



## Autonomic Resource Management for Multi-tier Application Deployment to Infrastructure-as-a-Service (IaaS) Clouds

PHD Dissertation Proposal Defense

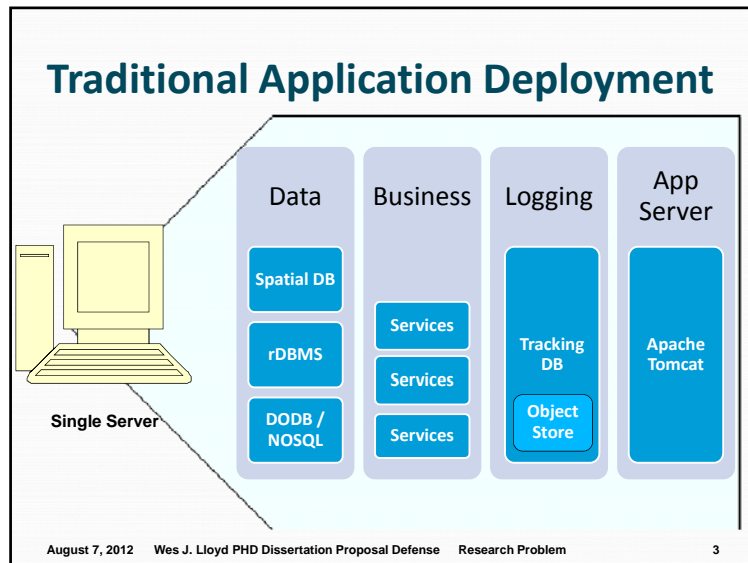
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August 7, 2012

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## Outline

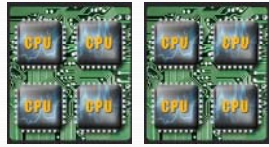
- Research Problem
- Challenges
- Approaches & Gaps
- Research Goals
- Research Questions & Experiments
- Research Contributions
- Preliminary Results

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## Infrastructure as a Service (IaaS) Cloud Computing

- Server partitioning of multi-core servers
- Hardware virtualization
- Service isolation
- Resource elasticity



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**How should applications be deployed to IaaS clouds?**

Geospatial DB, rDBMS, Services, File Server, Logging Server, Object Store, Distributed Cache, Apache Tomcat, NOSQL DB

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## Problem Statement

- Autonomic deployment of multi-tier applications to IaaS clouds
  - Component composition
    - Collocation and interference of components
  - Scaling infrastructure to meet demand

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## Challenges

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## Application Component Composition

Application Components

- App Server
- rDBMS r/o
- File Server
- Log Server
- Load Balancer
- rDBMS write
- Dist. cache

Application "Stack"

Component Deployment

Virtual Machine (VM) Images

- Image 1: App Server, File Server, Log Server
- Image 2: rDBMS write
- Image n: rDBMS r/o, Load Balancer

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## Bell's Number

n = number of application components

1 VM : 1..n components

Component Deployment

Application "Stack"

- Model
- Database
- File Server
- Log Server

# of Configurations

VM deployments

n	k
4	15
5	52
6	203
7	877
8	4,140
9	21,147
n	...

k = # of possible configs

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## Provisioning Variation

Request(s) to launch VMs

Ambiguous Mapping

VMs Share PM CPU / Disk / Network

VMs Reserve PM Memory Blocks

PERFORMANCE

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## Infrastructure Management

- Scale Services
- Tune Application Parameters
- Tune Virtualization Parameters

Service Requests

Load Balancer

Application Servers

distributed cache

noSQL data stores

rDBMS

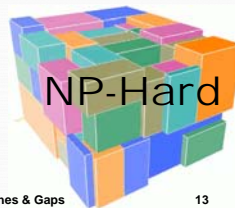
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## Approaches & Gaps

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## Virtual Machine (VM) Placement as “Bin Packing Problem”

