

# Fault-Tolerant Adaptive Parallel and Distributed Simulation

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*joint work with:*

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Lorenzo Armaroli***

**London, England**

**Distributed Simulation and Real Time Applications (DS-RT), 2016**



# Presentation **outline**

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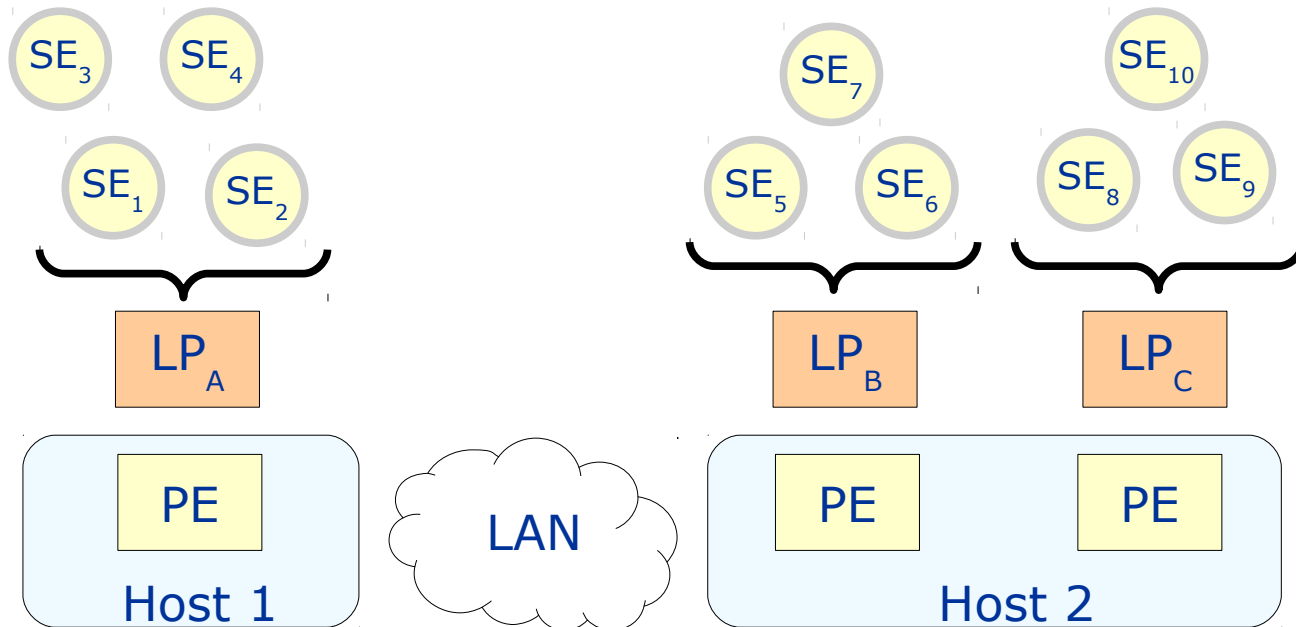
- Assumptions and Motivations
- Parallel And Distributed Simulation (PADS)
- Adaptive PADS (self-clustering of Simulated Entities)
- GAIA/ARTIS Software Architecture
- Problem: System Reliability
- Fault Tolerance in Distributed Systems
- FT-GAIA Software Architecture
- Fault-tolerance Type of Failures
- Experimental Evaluation
- Conclusions

# Assumptions and Motivations

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- **Discrete Event Simulation (DES)**
  - a set of **interacting entities** (can be seen as **agents**)
  - simulation is updated by **events**
  - the events happen at **discrete points in time**
- **Sequential** DES techniques are **not suitable** for the simulation of complex systems
- Parallel DES → **Parallel And Distributed Simulation (PADS)**
  - complex execution architecture (multi-core, multi-processors, clusters, cloud)
  - (aiming for) better scalability

# Parallel And Distributed Simulation (PADS)

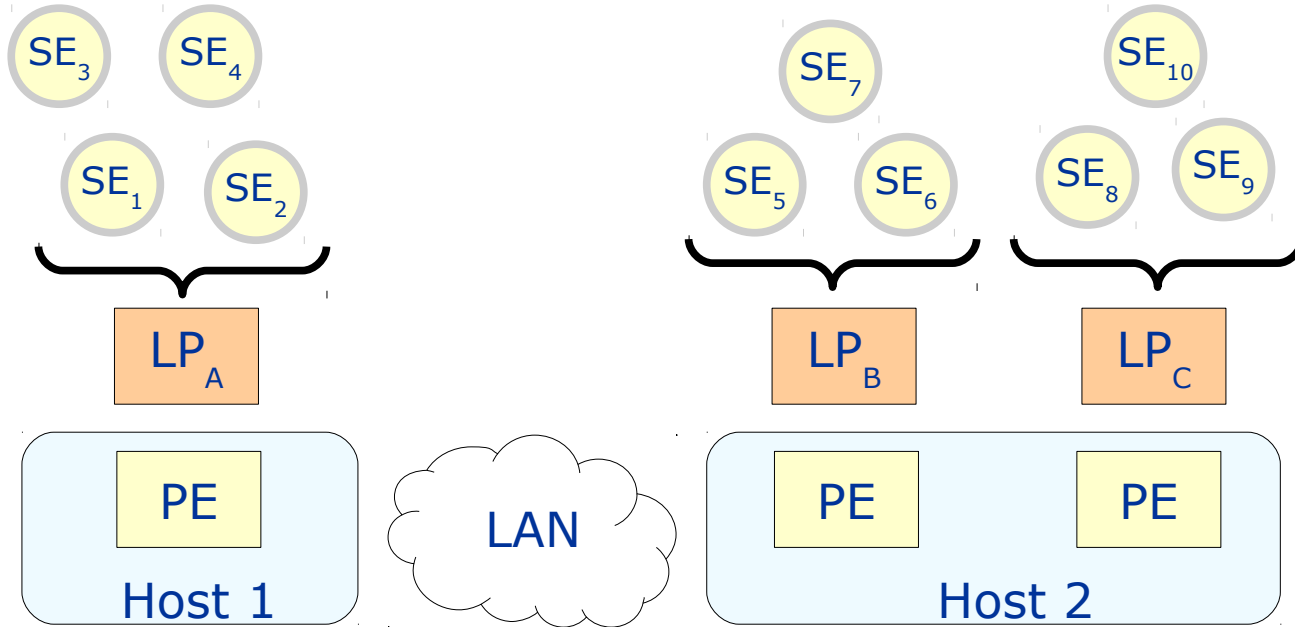


SE = Simulated Entity

LP = Logical Process

PE = Processing Element (*e.g. CPU core*)

# PARTITIONING

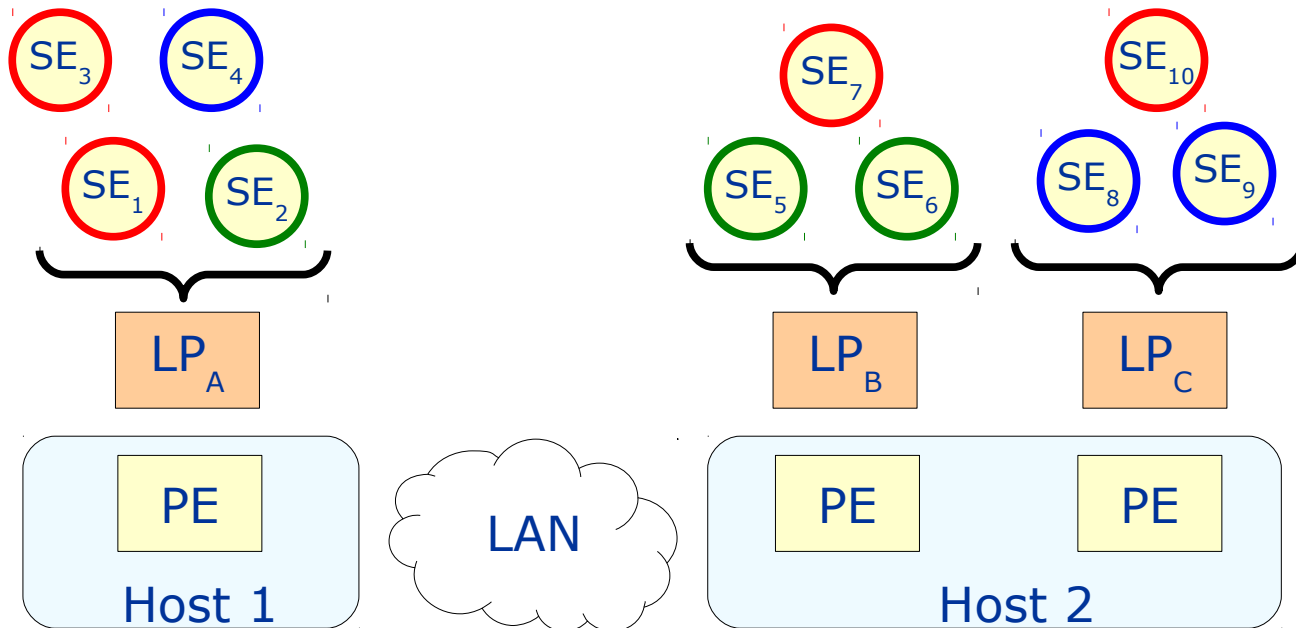


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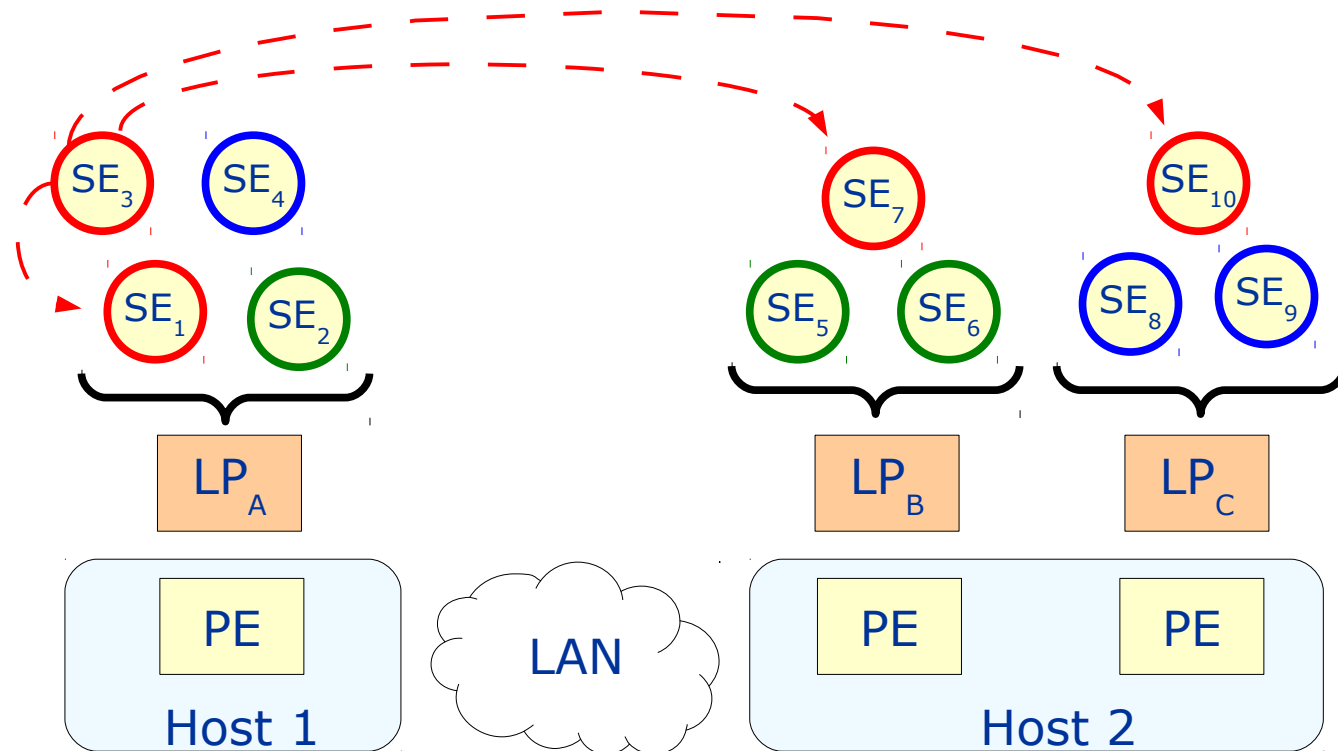


