

# Security Metrics and Risk Analysis for Enterprise Systems

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GramSec

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# Outline

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- Challenges for Cyber Security Risk Analysis
- NIST Cyber Security Framework
- Attack Graphs and Tools for generating Attack Graphs
- Quantifying Security Analysis
- Mission Impact Analysis
- Conclusions

# National Institute of Standards and Technology

## ■ About NIST

- Part of the U.S. Department of Commerce
  - Charter for public and private sectors
  - Non-regulatory
- NIST's mission is to develop and promote measurement, standards, and technology to enhance productivity, facilitate trade, and improve the quality of life.
  - 3,000 employees
  - 2,700 guest researchers
  - 1,300 field staff in partner organizations
  - Gaithersburg, MD and Boulder, CO
- Role in cybersecurity began in 1972 with the development of the Data Encryption Standard

## ■ NIST Priority



Advanced Manufacturing



IT and Cybersecurity



Healthcare



Forensic Science



Disaster Resilience



Cyber-physical Systems



Advanced Communications

# NIST Computer Security Division

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- National Institute of Standards and Technology
- Information Technology Lab
- Computer Security Division
  - <http://csrc.nist.gov>
  - Cryptography standards
  - Guidelines for Federal Agencies in the areas such as Mobile Device Security, Web Security and so on.
  - Research in the area of Cloud Computing, Biometrics, Network Security and so on.
  - About 60-70 computer scientists

# Enterprise Security Management

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- Networks are getting large and complex
- Vulnerabilities in software are constantly discovered
- Network Security Management is a challenging task
- Even a small network can have numerous attack paths

# Enterprise Security Management

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- Currently, security management is more of an art and not a science
- System administrators operate by instinct and learned experience
- There is no objective way of measuring the security risk for an enterprise
- “If I change this network configuration setting will my network become more or less secure?”

# NIST Cyber Security Risk Management

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- Identify
  - What are the assets?
  - How is the network configured?
- Protect
  - Access Control
  - Authentication
  - Data Security
- Detect
  - Intrusion Detection Systems (IDS)
  - Security Continuous Monitoring

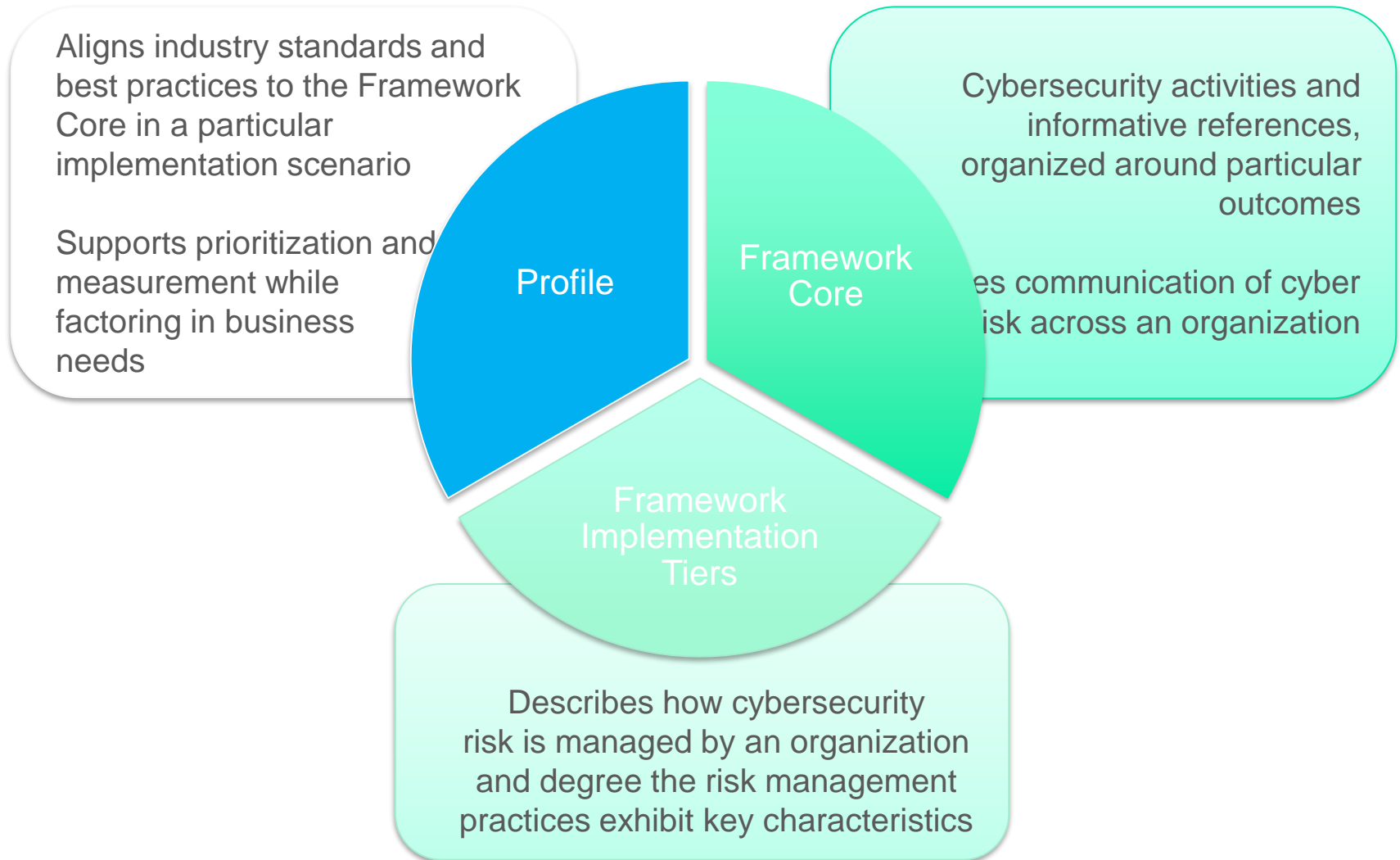
# NIST Cyber Security Risk Management

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- Respond
  - Response Planning
  - Analysis
  - Mitigation
- Recover
  - Timely recovery to normal operations
  - Recovery Planning
- NIST Special Publication 800-39 “Managing Information System Risk”, March 2011



