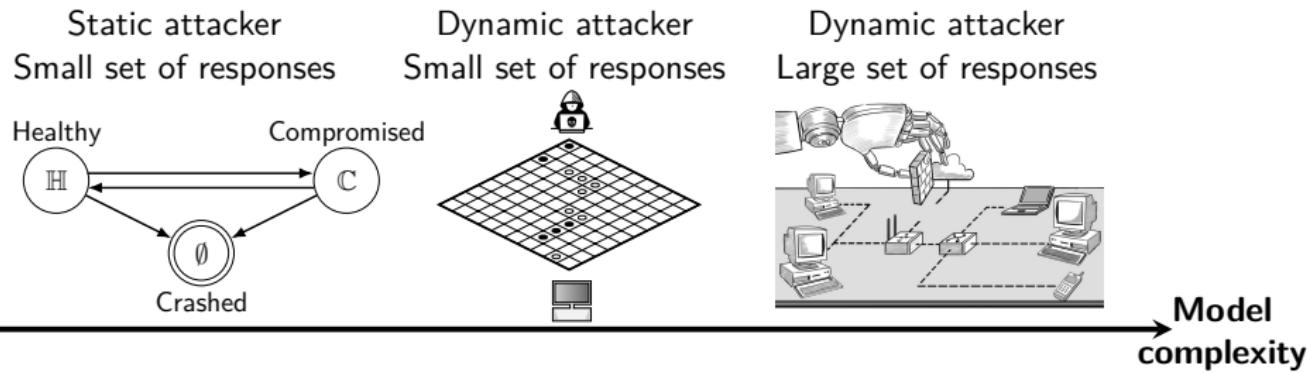
## Step 2: Data Collection



Distributions of IDS alarms during different types of intrusions.

- ▶ The first step in our framework is to collect data from the emulation system.
- ▶ We collect data both during normal operation and during attacks.

## Step 3: Modeling

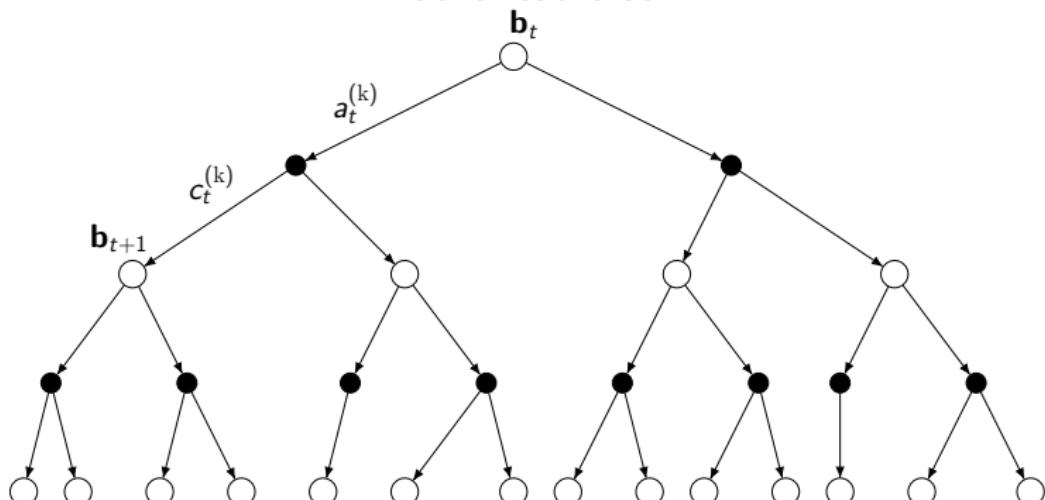


- ▶ Intrusion response can be **modeled in many ways**
  - ▶ As a *parametric optimization problem*
  - ▶ As an *optimal stopping problem*
  - ▶ As a *dynamic program*
  - ▶ As a *game*
  - ▶ etc.

## Step 4: Optimization

- ▶ Different optimization techniques:
    - ▶ Dynamic programming
    - ▶ Reinforcement learning
    - ▶ Stochastic approximation
    - ▶ Regret minimization
    - ▶ Evolutionary computation
    - ▶ etc.

## Lookahead tree.



# Conclusions

- ▶ We develop a *framework* to automatically learn **security** strategies.
- ▶ We apply the framework to an **intrusion response use case**.
- ▶ References and videos are available at:  
<https://www.kth.se/cdis>

