

# Migration, Assignment, and Scheduling of Jobs in Virtualized Environment



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# A Virtualized Environment



**Basis of Cloud Computing**

**Decouples Operating System  
Instances from Hardware**

**Enables migration of OS  
instances (Virtual Machines)**

# Challenges in Virtualized Environment

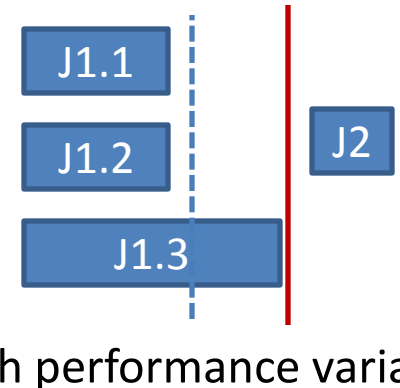
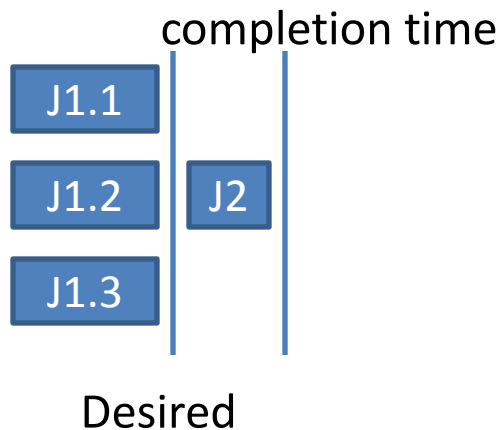
Obstacle	Opportunity
1 Availability/Business Continuity	Use Multiple Cloud Providers
2 Data Lock-In	Standardize APIs, Compatible SW to enable Surge or Hybrid Cloud Computing
3 Data Confidentiality and Auditability	Deploy Encryption, VLANS, Firewalls
4 Data Transfer Bottlenecks	FedExing Disks; Higher BW Switches
<b>5 Performance Unpredictability</b>	<b>Improved VM support; Flash memory; Gang Schedule VMs</b>
6 Scalable Storage	Invent Scalable Store
7 Bugs in Large Distributed Systems	Invent Debugger that relies on Distributed VMs
8 Scaling Quickly	Invent Auto-Scaler that relies on ML; Snapshots for Conservation
9 Reputation Fate Sharing	Offer reputation-guarding services like those for email
10 Software Licensing	Pay-for-use licenses

From Armbrust et al., A view of cloud computing. *Commun. ACM*, April 2010

# Unpredictable Performance May Cause

## Propagation Effects

Performance variance among jobs may create cascaded effects in all the related jobs