# NIST Cybersecurity Framework Components



# Core

## Cybersecurity Framework Component

Function	Category	Category Unique ID	Subcategory	Informative References
Identify	Asset Management	ID.AM	<b>ID.BE-1:</b> The organization's role in the supply chain is identified and communicated	COBIT 5 APO01.02, DSS06.03 ISA 62443-2-1:2009 4.3.2.3.3 ISO/IEC 27001:2013 A.6.1.1 NIST SP 800-53 Rev. 4 CP-2, PS-7, PM-11
	Business Environment	ID.BE		
	Governance	ID.GV		
	Risk Assessment	ID.RA		
	Risk Management Strategy	ID.RM		
Protect	Access Control	PR.AC	<b>ID.BE-2:</b> The organization's place in critical infrastructure and its industry sector is identified and communicated	COBIT 5 APO08.04, APO08.05, APO10.03, APO10.04, APO10.05 ISO/IEC 27001:2013 A.15.1.3, A.15.2.1, A.15.2.2 NIST SP 800-53 Rev. 4 CP-2, SA-12
	Awareness and Training	PR.AT		
	Data Security	PR.DS		
	Information Protection Processes & Procedures	PR.IP		
	Maintenance	PR.MA		
Detect	Protective Technology	PR.PT	<b>ID.BE-3:</b> Priorities for organizational mission, objectives, and activities are established and communicated	COBIT 5 APO02.06, APO03.01 NIST SP 800-53 Rev. 4 PM-8
	Anomalies and Events	DE.AE		
	Security Continuous Monitoring	DE.CM		
Respond	Detection Processes	DE.DP	<b>ID.BE-4:</b> Dependencies and critical functions for delivery of critical services are established	COBIT 5 APO02.01, APO02.06, APO03.01 ISA 62443-2-1:2009 4.2.2.1, 4.2.3.6 NIST SP 800-53 Rev. 4 PM-11, SA-14
	Response Planning	RS.RP		
	Communications	RS.CO		
	Analysis	RS.AN		
	Mitigation	RS.MI		
	Improvements	RS.IM	<b>ID.BE-5:</b> Resilience requirements to	ISO/IEC 27001:2013 A.11.2.2, A.11.2.3, A.12.1.3

# Improving a Cybersecurity Program

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- **Step 1: Prioritize and Scope**
  - Identifies its business/mission objectives and high level organization priorities
- **Step 2: Orient**
  - The organization identifies systems, assets, threats and vulnerabilities
- **Step 3: Create a Current Profile**
  - Create a profile indicating which Category and Subcategory from the Framework Core are currently being used.
- **Step 4: Conduct a Risk Assessment**
  - The organization analyzes the operational environment in order to determine the impact of an attack on the organization. It can be guided by the organization's overall risk management process.
- **Step 5: Create a Target Profile**
  - The organization creates a Target Profile that focusses on the assessment of the Framework Categories and Subcategories for the desired outcome.

# Improving a Cybersecurity Program

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- **Step 6: Determine, Analyze and Prioritize Gaps**
  - The organization compares the Current Profile and the Target Profile to determine gaps. It then creates an action plan to address those gaps.
- **Step 7: Implement Action Plan**
  - The organization determines which actions to take to address the gaps.
  - It monitors the cybersecurity practices against the target profile.

# Key Attributes

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- **It's a framework, not a prescription**
  - It provides a common language and systematic methodology for managing cyber risk
  - It is meant to be adapted
  - It does not tell a company *how* much cyber risk is tolerable, nor does it claim to provide “the one and only” formula for cybersecurity
  - Having a common lexicon to enable action across a very diverse set of stakeholders will enable the best practices of elite companies to become standard practices for everyone
- **The framework is a living document**
  - It is intended to be updated over time as stakeholders learn from implementation, and as technology and risks change
  - That's one reason why the framework focuses on questions an organization needs to ask itself to manage its risk. While practices, technology, and standards will change over time—principals will not

# Resources

*Where to Learn More and Stay Current*

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The National Institute of Standards and Technology Web site is available at <http://www.nist.gov>

NIST Computer Security Division Computer Security Resource Center is available at <http://csrc.nist.gov/>

The *Framework for Improving Critical Infrastructure Cybersecurity* and related news and information are available at [www.nist.gov/cyberframework](http://www.nist.gov/cyberframework)

For additional Framework info and help  
[cyberframework@nist.gov](mailto:cyberframework@nist.gov)



# Challenges in Security

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- Typical issues addressed in the literature
  - How can a database server be secured from intruders?
  - How do I stop an ongoing intrusion?
- Notice that they all have a qualitative nature
- Better questions to ask:
  - How secure is the database server in a given network configuration?
  - How much security does a new configuration provide?
  - How can I plan on security investments so it provides a certain amount of security?
- For this we need a system security modeling and analysis tool

# What is an Attack Graph

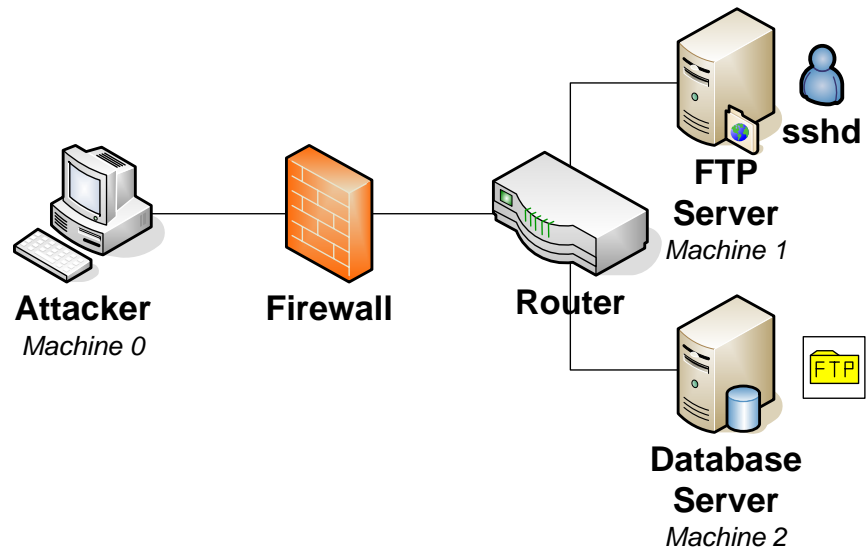
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- A model for
  - How an attacker can *combine* vulnerabilities to stage an attack such as a data breach
  - *Dependencies* among vulnerabilities



# Attack Graph Example

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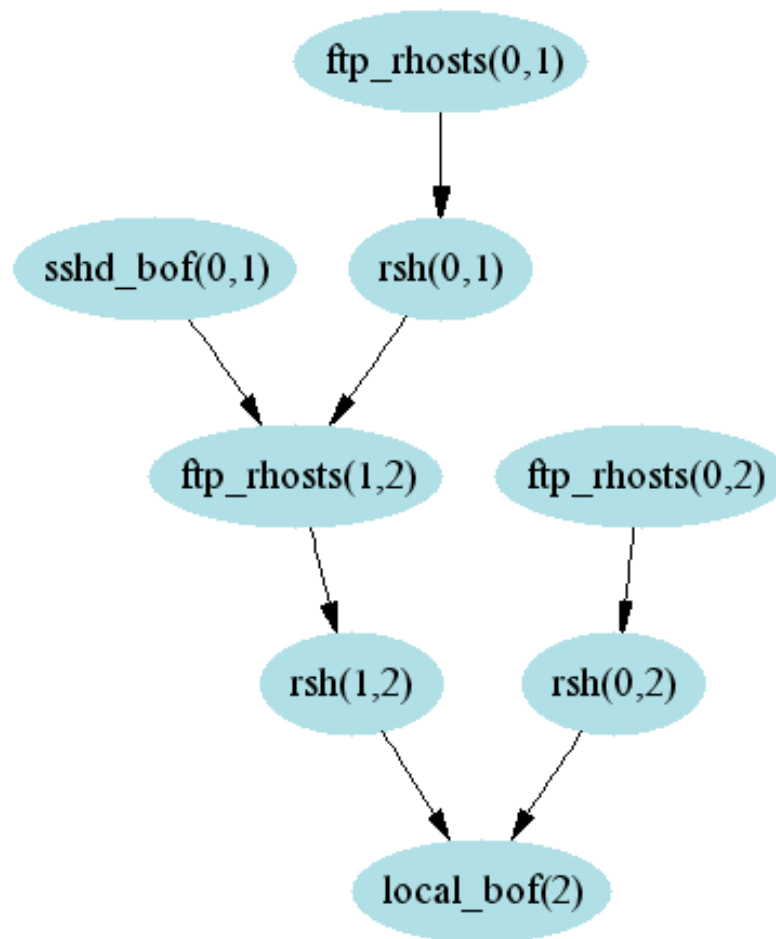
# Different Paths for the Attack