- Bins= physical machines (PMs)
- Items= virtual machines (VMs)
- Dimensions
  - CPU time
  - VM RAM, hard disk size, # cores
  - Disk read/write throughput
  - Network read/write throughput
- PM capacities vary dynamically
- VM resource utilization varies



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13

## Related Work

- Multivariate performance models
  - Regression models
  - Machine learning
- Feedback loop control
- Hybrid approaches
- Formal approaches
  - Integer linear programming
  - Case based reasoning



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14

## Gaps in Related Work

- Existing approaches do not consider
  - VM image composition
  - Complementary component placements
  - Interference among components
  - Minimization of resources (# VMs)
  - Load balancing of physical resources
- Performance models ignore
  - Disk I/O
  - Network I/O
  - VM and component location



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15

## Why Gaps Exist

- Public clouds
  - Research is cost prohibitive
  - Users concerned with performance not in control
- Private clouds: systems still evolving
- Performance models (large problem space)
- Virtualization misunderstood or overlooked



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16



# Research Goals

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17

## Research Goals

RG1: Support VM component composition

RG2: Support virtual infrastructure management

- Determine and execute VM placement
- Scale infrastructure for application demand

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18

## Performance Objectives

- Primary: Maximize application throughput
- Secondary: Minimize resource cost (# of VMs)
- Minimize modeling time
- Support high responsiveness to change in application demand

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19

## Research Questions & Methodology

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20

## Methodology Evaluation

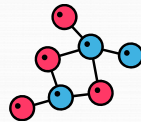
- CSIP: USDA-NRCS platform for model services
- Models as multi-tier application surrogates
  - RUSLE2 – Soil erosion model
  - WEPS – Wind Erosion Prediction System
  - Hydrology models: SWAT, AgES
  - Other models: STIR, SCI...
- Eucalyptus IaaS cloud(s)
  - Amazon EC2 compatible
  - XEN & KVM hypervisors



Component Composition	Infrastructure Management
RQ1	RQ3
RQ2	RQ4
	RQ5

## RQ1: Which independent variables best help model application performance (throughput) to guide autonomic component composition?

- Total (all VMs) resource utilization
  - CPU time, disk I/O, network I/O, ...
- Individual VM and PM resource utilization
- Component and VM location
- VM Configuration: number of cores, RAM, hypervisor type (KVM, XEN...)

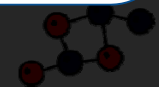


## RQ1: Which independent variables best help model application performance (throughput) to guide autonomic component composition?

### Methodology

#### Exploratory performance modeling

- Investigate independent variables
- Investigate modeling techniques
  - Multiple linear regression (MLR)
  - Artificial neural networks (ANNs)
  - Others



## RQ2: Can component resource classifications and behavioral rules predict performance of component compositions?

- Support simplification of the search space
- Support applications with large # of components
  - Bell's number

n	k
4	15
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n	...



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## RQ2: Can component resource classifications and behavioral rules predict performance of component compositions?

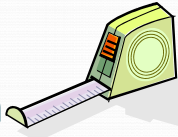
### Methodology

Investigate autonomic component composition approach(es)

- Performance modeling
- Heuristics to classify
  - Component resource utilization
  - Component dependencies

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## Evaluation Metrics: Component Composition



- Composition performance
  - Average throughput of configurations
- Resource packing density
  - # components/# VMs for compositions
- Derivation speed
  - Average wall clock time to produce compositions

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## RQ3: Does performance of component compositions change when scaled up?

- Single provisioned application VMs → Multiply provisioned application VMs
- Investigate collocation of new VMs
  - Intelligent vs. ad-hoc placement
  - Load balance physical resources



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### RQ3: Do performance rankings of component compositions change when scaled up?

#### Methodology

Scale up compositions and benchmark performance

- Investigate impact of VM placement for infrastructure scaling



### RQ4: How rapidly can VMs be launched in response to application demand?

- Determine upper bound of VM launch speed
- Devise workarounds to improve performance
  - VM prelaunch and suspension
    - Reserve RAM, other resources multiplexed
  - Enforced caching of VM data on PMs
  - Reassign duties of existing VMs
  - Others ?