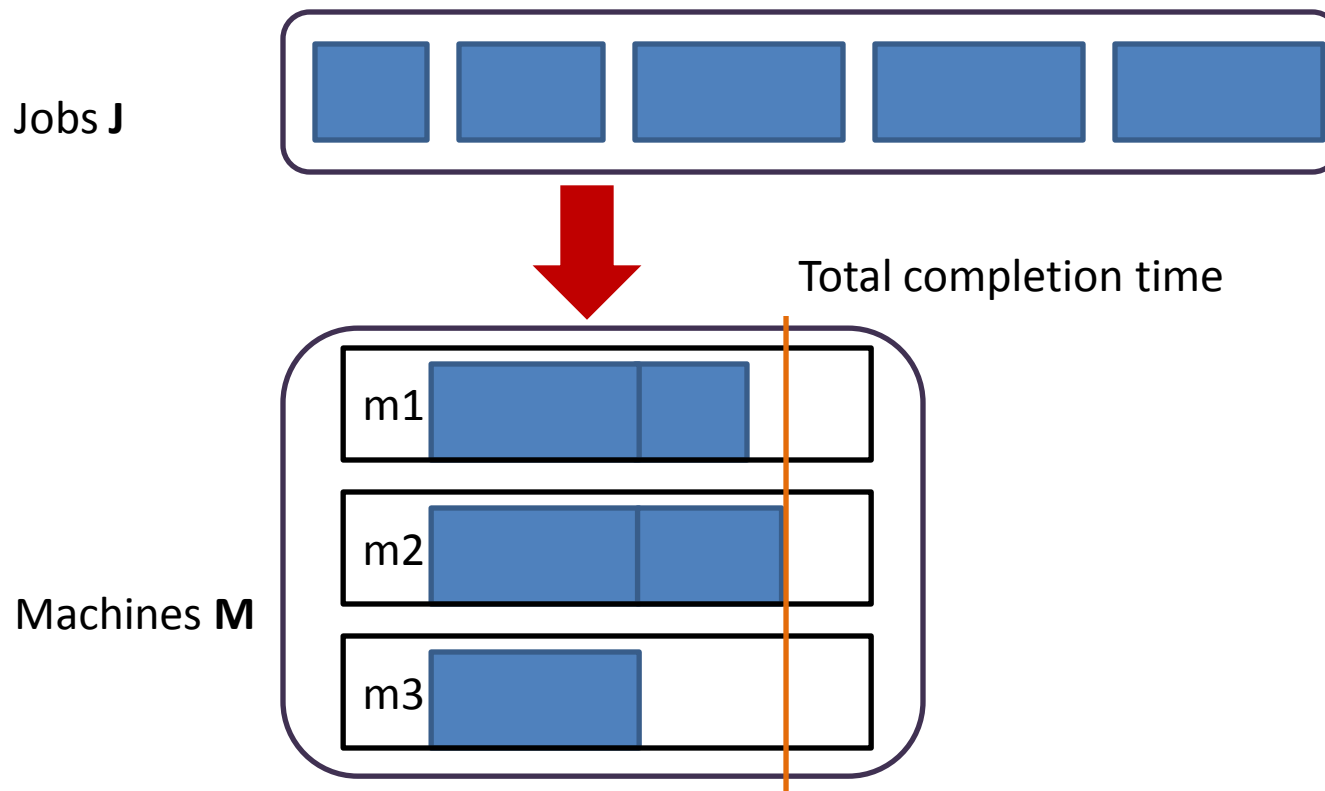


Repels performance critical applications.

