Evaluation through Realistic Simulations of File Replication Strategies for Large Heterogeneous Distributed Systems

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# Context: The Virtual Imaging Platform

- A science gateway for medical imaging
  - >20 applications
  - >1,000 registered users
- Supported by the BioMed VO within EGI
  - 130 computing clusters
  - 65 sites worldwide
  - 50 different Storage Elements (SEs)

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#### Typical execution model in VIP

- Computation distributed across multiple sites
- Numerous SEs used to transfer files
- Focus on file transfers for applications

# File replication

Consists in copying the same file onto multiple SEs.

- Avoid single-point failures ~> higher availability
- Distribute network traffic  $\rightsquigarrow$  shorter transfer duration

#### 2 aspects:

- Replica creation: where and how many times to replicate a file
- Replica selection: how to choose the "best" replica

#### File management on EGI

- APIs to upload, replicate, and register files
- Replica selection according to the geographical distance
- Decisions about replica creation are left to applications
  - $\bullet\,$  e.g., in VIP, files replicated on 3-5 stable SEs from a predefined list

# Why do we need simulation?

- Hardly to evaluate the impact of file replication directly in production
  - time-consuming, non-repeatable, harm production...



#### From simulation to real system

Real system can be optimized by reliable feedback from simulation

- Test different replication strategies
- Full-scale evaluation

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### Why do we insist on "realistic"?

### Limitation of simulation studies in literature

- Validation: questionable applicability to real systems
- The most used metric is file transfer durations
  - But, platform models are often oversimplified

#### Our proposal

- Design a platform model built from real execution traces
- Parameter injection in simulation scenarios
- Cross-evaluation with the state-of-the-art model

#### Questions to answer

- What is the impact of replication strategies on file transfer duration?
- Does the impact change on different platform models?
- What would be reliable recommendations for file management in VIP?

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### 2 Replication strategies and platform models

#### 3 Simulation evaluation

4 Conclusion and future work

### Replication strategies

### Static replication

- Decisions made before application starts and invariant during the execution of application
- How to choose SEs to have the best combination?
  - one combination of SEs = one prestaging list
- Random vs. based on statistical information on where jobs were executed



#### Dynamic method

#### Dynamic replication

- Decisions adapted to changes of the system during the execution of application
- Our proposal : a practical method inspired from "cache hit"
- The first job in a site replicates the downloaded file onto its local SE

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### Platform models

- 3-level hierarchical model
  - A widely used model in literature
  - 3-level network hierarchy: local, national, and inter-country
  - Unique theoretical bandwidth for each link category
  - Proposal: Enhance by average bandwidth derived from traces
    - local: 1.3 Gb/s, national: 255Mb/s, and inter-country: 100 Mb/s
  - Pros: Simplicity to build a complete network model
  - Cons: Hardly capture the heterogeneity of EGI
- Trace-based model
  - Derive network bandwidth from measured transfer durations
  - Spatial aggregation of multiple traces
    - Pros: Reproduce real-life variability
    - Cons: Construction complexity and missing links
  - Proposal: Fill missing links by leveraging existing information



2 Replication strategies and platform models

### Simulation evaluation

4 Conclusion and future work

- Realistic information extracted from execution logs
  - 15 execution instances of the typical workflow
  - Each one consists of 100 jobs
  - The queuing time and execution site of jobs (injected in simulation)
- Prestaging list = 3 SEs (among 32 SEs) for static replica creation
- 55 different prestaging lists
  - Current production setting: 3 SEs in France
  - Without a priori information: 50 random lists of 3 SEs
  - With a priori information: 4 lists based on the job distribution
- 220(2\*2\*55) scenarios for each workflow
   → 330,000 (220\*15\*100) simulated file transfers

### Q1: Impact of dynamic replication

### • 50 random lists of 3 SEs for both models



- Dynamic replication decreases transfer durations for both models
  - Larger improvement in 3-level model
- Prestaging lists have stronger impact without dynamic replication

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### Q1: Impact of different prestaging lists

• 50 random lists + 4 predefined list + the current production setting



- Best prestaging list is the same for both models
- SE list for best prestaging → sites with most jobs in 3 countries
  - Replicate close to jobs and scatter in different countries

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### Q2: Impact of platform model



 More heterogeneity in the platform ~> more gain comes from a-priori knowledge

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### Q3: Recommendations for file replication in VIP on EGI



- Without Dynamic Replication:
  - Replicate files close to the sites executing most jobs
  - Scatter across different countries
  - Best results are comparable to dynamic replication
    - requires to estimate where jobs will be executed
- With Dynamic Replication:
  - Always better than Prod.prestaging
  - Reliable method to reduce the file transfer durations

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2 Replication strategies and platform models

3 Simulation evaluation



### Take-home messages

### Realistic simulation

- Different platform models ~> different qualitative assessment
- Realism of the platform model is key to the evaluation process
  - And also to the applicability for production systems

#### Recommendations for file management on EGI

- Replicate data close to jobs
  - Requires a-priori information
- Further optimization by dynamic replication
  - Non-negligible implementation cost
- Scatter across countries is a safe strategy
- A-priori information is very important for a heterogeneous platform

#### • Still lots of aspects to investigate

- Study the impact of the number of prestaging SEs
- Further improve the accuracy of trace-based model
  - Integrate temporal aggregation of traces
  - Investigate different methods to fill missing links
- Consider other parameters in simulation scenarios
  - Transfer failure rates
  - Available storage space

• Build probability distributions out of traces for these parameters

# Thank you!

- Companion of article: http://doi.org/10.5281/zenodo.1239677
- VIPSimulator: https://github.com/frs69wq/VIPSimulator
- Simgrid: https://simgrid.gforge.inria.fr/download.php
- VIP: https://www.creatis.insa-lyon.fr/vip/
- EGI: https://www.egi.eu/

### Fill missing links

### Hypothesis

- For a site  $S_i$ , the connectivity to SEs follows the network hierarchy
- Measured links to/from  $S_i$  could reflect its general connectivity
- Reliability depends on the number of known links

$$C_{i} = \sum_{c} \left( \frac{|L_{i}^{c}|}{|L_{i}|} \cdot \frac{\widetilde{B}_{i}^{c}}{\widetilde{B}^{c}} \right)$$
(1)

- Bandwidth of a missing link of category c to/from  $S_i$ :  $B^c \times C_i$
- Category c: local, national, and inter-country
- B<sup>c</sup>: median bandwidth of all known links in category c
- B<sup>c</sup><sub>i</sub>: median bandwidth of the known links to/from S<sub>i</sub> in category c
- $|L_i|$ : the total number of known links for site  $S_i$
- $|L_i^c|$ : the number of known links to/from  $S_i$  in category c

### 4 predefined prestaging list of 3 SEs

- SEs of the top 3 sites with most executed jobs in one country
- SEs of sites with the most executed jobs in 3 country
- SEs of 3 sites with no executed jobs in one country
- SEs of sites with no executed jobs in 3 country

#### Replica selection on EGI

- First, the local SE of the computing site
- Then, the SE in the same country as the job execution
- Randomly among all available replicas