## Dependable and Resilient Cloud Computing

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Based on joint work with: M. Albanese, S. Jajodia, R. Jhawar

#### **Outline**

- Motivation
- System overview
  - Vulnerability and failure characteristics of Cloud infrastructures
  - o Security and fault tolerance of the mission
- Secure mission deployment and mission protection
- Fault tolerance of the mission
  - Fault tolerance as a service
  - Constraints-aware resource provisioning
  - Adaptive resource management

## Motivation (1)

- · Cloud computing is becoming increasingly popular
  - + Flexibility in obtaining and releasing computing resources
  - + Lower entry and usage costs
  - + Effective for applications with high scalability requirements
- Growing interest among users to leverage Cloud-based services to execute critical missions
- Exacerbate the need to ensure high security and availability of the system and the missions

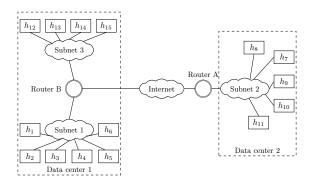
## Motivation (2)

- Cloud computing infrastructure is highly complex
  - Vulnerable to various cyber-attacks and subject to failures
  - Outside the control scope of the user's organization
- Existing solutions individually focus on the security of the infrastructure and the mission
  - Do not take into account the interdependencies between them
- Fault tolerance methods are typically applied during development
  - Unfeasible to combine failure behavior and system architecture in the Cloud due to the abstraction layers

## Motivation (3)

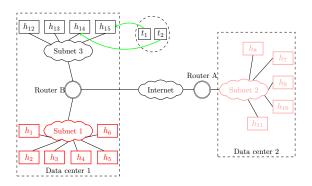
- User-centric approach to address the security and fault tolerance issues
  - Deploy missions so as to minimize their exposure to the vulnerabilities in the Cloud
  - o Protect the hosts and network links used by the mission
  - Deliver fault tolerance as a service to the mission
  - o Response to faults at run-time
  - Response to security attacks at run-time

## System Overview – Cloud Infrastructure



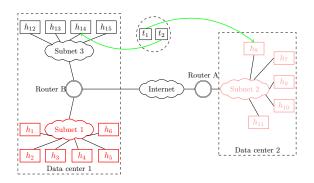
- Redundant switches, routers and links for fault tolerance
- Security tools (e.g., intrusion detection, firewalls)

## System Overview – Cloud Infrastructure



Hosts may be vulnerable to various cyber-attacks
 (e.g., Subnet 1: compromised, Subnet 2: vulnerable, Subnet 3: highly secure)

## System Overview – Cloud Infrastructure

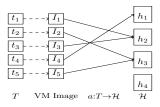


 Tasks may have vulnerability tolerance capability (e.g., Task 1 can handle buffer overflow attacks using memory management mechanisms)

# Mission Deployment

### Static Mission Deployment

- Each host  $h \in \mathcal{H}$  is associated with a vulnerability value  $V_h$
- tol(t) provides an estimate of the maximum level of vulnerability the task can be exposed to
- Task allocation problem with two sub-problems
  - Map each task to an appropriate VM image in the repository
  - Allocate VMs on suitable physical hosts in the Cloud



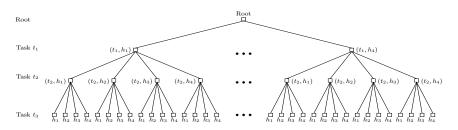
## Selecting VM Images

- Challenge: Develop techniques to assess security of VM images at run-time and an automated security-driven search scheme to deploy mission tasks
- VM images encapsulate the entire software stack and determine the initial state of running VM instances
- Most Cloud laaS require users to manually select VM images; in public Cloud services, VM images have critical vulnerabilities
- Objective: Select VM images that satisfy both functional requirements and security policy of mission tasks

## Allocating VMs on Cloud Infrastructure (1)

- Challenge: Develop approximation algorithms to find suboptimal allocation solution in a time-efficient manner
- Objective is to minimize exposure of mission tasks to the vulnerabilities in the Cloud infrastructure
- Satisfy additional dependability constraints
   (e.g., host's capacity and task's vulnerability tolerance constraint)

## Allocating VMs on Cloud Infrastructure (2)



- Possible solution: Use A\*-based state-space search approach
- State is a possible choice for allocating a task on a host  $(t_i, h_j)$
- Root state is the initial state where no task is allocated
- Operation generates child states for a given state s
- Goal state is a state in which all the tasks have been allocated (leaf)
- Solution path is the path from root state to any goal state

