

# Dynamic Scheduling of Parallel Real-time Jobs by Modelling Spare Capabilities in Heterogeneous Clusters

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## Motivation

- Reservation of real time computations in resources
- New real time jobs keep arriving at the resources for computation
- Scheduling newly arriving real time jobs to resources while the reserved real time computations are still guaranteed

## Objective

- Modeling the spare capabilities left by the existing periodic real time jobs in heterogeneous cluster
- Scheduling parallel real-time jobs with the topology of Directed Acyclic Graph (DAG), based on the modeling approach for spare capabilities

## Contributions

- An optimal approach is presented to model the spare capabilities left by periodic jobs in a heterogeneous cluster
- A dynamic scheduling mechanism is proposed to satisfy the real-time requirements of both existing jobs and newly arriving jobs

## Presentation Outline

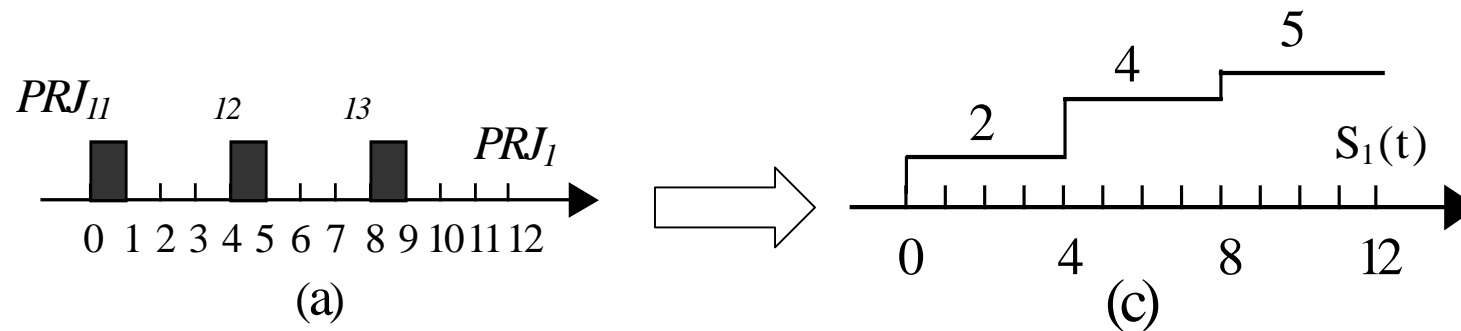
- Modeling spare capabilities in a heterogeneous cluster
- Scheduling of parallel real-time jobs with DAG topology
- Experimental studies

# Modeling spare capabilities in a heterogeneous cluster

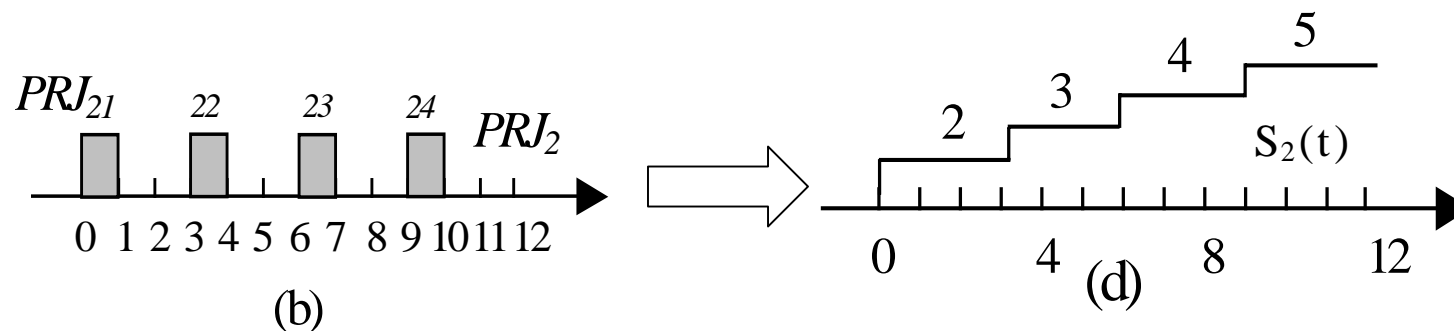
## Difficulties

- In the cluster architecture, the global scheduler usually locates in a centric computer while the jobs are run in other processing computers
- The global scheduler has to model the spare capabilities of other computers rather than a processing computer models the spare capability in itself

