



# DYNAMIC RESOURCE PRICING ON FEDERATED CLOUDS

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[Marian Mihailescu](#)  
Yong Meng Teo

Department of Computer Science  
National University of Singapore

# Overview



- Introduction
- Resource pricing and cloud computing
- Impact of dynamic pricing
  - ▣ Proposed dynamic scheme
  - ▣ User welfare and allocation efficiency with dynamic pricing
- Conclusions and remarks

# Introduction

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- Large-scale sharing of computing resources
  - ▣ Peer-to-peer, grid, cloud computing
- Users are rational
  - ▣ Self-interested parties, which can devise strategies and manipulate the system to maximize their benefit
- Market-based models used for resource allocation
  - ▣ Efficiency is user-centric: Pareto efficiency
  - ▣ Strategy-proof: users are incentivized for being truthful

# Resource pricing

- *Pricing is the process of computing the exchange value of resources using a common form of currency*

- Pricing enables financial incentives for rational users:

$$\text{payments} = \text{price} + \text{incentives}$$

- Challenges in resource pricing

- Computational

- Efficient algorithms are NP-complete, not scalable

- Economic

- Myerson-Satterthwaite theorem: *No mechanism is efficient, budget-balance and incentive-compatible at the same time*

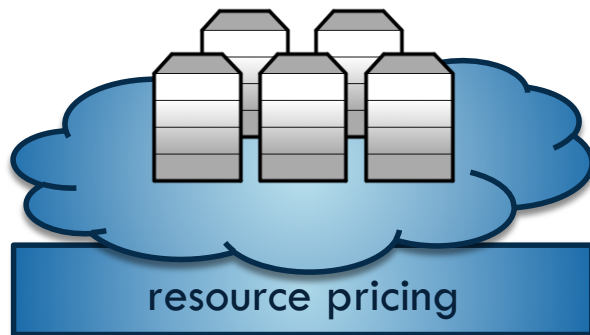
# Example: pricing on Amazon EC2

- On-demand instances
  - ▣ Hourly flat rate (e.g. small instance = \$0.085/h)
- Reserved instances
  - ▣ Hourly flat rate + one-time-fee  
(e.g. small instance = \$0.03 + \$0.013\* = \$0.043/h)
- Spot instances (dec 2009)
  - ▣ Load-based **dynamic** rate  
(e.g. small instance = \$0.028 - \$0.095 dec09 – may10)
  - ▣ Spot pricing is **not** market-based pricing

