

# Cost-Time Performance of Scaling Applications on the Cloud

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INTERNATIONAL  
CONFERENCE ON  
PARALLEL  
PROCESSING

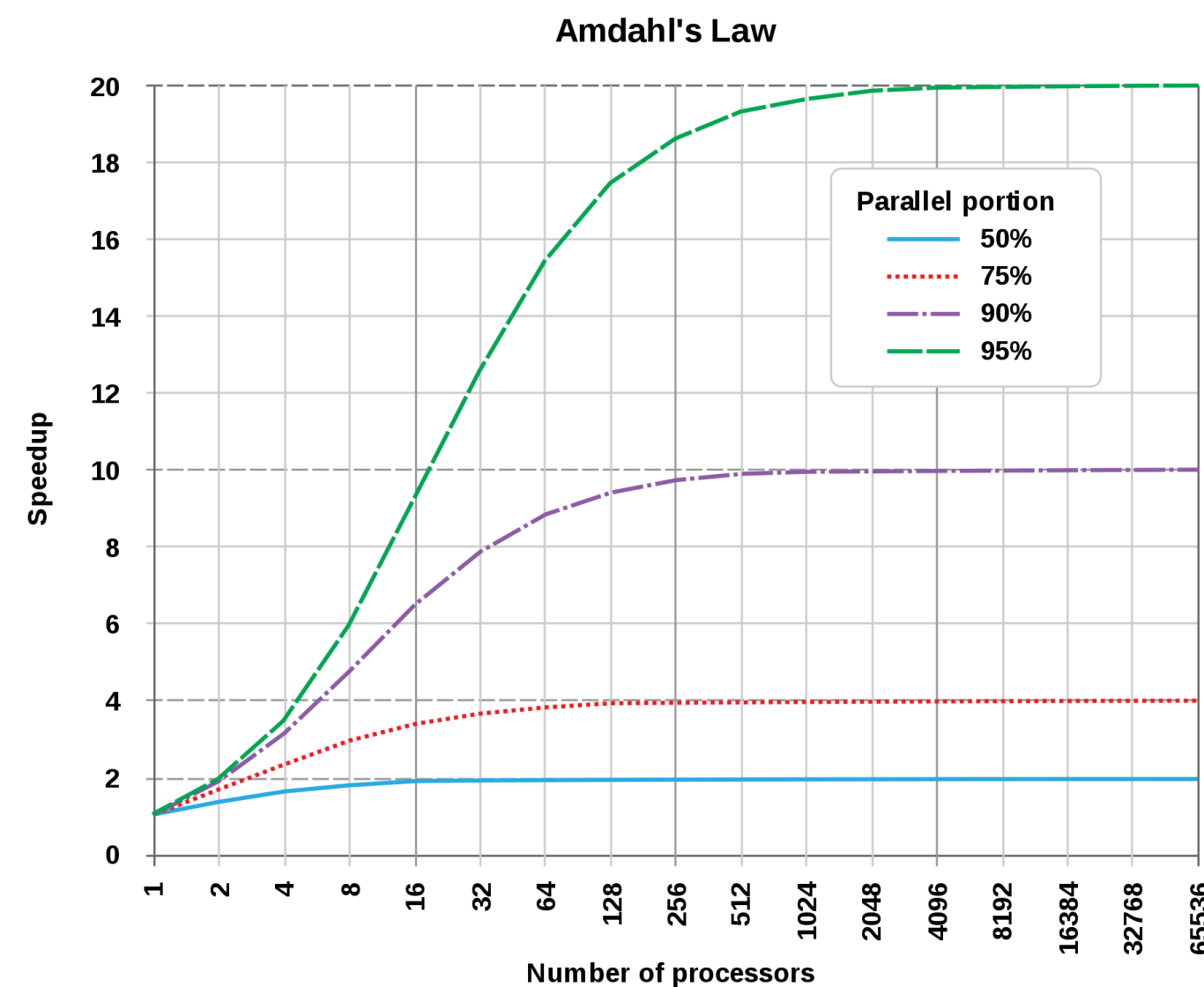
## 1 Motivation

scaling in  