# Function of Spare time slots (1)

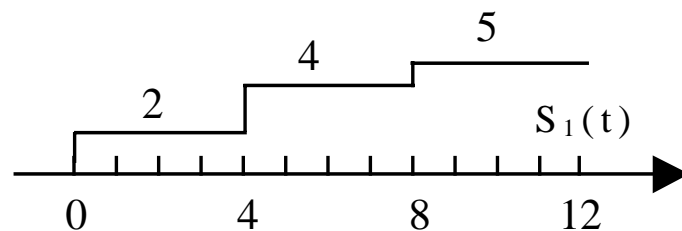


$$S_i(t) = D_{ij} - P_{ij} \quad D_{i(j-1)} < t \leq D_{ij}$$

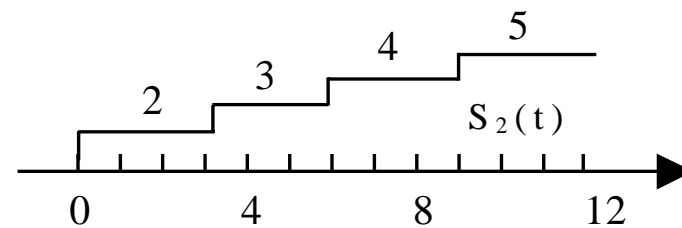




## Function of Spare time slots (2)

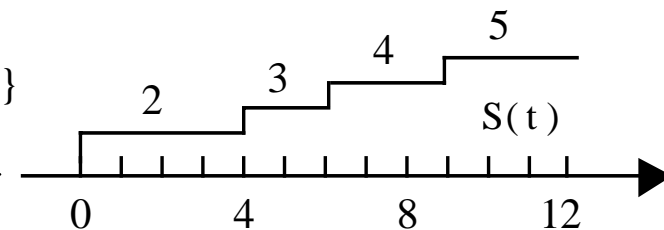
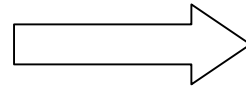


(c)



(d)

$$S(t) = \min\{S_i(t)\}$$



Function  $S(t)$  means that the real-time requirements are still guaranteed as long as the amount of time slots used for running new jobs between time 0 and any time point does not exceed the value indicated by the function

## Modeling Spare Capabilities on-line

- Function  $S(t)$  can be constructed off-line for every computer in the heterogeneous cluster
- Function  $S(t)$  indicates the time slots available for new jobs between time 0 and any time point in the future.
- The dynamic arrivals of new jobs complicate the problem since their arriving times may not be 0.
- Suppose a new job arrives at time  $t_0$ , we need to work out on-line how many time slots are available for the job between its arrival time  $t_0$  and a time point  $t$  after  $t_0$ , denoted by  $S(t_0, t)$

## Compute $S(t_0, t)$ (Theorem 1 in the paper)

- $W_1$ : work amount to be finished before  $t$ 
  - sum of exec times of instances whose deadlines are less than  $t$
- $W_2$ : work amount having been finished before  $t_0$
- $W_1$  minus  $W_2$  is the work amount to be finished in  $[t_0, t]$
- The left time slots are spare, that is,
$$S(t_0, t) = (t - t_0) - (W_1 - W_2) = (t - W_1) - t_0 + W_2$$
- Since  $t - W_1 = S(t)$ , we just need to work out  $W_2$

## Compute $W_2$

- $W_2$  includes two parts
  - $W_{2a}$ : the sum of exec times of instances whose deadlines are less than  $t_0$
  - $W_{2b}$ : work finished before  $t_0$  for the instances whose deadlines are greater than  $t_0$  but less than  $t$
- $W_{2a}$  is easy to compute, the problem is narrowed down to work out  $W_{2b}$

## Compute $W_{2b}$

- The instances whose deadlines are greater than  $t_0$  can only occupy the time slots left by the instances whose deadlines are less than  $t_0$  (because of EDF policy)
- To compute  $W_{2b}$ , we need to work out the distribution pattern of time slots left by the instances with deadlines less than  $t_0$