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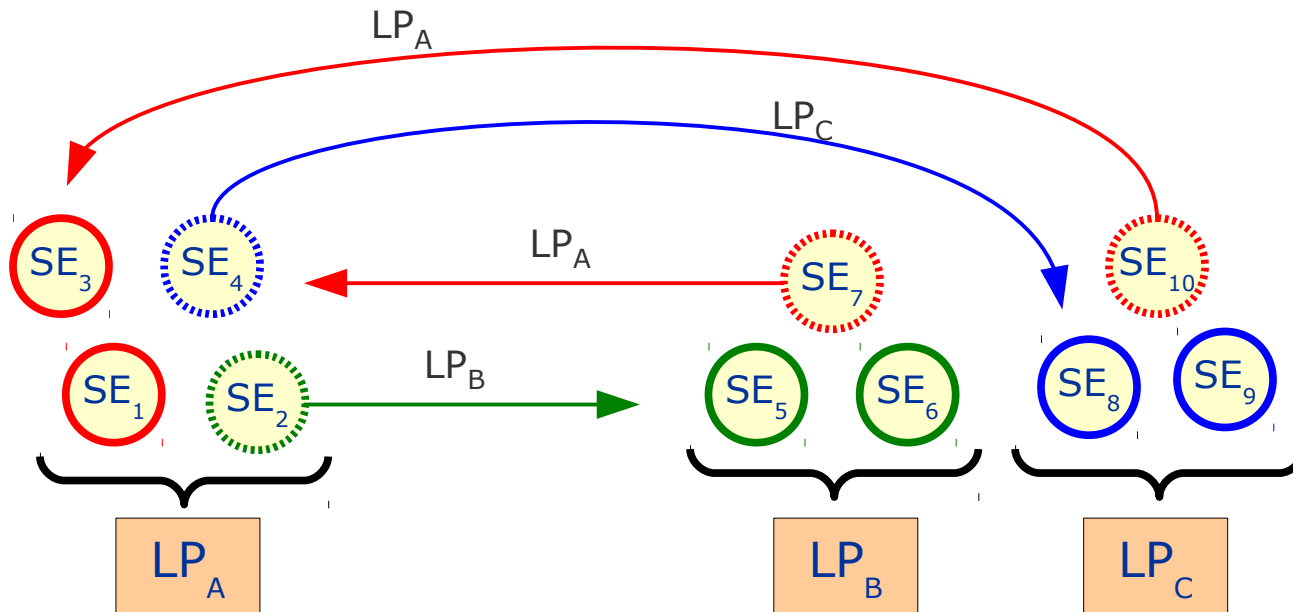


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# Adaptive PADS: self-clustering of SEs



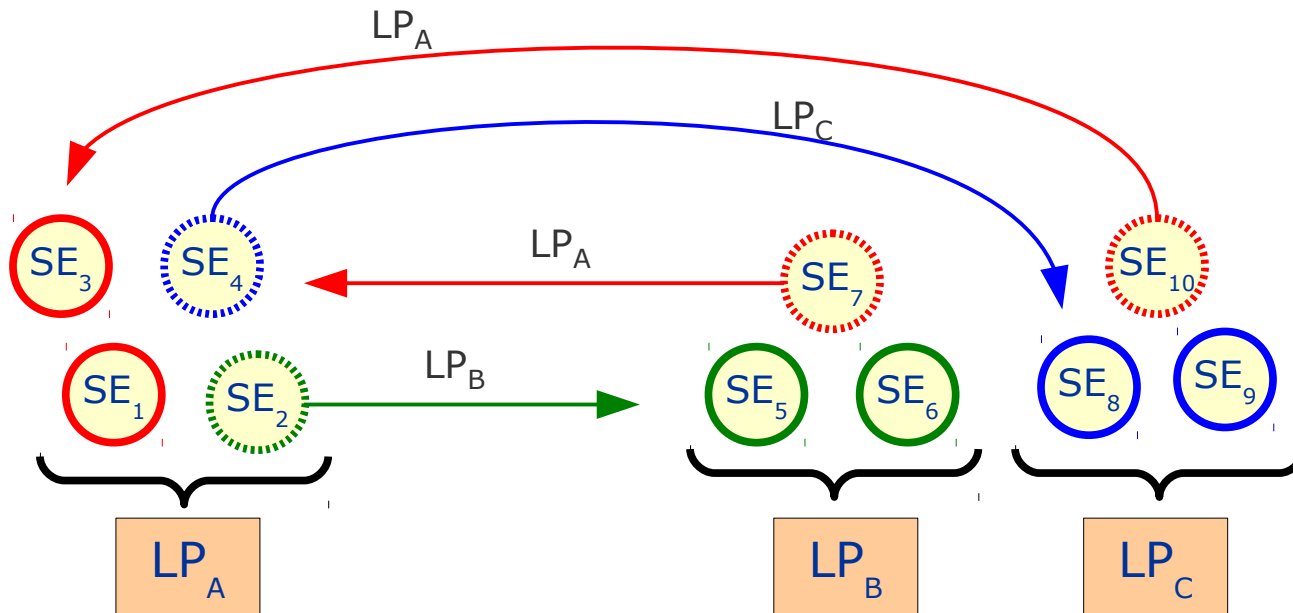
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# MIGRATION



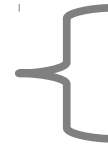
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# Software Architecture