### Allocating VMs on Cloud Infrastructure (3)

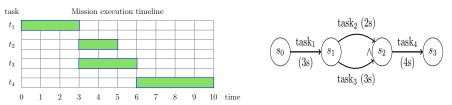
- Objective is to find the solution path with minimum vulnerability value
- Cost function is the vulnerability measure of complete allocation fvul(s) = gvul(s) + hvul(s)
- gvul(s) is the total minimum vulnerability due to task allocation from the root state to the current state s
- hvul(s) is the lower-bound vulnerability estimate of the allocation from the current state to any goal state
  - hvul(s) is computed using an admissible heuristic
  - o Improves search performance while not compromising optimality

## Dynamic Mission Deployment (1)

- Each task is associated with temporal constraints (e.g., a task may only run after another task)
- Critical missions must complete within a certain amount of time
- Possible solution: Complex task scheduling solution that takes into account the capability of the VM while computing the solution

## Dynamic Mission Deployment (2)

- Challenge: Schedule mission tasks on the hosts
  - 1 To minimize their exposure to the vulnerabilities in the network
  - 2 To ensure their deadlines are met

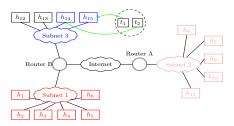


- Critical tasks (e.g., task t<sub>3</sub>) must be placed on highly reliable host
- Adopt scheduling schemes such as greedy heuristics, genetic algorithms, tabu search, A\* to solve the scheduling problem

## Mission Protection

### Static Network Hardening

- Challenge: Given a mission is deployed in the Cloud, protect the resources used by the mission tasks
- In the static version, all the hosts and network links are protected for the entire duration of mission execution



 Possible solution: Build on top of previous work for network hardening

### Dynamic Mission Protection

- Challenge: At any point in time, find a cost-optimal time-varying strategy to harden the resources not yet used by the mission
- Dynamic protection minimizes the disruption that hardening strategy causes to legitimate users
- Possible solution: Efficient technique that analyzes huge streams of security threats at real-time
- For example, use of attack graphs to track where the attacker is going (the penetration path)

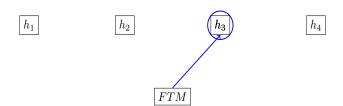
## Fault Tolerance of the Mission

### Fault Tolerance Support for Mission

- Realize the notion of Fault tolerance as a Service
- Fault tolerance mechanisms based on the virtualization technology (e.g., checkpointing virtual machine instances)
  - + introduce fault tolerance in a transparent manner
  - + offers high level of generality
  - + Possible to change fault tolerance properties based on business needs
- Construct dependability mechanisms at runtime
  - o Mission centric Service Level Agreement (SLA)

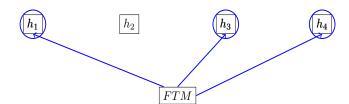
#### Fault Tolerance as a Service

- Build and deliver the service by orchestrating a set of micro-protocols
  - Realize fault tolerance techniques as independent, stand-alone, configurable modules (web services)
  - Operate at the level of virtual machine instances
- VM instance replication technique



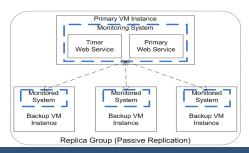
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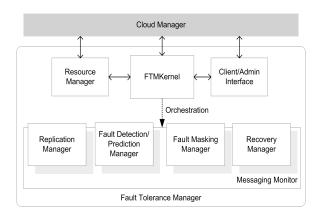
#### Fault Tolerance as a Service

- Build and deliver the service by orchestrating a set of micro-protocols
  - Realize fault tolerance techniques as independent, stand-alone, configurable modules (web services)
  - Operate at the level of virtual machine instances
- Failure detection using hearbeat test



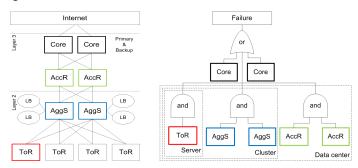
# Fault Tolerance Manager

## Fault Tolerance Manager - Framework Overview



## Configuration of a Dependability Solution (1)

- Based on the affect of failures on mission's tasks
- Using Fault trees and Markov chains