\*) 3 years reservation

# Motivation

## Standalone clouds

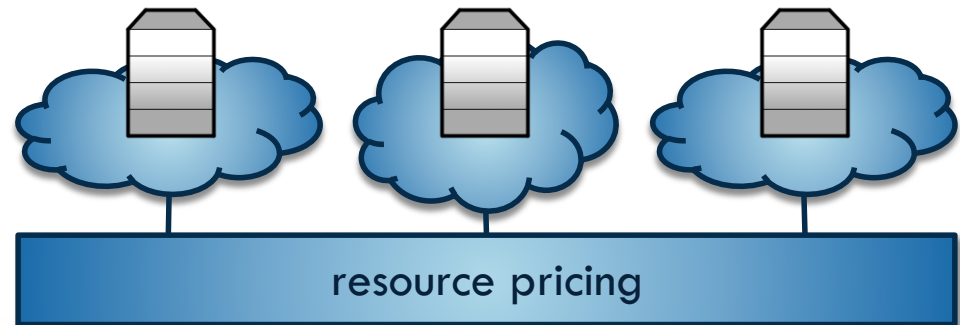


resource price  
set by the  
provider

users cannot  
behave  
rational



## Federated clouds



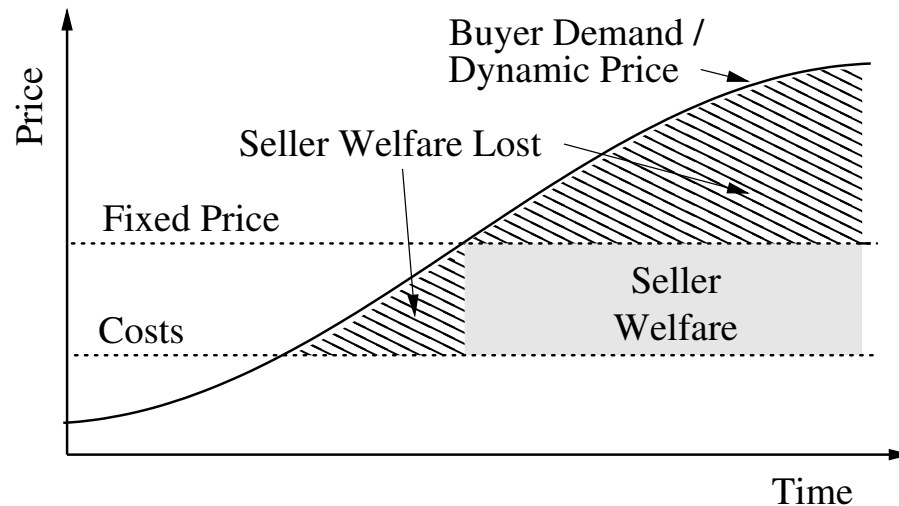
*dynamic*  
resource price  
set by demand  
and supply

users  
behave  
rational



# Motivation (cont.)

- Fixed pricing limits provider (seller) welfare



load-based pricing is not sufficient without a market mechanism

- Provide financial incentives for rational users

# Performance study

- Economic efficiency measures the aggregate buyer and seller welfare
- Metrics
  - ▣ average buyer and seller welfare
  - ▣ number of successful buyer requests
  - ▣ number of allocated seller resources
- Truthful users
  - ▣ prices generated from a uniform distribution