**simulation model**



## model behavior:

- state variables
- event handlers

**GAIA**



## framework services:

- high level communication APIs
- migration support
- clustering heuristics

**ARTIS**

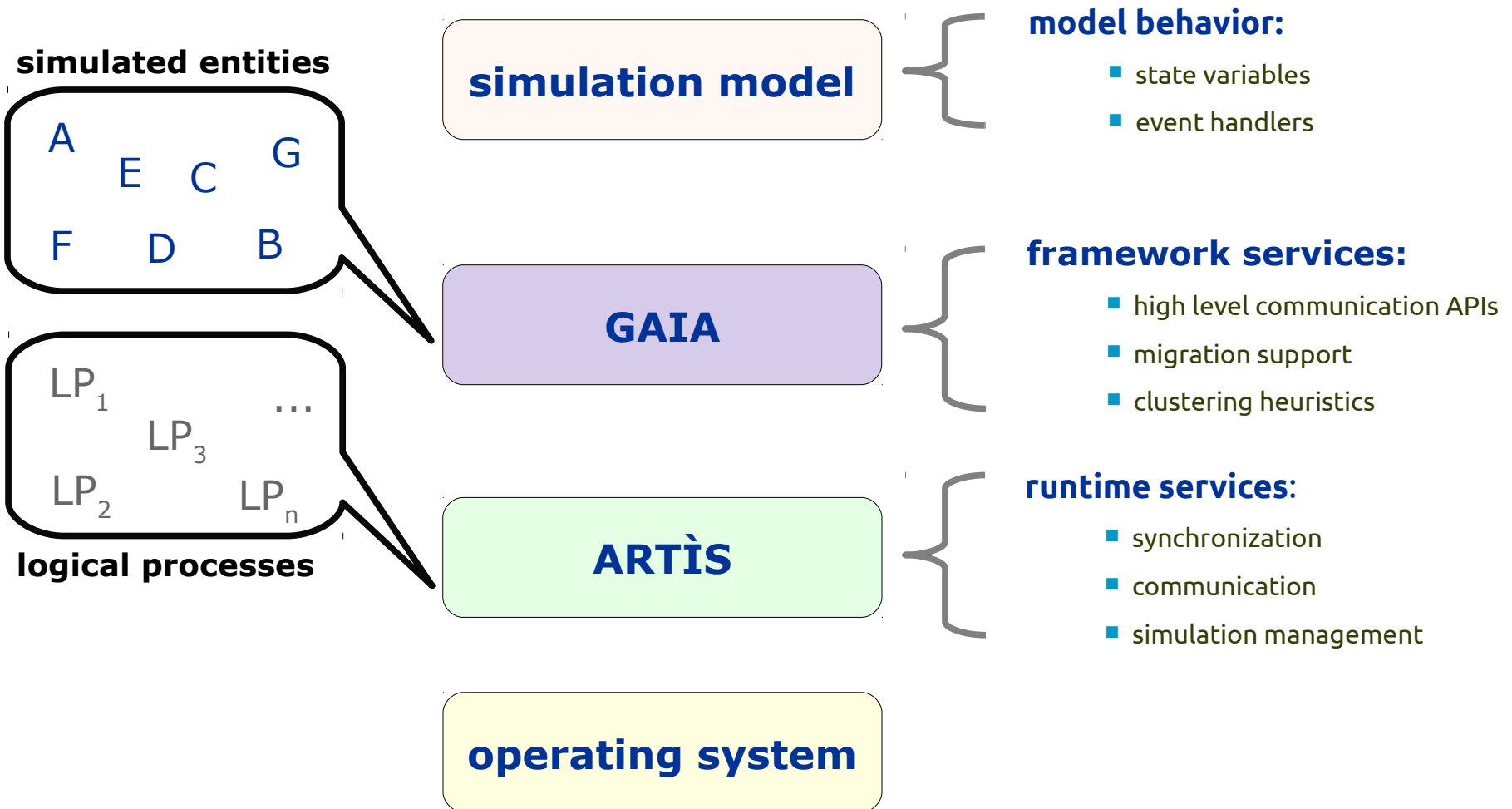


## runtime services:

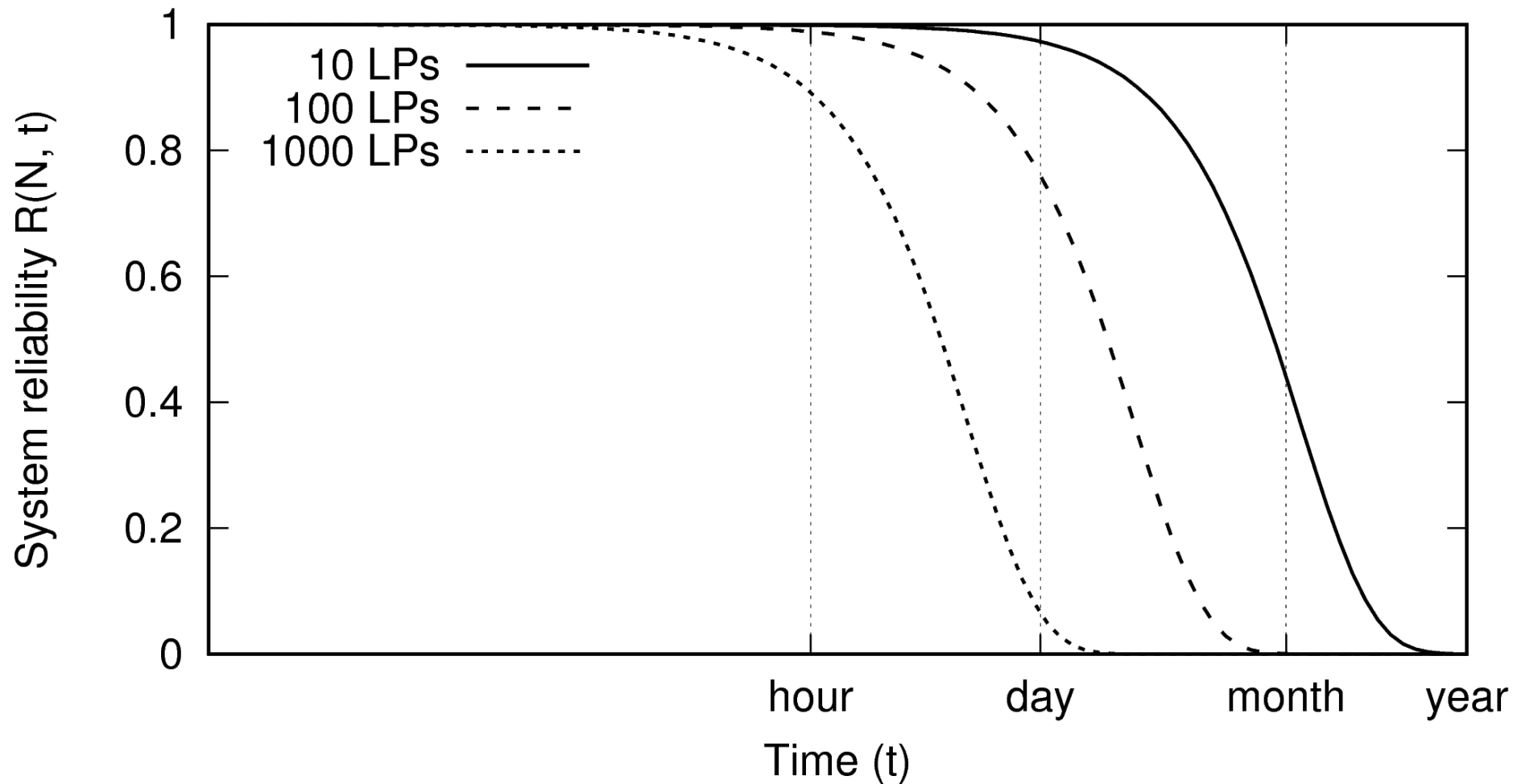
- synchronization
- communication
- simulation management

**operating system**

# GAIA/ARTÌS Software Architecture



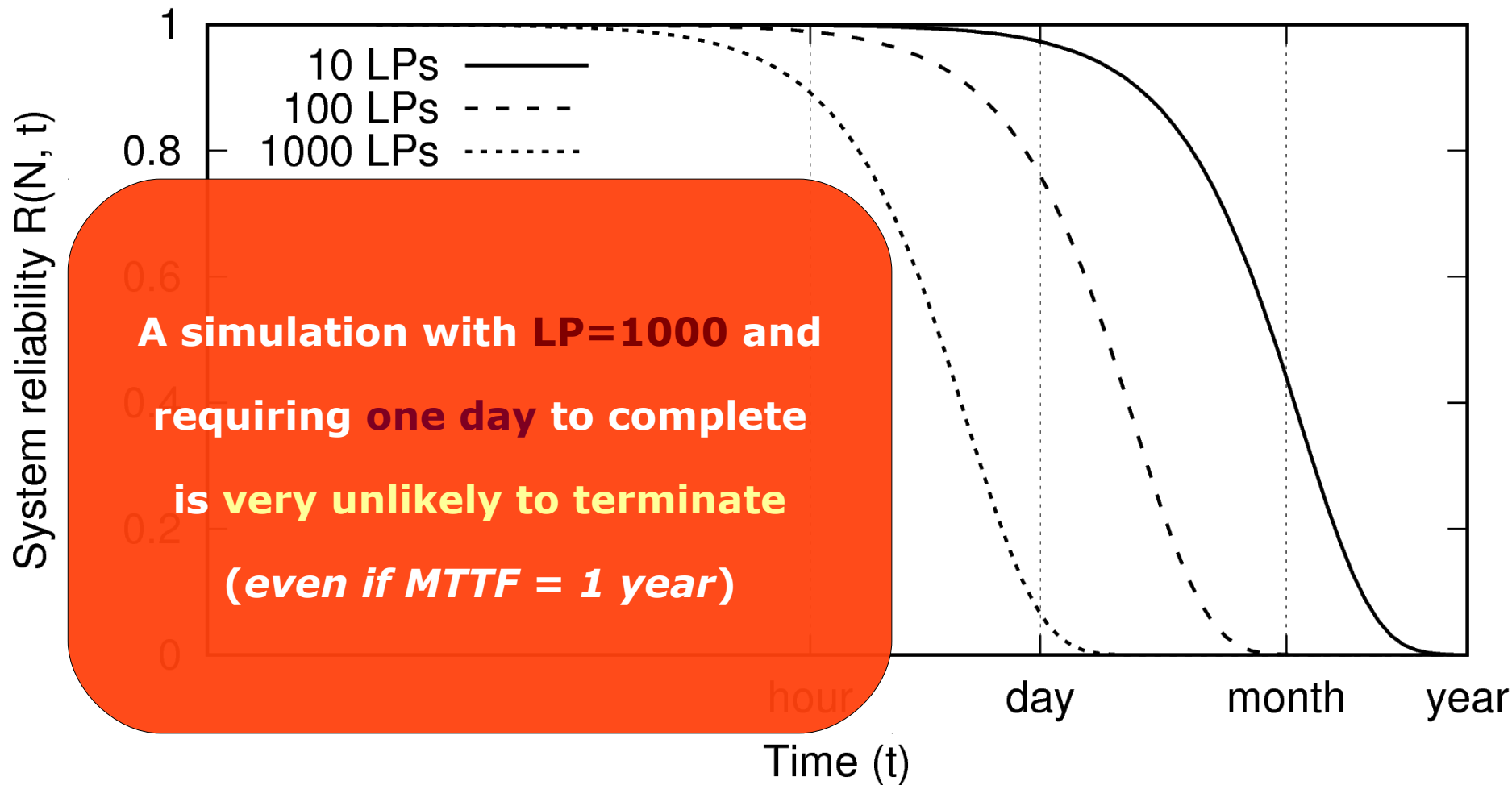
# Problem: System Reliability



**$R(N, t)$**  = joint probability that all  **$N$**  LPs operate without failures for  $\geq t$  time units

**ASSUMPTION:** Mean Time To Failure (MTTF) = 1 year

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# Fault Tolerance in Distributed Systems

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Many approaches are possible, two main categories:

- **Checkpointing:** rollback based recovery scheme (e.g. the checkpoints are periodically saved on stable storage)
  - *the **interval** between checkpoints is a parameter*
- **Functional Replication:** some (or all) parts of the PADS are replicated
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# Fault Tolerance in Distributed Systems

**FT-GAIA works by replicating Simulation Entities (SEs)**

**For example:**

**given  $N$  distinct SEs**

**FT-GAIA generates  $N \times M$  entities**

**(that is  $M$  independent instances of each SE)**

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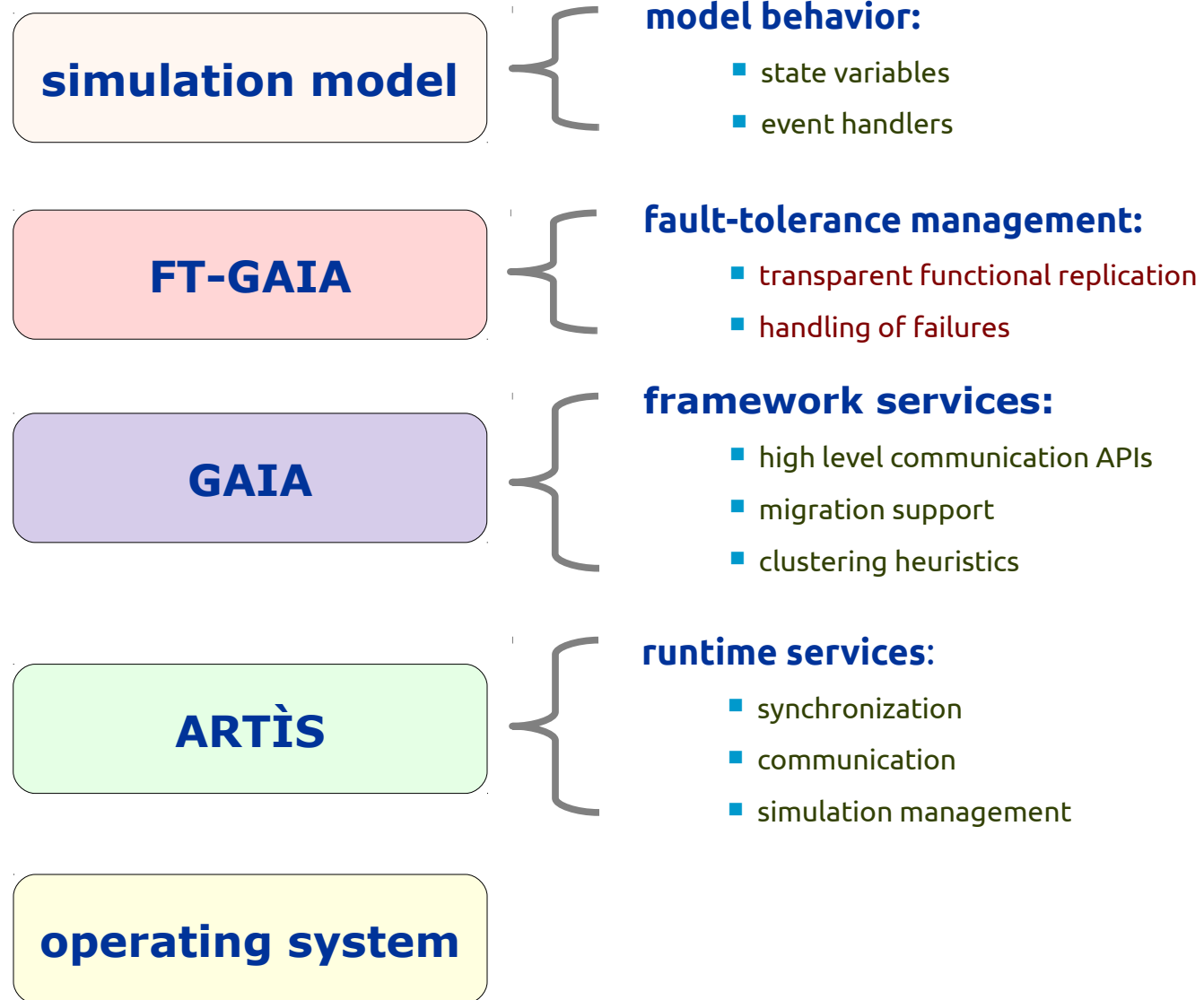
**The cost of Functional Replication:**