parallel computing

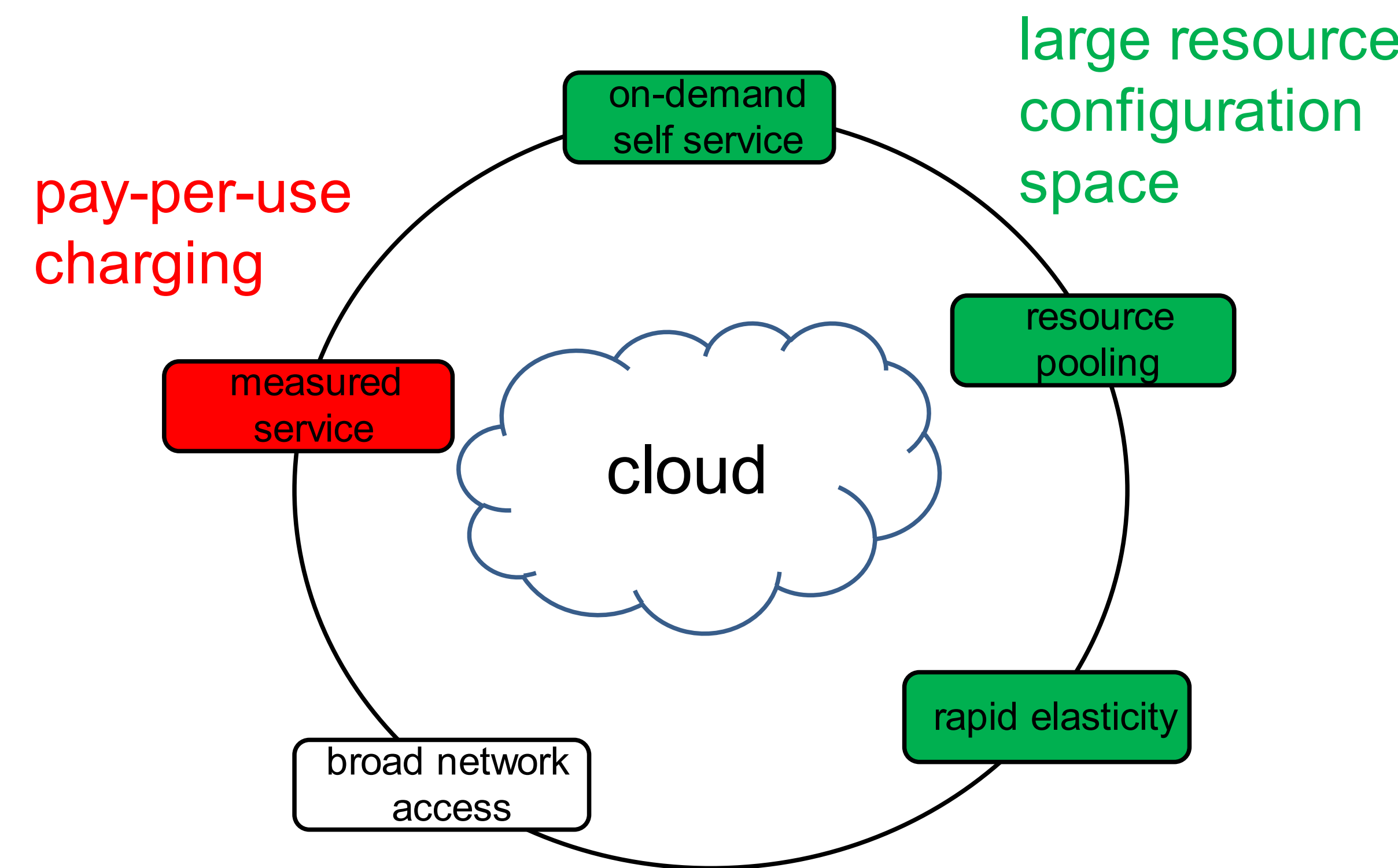
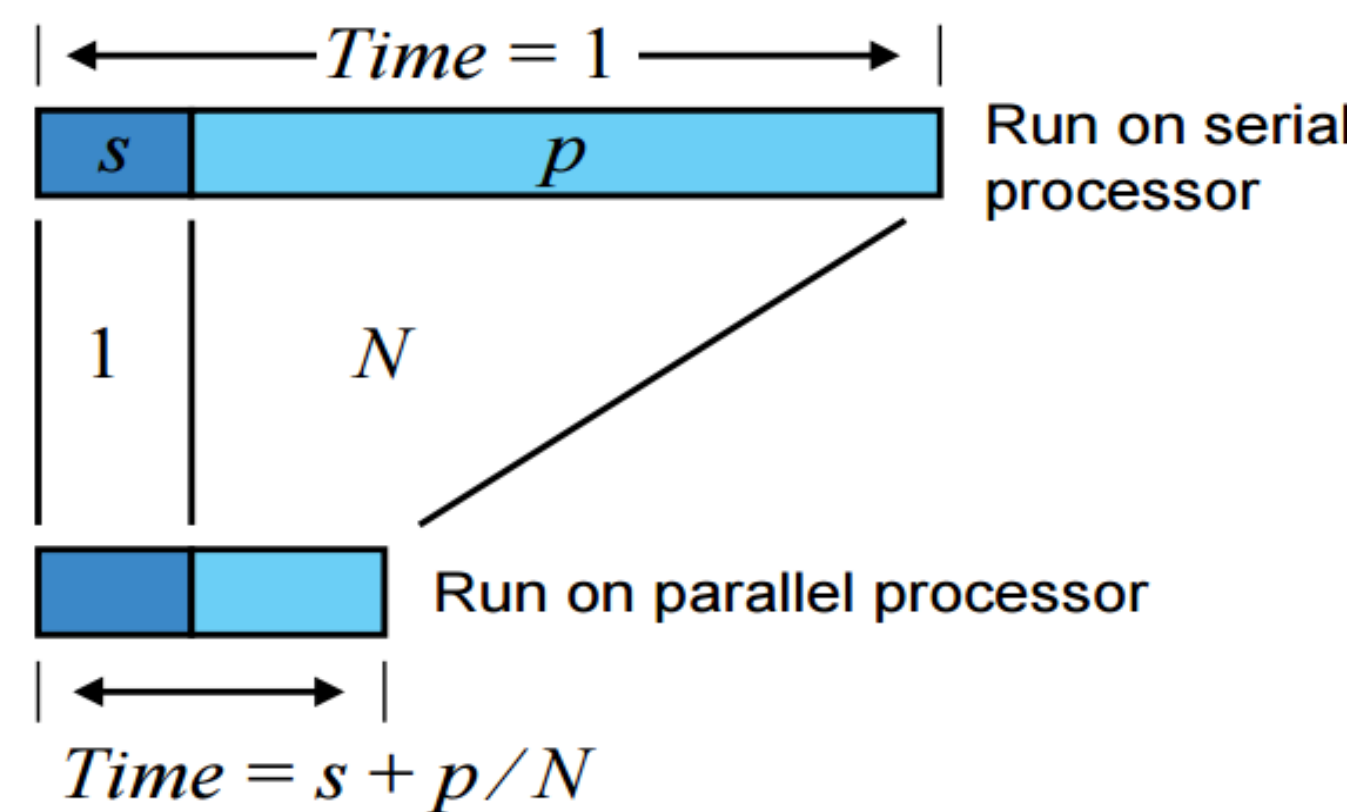
fixed-workload  
(Amdahl's law)