# Proposed dynamic pricing scheme [ICPP09]

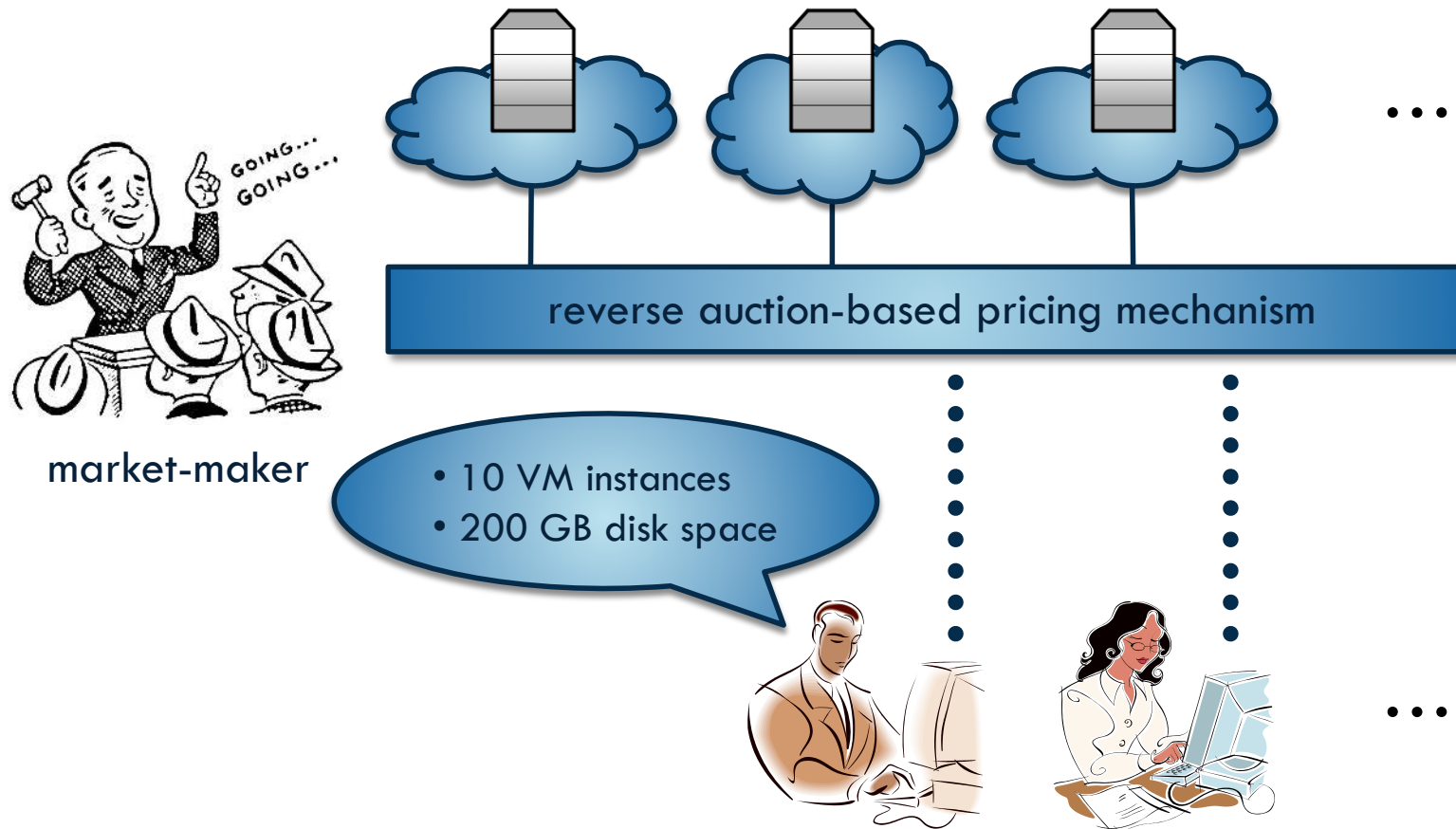
## □ Payment functions

$$p_s = \begin{cases} 0, & \text{if seller } s \text{ does not contribute with} \\ & \text{resources to satisfy the request} \\ c_{M|s=\infty} - c_{M|s=0} & \text{if seller } s \text{ contributes with} \\ & \text{resources to satisfy the request} \end{cases} \quad p_b = - \sum_{s \in S} p_s$$

## □ Properties

- **Economic**
  - Strategy-proof
  - Budget balance
  - Multiple resource type allocations
- **Computational**
  - Low algorithm complexity

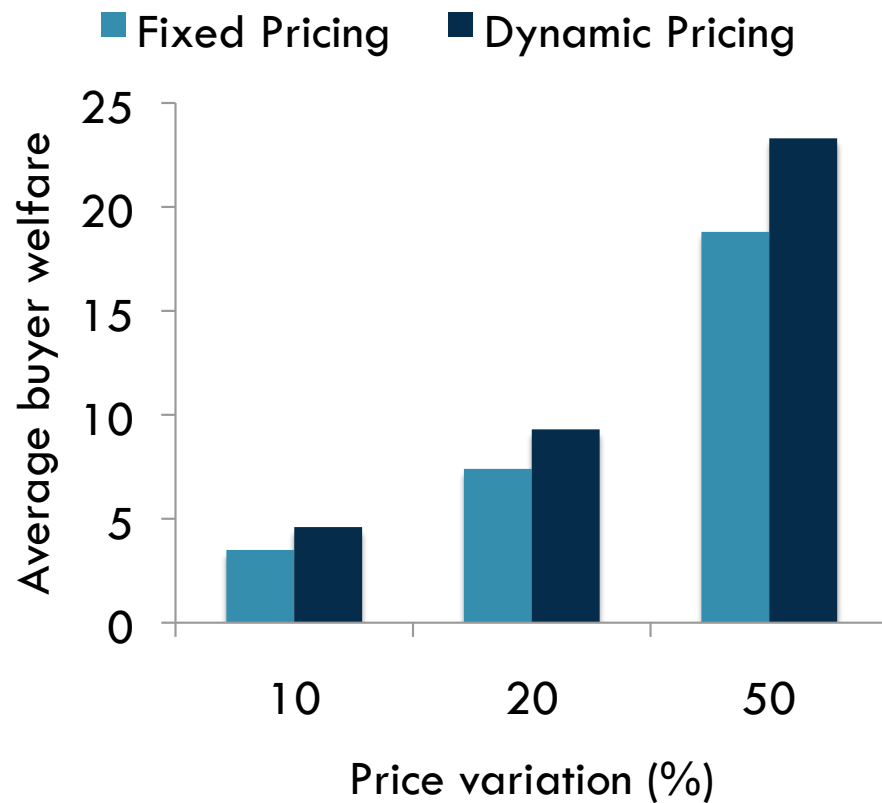
# Proposed dynamic pricing scheme (cont.)