**a) additional processing power (e.g. CPU load)**

**b) number of messages**

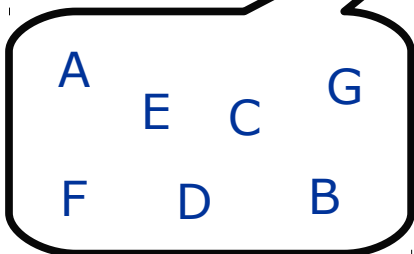
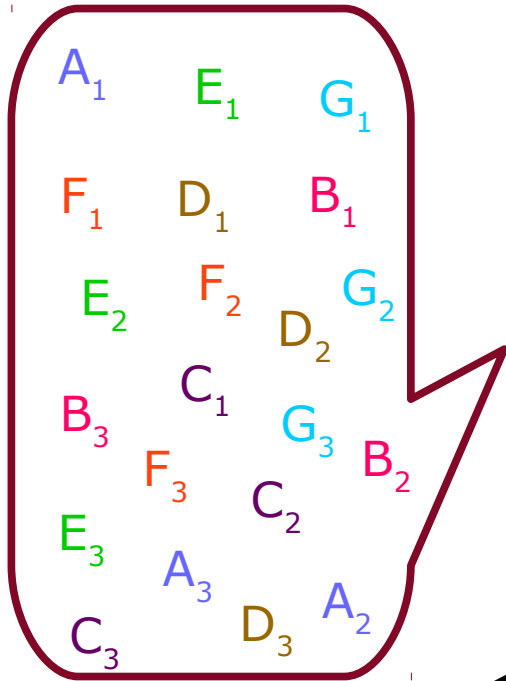
**(i.e.  $M$  redundant messages for each "original" message)**

# FT-GAIA Software Architecture



# FT-GAIA Software Architecture

simulated entities



simulated entities

simulation model

FT-GAIA

GAIA

ARTÌS

operating system

model behavior:

- state variables
- event handlers

fault-tolerance management:

- transparent functional replication
- handling of failures

framework services:

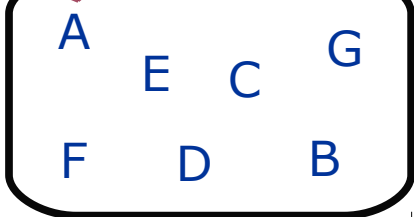
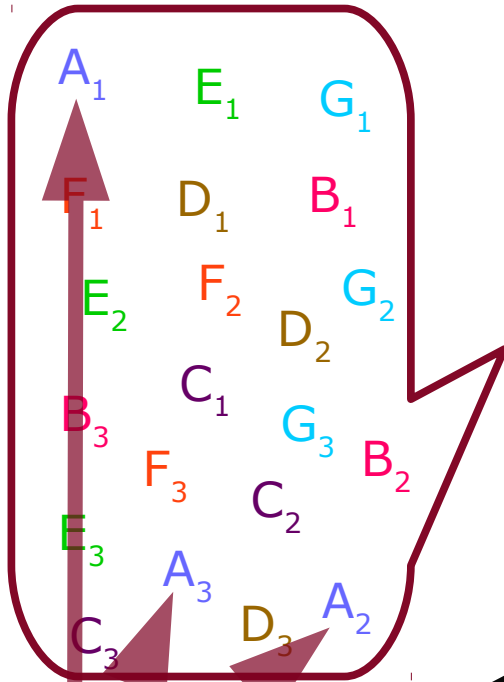
- high level communication APIs
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runtime services:

- synchronization
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# FT-GAIA Software Architecture

simulated entities



simulated entities

simulation model

FT-GAIA

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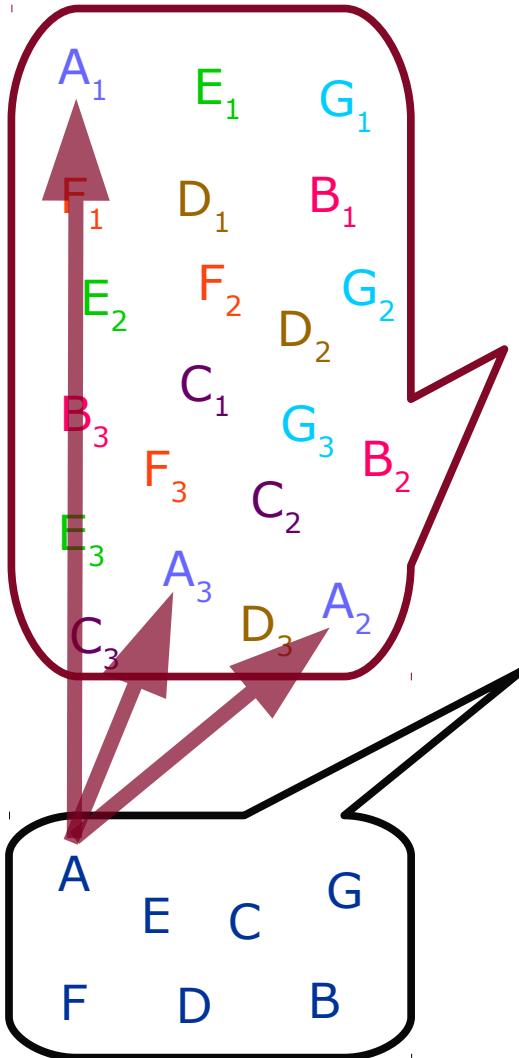
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# FT-GAIA Software Architecture

simulated entities



simulated entities

simulation model

**CONSTRAINT**

(implementation issue)

A given PE can not allocate more than

**one replica of each SE**

(that is, "no replications in the same LP")

**NOTE:** this needs to be integrated in the  
adaptive migration scheme described before

operating system

# Fault Tolerance: Type of Failures

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- **Crash failures:** a PE (e.g. CPU core) **halts but operated correctly** until it halted. The local state of all SEs on such PE is lost
  - *to tolerate  $f$  faults:  $\geq f+1$  instances of each SE ( $M=f+1$ )*
- **Byzantine Failures:** all types of **abnormal behavior** of a PE (*e.g transmission of erroneous/corrupted data, computation errors*)
  - *to tolerate  $f$  faults:  $M=2f+1$  replicas are needed (that is: "majority rule")*

# Experimental Evaluation

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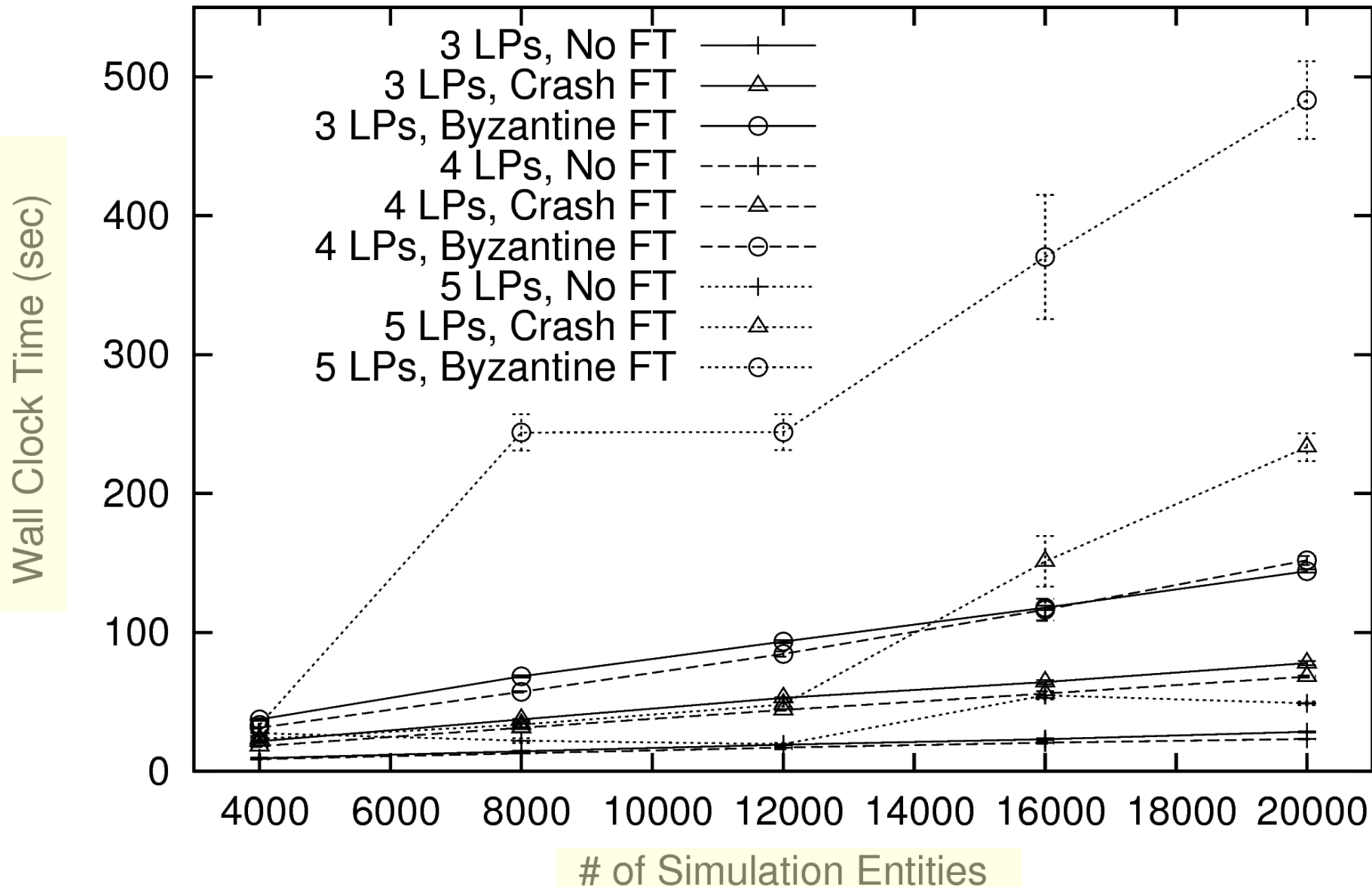
- **Simulation model:** simple P2P communication protocol (PING-PONG) over randomly generated directed overlay graphs
- **Execution platform:** cluster of Intel® Core® i5-4590 3.30 GHz CPU, 8 GB RAM, Debian Jessie, Fast Ethernet LAN
- **Methodology:** 15 independent replications of each simulation run. Reported mean values with 99.5% confidence intervals
- **Warning:** prototype implementation, not dedicated cluster (i.e. background load)