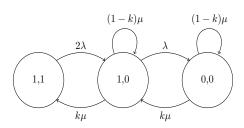


ToR-Top of Rack Switch
AccR-Access Router

AggS–Aggregate Switch LB–Load Balancer

## Configuration of a Dependability Solution (2)

- Analyze the properties of typical dependability mechanisms
- For example, semi-active replication
- Primary, Backup ( $\lambda$  failure rate,  $\mu$  recovery rate, k constant)



## Matching and Comparison Process

- Represent fault tolerance properties of ft\_sols using  $p=(s,\hat{p},A)$ 
  - o s denotes the ft sol
  - $\circ$   $\hat{p}$  represents the high level abstract properties such as reliability and availability
  - o A denotes the set of structural, functional and operational attributes
- Based on the mission's fault tolerance requirements
  - ∘ for each ft\_sol  $s \in S$  in the system, first shortlist  $S' \subset S$  that satisfy abstract property requirements  $\hat{v_c}(a) \preceq \hat{v_i}(a)$
  - o for each ft\_sol in S', compare  $v_c(a) \leq v_i(a)$  attribute values to obtain a set S'' of candidate ft\_sols

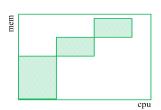
### Replica Placement Constraints

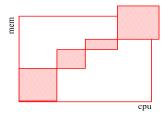
- Location and performance requirements of replicas can be specified using constraints
  - Global constraints Resource Capacity
  - Infrastructure oriented constraints Forbid, Count
  - o Application oriented constraints Restrict, Distribute, Latency

### Resource Capacity Constraint

- To avoid inconsistent system state
- Resources consumed by all VM instances on a single host cannot exceed a specified threshold of host's capacity

$$\forall h \in \mathcal{H}, \ d \in \mathcal{D}, \ \sum_{v \in \mathcal{V} \mid p(v) = h} v[d] \ \leq \ (h[d] * threshold[d])$$



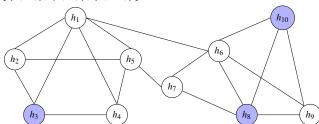


#### Forbid Constraint

- To dedicate hosts for system-level services (e.g., AC engine, Reference Monitor)
- Prevents VM instance v from being allocated on physical host h

$$\forall v \in \mathcal{V}, h \in \mathcal{H}, (v,h) \in Forbid \implies p(v) \neq h$$

•  $Forbid = \{(v, h_8), (v, h_3), (v, h_{10})\}$ 



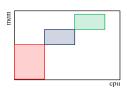
#### Count Constraint

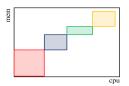
- To avoid performance degradation due to co-hosted VM instances
- · Limits the number of VM instances on a given host

$$\forall v \in \mathcal{V}, \quad h \in \mathcal{H}, \quad |\{v \in \mathcal{V} | p(v) = h\}| \leq count_h$$

•  $Count_h \le 3$ 







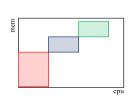
#### **Count Constraint**

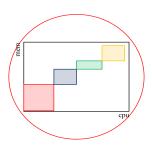
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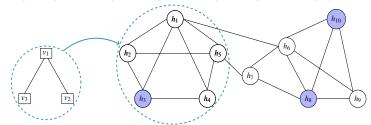


#### **Restrict Constraint**

- To support security and privacy policies and government enforced obligations
- Place VM instances only a specified group of physical hosts

$$\forall v_i \in \mathcal{V}, \ H_j \in 2^{H_j}, \ (v_i, H_j) \in Restr \Longrightarrow p(v_i) \in H_j$$

•  $Restr = \{(v_1, \{h_1, \dots, h_5\}), (v_2, \{h_1, \dots, h_5\}), v_3, \{h_1, \dots, h_5\})\}$ 

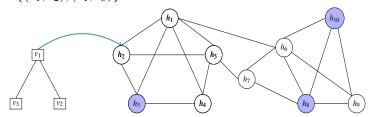


#### Distribute Constraint

- To avoid single points of failure among replicated applications
- Two VM instances are never located on the same physical host

$$\forall v_i, v_j \in \mathcal{V}, h \in \mathcal{H}, (v_i, v_j) \in Distr \Longrightarrow p(v_i) \neq p(v_j)$$

•  $Distr = \{(v_1, v_2), (v_1, v_3)\}$ 

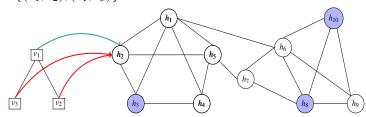


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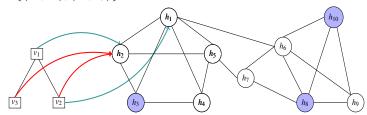