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- $sshd\_bof(0,1) \rightarrow ftp\_rhosts(1,2) \rightarrow rsh(1,2) \rightarrow local\_bof(2)$
- $ftp\_rhosts(0,1) \rightarrow rsh(0,1) \rightarrow ftp\_rhosts(1,2) \rightarrow rsh(1,2) \rightarrow local\_bof(2)$
- $ftp\_rhosts(0,2) \rightarrow rsh(0,2) \rightarrow local\_bof(2)$

# Attack Graph from machine 0 to DB Server

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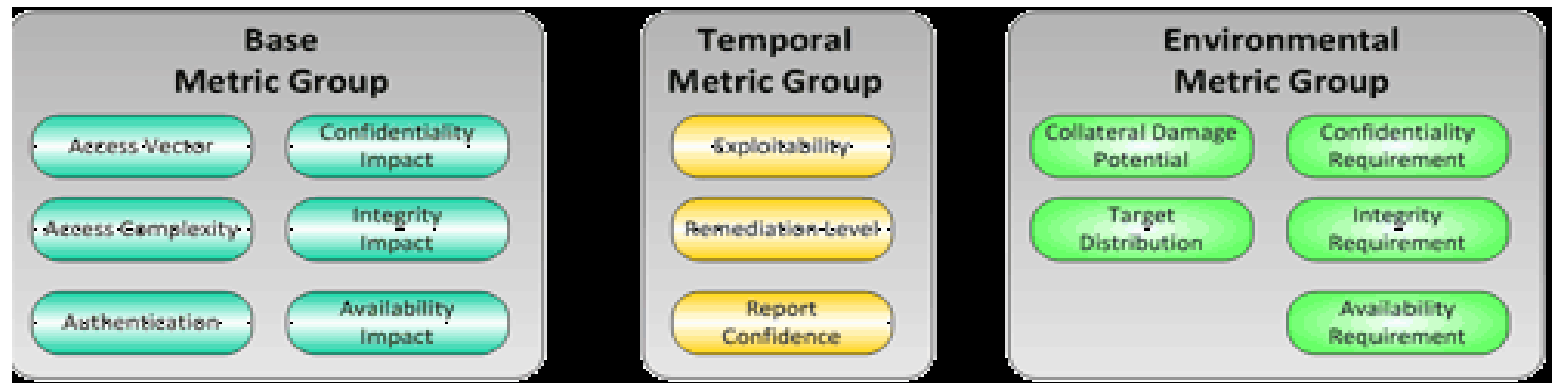
- Stands for *Common Vulnerability Scoring System*
- An open framework for communicating characteristics and impacts of IT vulnerabilities
- Consists three metric groups: *Base*, *Temporal*, and *Environmental*

# CVSS (Cont'd)

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- Base metric : constant over time and with user environments
- Temporal metric : change over time but constant with user environment
- Environmental metric : unique to user environment

# CVSS (Cont'd)



CVSS metric groups

- Each metric group has sub-metricies
- Each metric group has a score associated with it
- Score is in the range 0 to 10

# Base Score

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Base Score = Function(Impact, Exploitability)

Impact =  $10.41 * (1 - (1 - \text{ConImp}) * (1 - \text{IntImp}) * (1 - \text{AvailImpact}))$

Exploitability =  
 $20 * \text{AccessV} * \text{AccessComp} * \text{Authentication}$

# Base Score Example CVE-2002-0392

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- Apache Chunked Encoding Memory Corruption

BASE METRIC	EVALUATION	SCORE
Access Vector	[Network]	(1.00)
Access Complex.	[Low]	(0.71)
Authentication	[None]	(0.704)
Availability Impact	[Complete]	(0.66)

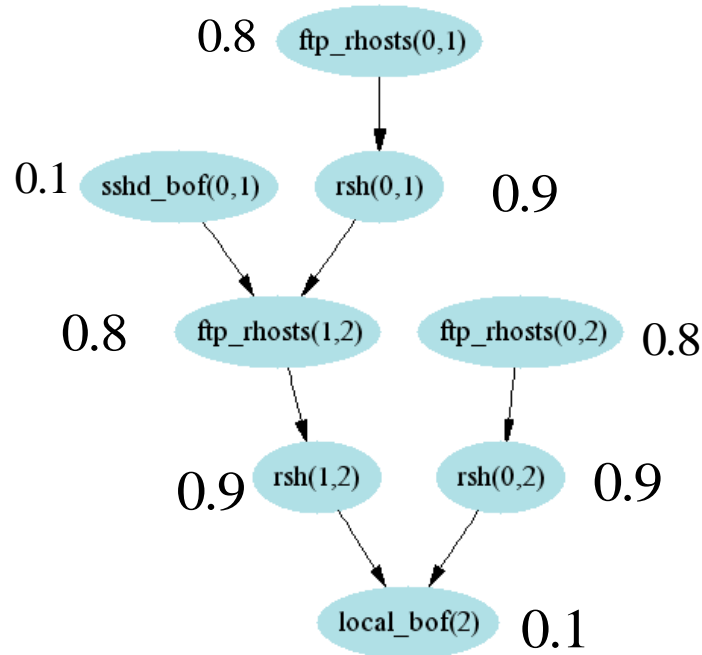
Impact = 6.9

Exploitability = 10.0

BaseScore = (7.8)