All the source code and scripts used for this performance evaluation are available with a Free Software license from:

<http://pads.cs.unibo.it>

# Impact of the number of LPs and SEs

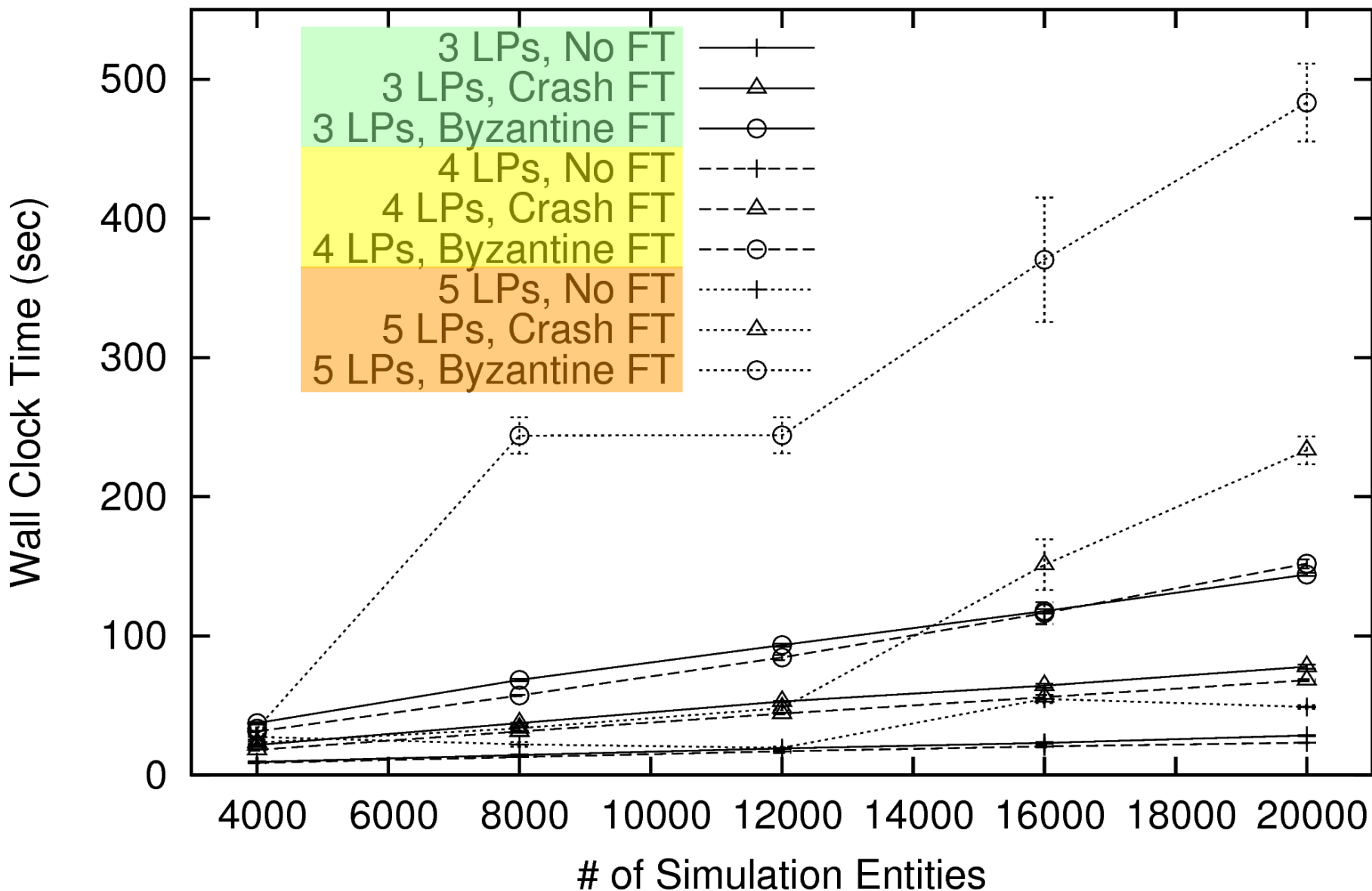
WCT with different num. of SEs





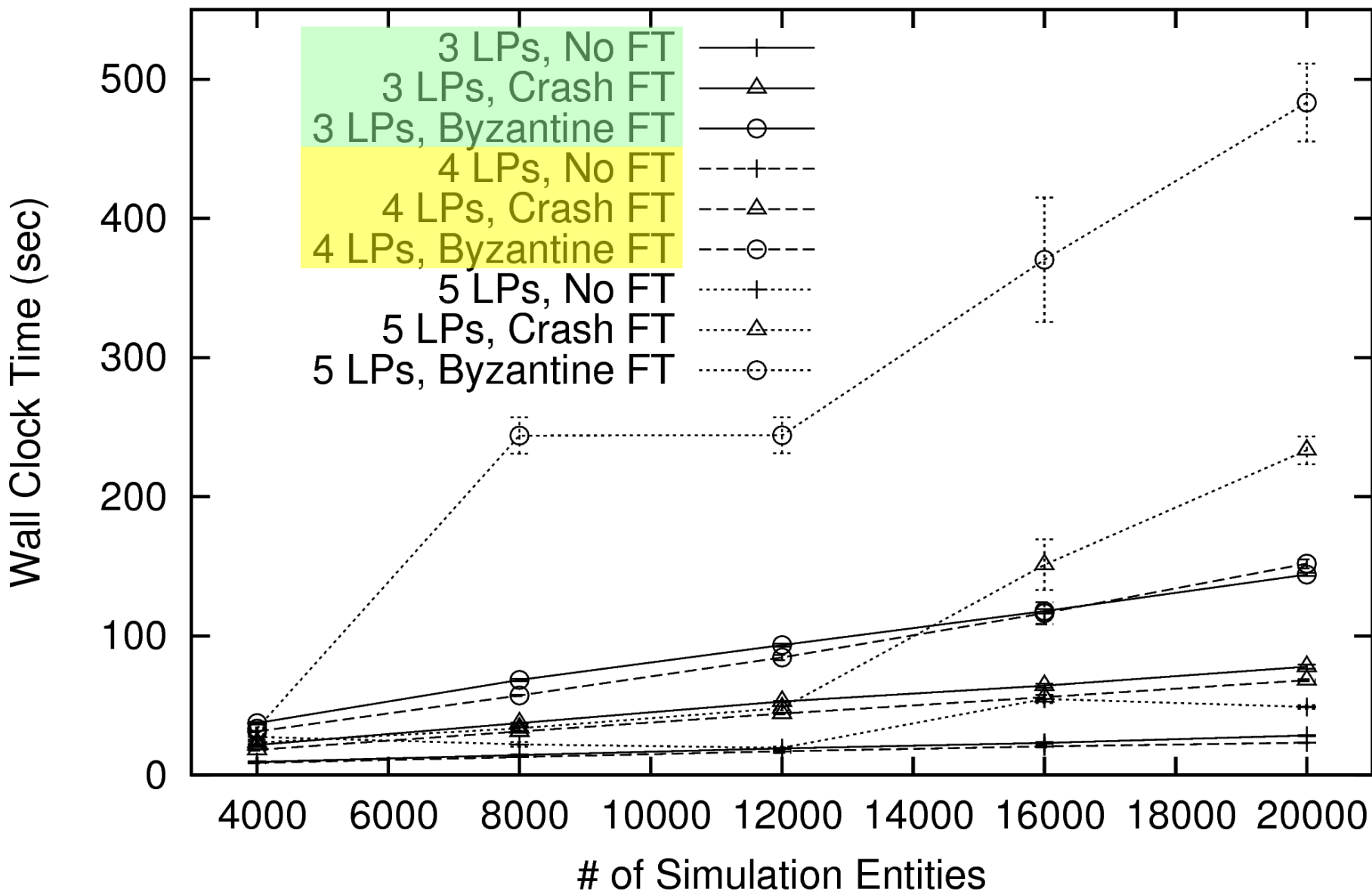
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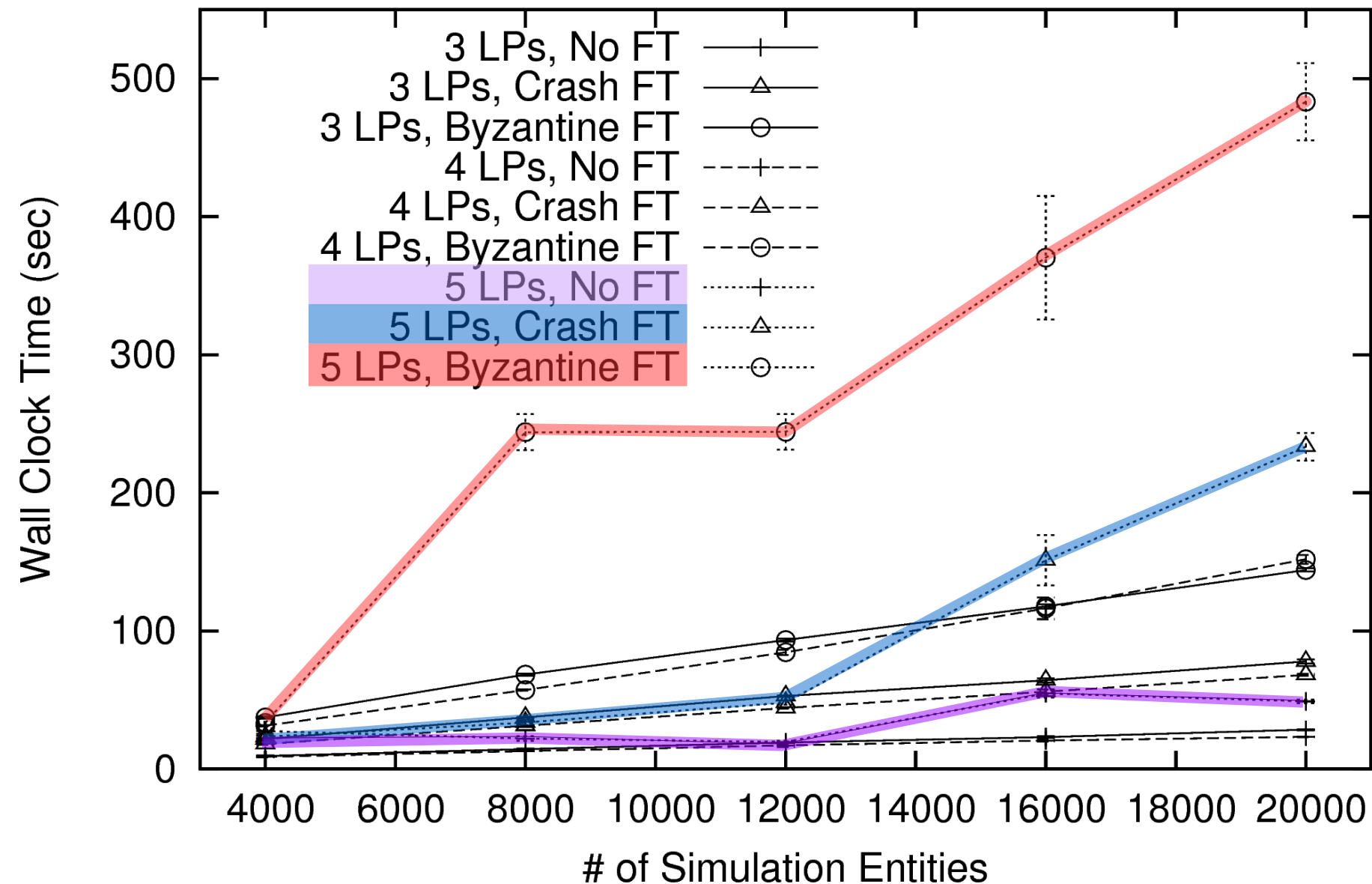
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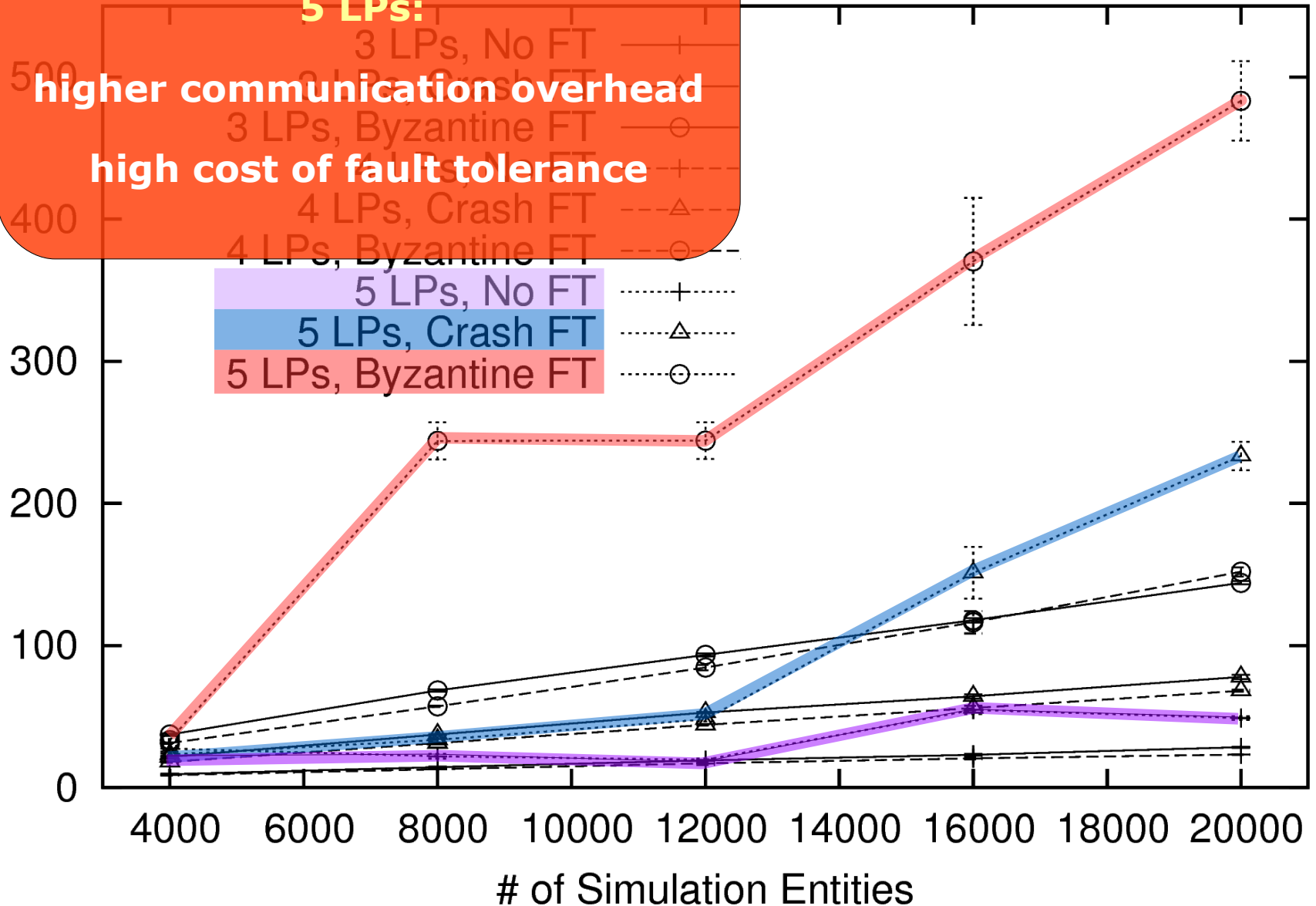
WCT with different num. of SEs