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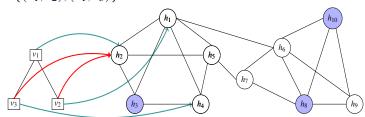


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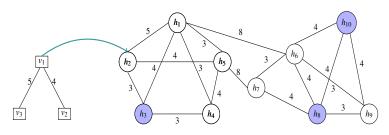
•  $Distr = \{(v_1, v_2), (v_1, v_3)\}$ 



### Latency Constraint

- To maintain performance of user's application
- Allocate VM instances such that network delay between them is less than a specified value

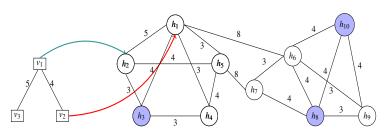
 $\forall v_i, v_j \in \mathscr{V}: (v_i, v_j, T_{max}) \in MaxLatency \Longrightarrow latency(p(v_i), p(v_j)) \leq T_{max}$ 



### Latency Constraint

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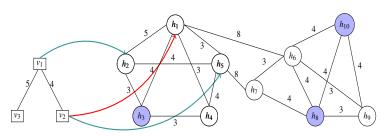
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### **Latency Constraint**

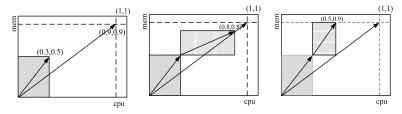
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$$\forall v_i, v_j \in \mathscr{V} : (v_i, v_j, T_{max}) \in MaxLatency \Longrightarrow latency(p(v_i), p(v_j)) \leq T_{max}$$



## VM Provisioning (1)

- A two-stage, host-centric greedy heuristic
- Build a priority queue to select least-used cluster
- Consider hosts in the order of their identifiers
- Use vector dot-product method to allocate VM instances

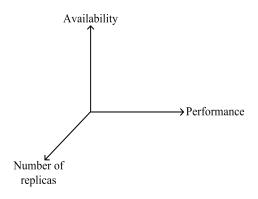


The vector dot-product values are 0.165 and 0.127 respectively

### Fault Tolerance at Runtime (1)

- Fault tolerance policy of a mission may not be satisfied when the system's working status changes
- Static allocation schemes are computationally expensive
- Dynamically adapt the current allocation to the new working status of the Cloud by means of a heuristic
  - Online fault tolerance controller for the mission
  - Uses monitoring information (e.g., bandwidth availability, resource status) and virtualization technology constructs
  - Applies fewer actions to respond to the incidents (instead of computing an allocation from scratch)
  - Performs incremental allocation

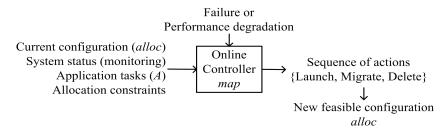
# Fault Tolerance at Runtime (2)



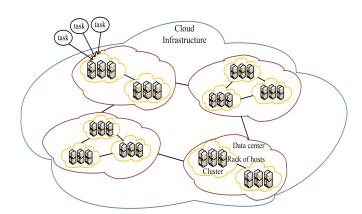
- High availability and performance are competing attributes
- Balance availability and performance while generating a new configuration for a given mission

- Heuristics-based solution to minimize the performance and availability degradation of the mission due to the changes in the working status of the system
- Realized as an online fault tolerance controller that uses three activities to change the current allocation status of the mission
  - Launch(t,h): Create new replicas of a task instantiate VM  $\nu$ , hosting task replica t, on the host h
  - o Migrate $(t, h_i, h_j)$ : Change the current location of a task replica as a response to performance or availability degradation move task t from host  $h_i$  to host  $h_j$
  - Delete(t,h): Reduce the replication level of a task remove task t from host h

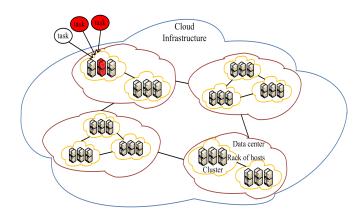
- A task can be allocated on host  $h \in \mathcal{H}$  if the constraints (restriction, distribution, capacity and allowed latency) are satisfied
- Implement task allocation as the bin-packing problem (bins=hosts and items=VMs)
- The function  $map : \mathcal{V} \to \mathcal{H}$  performs tentative search