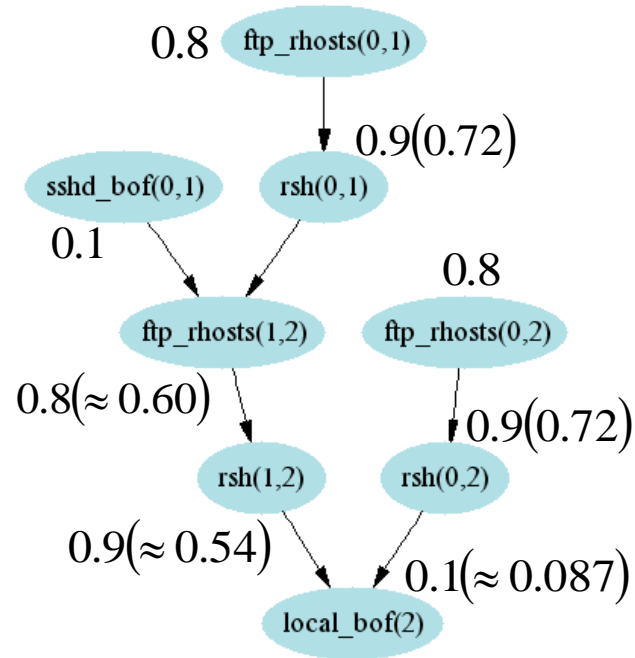


# Attack Graph with Probabilities



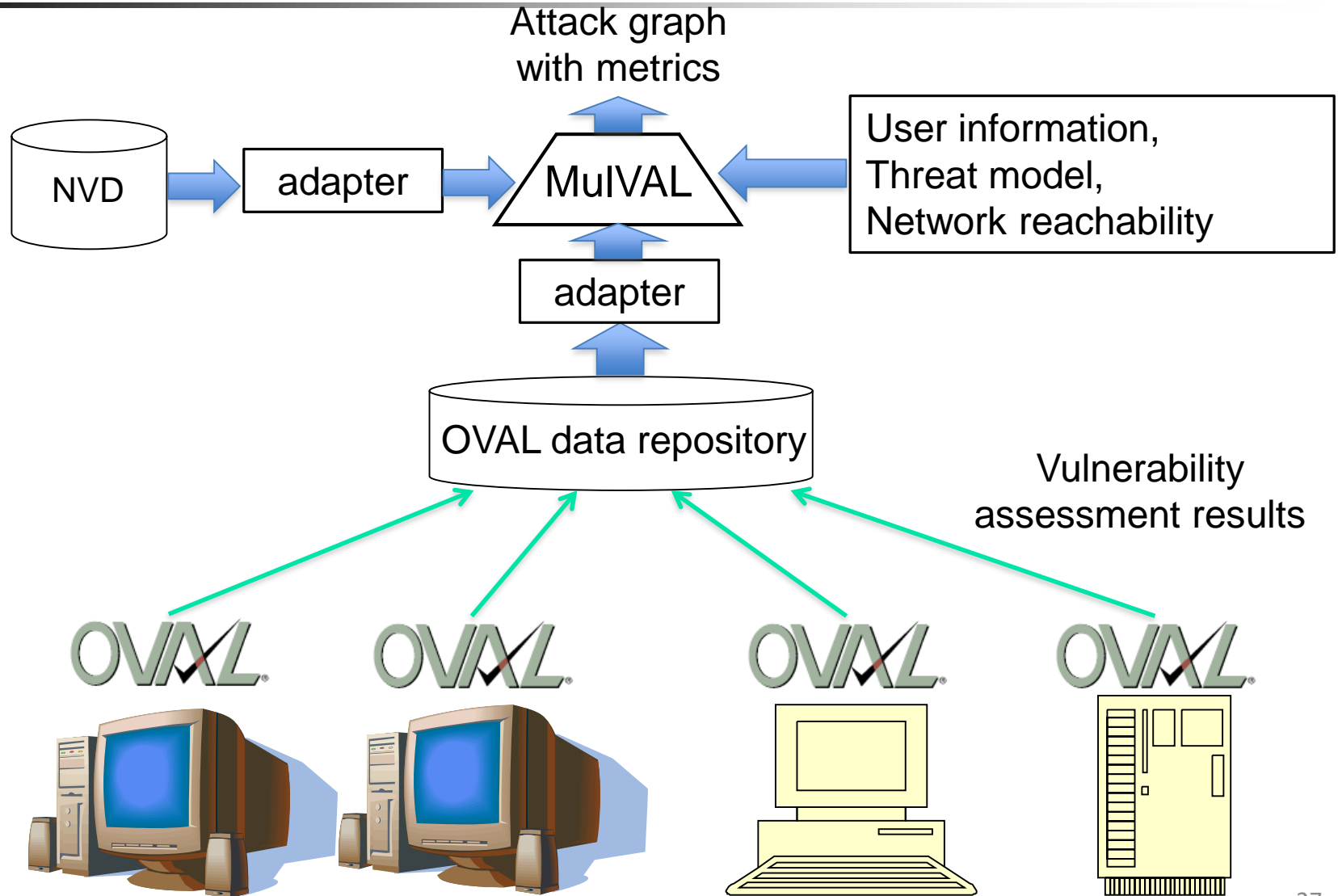
- Numbers are estimated probabilities of occurrence for individual exploits, based on their relative difficulty.
- The *ftp\_rhosts* and *rsh* exploits take advantage of normal services in a clever way and do not require much attacker skill
- A bit more skill is required for *ftp\_rhosts* in crafting a .rhost file.
- *sshd\_bof* and *local\_bof* are buffer-overflow attacks, which require more expertise.

# Probabilities Propagated Through Attack Graph



- When one exploit must follow another in a path, this means **both** are needed to eventually reach the goal, so their probabilities are multiplied:  $p(A \text{ and } B) = p(A)p(B)$
- When a choice of paths is possible, **either** is sufficient for reaching the goal:  $p(A \text{ or } B) = p(A) + p(B) - p(A)p(B)$ .

# MuIVAL attack-graph tool-chain



# Example

- Internet is allowed to access the web server through HTTP protocol and port
- Web server is allowed to access the MySQL database service on the db server
- User workstations are allowed to access anywhere