## Distribution of time slots left by instances with deadlines less than $t_0$

- If only existing periodic jobs are running, the distribution of time slots is easy to work out (which can be done off-line)
- However, the arrival and execution of previous new tasks will disturb the original distribution
- A property is revealed about how the previous new tasks disturb the original distribution

## A property (Theorem 2 in the paper)

- Suppose the last executed new task is completed at time  $f$ , then there exists such a time point  $t_s$  in  $[f, t_0]$ , that
  - The instances with deadlines less than  $t_0$  retain the original execution pattern in  $[t_s, t_0]$  as if there were no previous new tasks run before
  - There are no idle time slots in  $[f, t_s]$
- Since the original pattern is retained,  $W_{2b}$  can be worked out. Hence  $S(t_0, t)$  can be computed.

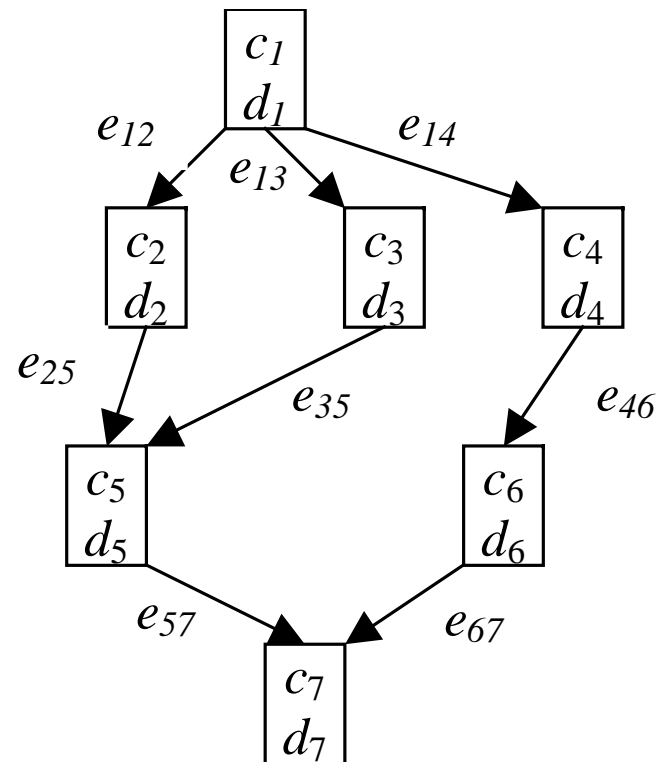
## Advantage of the model approach

- The modeling procedure obtains the maximal spare time slot available for running new jobs between the job's arrival time and a future time point, so that new jobs can achieve the optimal response time
- Free of communication between the global scheduler and other processing computers in the modeling procedure