### RQ4: How rapidly can VMs be launched in response to application demand?

- Determine upper bound of VM launch speed

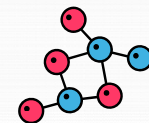
#### Methodology

Benchmark VM launch performance and investigate potential improvements

- Reassign duties of existing VMs
- Others ?

### RQ5: Which independent variables best support application performance modeling for autonomic infrastructure management?

- Virtual infrastructure
  - Number of VMs (1 to n) per application VM
  - VM RAM, # cores
  - VM location data
- Application specific parameters
  - Number of worker threads
  - Number of database connections
  - Number of app server concurrent connections





## RQ5: Which independent variables best support application performance modeling for autonomic infrastructure management?

### Methodology

Explore autonomic infrastructure management approach(es)

- Performance model based
- Feedback control
- Hybrid approach
  - Number of worker threads
  - Number of database connections
  - Number of app server concurrent connections

## Evaluation Metrics: Infrastructure Management



- Percentage of service requests completed
- Responsiveness
  - Max supported load acceleration without dropping requests
- Adaptation time
  - Time window with dropped requests
- Failure recovery time

## Contributions

## Expected Contributions (1/2)

- Novel, intelligent approaches for IaaS cloud
  - Application deployment
  - Infrastructure management
- Move IaaS infrastructure management beyond simple management of VM pools

## Expected Contributions (2/2)

- Autonomic component composition (RQ1, RQ2)
- Autonomic infrastructure management (RQ3, RQ4, RQ5)
- Improve application performance modeling
  - For component composition (RQ1)
  - New independent variables (RQ1)
  - Heuristics (RQ2)
  - For infrastructure management (RQ5)
- Support load balancing of physical resources

## Non-goals

- Support for stochastic applications
  - Only applications with stable resource utilization characteristics supported
- External interference
  - From non-application VMs
- Hot-spot detection

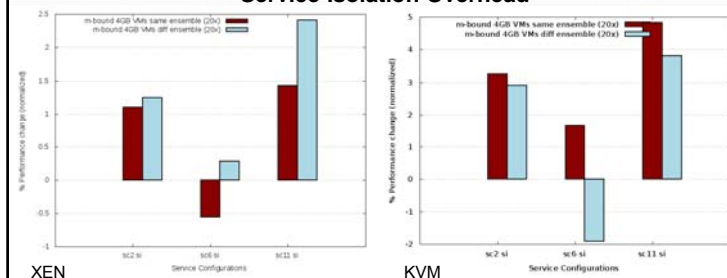
## Preliminary Results

## Component Compositions

Rusle 2 Model Fastest Compositions



Service Isolation Overhead



## Component Compositions

Rusle 2 Model Fastest Compositions

SC<sub>2</sub>
SC<sub>6</sub>
SC<sub>11</sub>

- Determining fastest compositions
  - Not intuitive
  - Testing / prediction required
- Service Isolation
  - Was not fastest
  - Adds overhead
  - Results in maximum hosting costs (# of VMs)

XEN      KVM

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## Component Composition Resource Utilization Diversity

Resource Type

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## Component Composition Resource Utilization Diversity

- Resource utilization varies
  - Component/VM placements
  - VM memory size allocations
  - Hypervisor type KVM/XEN
- Testing required to identify resource utilization
- Intuition is insufficient