**5 LPs:**

higher communication overhead

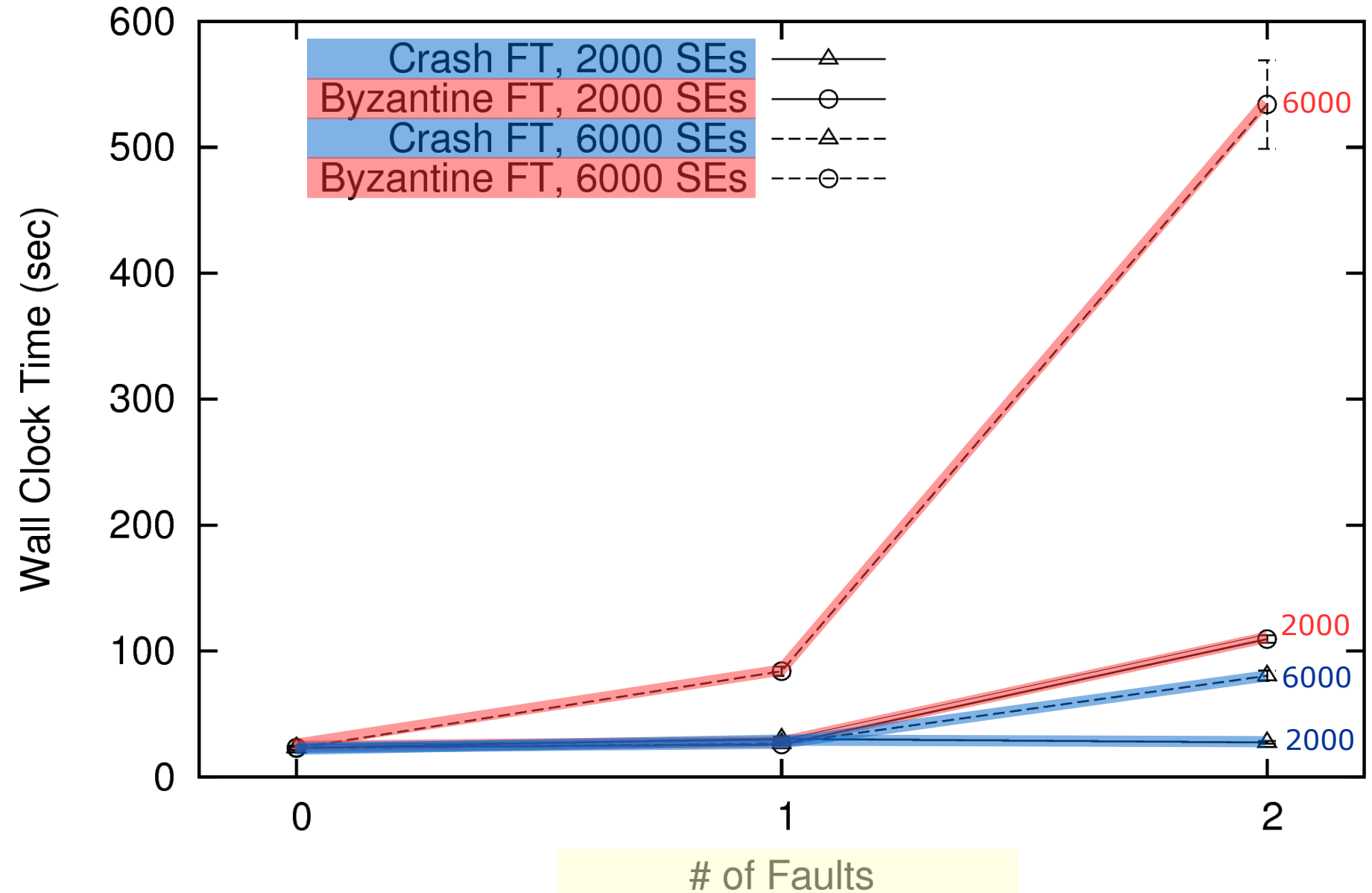
high cost of fault tolerance

Wall Clock Time (sec)



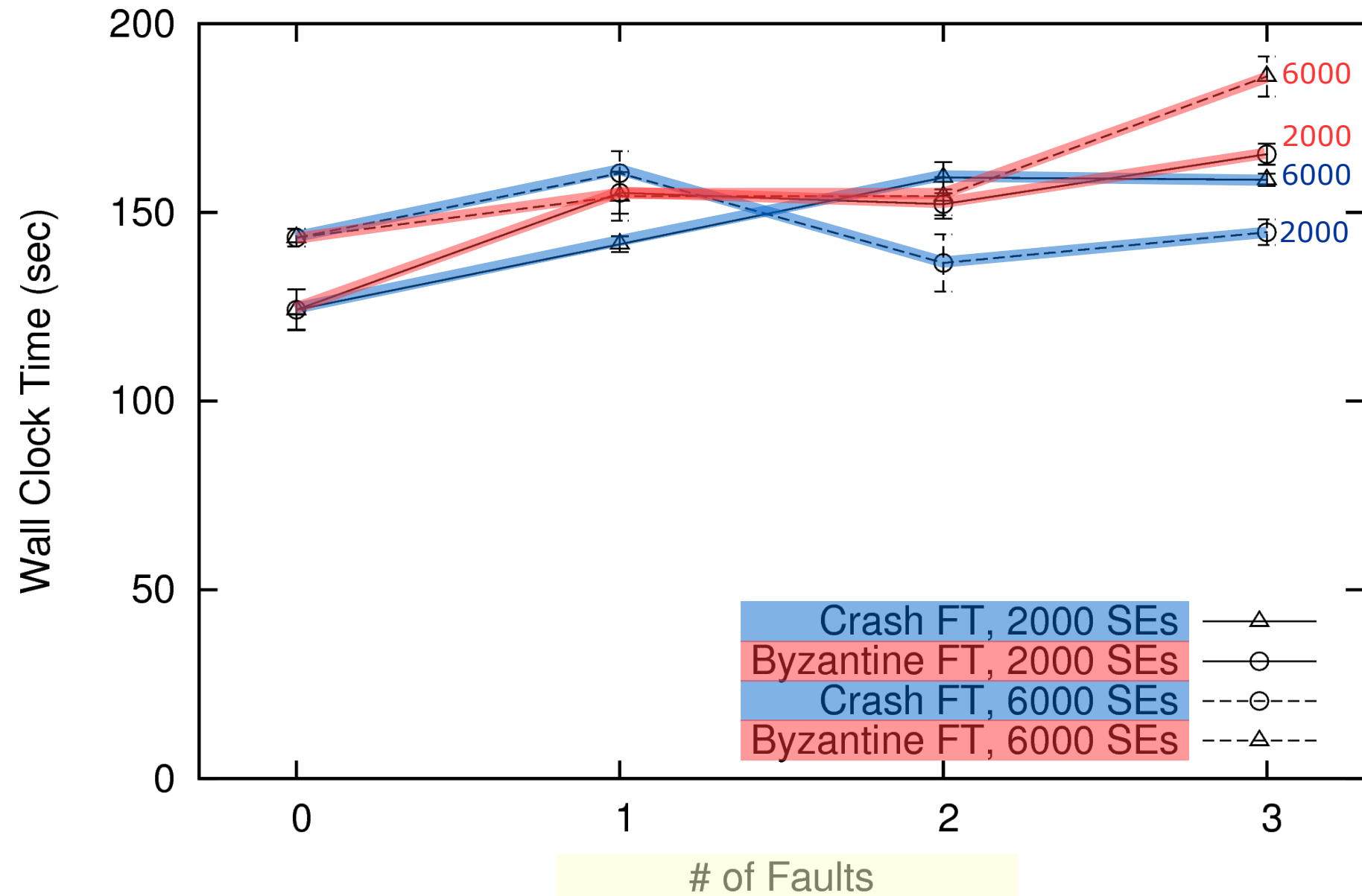
# Impact of the number of failures (5 LPs)