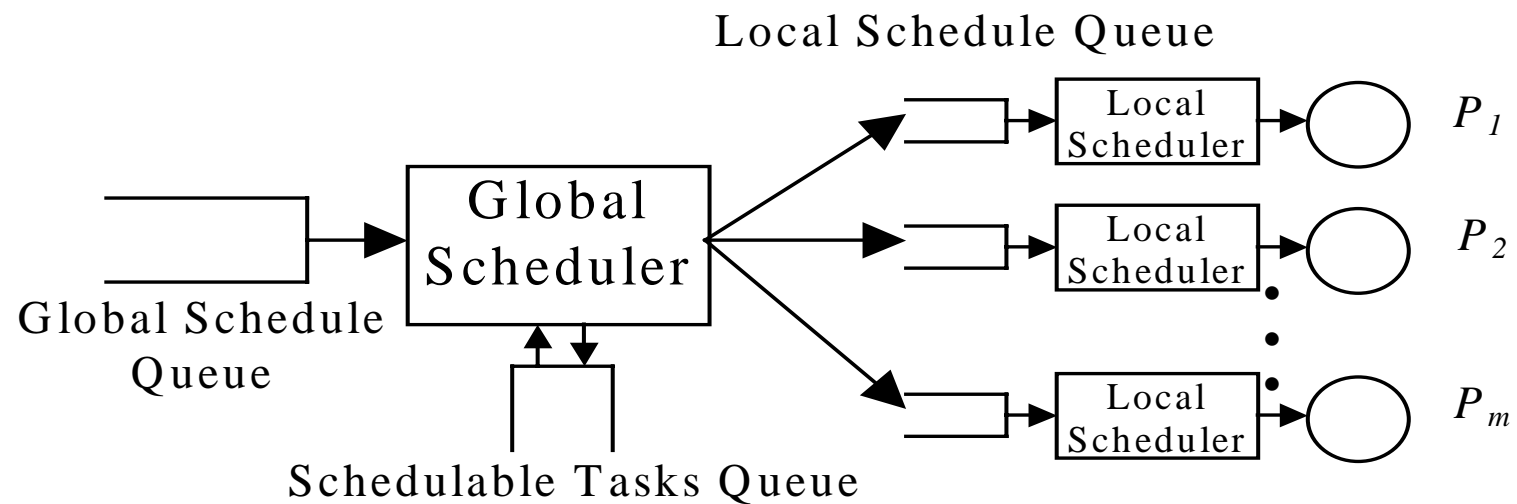


# Scheduling of parallel real-time jobs with DAG topology

# The Model of Parallel Real-time Jobs



# The Scheduler Model (1)



## The scheduling procedure (1)

- There are existing periodic jobs running in processing computers
- New parallel real time jobs arrive at the global scheduler for execution
- Each time the global scheduler gets a job from the global schedule queue and searches for the schedulable subtasks in the job and put them into the schedulable tasks queue, then the global scheduler get a subtask from the schedulable tasks queue and schedule it onto one of processing computers
- When deciding which computer to choose, The global scheduler will compute the spare capability in each computer
- In each processing computer, the local scheduler schedules the tasks in the local schedule queue as the EDF policy (the task is a subtask of a new parallel job or a periodic job instance)

## Compute the finish time of a task (Algorithm 1 in the paper)

- 1. Get a time point  $t_k$  after  $t_0$  that  $S(t_k)$  changes
- 2. Compute  $S(t_0, t_k)$
- 3. If  $S(t_0, t_k) < \text{task's execution time } c_i$
- 4. Get  $k=k+1$ , go to Step 2
- The task's finish time is

$$t_{k-1} + c_i - S(t_0, t_{k-1})$$

# Admission Control

## (Algorithm 2 in the paper)

- If the finish time of a task in any processing computer is greater than its deadline, the parallel real-time job that the task belongs to is rejected
- If multiple computers can satisfy the task's deadline, two possible selection policies are applied
  - Select the computer which provides the shortest finish time (Response-First policy)
  - Select the computer which provides the longest finish time (Utilization-First policy)
- After deciding which computer the task should be sent to, the deadline of the task is reset to be the finish time of the task in that computer

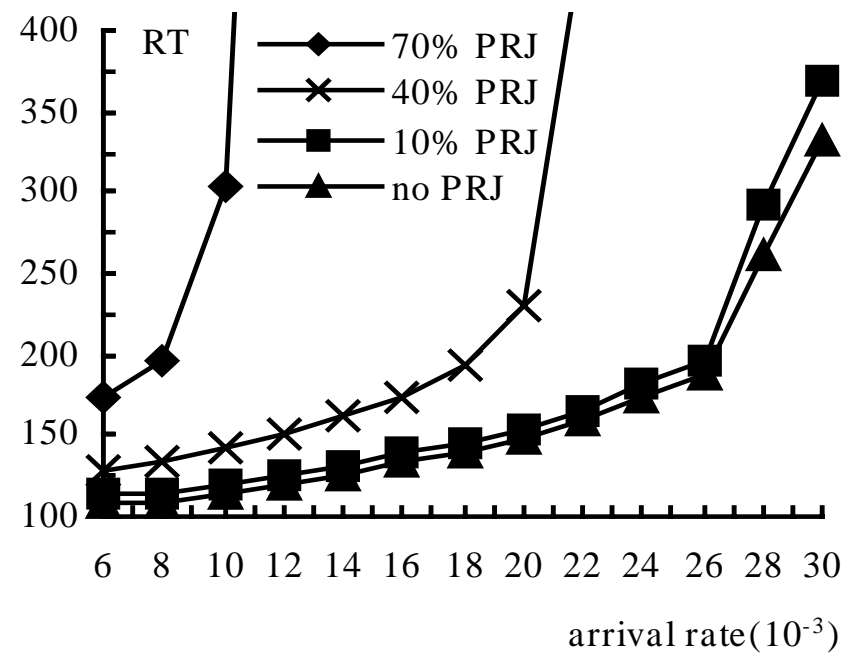
## Advantage of the scheduling procedure