VM assignment/scheduling schemes consider performance

# Job Scheduling

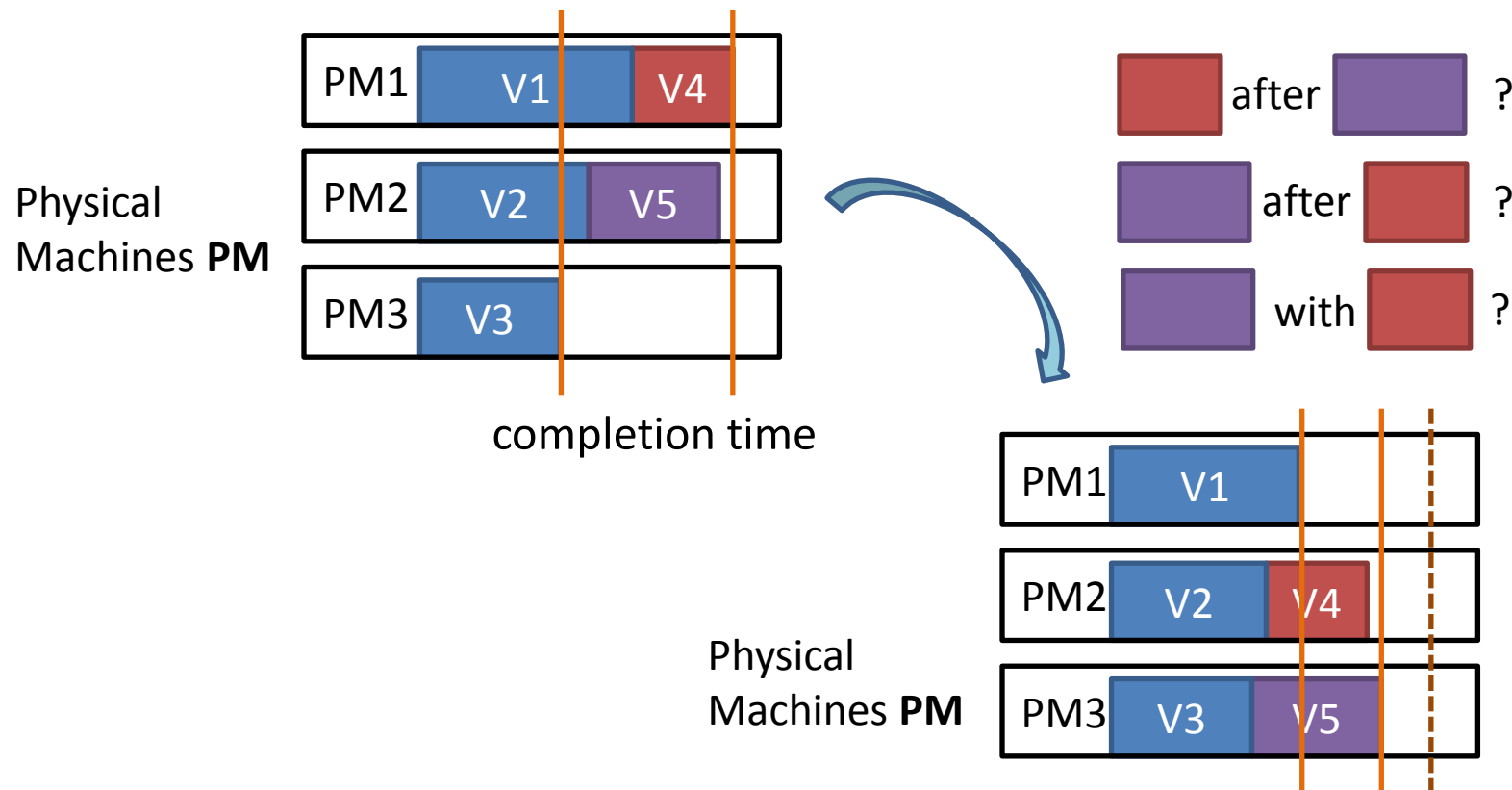
An optimization problem to find assignment of jobs to the given set of machines so as to minimize the *total completion time* of jobs



