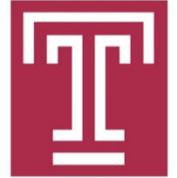




# Migration-based Virtual Machine Placement in Cloud Systems

Kangkang Li, Huanyang Zheng, and Jie Wu

Temple University, Philadelphia, PA, USA



# Outline

**1. Introduction**

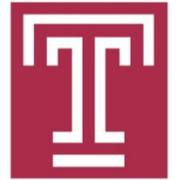
**2. Off-line VM placement**

**3. On-line VM placement**

**4. A Hybrid scheme**

**5. Simulation**

**6. Conclusion**



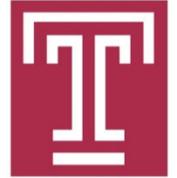
# Introduction



Virtual Machine Placement (VMP)



Motivational Example



## Virtual Machine Placement (VMP)

- Heterogeneity of VMs
  - different resource demands
  - different running jobs
- Different VMs running on the same PM can have different job completion times.

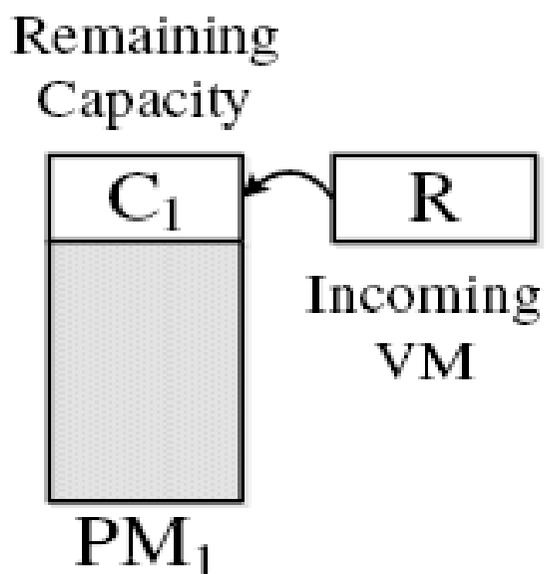


## Virtual Machine Placement (VMP)

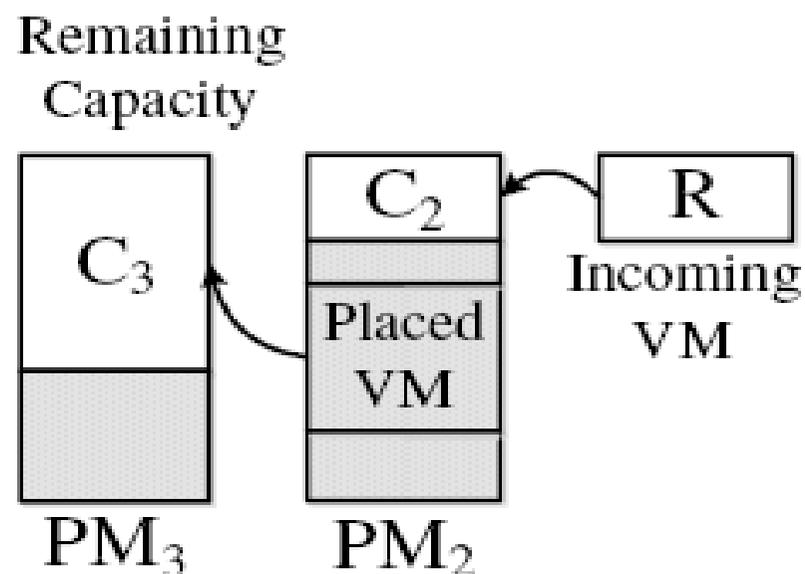
- Heterogeneity of PMs
  - different CPU architectures
  - different OSes
  - differing amounts of memory, etc.
- The same VM placed on different PMs will have different completion times.
- VM placement can be reduced to a knapsack problem, which is NP-hard.