Internet



External Firewall

DMZ

Web Server



CVE-2006-3747  
was identified  
on web server

CVE-2009-2446  
was identified  
on db server

Database



Internal

CVE-2009-1918  
was identified  
on user  
workstations

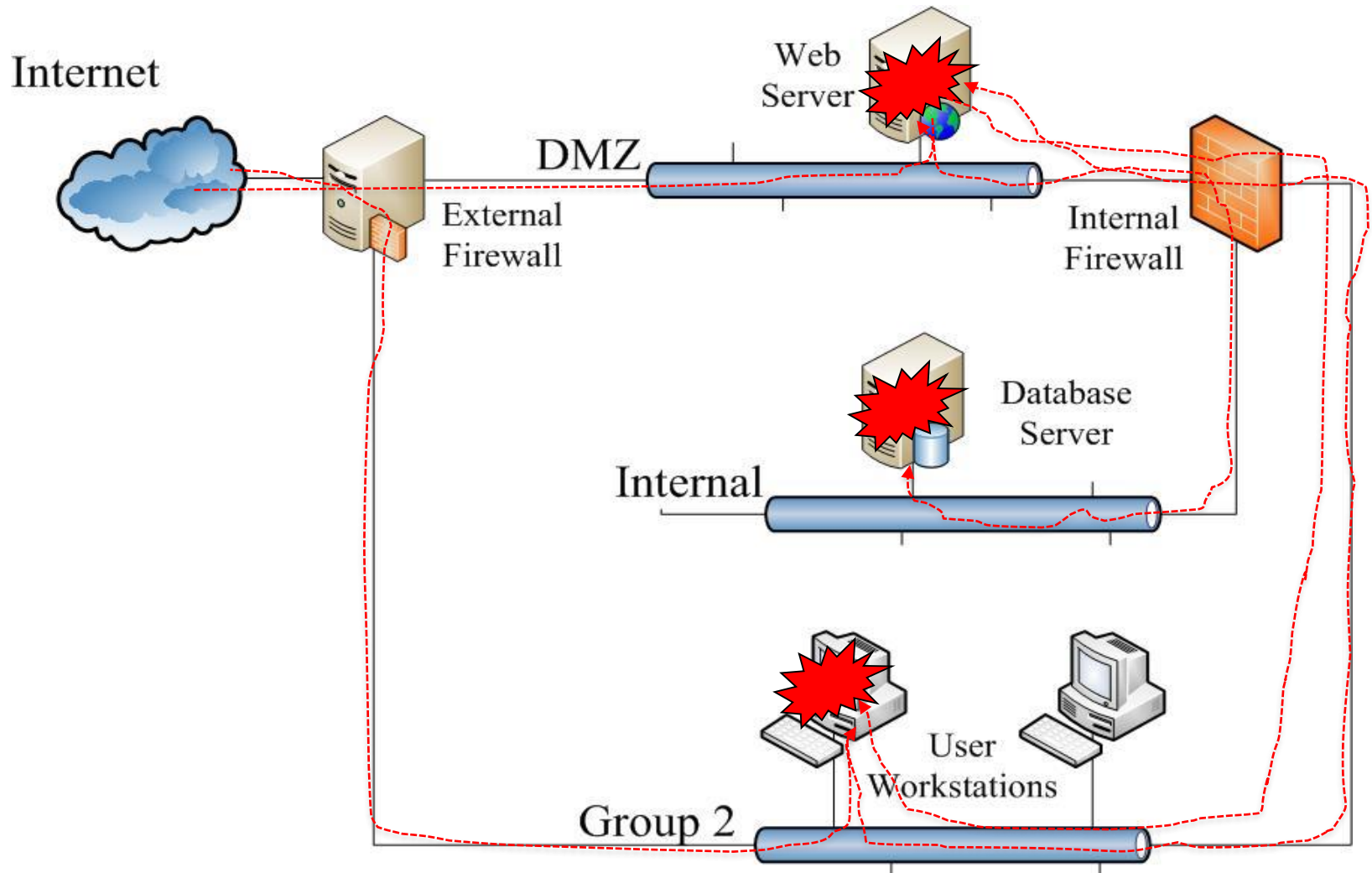


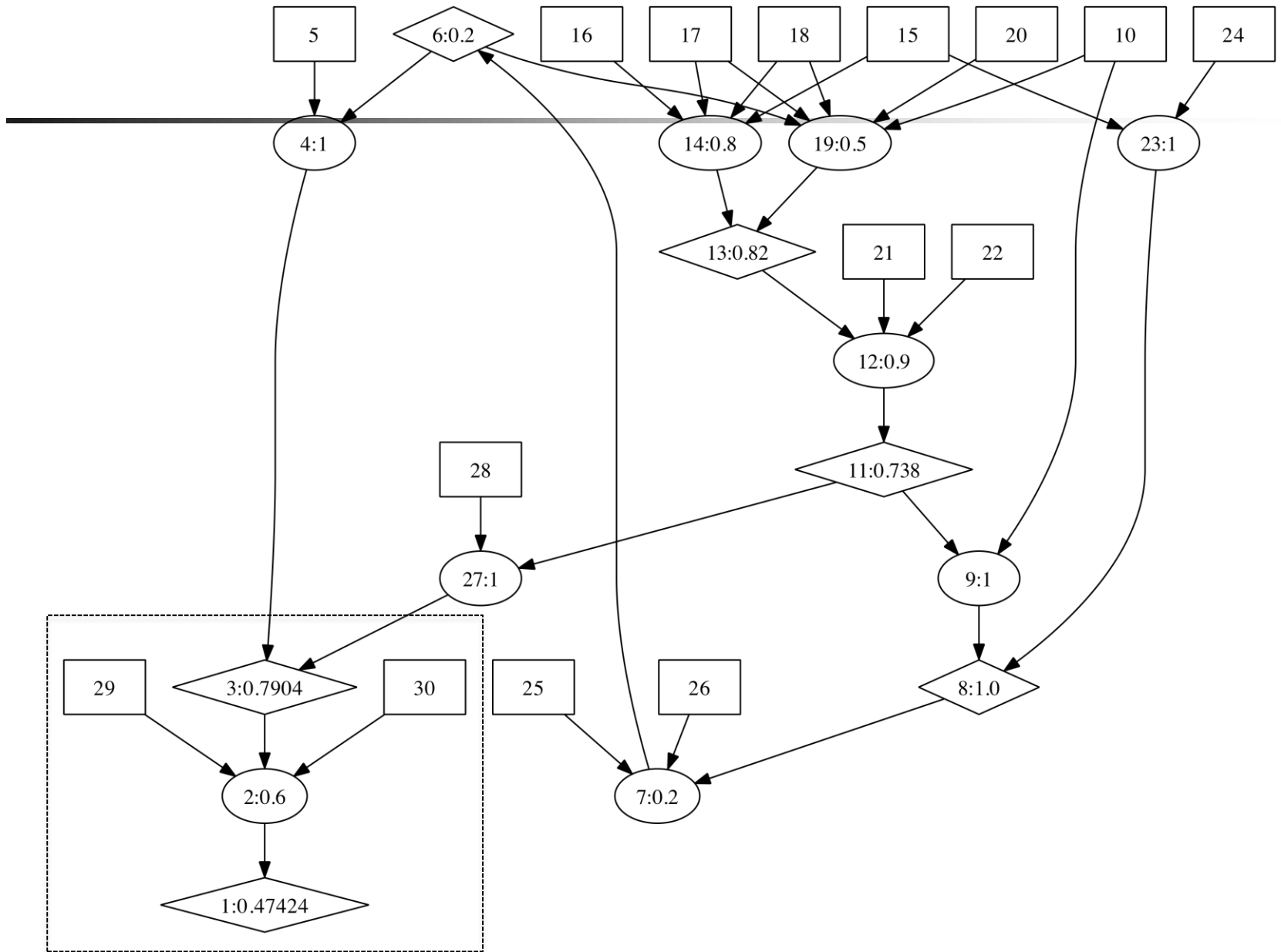
User Workstations

Group 2

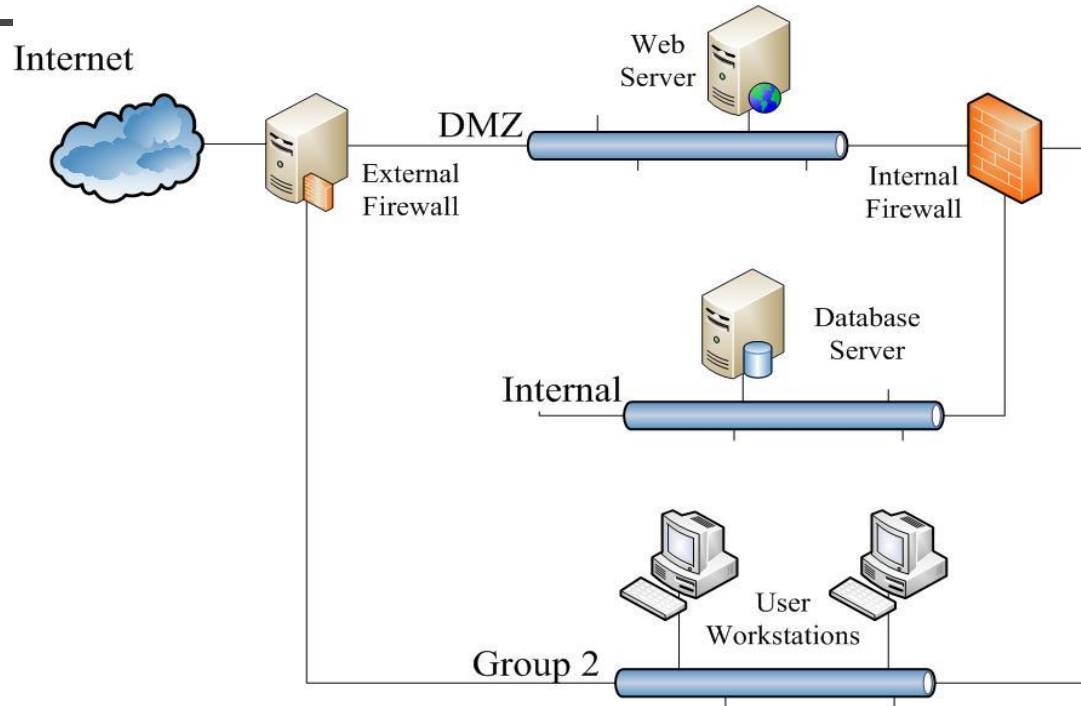


# Possible attack paths





# Result



`execCode(dbServer,root): 0.47`  
`execCode(webServer,apache): 0.2`  
`execCode(WS,normalAccount): 0.74`