limited by resources

fixed-time  
(Gustafson's law)

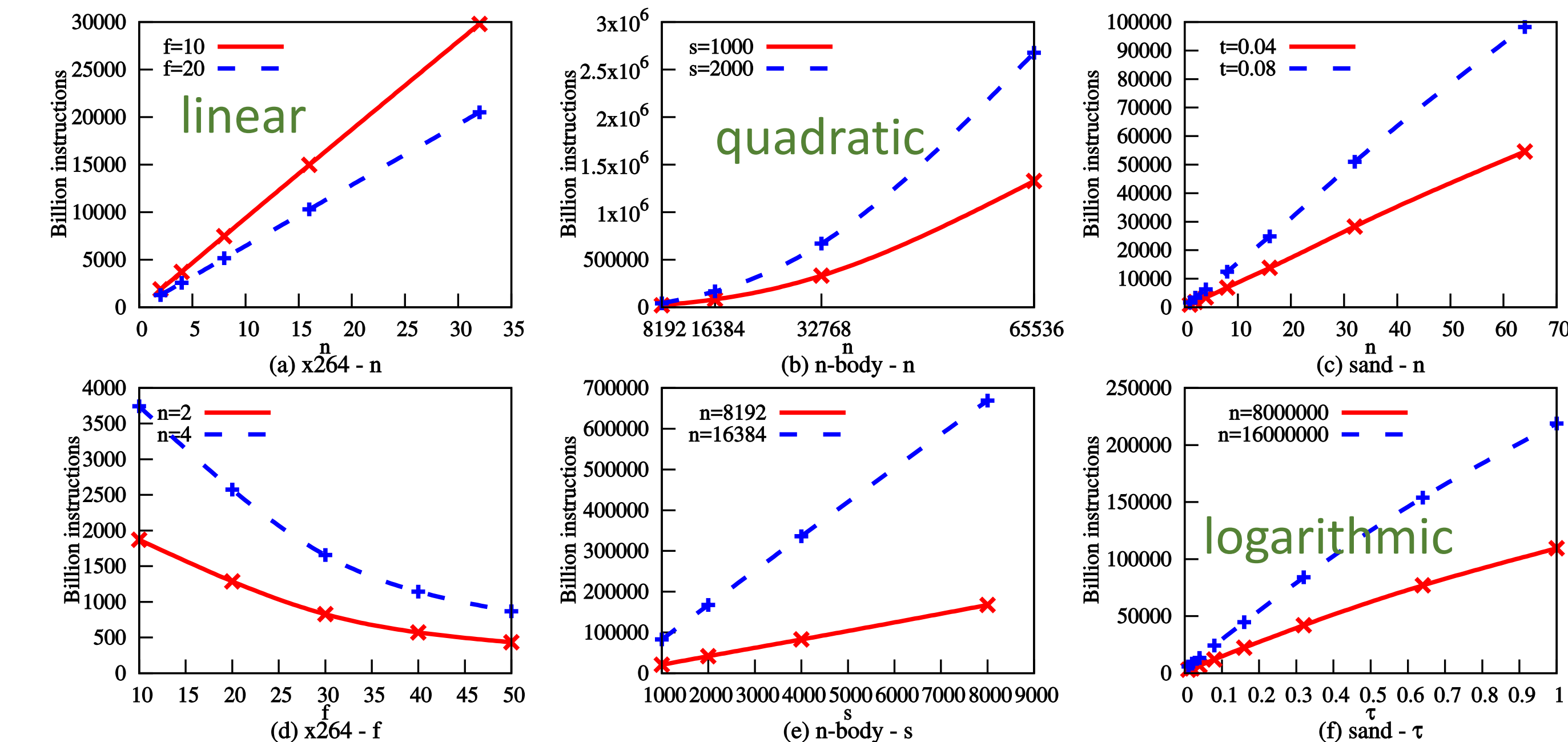


J. L. Gustafson, Reevaluating Amdahl's Law, Communications of the ACM, 31(5):532-533, 1988.

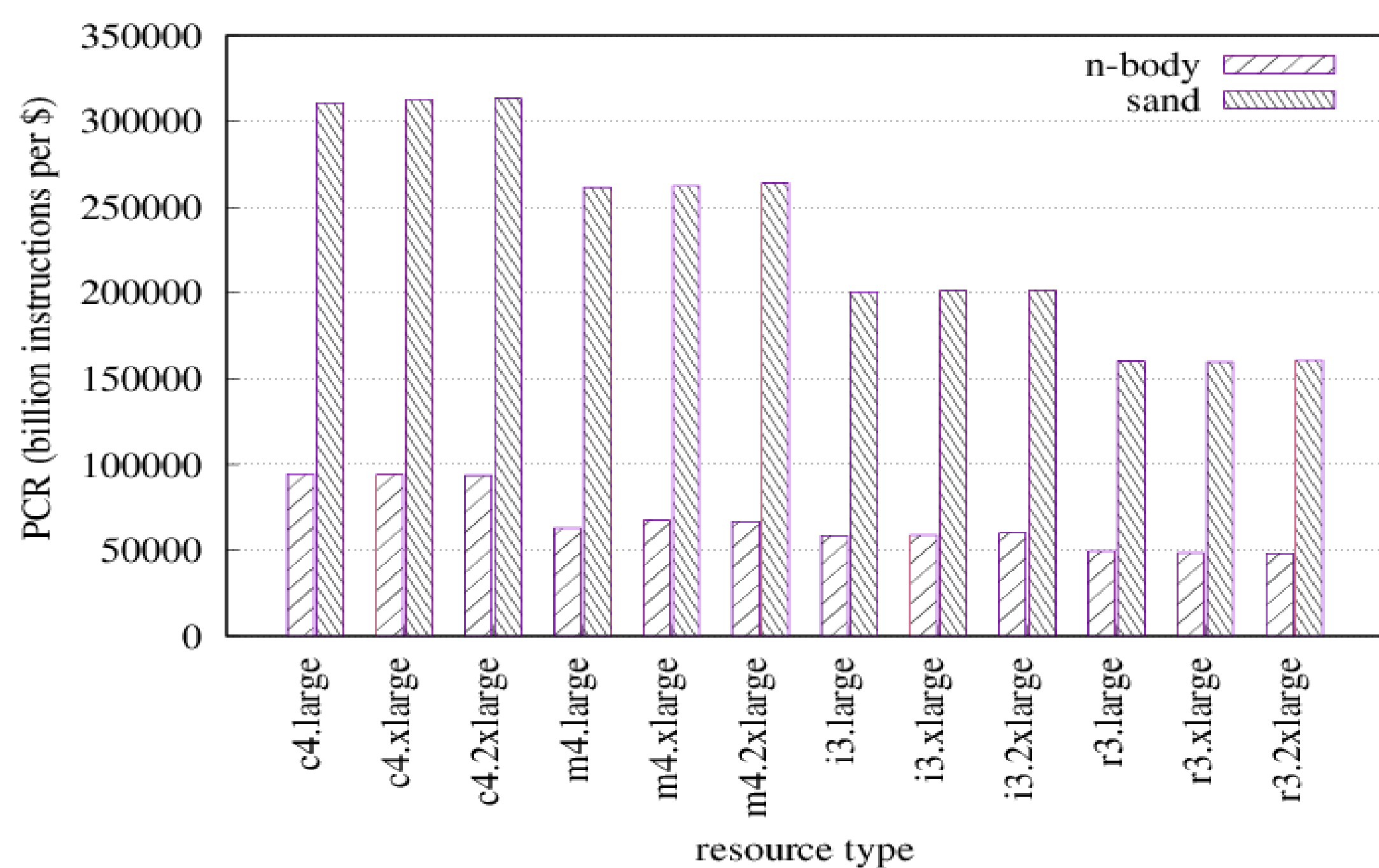


On Cloud, application scalability is limited only by the **cost budget**!

application resource demand scale differently