WCT with different numbers of faults (5 LPs)



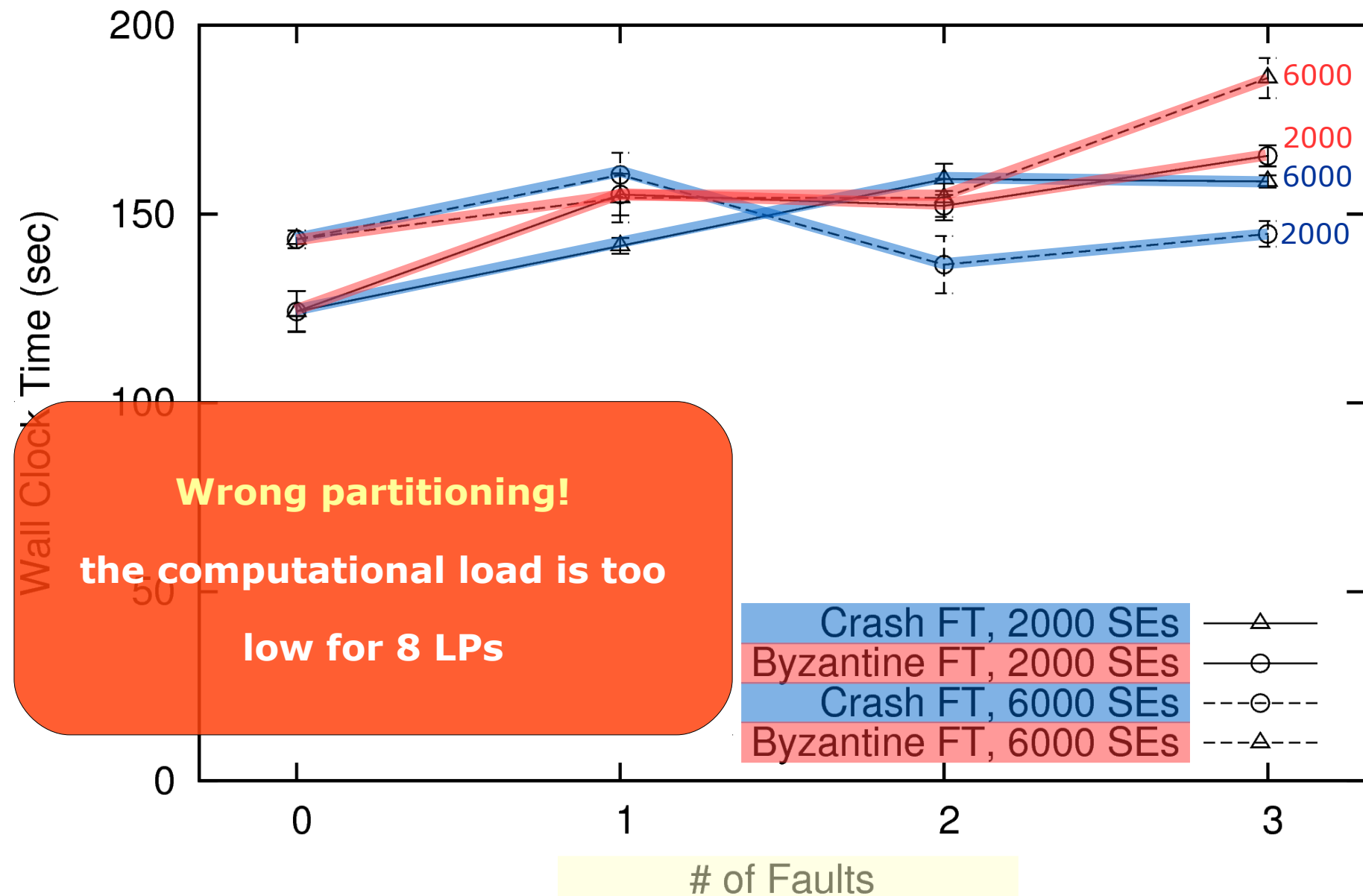
# Impact of the number of failures (8 LPs)

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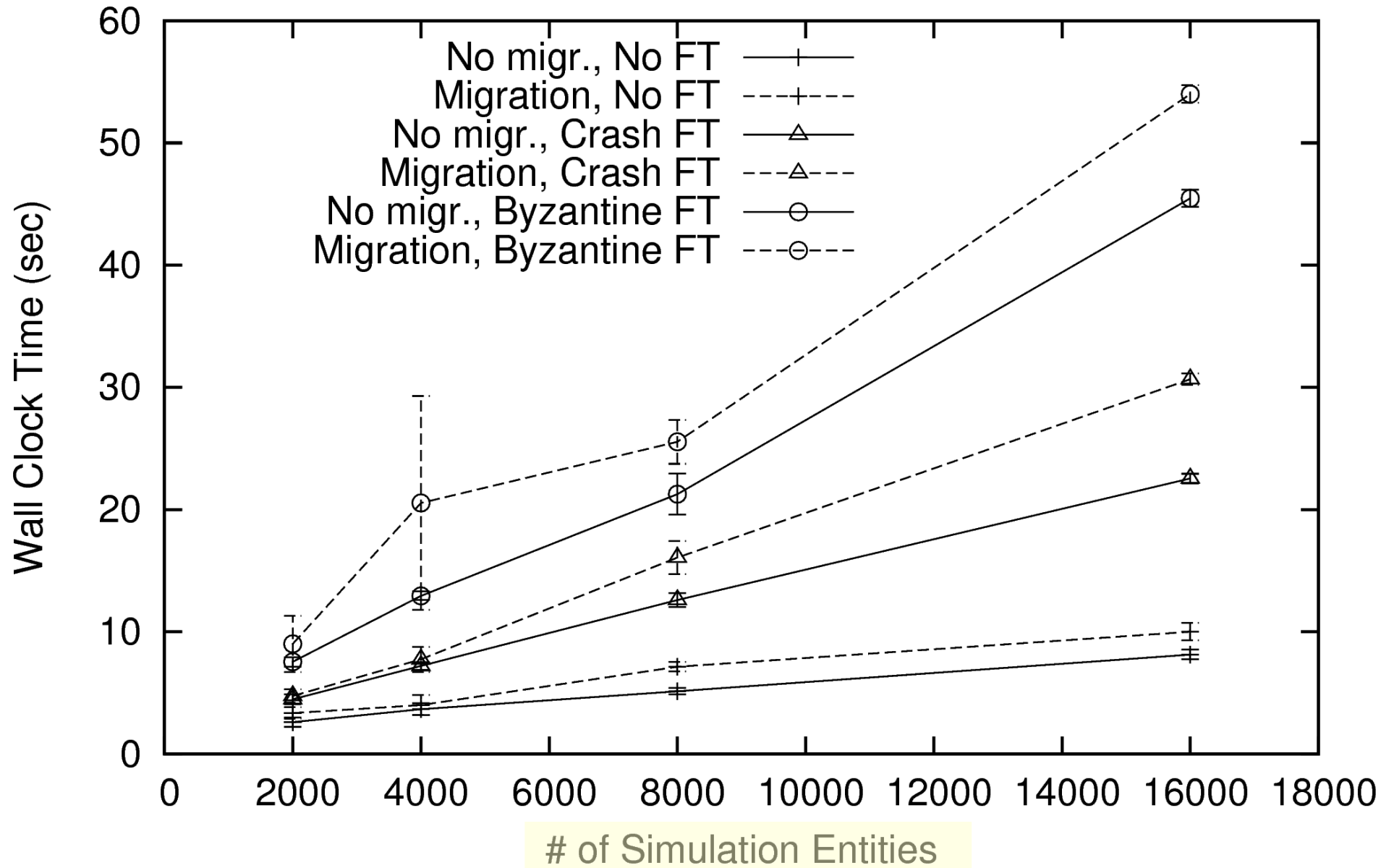
WCT with different numbers of faults (8 LPs)