# Experimental setup

- Pricing schemes implemented on top of FreePastry, open-source DHT overlay (simulator)
  - ▣ 10,000 nodes
  - ▣ 600,000 events, 1s inter-arrival rate
- Nodes act as providers (sellers) and users (buyers)
  - ▣ Requests of multiple resource types
- One node acts as (centralized) market-maker

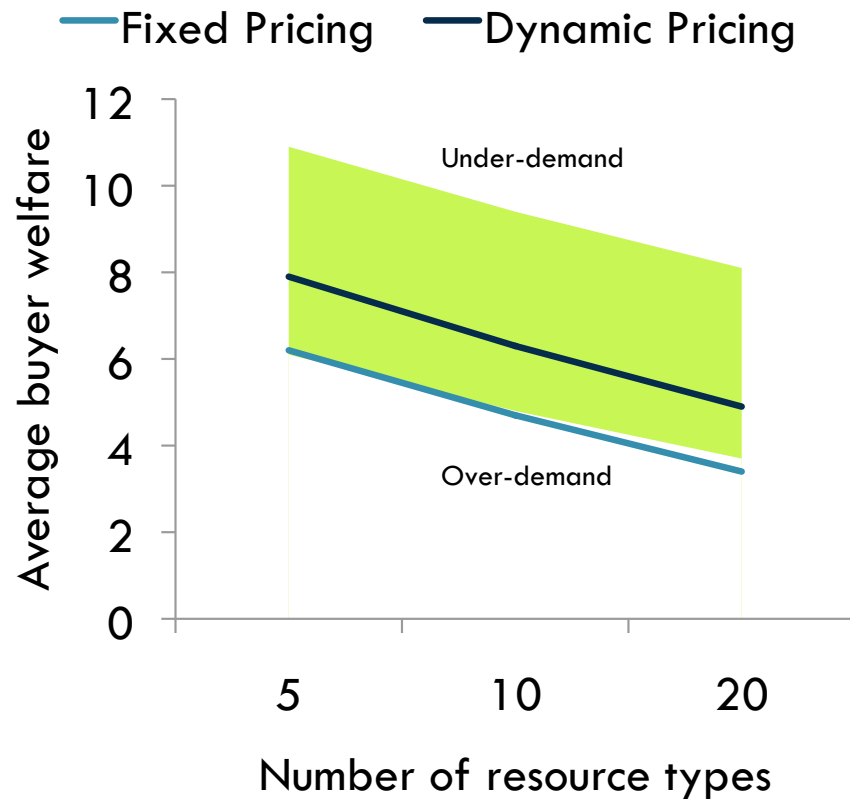
# Impact of dynamic pricing



## Average buyer welfare

- Balanced market (demand = supply)
- Price variation 10%, 20%, 50%
- avg. 10% increase