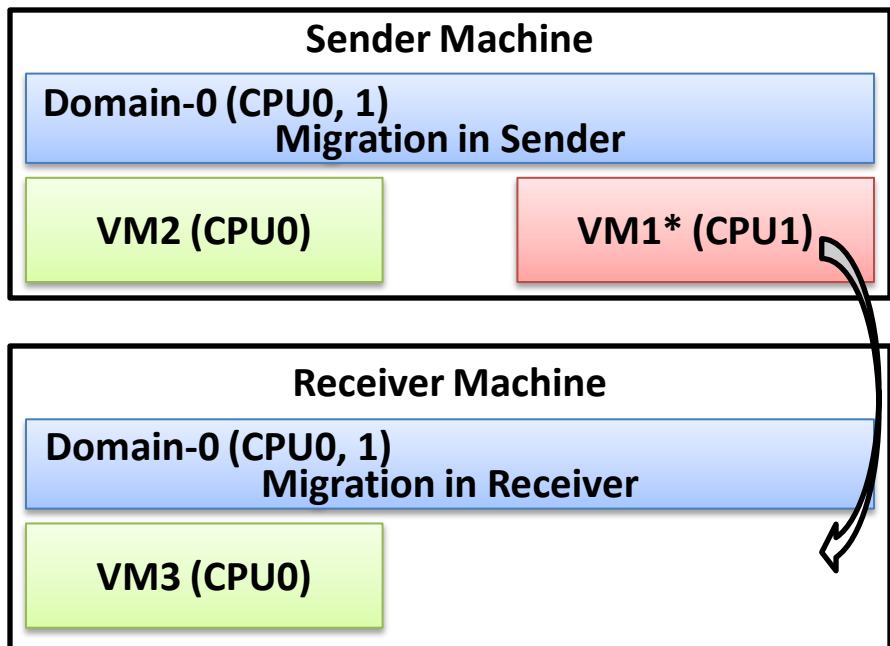
# During (Re-)Assigning VMs

A set of VMs migrates

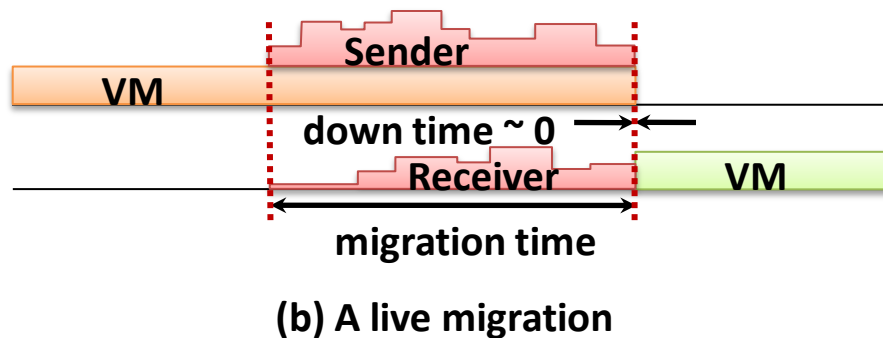
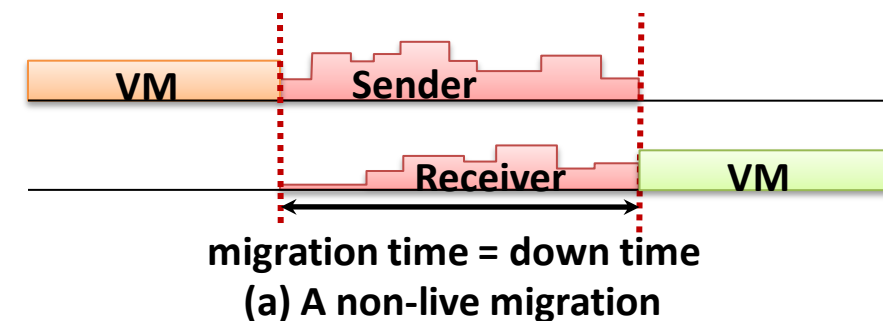
Migration policy determines the amount of time to reassign VMs and hence impacts performance