Without Group2: `execCode(dbServer,root): 0.12`  
`execCode(webServer,apache): 0.2`

# Mission Impact Analysis in the Context of Cloud Computing

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# Cyber Resilience

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Cyber resilience:

Capabilities to take cyber defense actions, including network and host hardening actions, quarantine actions, adaptive MTD (Moving Target Defense) and so on.

# Mission Impact Assessment and Cyber Resilience

**Cyber Resilience**



is the foundation

**Mission Impact  
Assessment**

# Overlooked Gap between Mission Impact Assessment and Cyber Resilience

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- All existing cyber resilience techniques are unfortunately *not mission-centric*.
- Mission impact analysis becomes more complex in the cloud environment.
- Most mission impact assessment techniques are generally *one-dimensional*, without explicitly considering the dimension of service dependency.

# Challenges to Bridge the Gap

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- It is very challenging to develop a graphical model that can integrate mission dependency graphs and attack graphs
- A cloud environment gives rise to new challenges in bridging the gap

# Existing Techniques

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For *mission impact assessment*:

- Different types of mission dependency graphs have been developed to associate missions with component tasks and assets
- However,
  - Dependency relations are usually very loose and not well defined
  - Possibility of multi-step attacks are not considered

# Existing Techniques

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For ***cyber resilience***:

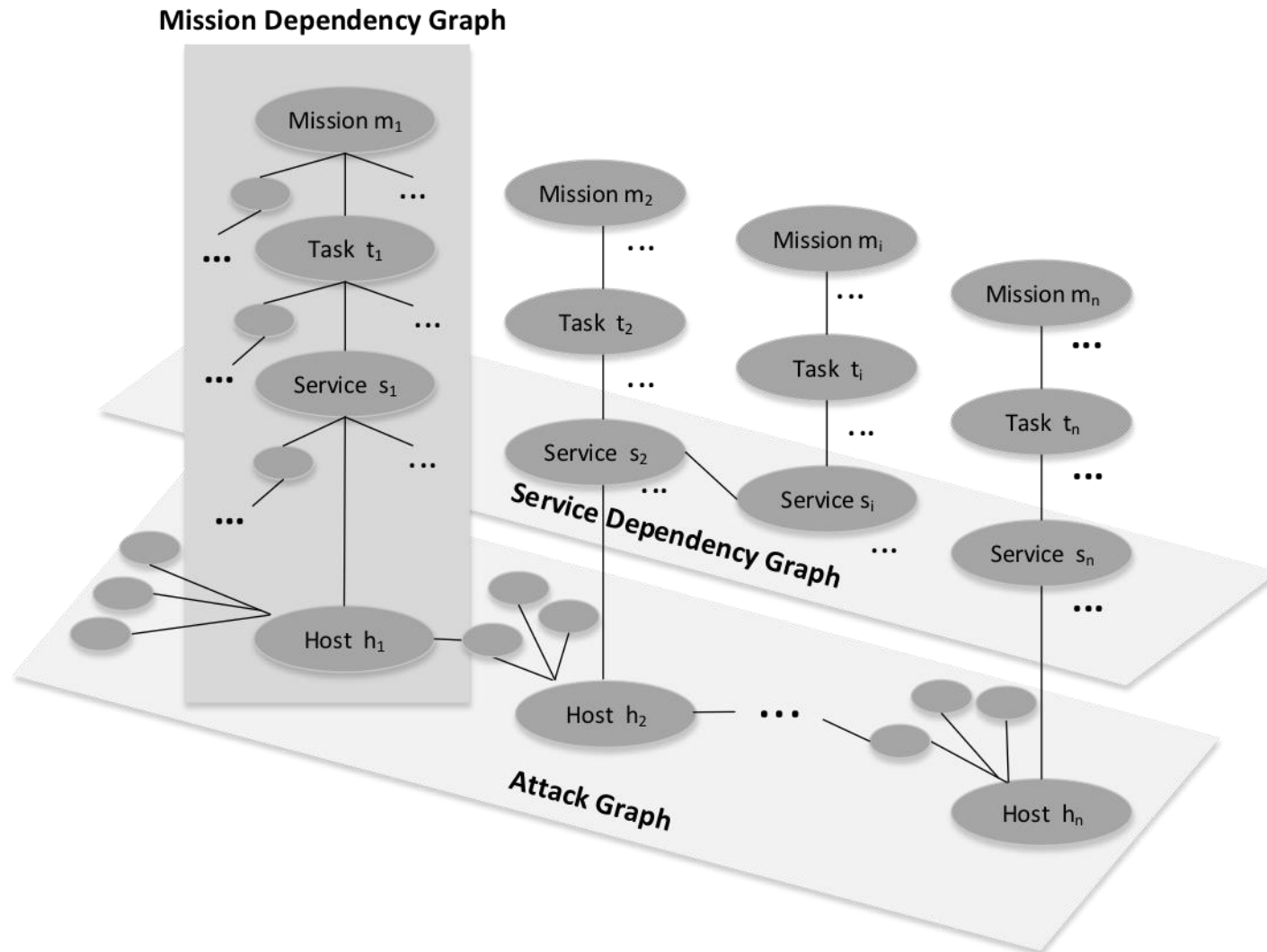
- Attack graphs have become mature techniques for analyzing the causality relationships between vulnerabilities and exploitations
- However,
  - It is not mission-centric
  - Traditional attack graphs do not consider potential attacks enabled by some special features of public *cloud environment* (e.g., virtual machine image sharing and virtual machine co-residency).