## Motivational Example



(a) Direct placement

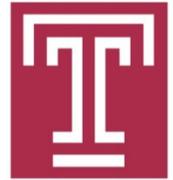


(b) Migration-based placement



## Off-line Migration-based Virtual Machine Placement Algorithm

- Completion time increase:
- Since the completion time of the same VM on a different PM host varies, for the migrated VM, there might be an increase in completion time increase, due to the host changing.
- Migration constraint:
- Even with the increased completion time of the migrated VM, the migration-based VM placement is still better than direct placement at minimizing the total completion time



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# Problem Definition

- **Input:**

Given a cloud system with  $N$  PMs, we have a set of  $M$  incoming VMs to be placed.

- **Objective:**

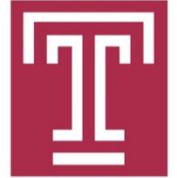
Minimize the total completion time of the input VMs.

TABLE I  
NOTATIONS

Notation	Description
$VM_i$	The $i^{th}$ VM
$PM_j$	The $j^{th}$ PM
$R_i$	The resource demand of $VM_i$
$C_j$	The remaining capacity of $PM_j$
$x_{ij}$	$\{0,1\}$ variable indicates whether $VM_i$ is placed into $PM_j$
$t_{ij}$	The job completion time of $VM_i$ in $PM_j$

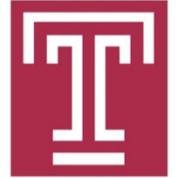
$$\text{Minimize } \sum_{i=1}^M \sum_{j=1}^N x_{ij} t_{ij}$$

$$\text{S.T. } \sum_{j=1}^N x_{ij} \leq 1, \sum_{i=1}^M x_{ij} R_i \leq C_j, x_{ij} \in \{0, 1\}$$



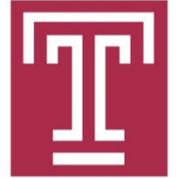
## Off-line Migration-based Virtual Machine Placement Algorithm

- Direct Placement:
- Among those PMs which have enough resources to accept the incoming VM, we select the one with the minimal completion time.
- (emulated) Migration-based placement:
- We try to migrate one VM placed on the optimal PM to another host to make space to accept the incoming VM. In the off-line scenario, the migration process is emulated. Therefore, we call it (emulated) Migration-based Placement.



## Off-line Migration-based Virtual Machine Placement Algorithm

- Determination of a qualified victim VM
- Can save enough resources for accepting a new VM
- Can find a new available host with enough current capacity to accept the new VM
- With the increased completion time of the migrated victim VM, the completion time by migrated-based placement is less than that of direct placement (migration constraint is satisfied)



# Off-line Migration-based Virtual Machine Placement Algorithm

## Special Cases:

- We cannot find a qualified victim VM on the mincompletion time PM. We then try to place the incoming VM in the next-min-completion time PM. If the incoming VM still cannot be placed, we continue to try the next-next-min-completion time PM. The search process is minated when the incoming VM is placed, or encounters the best available PM found by Direct Placement.
- After trying all the PMs, and if the incoming VM is still not placed, we have no choice but to reject it.



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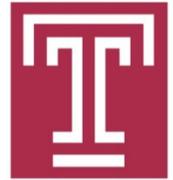
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# On-line Virtual Machine Placement



Major difference compared to the off-line scenario:

- The information of incoming VMs are unknown to us.
- Migration is actually implemented, which introduces delay in transferring the migrated VM image.
- An extra migration overhead is added to the migration constraint
- Migration overhead is proportional to the size of the migrated VM. Larger VMs need more time to transfer.



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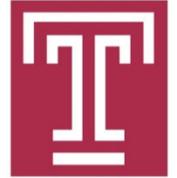
2. Off-line VM placement

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# A Hybrid Scheme

## Motivation:

- On-line migration delay causes too much overhead in the total completion time.
- There is NO migration overhead in the off-line scenario.