S. Rathnayake, D. Lohin, Y. M. Teo, CELIA: Cost-time Performance of Elastic Applications on Cloud, Proc. of 46th International Conference on Parallel Processing, pages 342-351, 2017.



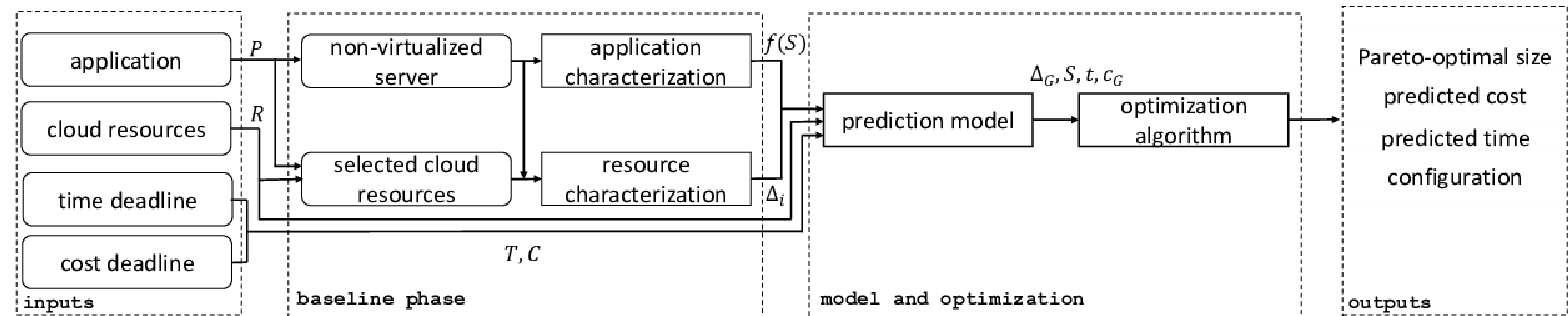
cloud resources  
have different **cost**  
and **performance**  
e.g. Amazon EC2

