## A Novel Scheduling Mechanism For Hybrid Cloud Systems

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## Hybrid Cloud Systems

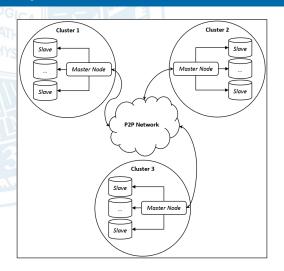


Figure 1: Hybrid Cloud Systems



## System Overview

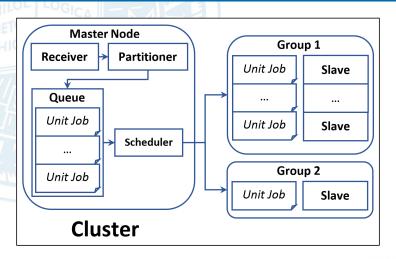


Figure 2: The framework of cluster.



# System Overview (Cont.)

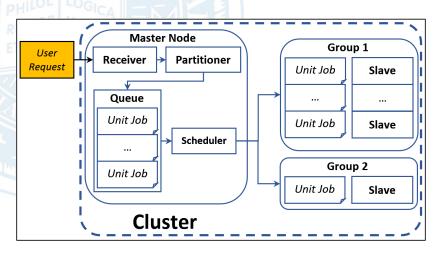


Figure 3: User Request.



# System Overview (Cont.)

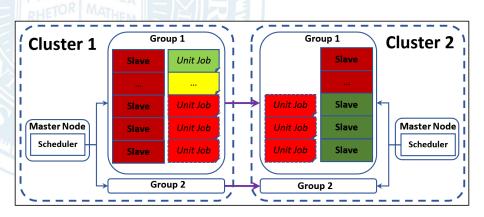


Figure 4: Unit job migration between clusters.



### Measures

#### Makespan

Total elapsed time from entering the system to finishing/leaving.

## **Expected (Ideal) Makespan**

### **Actual Makespan**

#### **Estimated Makespan**

Elapsed time already spent in the system + estimated time remaining in the system.

## Measures (Cont.)

## **Actual Makespan Ratio**

The ratio of actual makespan to ideal makespan. It measures how efficiently a given unit job/user request is processed by the system.

## **Estimated Makespan Ratio**

The ratio of estimated makespan to ideal makespan.

## Baseline (Average) Makespan Ratio

Given a sequence of user request completions in a cluster, this ratio is the weighted average of their actual makespan ratios, where the weights are normalized lengths.



## Measures (Cont.)

## Estimated Baseline Makespan Ratio Elevation (EBMRE)

The weighted average of the baseline makespan ratio and the sum of the estimated makespan ratios of queued unit jobs in a given group. It measures how much the baseline makespan ratio would rise if all unit jobs in this group are completed here (i.e. no job is moved out).



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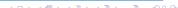
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#### Objective of the Scheduling Mechanism

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#### General Idea

Migrate some unit jobs to somewhere to make them wait less.



## Core Problem

When should we migrate whom to where?



## Why Might Waiting Be Reduced?

• Groups in the same cluster are not load-balanced relatively to each other.



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o Inter-Cluster Load Balancing.



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#### Key Fact

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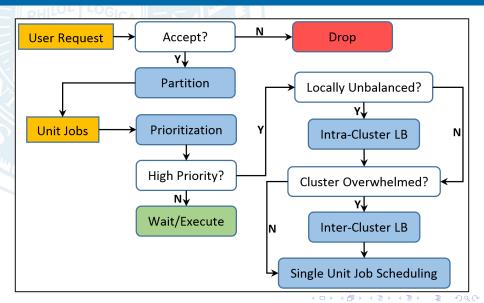
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#### Prioritization

The priority of a unit job measures how much its waiting would worsen the system performance. It is dynamically updated, (i.e. the longer the waiting time the higher the priority). Furthermore, high priority is telling that the corresponding group might have been overwhelmed.



## General Scheduling Mechanism



## Two Important Indicators

 $\hat{N}_{mig}^{k}$  and  $\hat{N}_{acc}^{k}$ 

 $\hat{N}_{mig}^{k}$ : the estimated number of unit jobs could be migrated out of group k.

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#### How to calculate?

Calculated from the EBMRE value for the group.





## Conditions in General Scheduling Mechanism

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#### Locally Unbalanced?

High-priority unit job exists and  $\sum_{k} \hat{N}_{mi\sigma}^{k} + \sum_{k} \hat{N}_{acc}^{k} \geq \Gamma_{II}$ 

#### Cluster Overwhelmed?

Locally balanced and  $\sum_{k} \hat{N}_{mi\sigma}^{k} - \sum_{k} \hat{N}_{acc}^{k} \geq \Gamma_{gl}$ 



## Intra-Cluster Load Balancing

"When should we migrate whom to Where?"

Migrate unit jobs from  $\hat{N}_{mig}^{k} > 0$  groups to  $\hat{N}_{acc}^{k} > 0$  groups to minimize the sum of EBMREs.



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Unit jobs are waiting and of low priorities.



## Inter-Cluster Load Balancing

"When should we migrate whom to Where?"

A cluster having its number of queued unit jobs in a certain group greater than average among its neighbors is considered as *heavy*, otherwise *light*. It migrates unit jobs to its light neighbors if any. The source and the destination groups are the same.



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# Single Unit Job Scheduling

"When should we migrate Whom to Where?"

Place this high priority unit job to a group who will have the minimum increase in its cumulative estimated makespan for adding this job in.



### Additional Considerations

## Implementation of Inter-Cluster Load Balancing

It is using a Gossip-based P2P communication. A gossip table is maintained by each cluster, and it is used to select neighbors to migrate unit jobs.



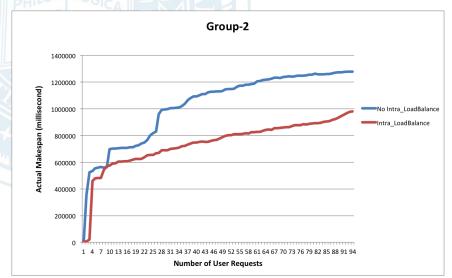
## Settings

- Four clusters;
- Four groups in each cluster;

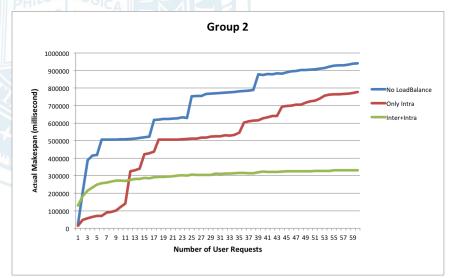
Group	Execution Time(millisecond)
$\mathcal{G}_1$	50
$\mathcal{G}_2$	250
$\mathcal{G}_3$	1250
$\mathcal{G}_4$	6250

- Arrival of user requests follows the Poisson distribution,  $\lambda = 20$ ;
- $\bullet$  Number of unit jobs in each user request is randomly picked in range of [1  $\sim$  20];
  - Performance measure is average actual user request makespan.

# Experimental Results (Intra-Cluster LB)



# Experimental Results (Intra- and Inter-Cluster LB)



### **Future Work**

#### Pricing & Costs

If the pricing and the costs of different types of computing resources are taken into account, then the problem would become more interesting.