# VM Migration



VM1\* migrates

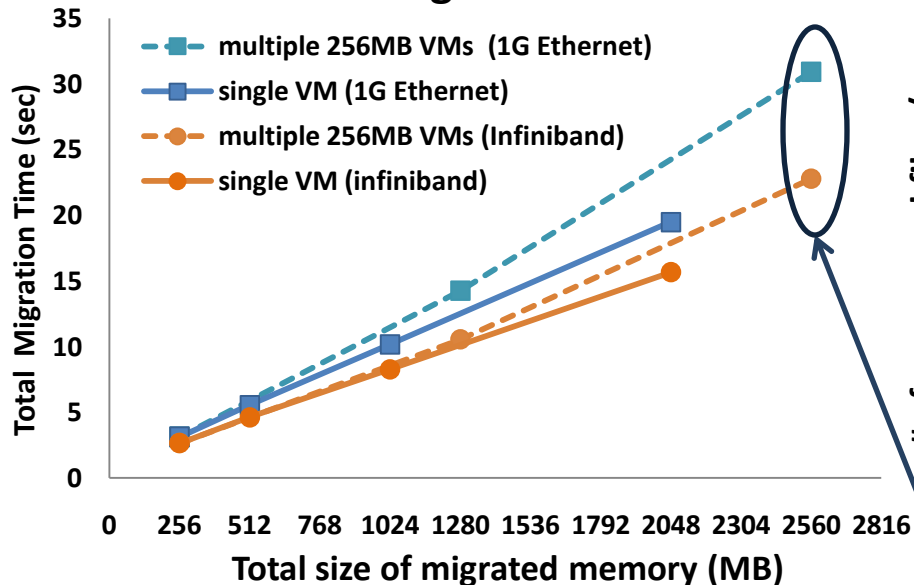


Types of VM migrations

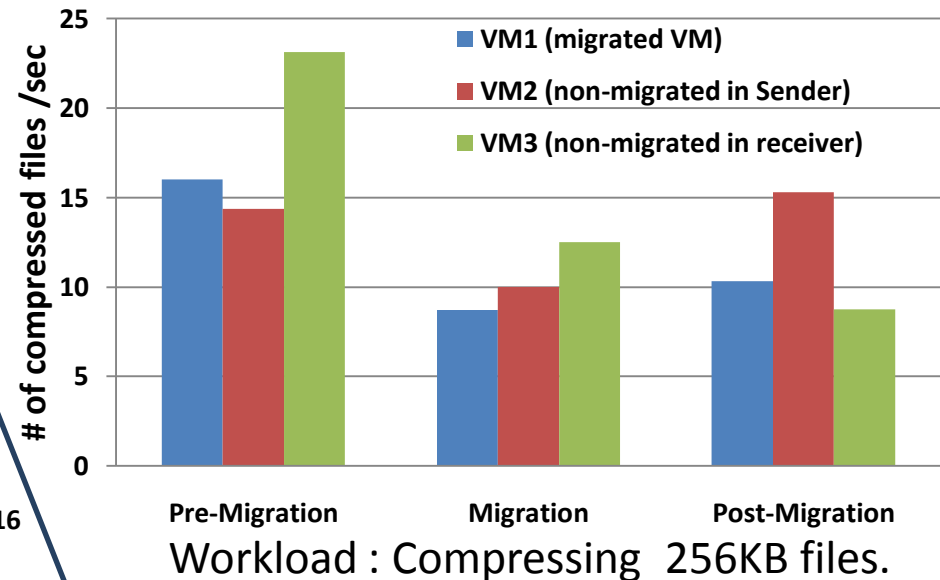
# Cost of VM Migration

When a set of VM migrates, how do we minimize  $T$  while bounding  $\beta$ ?

## Total Migration Time $T$



## Performance Impact $\beta$



Migration policy decides total migration time

Migration impacts performance

Slightly faster than ten sequential migrations (30.9sec < 10x3.1 sec, 22.8 sec < 10x2.6sec), but with greater performance impact



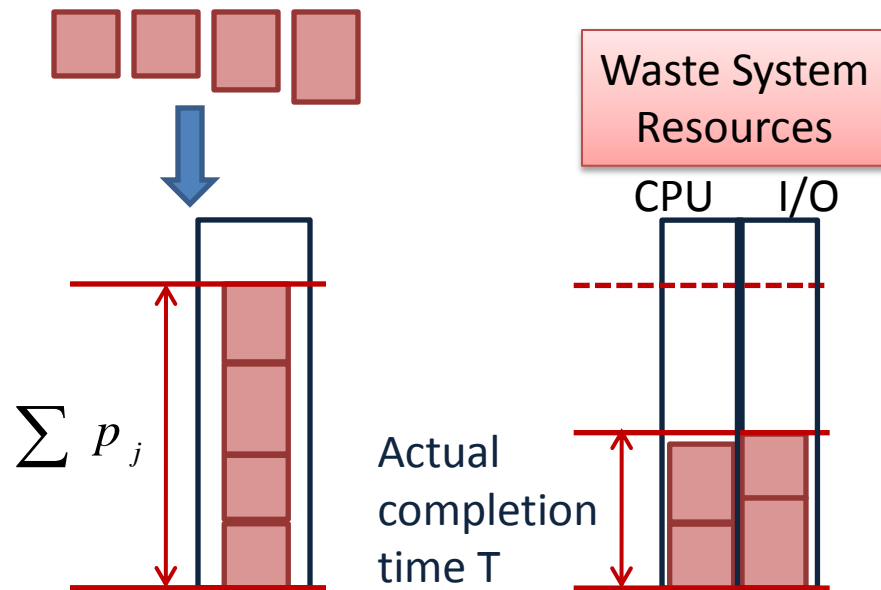
Minimizing time  $T$  while bounding performance variation  $\beta$