# Our Approach

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- Develop a logical graphical model
  - called *attack graph based mission impact analysis*
  - to integrate mission dependency graphs, service dependency graphs, and cloud-level attack graphs

# Our Approach





# Our Approach

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- Three steps:
  - Unify the representation of nodes and edges in mission dependency graphs and attack graphs
  - Extend traditional attack graphs into cloud-level attack graphs
  - Implement a set of interaction rules in MulVAL to enable automatic generation of logical mission impact graph

# The Semantic Gap Between the Attack Graph And the Mission Dependency Graph

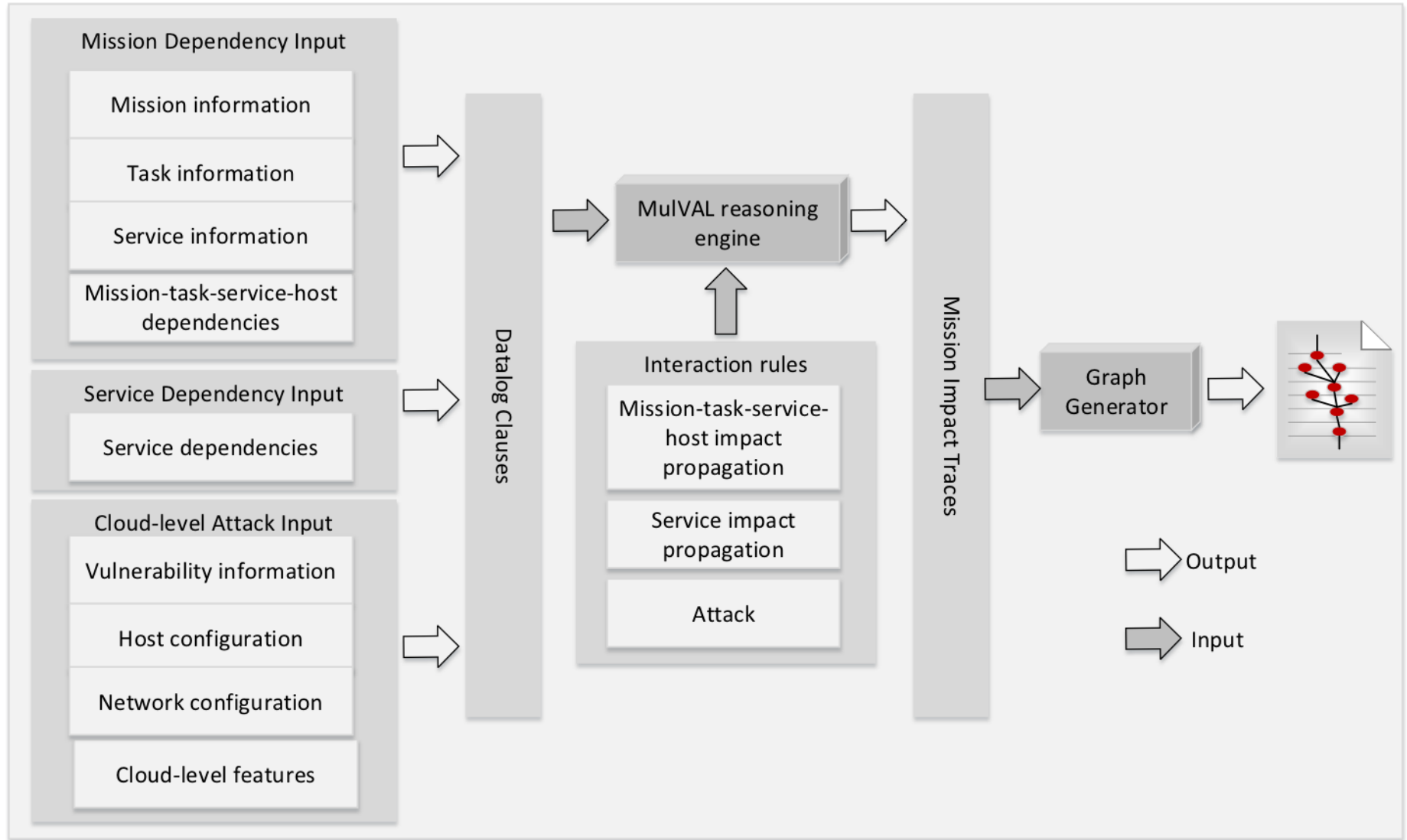
- A mission dependency graph is a mathematical abstraction of assets, services, mission steps (also known as tasks) and missions, and all of their dependencies
- The attack graph usually shows the potential attack steps leading to an attack goal

# Mission Impact Graph Definition

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- It is a directed graph that is composed of three parts: attack graph part, service dependency part and mission-task-service-host dependency part.
- It contains two kinds of nodes: derivation nodes and fact nodes.
- The edges in the mission impact graph represent the causality relations among nodes.

# Logical Mission Impact Graph Generation



# Automatic Generation of Mission Impact Graphs

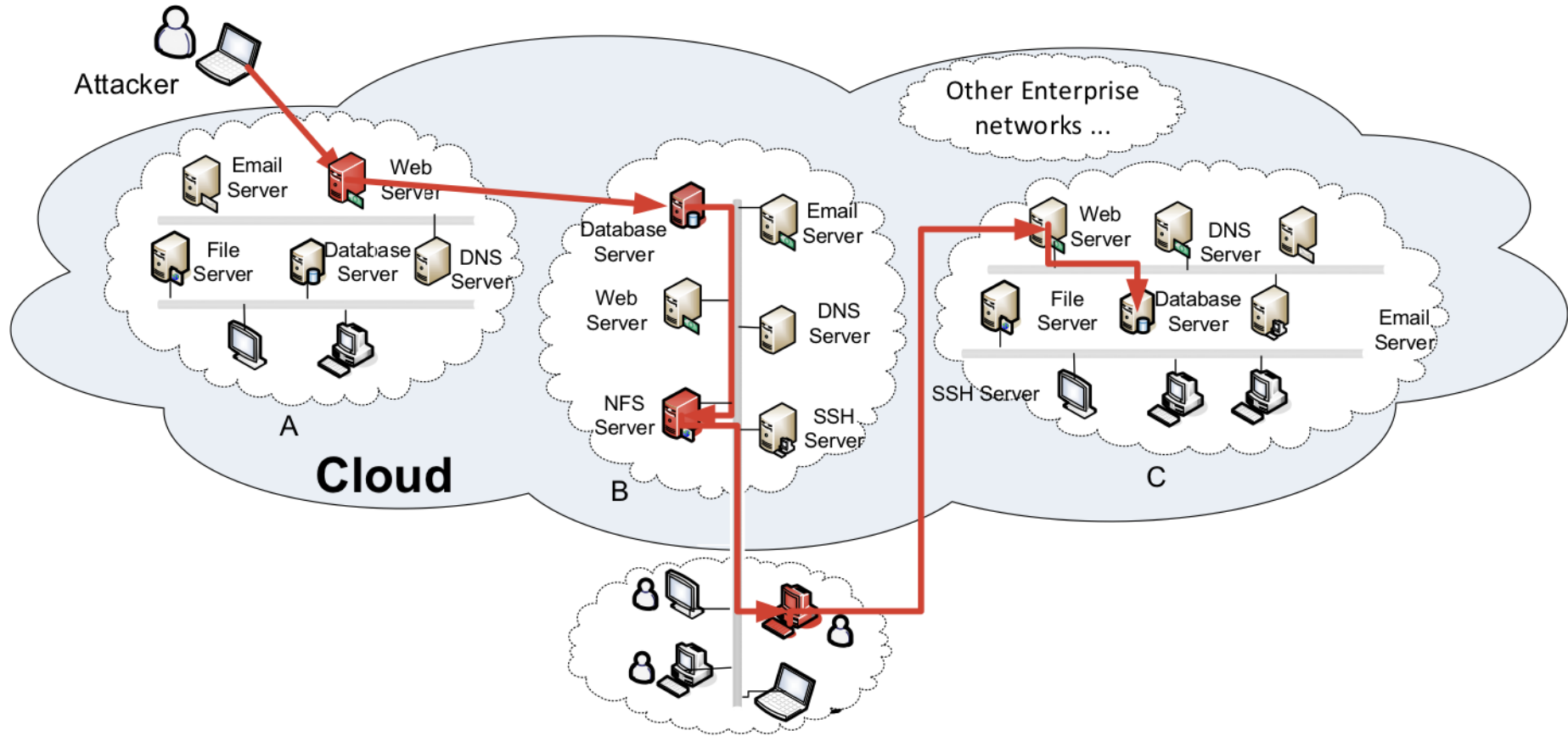
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- Create new Datalog clauses in MuI VAL
  - mission dependencies,
  - service dependencies,
  - cloud-level attacks