## 2 Approach

measurement-driven analytical modeling approach

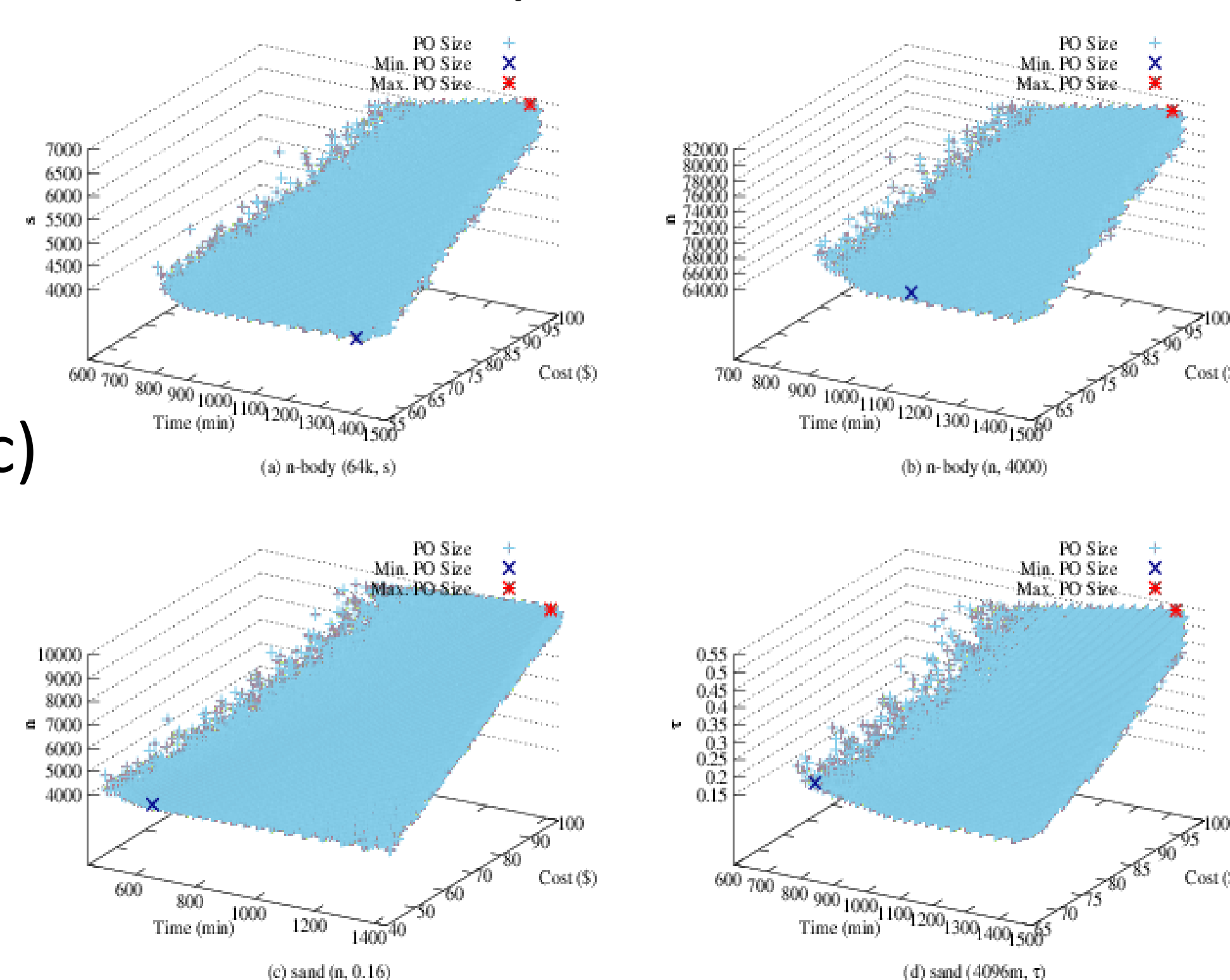
$$PCR = \frac{\text{instruction execution rate}}{\text{cost per unit time}}$$

application demand  $\rightarrow$  number of instructions  
resource capacity  $\rightarrow$  instruction execution rate



## 3 Evaluation

Pareto Optimal Problem Size



Observation 1:

Multiple Pareto-optimal problem sizes.