- Since the computed spare capabilities are maximal possible, the computed finish time of a task is shortest possible while the real time requirements of all periodic jobs are still guaranteed

# Experimental Studies

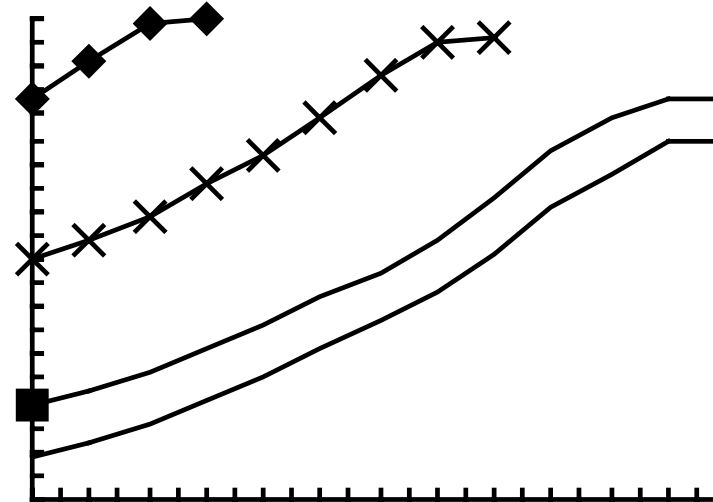


## Job workload (1)

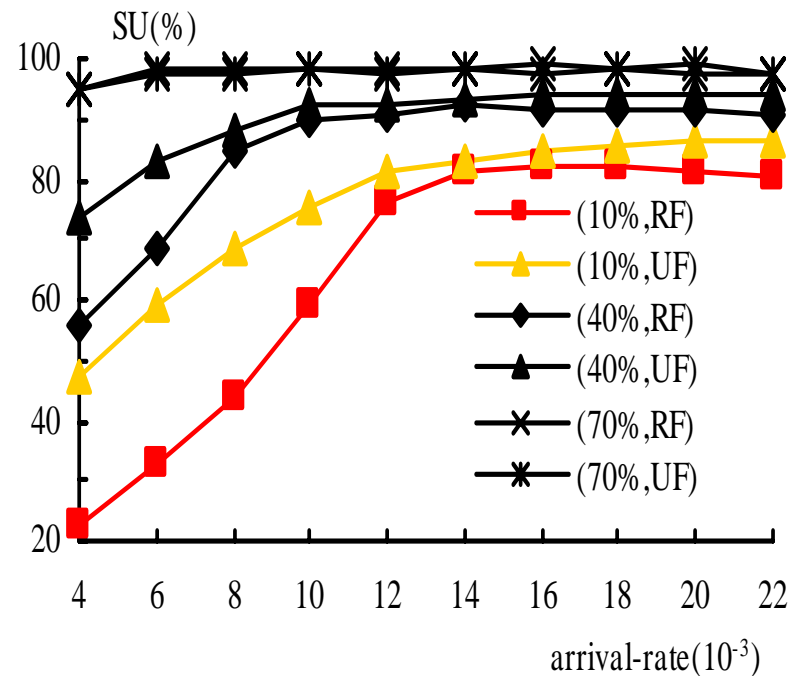


Effect of workload on average response time under different levels of PRJs