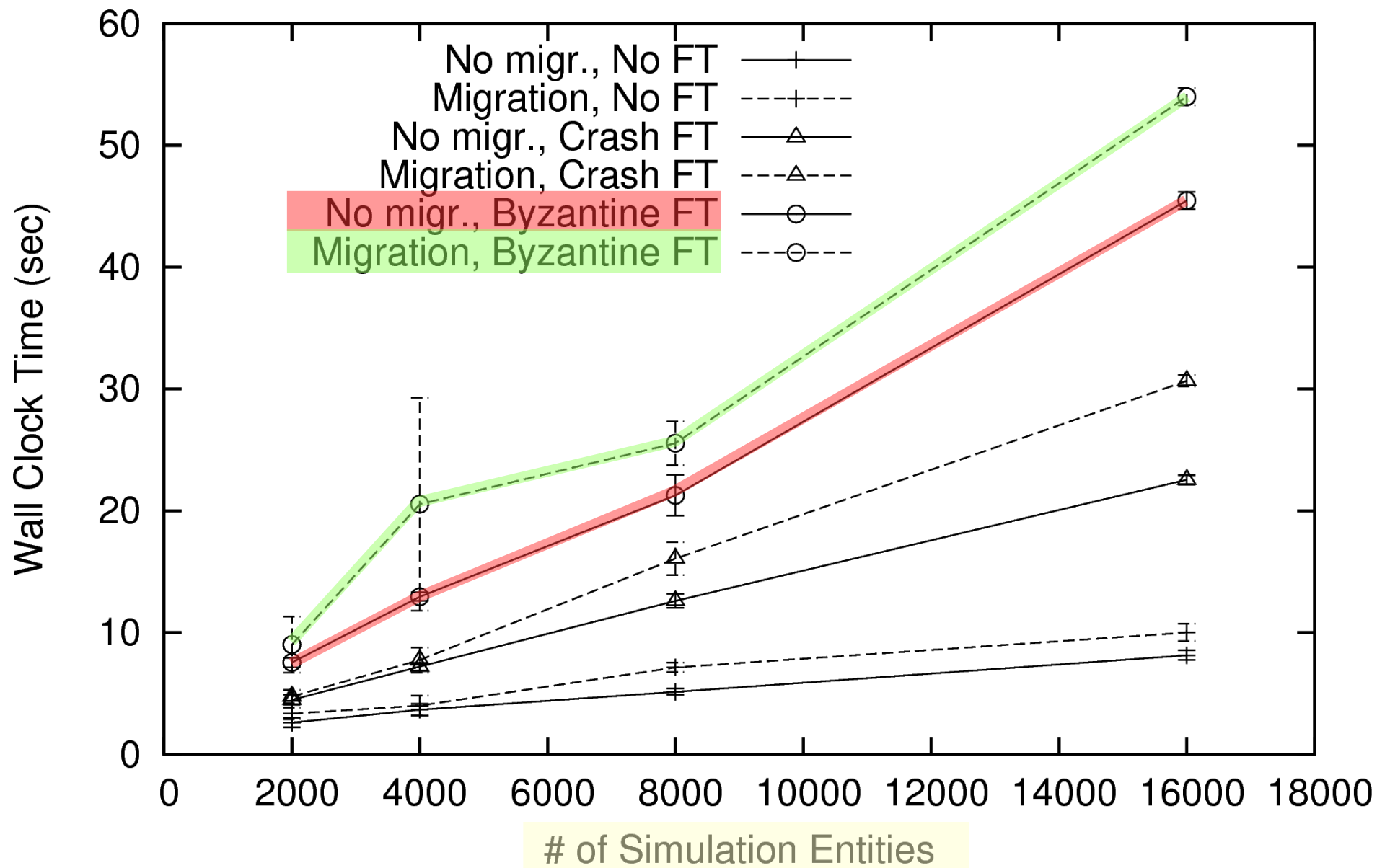
# Impact of SEs migration

WCT for varying num. of Simulation Entities, Migration on/off



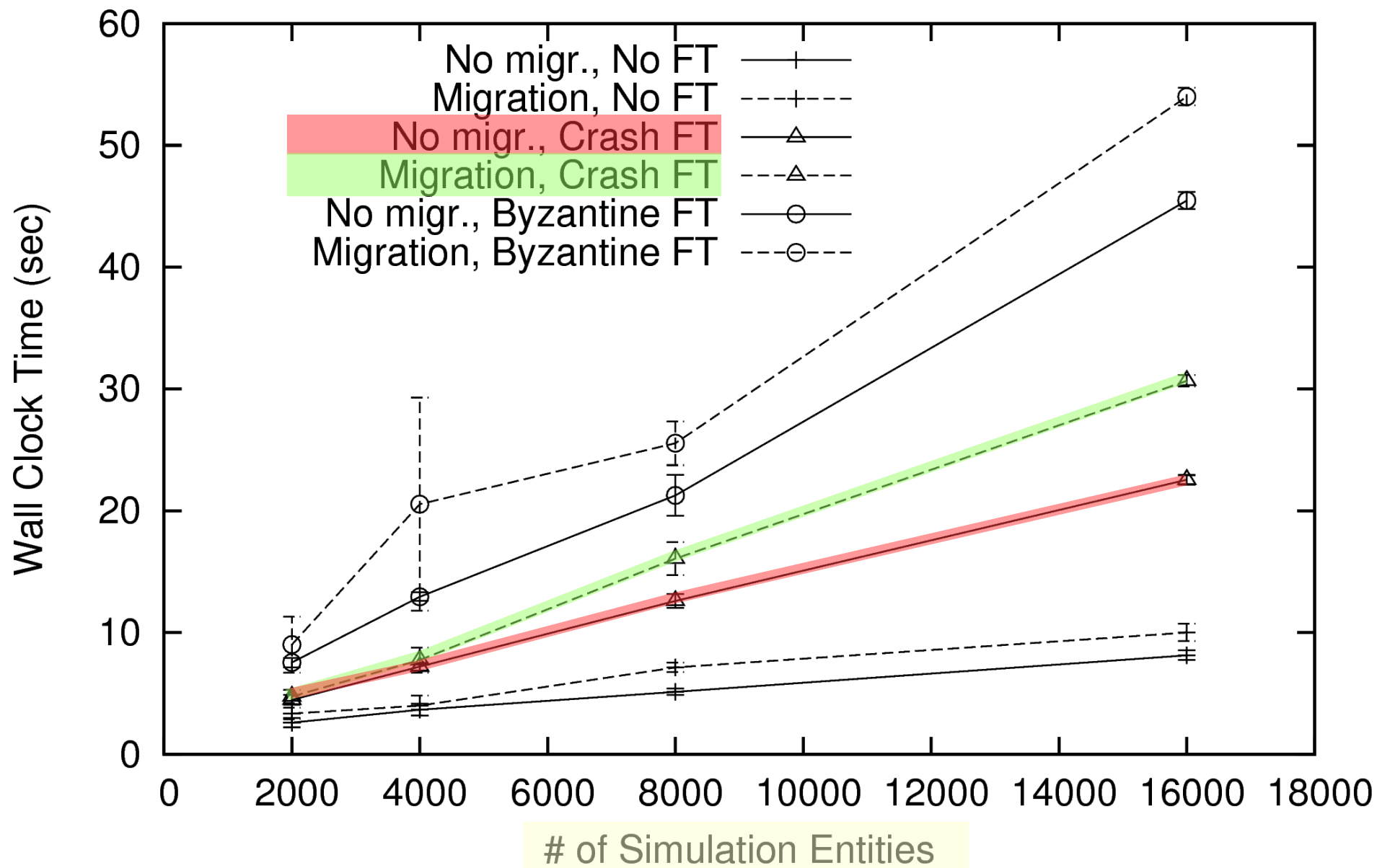
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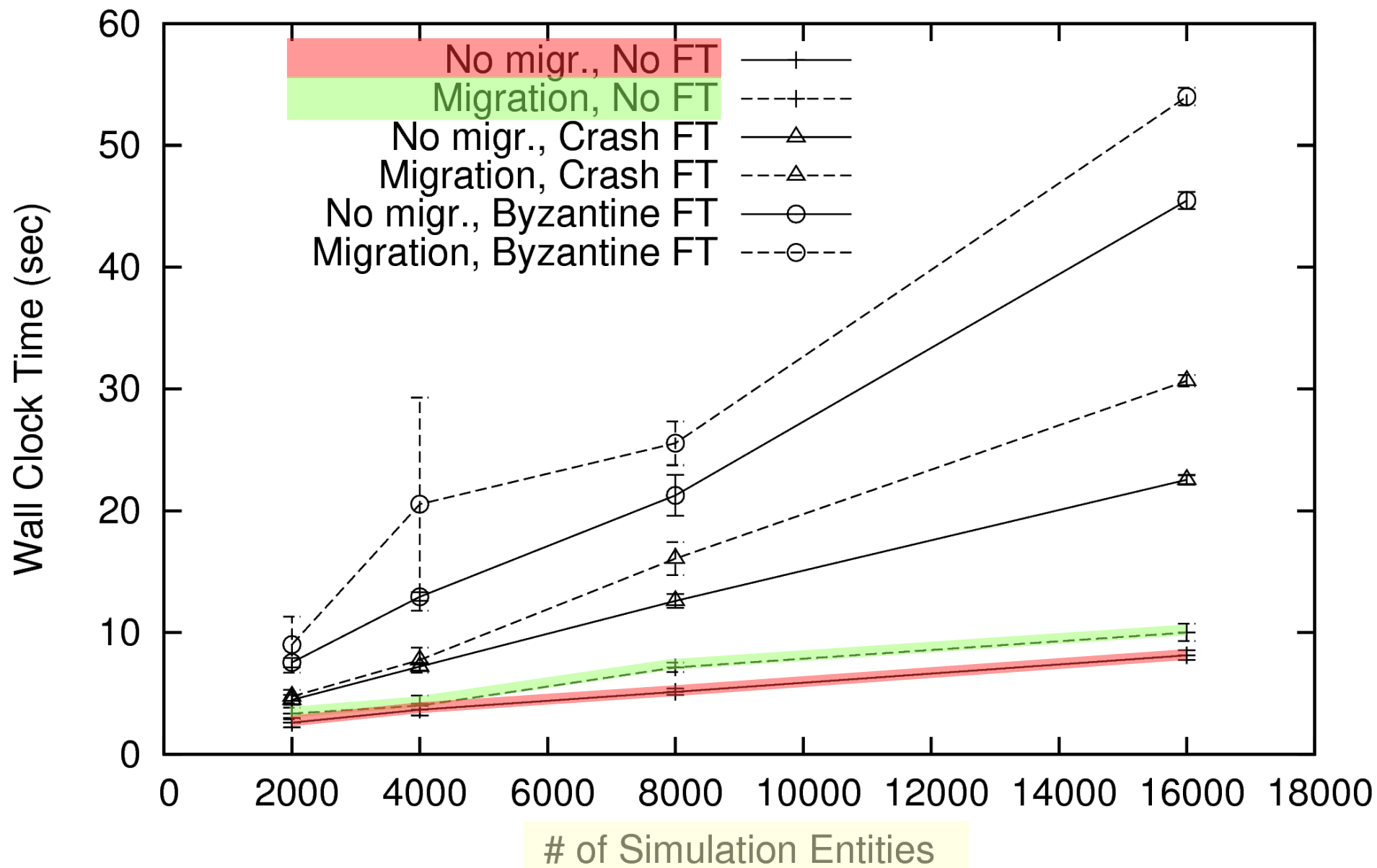
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# Conclusions

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- A **high degree** of **Fault-tolerance** can be achieved in very large scale parallel/distributed simulation
- The **cost** of Fault-tolerance is a **moderate increase** in the **computational** and **communication load**
- This permits the usage of “**low reliability**” **computational resources** or “**cheap**” **interruptible spot cloud instances**
- The efficiency of the **GAIA self-clustering mechanism** needs to be improved when used with FT-GAIA

# Further Information

Gabriele D'Angelo, Stefano Ferretti, Moreno Marzolla, Lorenzo Armaroli

## Fault-Tolerant Adaptive Parallel and Distributed Simulation

*Proceedings of the 20-th ACM/IEEE International Symposium on Distributed Simulation and Real Time Applications (DS-RT 2016). London, England, 2016*

A **draft version** of this paper is available on the  
open e-print archive (**arxiv**)

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## Gabriele D'Angelo

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