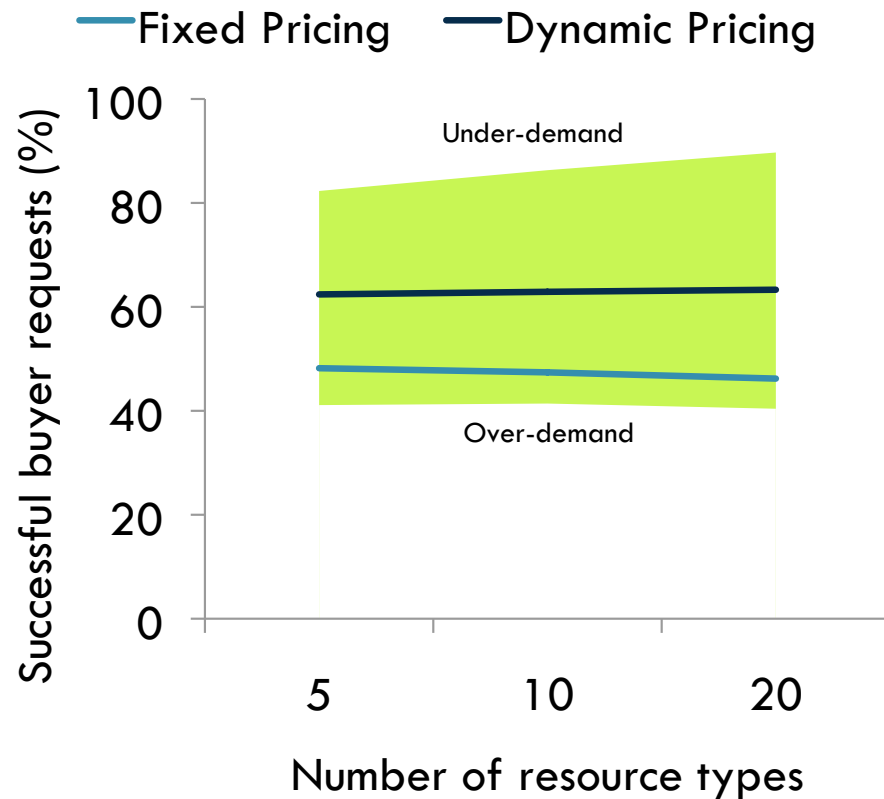
# Impact of dynamic pricing



## Average buyer welfare

- Up to 25% increase when demand is low
- Up to 10% increase for a balanced market
- User welfare decreases slower when the number of resource types increases

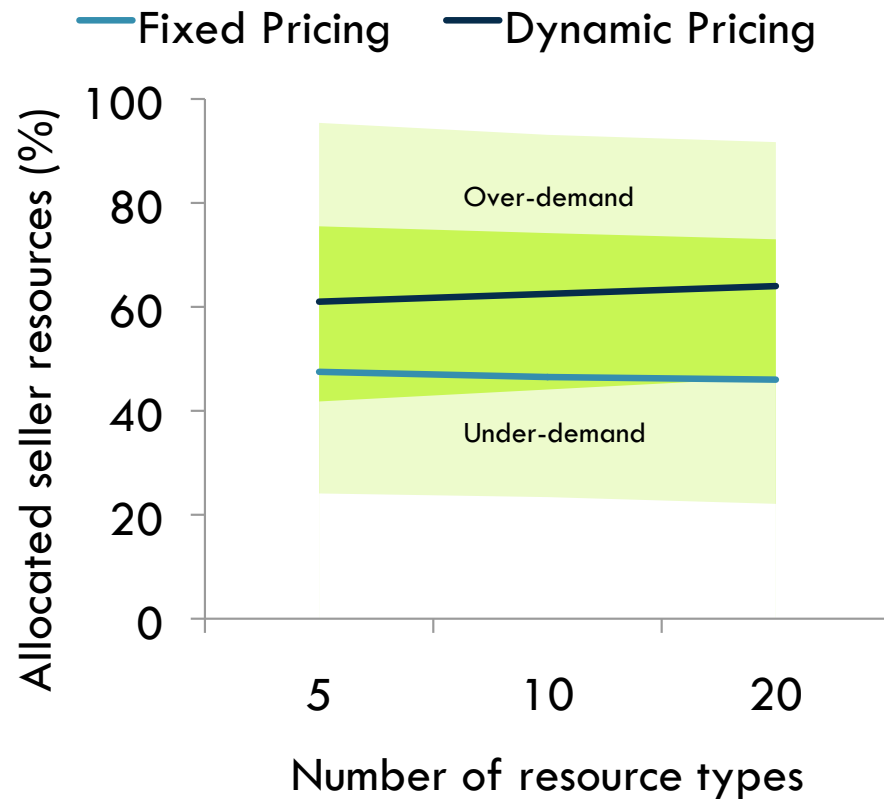
# Impact of dynamic pricing



## Successful buyer requests

- Up to 90% increase when demand is low
- Up to 20% increase in a balanced market
- Number of successful buyer requests is increased when the number of resource types in a request grows

# Impact of dynamic pricing



## Allocated seller resources

- More than 20% increase when demand is low
- Up to 20% increase in a balanced market
- Number of allocated seller resources is increased when the number of resource types in a request grows

# Conclusions and remarks

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- Dynamic pricing is more suitable than fixed pricing for federated clouds
  - ▣ Dynamic pricing offer incentives to users and providers
  - ▣ User and provider welfare is increased
  - ▣ Successful number of requests and number of allocated resources are increased
- Scalability of pricing algorithms can still be improved
  - ▣ Distributed pricing mechanisms



Thank you!

Q & A

Contact: [marianmi@comp.nus.edu.sg](mailto:marianmi@comp.nus.edu.sg)