## Job workload (2)

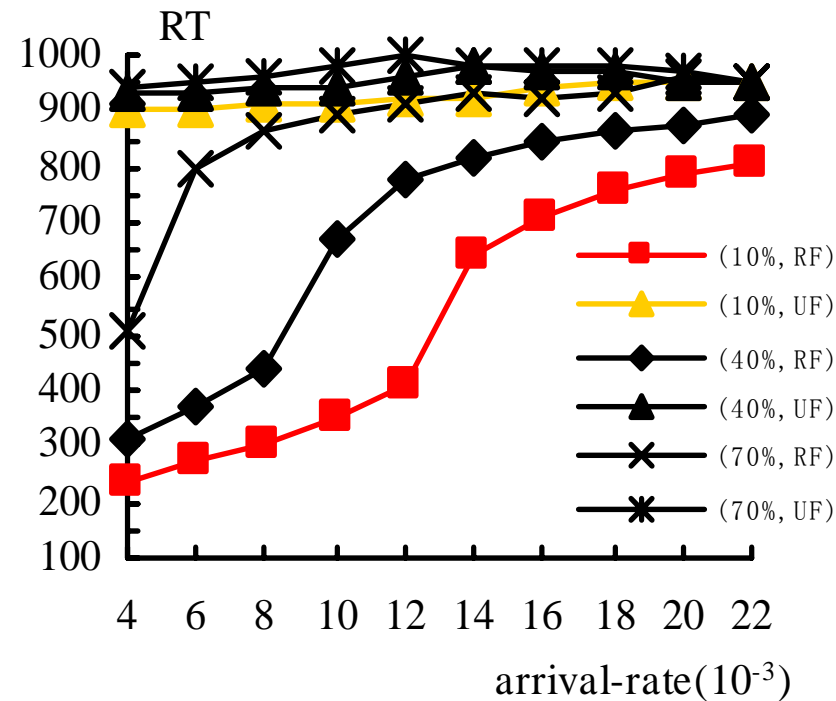


## Selection Policies (RF vs UF) (1)



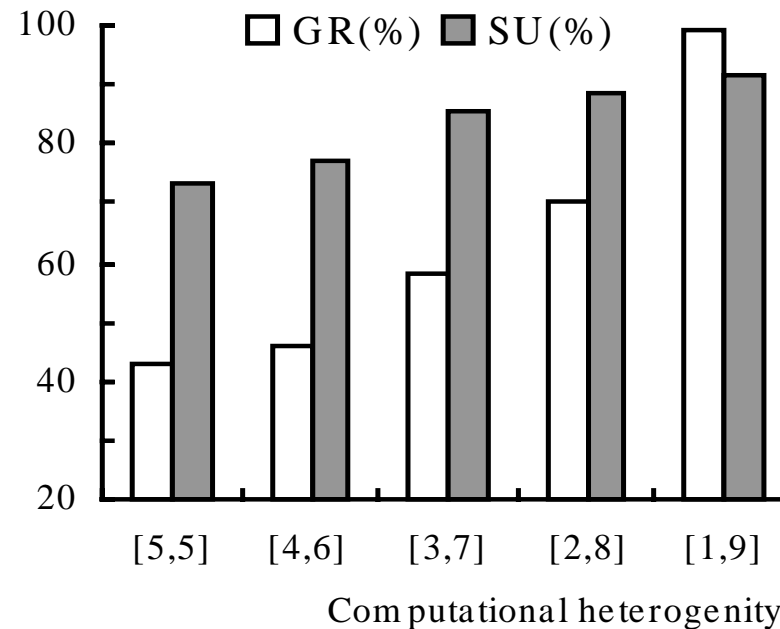
**Effect of Job workloads and second-level selection policy on SU**

## Selection Policies (RF vs UF) (2)



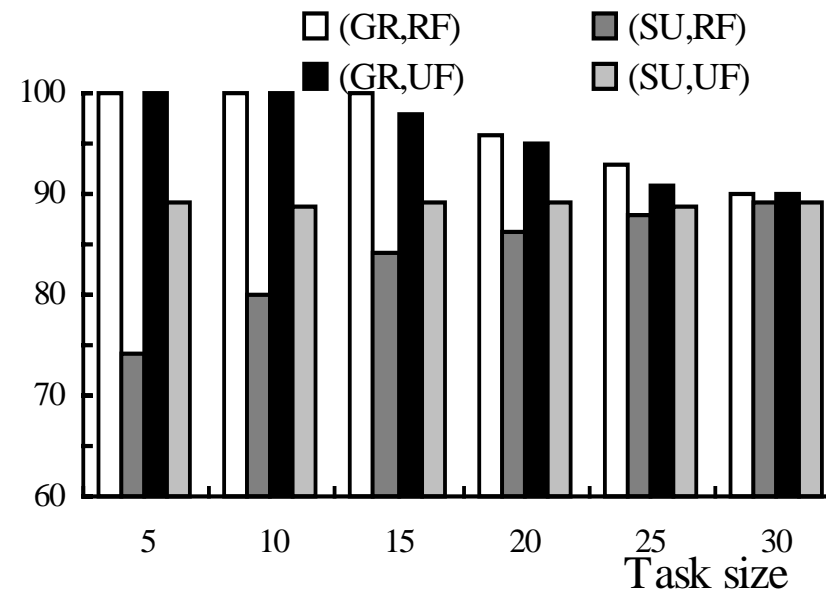
**Effect of Job workloads and second-level selection policy on RT**