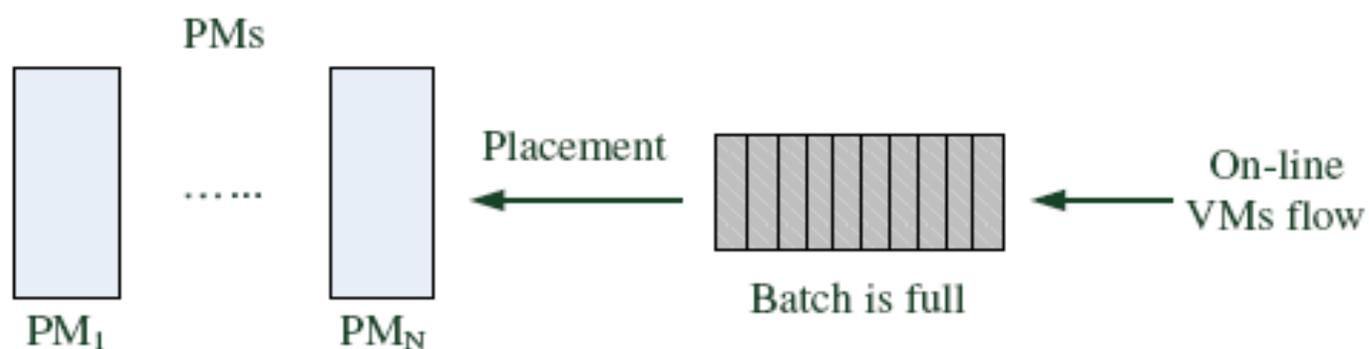
## Solution:

- Reserve a batch to store the on-line VM requests
- The information of reserved VMs are known to us, enabling us to place these VMs as in the off-line scenario, and avoiding the migration overhead.

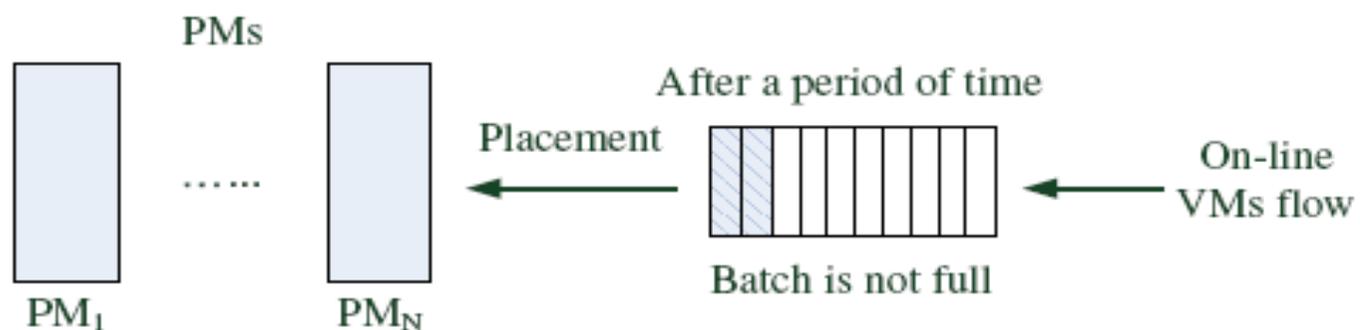


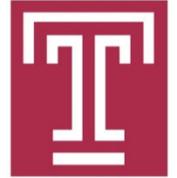
## Two batch models

Provider-oriented:



User-oriented:





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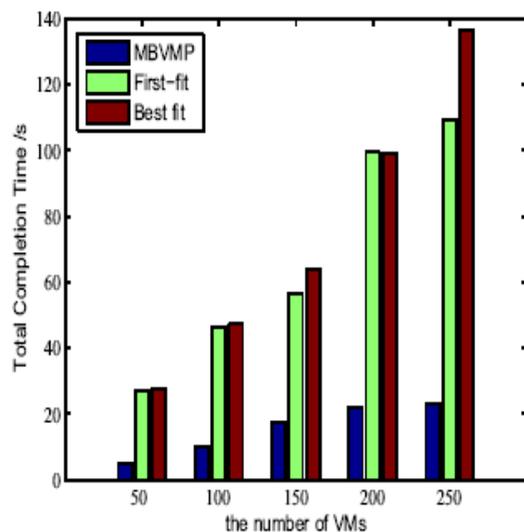
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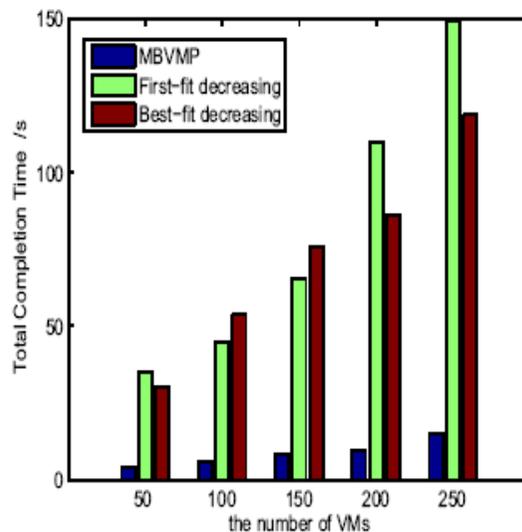
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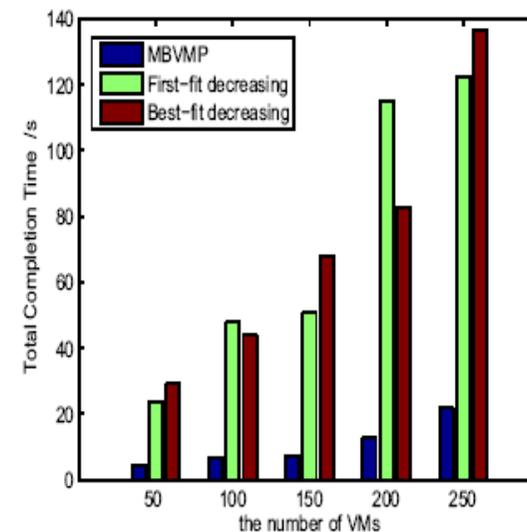
# Simulations



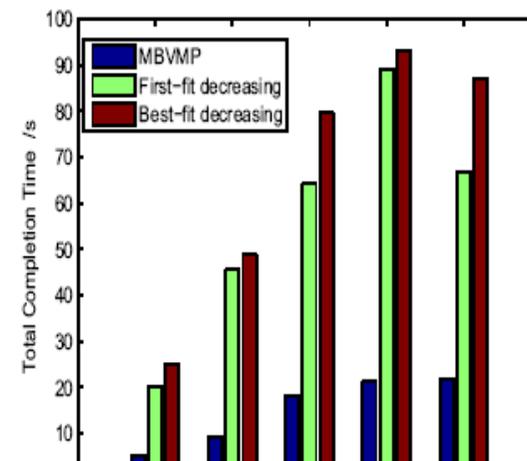
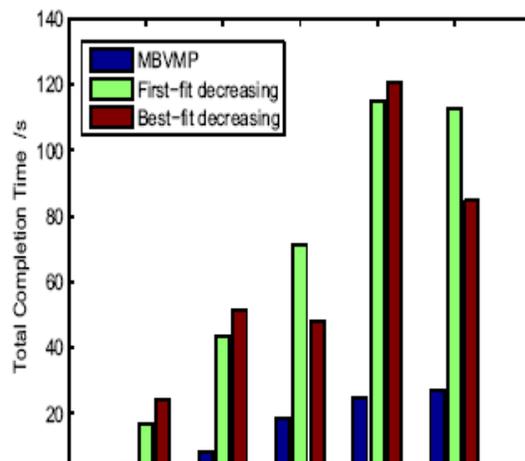
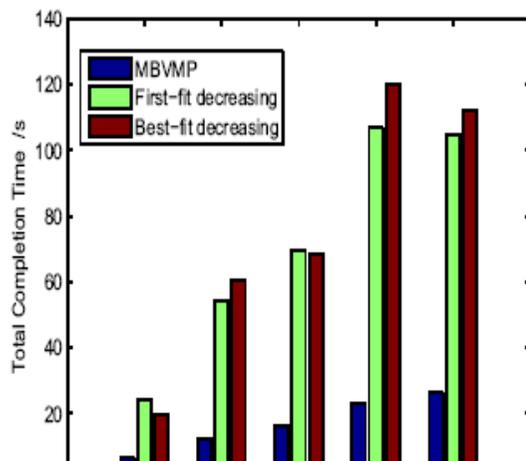
(a) Number of PMs: N=100