- Example interaction rules:

```
interaction rule(  
    (serviceImpacted(Service, H, Perm):-  
    hostProvideService(H, Service),  
    execCode(H, Perm)),  
    rule_desc('An compromised server will impact the  
dependent  
    service'))).
```

# Case Study: Attack Scenario

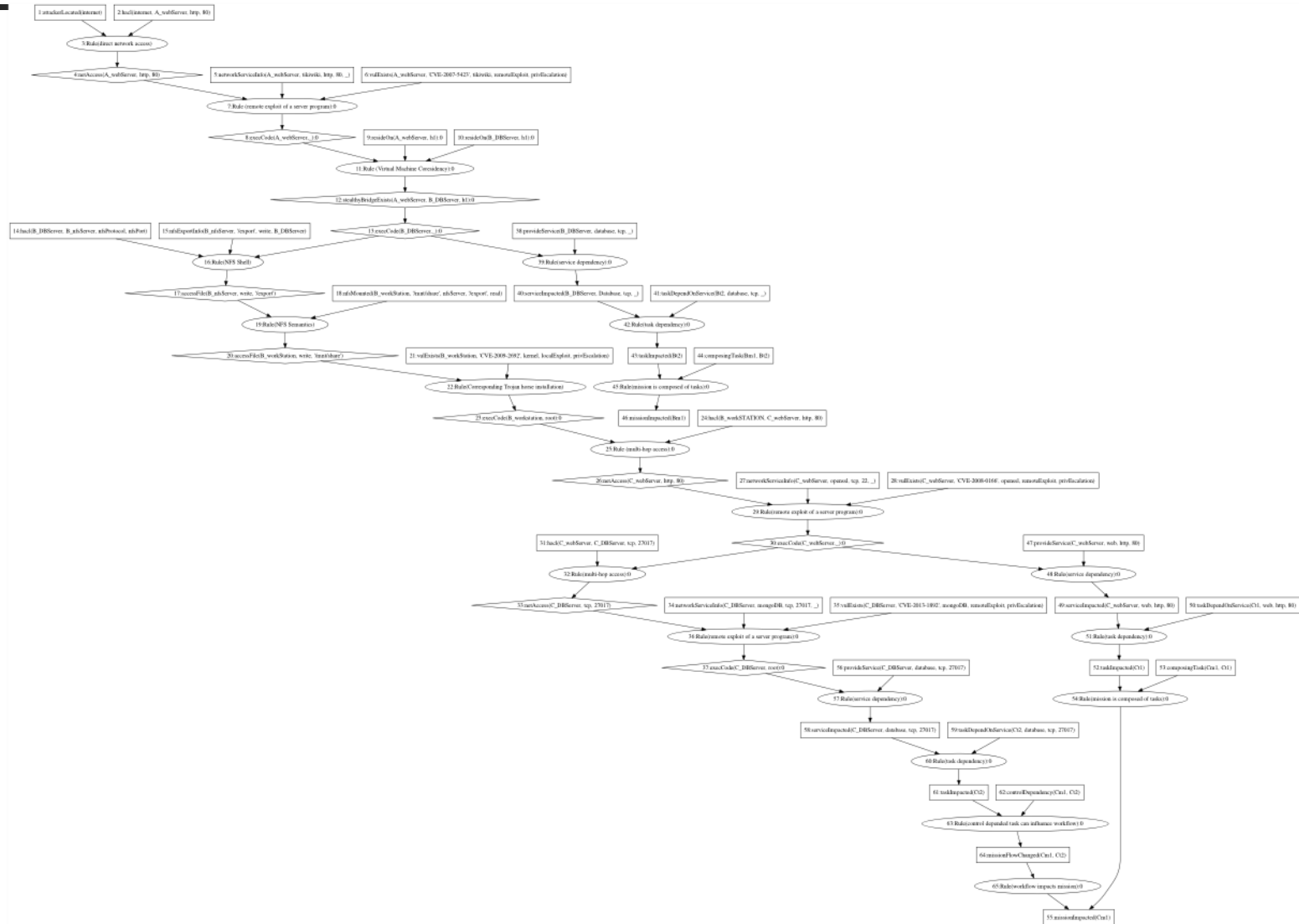


# Case Study: Attack Scenario

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## 7-step attack:

- 1) Mallory compromises A's webserver by exploiting a vulnerability
- 2) Mallory leverages the co-residency relationship to take over B's database server, based on a side channel attack in cloud.
- 3) Mallory uploads a software tool.deb with a Trojan horse to a directory that is shared by all the servers and workstations inside the company.
- 4) The innocent Workstation user from B downloads tool.deb from NFS server and installs it. This creates an unsolicited connection back to Mallory.
- 5) The Workstation has access to C's webserver as a trusted client. Mallory then managed to take over it via a brute-force key guessing attack;
- 6) Mallory leverages C's webserver as a stepping stone to compromise C's MongoDB database server, which allows Mallory successfully steal credential information from an employee login database table;
- 7) Mallory logs into C's webserver as a collaborator of C, and accesses the project proprietary documentation to collect formula-related vaccine research and development records.





# Case Study: Analysis

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- The result cloud-level mission impact graph is very helpful for understanding potential threats to missions in this scenario.
- One function of our mission impact graph is to perform automated “taint” propagation through logical reasoning.
- The generated mission impact graph enables effective mission-centric cyber resilience analysis.

# Case Study: Analysis

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- Automated “taint” propagation
  - Given a “taint”, be it a vulnerability, a compromised machine, or a disabled service, the impact of the “taint” can be analyzed through logical reasoning
  - The mission impact graph is able to reflect affected entities such as assets, services, tasks, and missions.

# Case Study: Analysis

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- Mission-centric cyber resilience analysis
  - Performing proactive “what-if” mission impact assessment. Which tasks or missions will be impacted?
    - E.g., what if we remove a server?
    - E.g., what if we patch a vulnerability on a host?

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- X. Sun, A. Singhal, P. Liu, "Towards Actionable Mission Impact Assessment in the Context of Cloud Computing", 31<sup>st</sup> IFIP WG 11.3 Conference on Data and Application Security and Privacy, Philadelphia, July 19<sup>th</sup> to 21<sup>st</sup> 2017.

# Conclusions

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- Based on attack graphs, we have proposed a model for security risk analysis of information systems
  - Composing individual scores to more meaningful cumulative metric for overall system security
- Future work is how to apply these techniques for security of cloud computing and for cyber resilience