# Computation heterogeneity



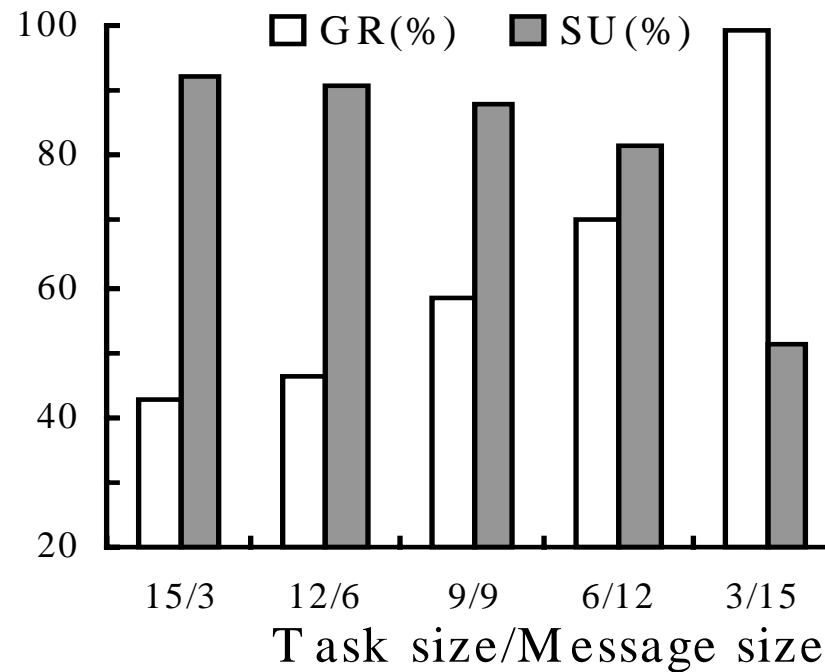
**Effect of computation heterogeneity on GR and SU**

# Task size



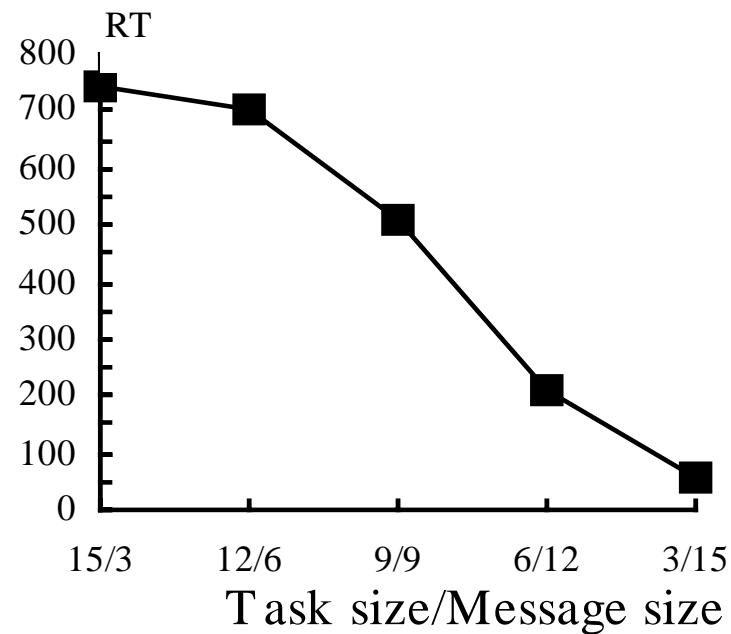
Effect of task size on GR and SU

## Task size and Message size (1)



**Effect of task-size/message-size ratio on GR and SU**

## Task size and Message size (2)



**Effect of task-size/message-size ratio on RT**



## Conclusions

- An optimal approach for modeling the spare capabilities in a cluster left by the periodic jobs
- A dynamic scheduling mechanism is developed to satisfy the real-time requirements of both existing periodic jobs and newly arriving parallel real-time jobs