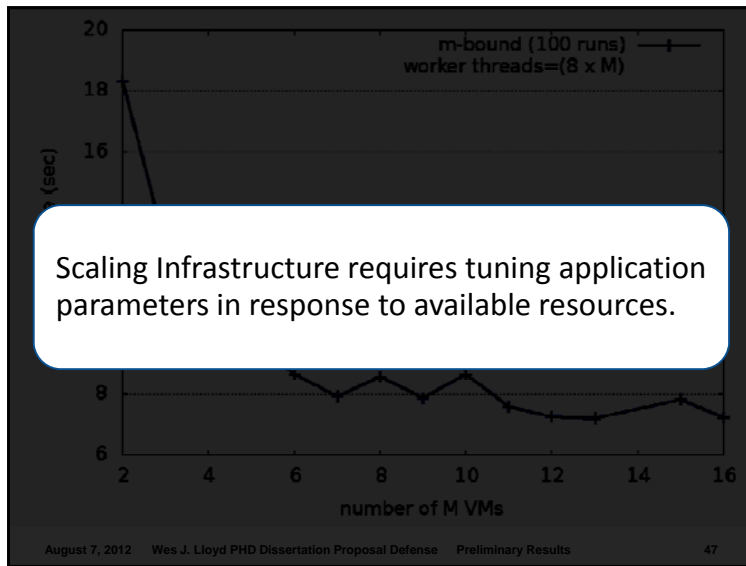
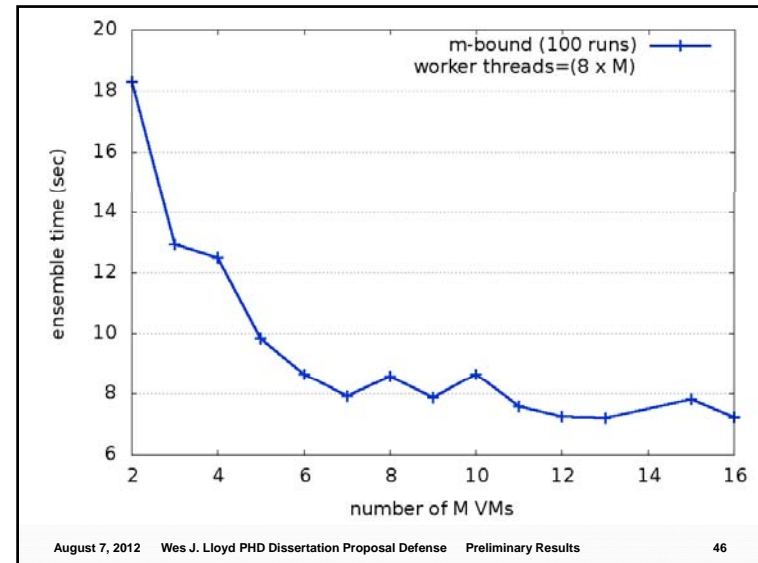
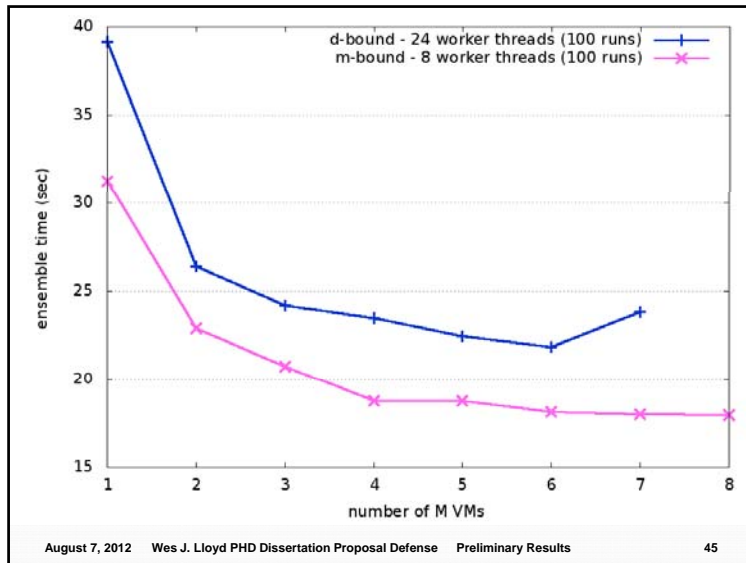
Resource Type

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ensemble time (sec)

number of worker threads

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# Questions

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