(b) Number of PMs: N=150

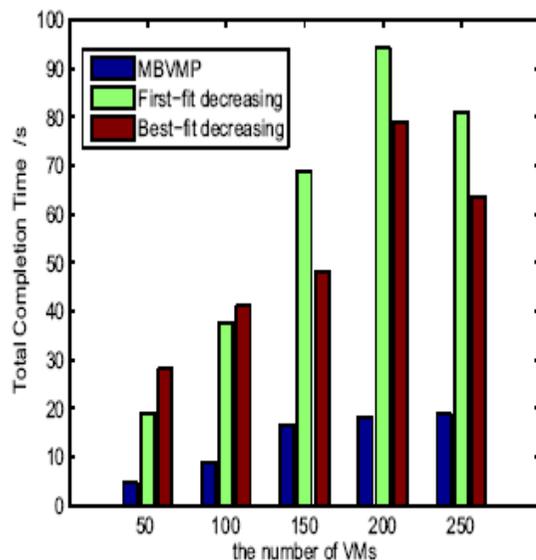


(c) Number of PMs: N=200

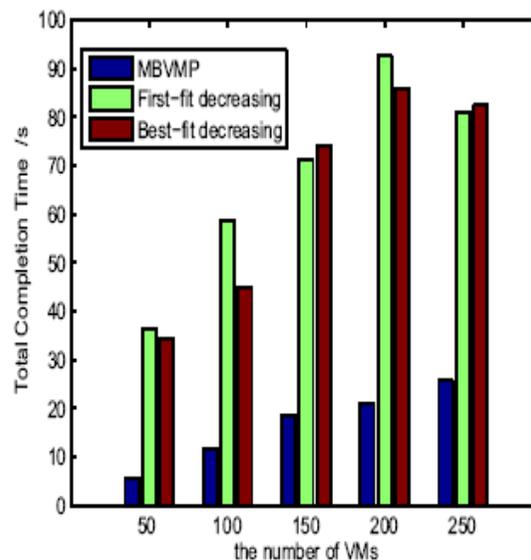




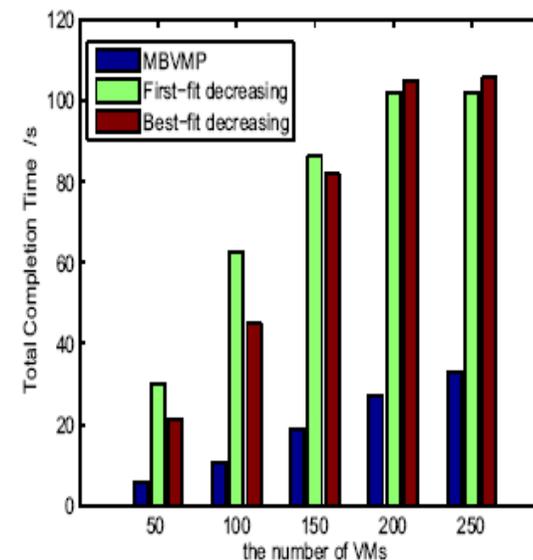
# Simulations



(a) variance of PMs' capacity:[50,150]



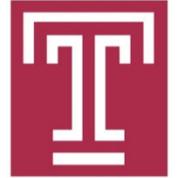
(b) variance of PMs' capacity:[100,150]



(c) variance of PMs' capacity:[150,150]

## PERFORMANCE COMPARISON FOR ON-LINE SCENARIO

Total Completion Time /s	Number of PMs			Coefficient of Migration Cost			Variance of PMs' Capacity		
	100	150	200	0.1	1	10	[10,50]	[10,100]	[10,150]
MBVMP	52.4475	55.2926	83.9606	56.1748	58.3576	53.1326	51.2983	53.9628	52.8962
First-fit	140.7237	214.7462	265.3581	150.1385	254.9847	284.9215	147.4251	221.2317	251.1223
Best-fit	130.2293	206.0019	233.3534	127.9724	215.9011	201.1946	125.9402	237.7812	263.9472



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# Conclusions

- A Migration-based Virtual Machine Placement Algorithm is proposed for minimizing the total completion time of the input VMs.
- Both off-line and on-line scenarios are considered.
- We study the hybrid scheme of integrating off-line placement into an on-line scenario, and propose two batch models considering users and providers separately.
- Experiments and simulations verify the strength of our approach.



Thank you!

Questions?

kang.kang.li@temple.edu