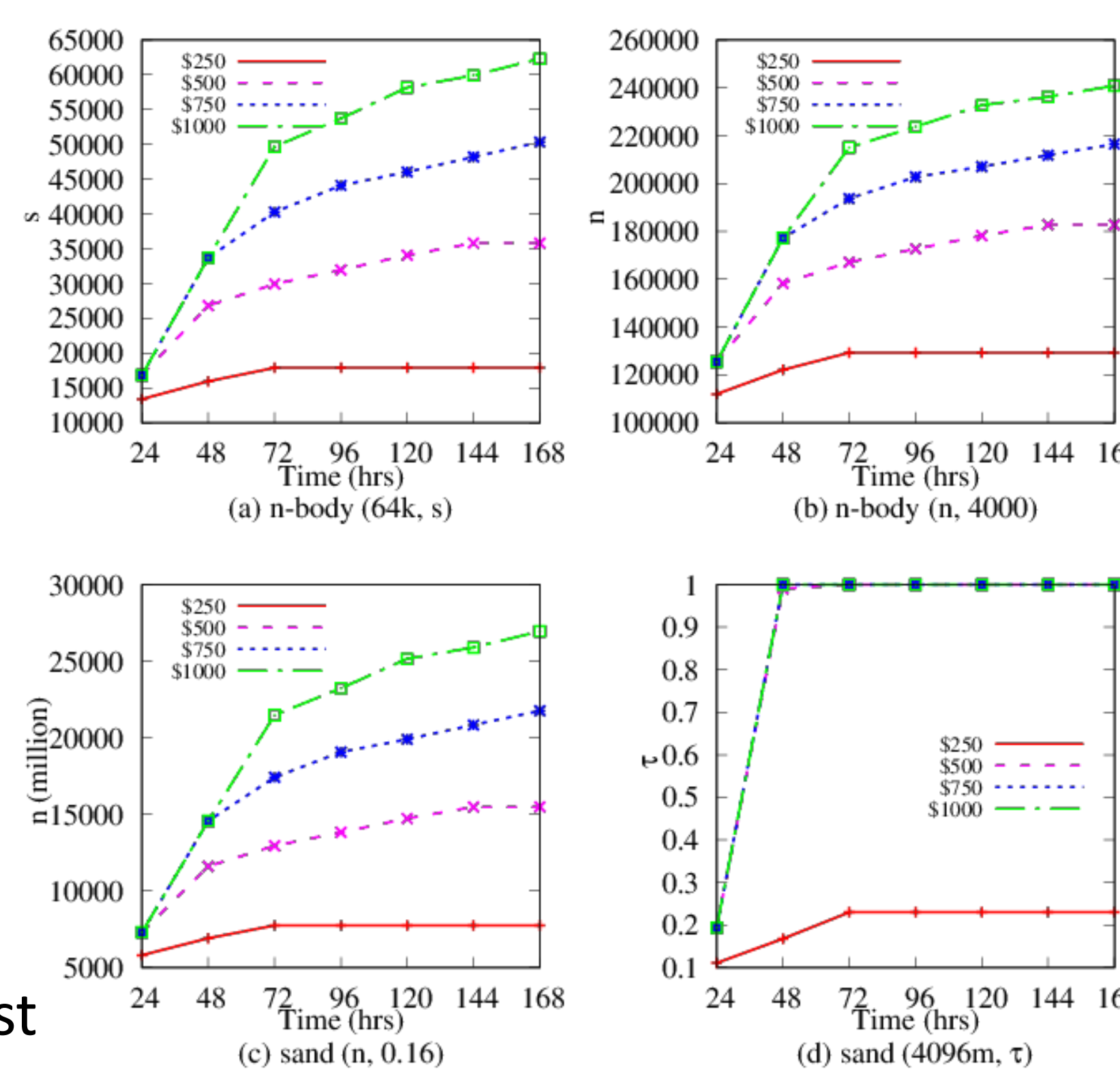
Observation 2:

Increasing the cost budget and relaxing the time deadline does not always result in obtaining a larger problem size.

Observation 3:

Resource demand is allocated in order of highest PCR.