Desired is an accurate estimator of  $T$  and  $\beta$   
when **multiple jobs** contend for **multiple resources** \*

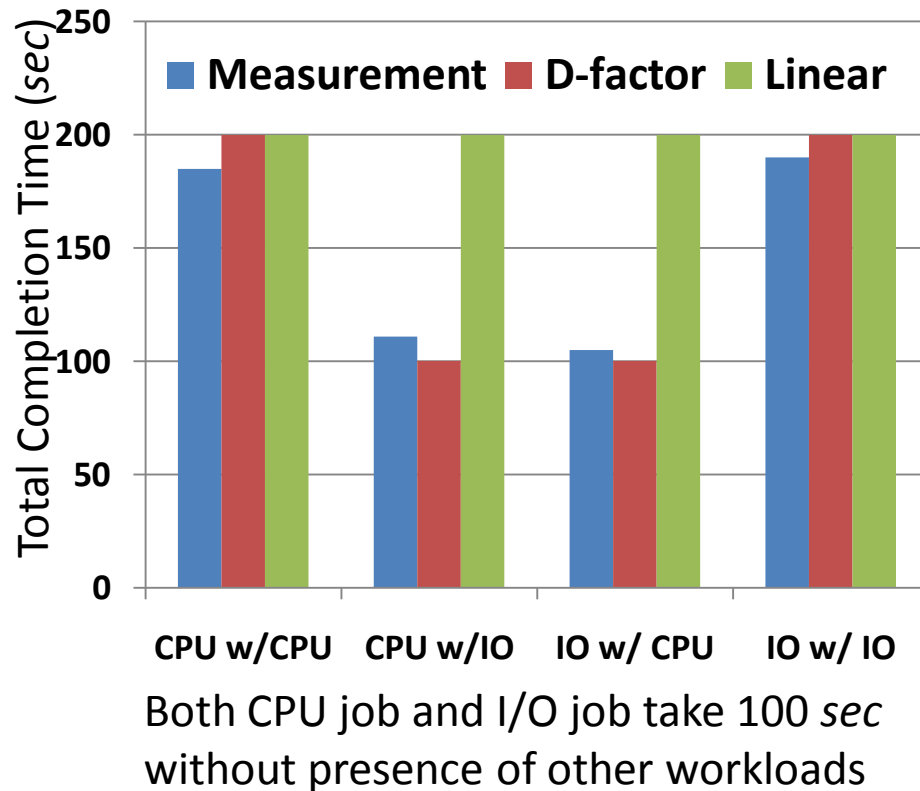
\*A generic model for  $n$  job and  $m$  resources has been developed.

# Performance of Shared Systems with Multiple Resources

Total completion time may *not* be linear to individual completion times



Bin packing or scheduling algorithms use *linear* relation



# Estimating Completion Time $T$

Assume *two* 2-resource-busy jobs

with their loading vectors, access *probability* of each resource,  $\mathbf{p}_i = (p_i, 1-p_i)^*$ .