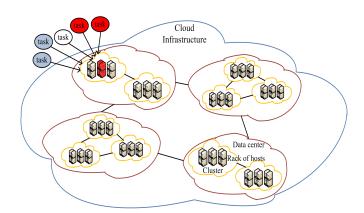
When availability of the mission is less than the desired one



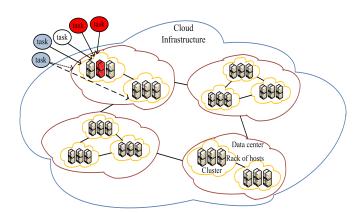
1 Identify task replica failures



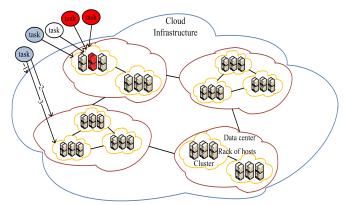
2 Launch new replicas at the same deployment level until current replication level is equal to original replication level and performance goals are satisfied



- 3 If availability goals are still not satisfied
  - 3.1 Move the task replicas to higher deployment levels



- 3 If availability goals are still not satisfied
  - 3.2 If the performance conditions conflict, starting from higher deployment levels, move gradually to lower levels and launch replicas where availability and performance goals are fulfilled



#### When **performance** of the mission is less than the desired one

- Identify the tasks with affected response time
- Delete task replicas in the same deployment level without violating availability goals
- If expected performance is still lower than the desired one
  - Move task replicas to lower deployment level
  - If availability conditions conflict, traverse from lowest deployment level, move gradually to higher levels and decrease replication level until availability and performance goals are fulfilled

#### Conclusions

- Mission-centric techniques to improve the security and fault tolerance in Cloud computing
- Secure mission deployment techniques (allocation and scheduling)
- · Static and dynamic mission protection by network hardening
- Provide complementary fault tolerance support to the mission as a service

#### **Publications**

#### Chapters in Books

- R. Jhawar, V. Piuri, "Dependability-oriented Resource Management Schemes For Cloud Computing Data Centers," in Handbook on Data Centers, S.U. Khan, A.Y. Zomaya (eds.), Springer, 2015 (to appear)
- M. Albanese, S. Jajodia, R. Jhawar, V. Piuri, "Securing Mission-Centric Operations in the Cloud," in Secure Cloud Computing, S. Jajodia, K. Kant, P. Samarati, V. Swarup, C. Wang (eds.), Springer, pp. 239-260, 2014

#### International Journals Articles

- R. Jhawar, V. Piuri, M. Santambrogio, "Fault Tolerance Management in Cloud Computing: A System-Level Perspective," in IEEE Systems Journal, pp.288-297, June, 2013
- C. A. Ardagna, R. Jhawar, V. Piuri, "Dependability Certification of Services: A Model-Based Approach," in Springer Computing Journal, pp.1-28, October 2013

#### **Publications**

#### International Conferences and Workshops

- R. Jhawar and V. Piuri, "Adaptive Resource Management for Balancing Availability and Performance in Cloud Computing," in Proc. of 10th Int'l Conference on Security and Cryptography, Reykjavik, Iceland, July 29-31, 2013
- M. Albanese, S. Jajodia, R. Jhawar, V. Piuri, "Secure Mission Deployment in Vulnerable Networks," IEEE Workshop on Reliability and Security Data Analysis, Budapest, Hungary, June 24-27, 2013
- R. Jhawar, V. Piuri, and P. Samarati, "Supporting Security Requirements for Resource Management in Cloud Computing," in Proc. of the 15th IEEE Int'l Conference on Computational Science and Engineering, Paphos, Cyprus, December 5-7, 2012
- R. Jhawar, and V. Piuri, "Fault Tolerance Management in laaS Clouds," in Proc. of the 1st IEEE-AESS Conference in Europe about Space and Satellite Telecommunications, Rome, Italy, October 2-5, 2012

#### **Publications**

- C.A. Ardagna, E. Damiani, R. Jhawar, and V. Piuri, "A Model-Based Approach to Reliability Certification of Services," in Proc. of the 6th IEEE Int'l Conference on Digital Ecosystem Technologies - Complex Environment Engineering, Campione d'Italia, Italy, June, 2012
- R. Jhawar, V. Piuri, and M. Santambrogio, "A Comprehensive Conceptual System-Level Approach to Fault Tolerance in Cloud Computing," in 2012 IEEE Int'l Systems Conference, Vancouver, BC, Canada, March 19-22, 2012