Impact of Time Deadline on Largest Pareto-optimal Problem Size



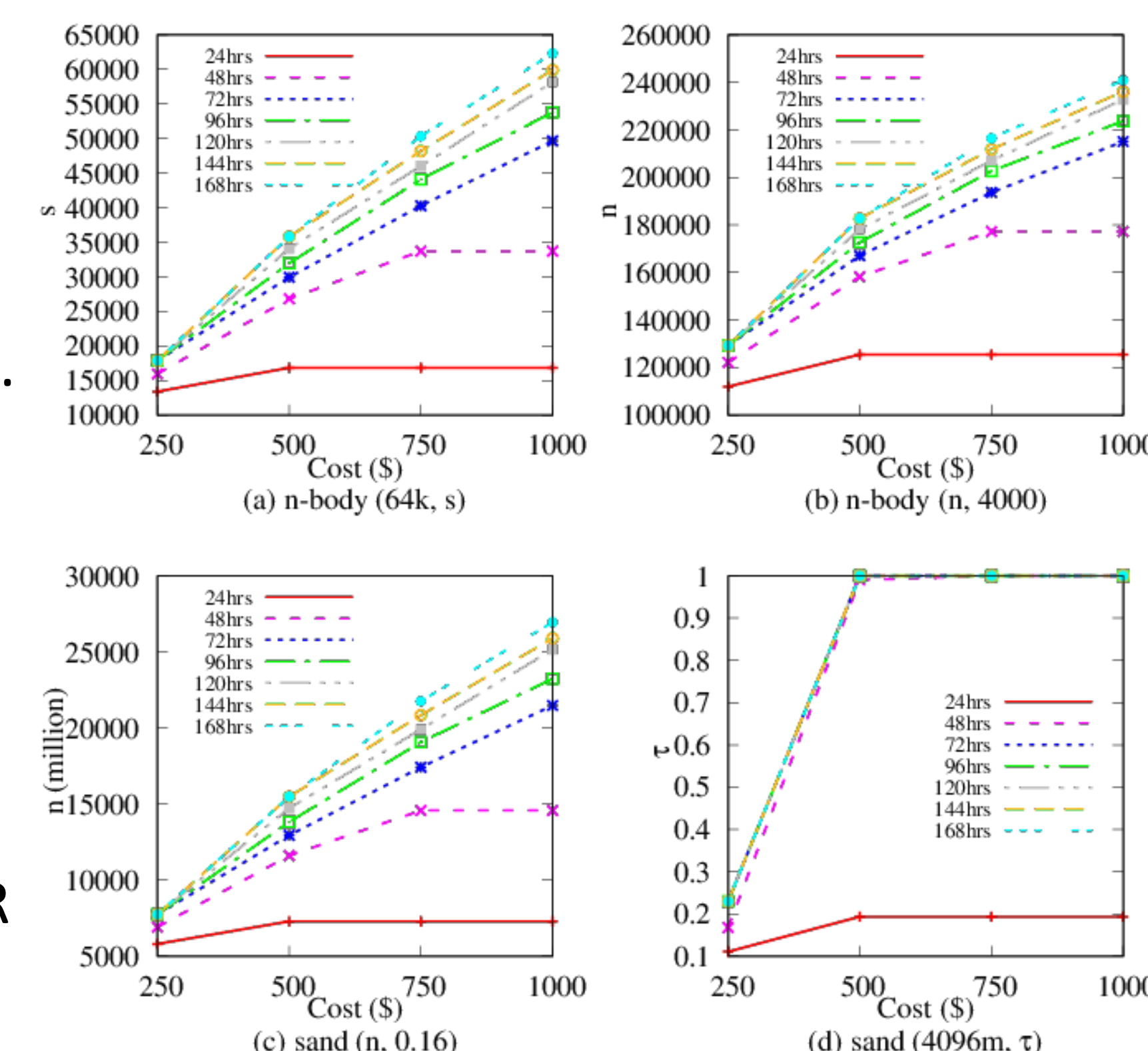
Observation 4:

Among Pareto-optimal problem sizes, tightening the time deadline results in relatively smaller reduction of problem size.

Observation 5:

Among Pareto-optimal problem sizes, increasing cost results in relatively smaller increase of problem size because PCR is non-linear across resource types.

Impact of Cost Budget on Largest Pareto-optimal Problem Size



Given an **application**, **time deadline** and a **cost budget**

- **largest size** of the application executable?
- execution **cost** and **time**?
- cloud **configuration**?

- Applications
  - n-body (linear, quadratic)
  - sand (linear, logarithmic)
- Cloud Resources
  - Amazon EC2 cloud
  - 9 resource types