Then, expanded completion time  $T$  of each job is given by

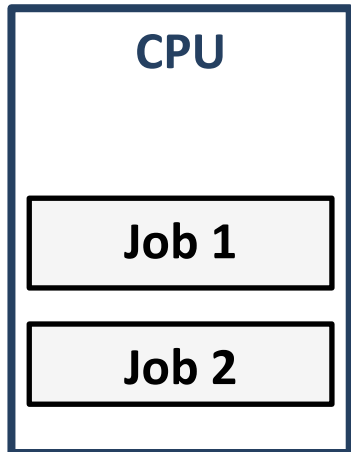
Without  
other jobs

$$T_1 = \tau_1 (1 + p_1 p_2 + (1 - p_1)(1 - p_2)) \leq \tau_1 + \tau_2$$

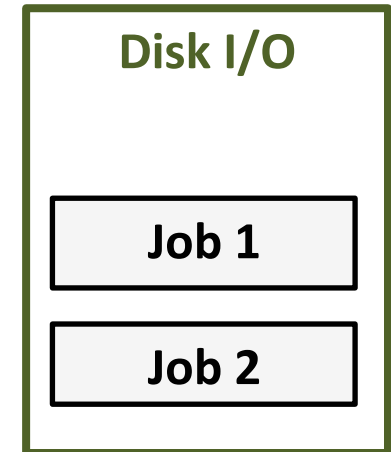
$$T_2 = \tau_2 (1 + p_1 p_2 + (1 - p_1)(1 - p_2)) \leq \tau_1 + \tau_2$$

Linear  
estimation

From original  
completion time



OR

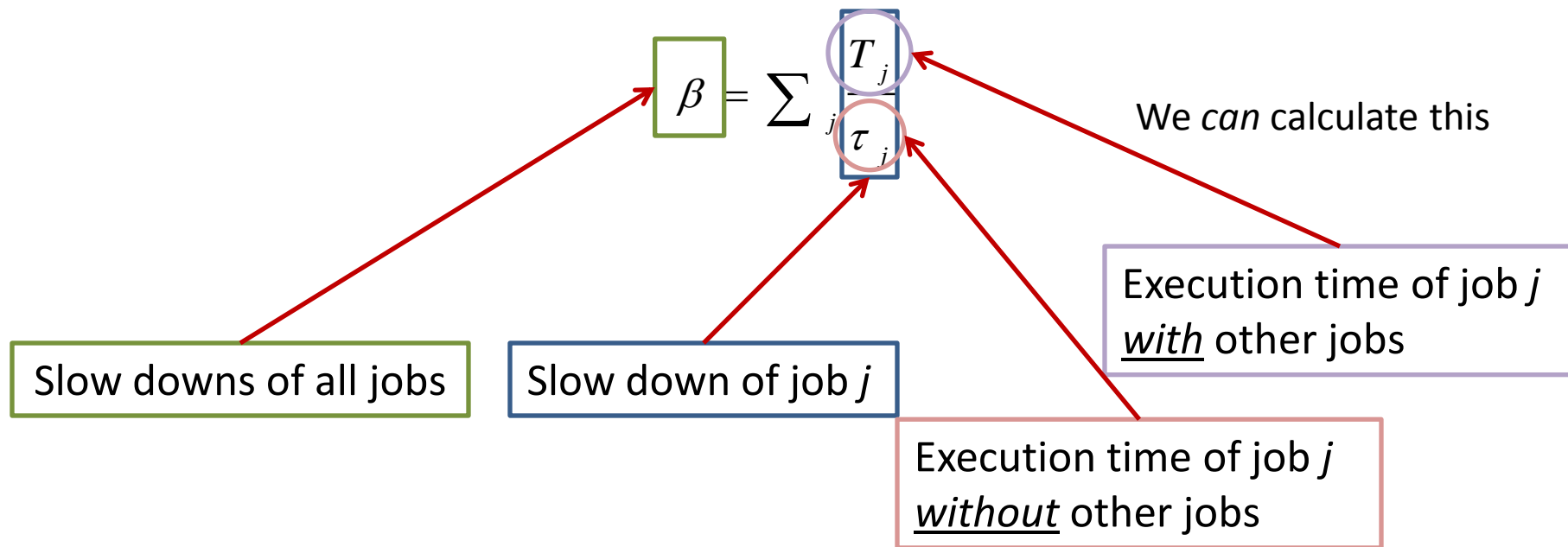


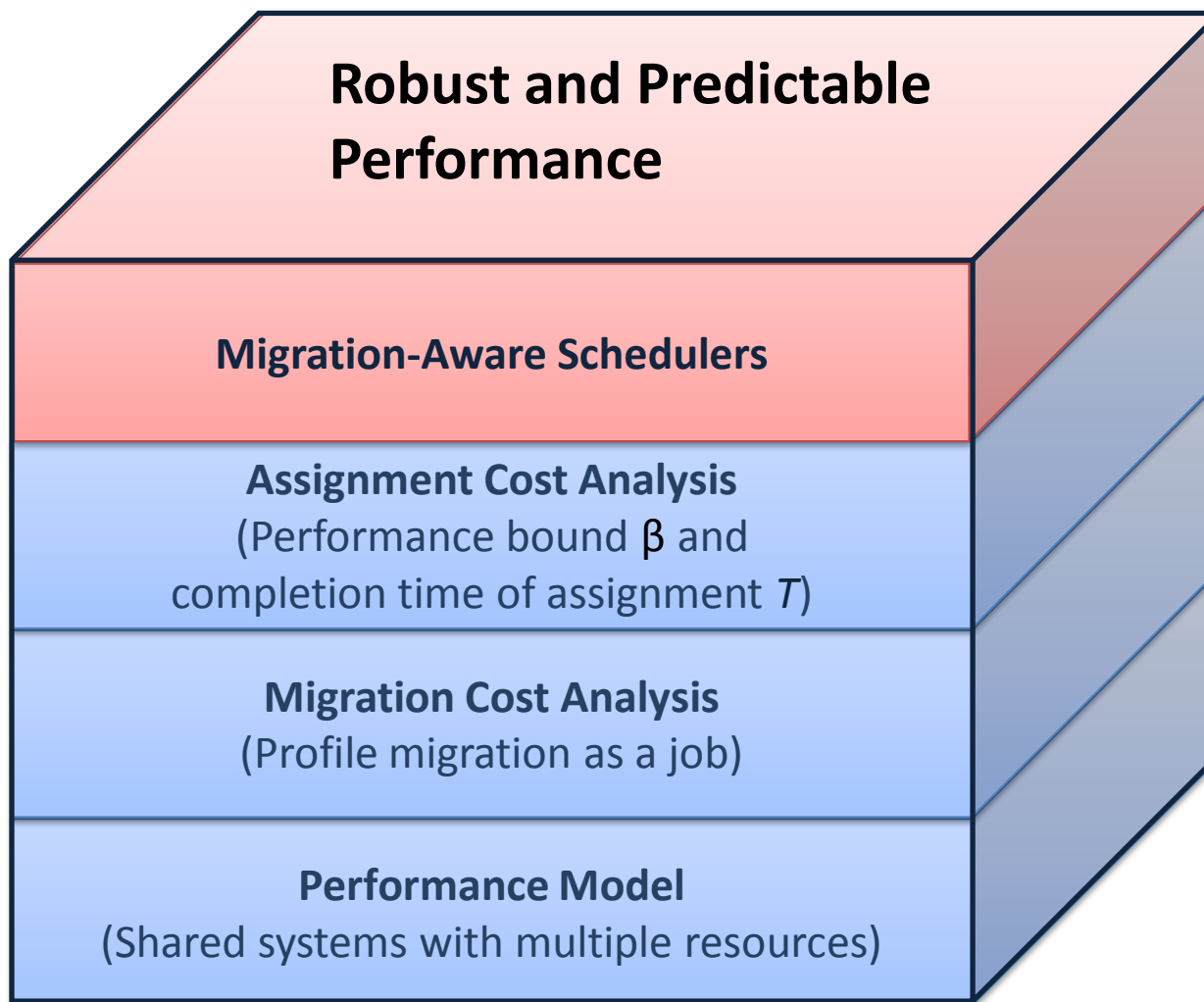
\*Without resource monitoring, loading vectors can be constructed (Algorithm 1)

# Estimating Performance Variation $\beta$

Consider slow-down of jobs in the system as the performance variation

Given  $\tau_j$ , define performance impact  $\beta$  by





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**THANK YOU**

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