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WORKFLOW ENGINE PERFORMANCE BENCHMARKING WITH BENCHFLOW



Vincenzo Ferme

Faculty of Informatics USI Lugano, Switzerland



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The BenchFlow Project

"Design and implement the first benchmark to assess and compare the performance of WfMSs that are compliant with Business Process Model and Notation 2.0 standard.,,

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What is a Workflow Management System?



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Many Vendors of BPMN 2.0 WfMSs



https://en.wikipedia.org/wiki/List_of_BPMN_2.0_engines



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Why do We Need a Benchmark?

end-users, vendors, developers

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Why do We Need a Benchmark?

end-users, vendors, developers

I. How to choose the best WfMS according to the company's technical requirements?





2. How to choose the best WfMS according to the company's business process models (workflows)?







Why do We Need a Benchmark?

end-users, vendors, developers

I. How to choose the best WfMS according to the company's technical requirements?



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> 2. How to choose the best WfMS according to the company's business process models (workflows)?



3. How to evaluate performance improvements during WfMS's development?







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The BenchFlow Benchmarking Process

Input/Process/Output Model



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The BenchFlow Benchmarking Process



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The BenchFlow Benchmarking Process



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The BenchFlow Benchmarking Process



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The BenchFlow Benchmarking Process



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Container Based Methodology and Framework





Methodology

Framework

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Container Based Methodology and Framework



Provides Great Advantages for Automation and **Reproducibility** of Results, while 🔗 cker **Ensuring Negligible Performance Impact**

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[CLOSER'16]

Container-centric Methodology for Benchmarking Workflow Management Systems.

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BenchFlow Benchmarking Methodology

requirements from the WfMS

- **Availability of APIs**
- Deploy Process
- Start Process Instance
- Users API
- Web Service APIs
- Events APIs

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BenchFlow Benchmarking Methodology

requirements from the WfMS

- Availability of APIs
- Deploy Process
- Start Process Instance
- Users API
- Web Service APIs
- Events APIs

Availability of Timing Data

- Workflow & Construct:
 - Start Time
 - End Time
 - [Duration]

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BenchFlow Benchmarking Methodology

requirements from the WfMS

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Availability of Timing Data

- Workflow & Construct:
 - Start Time
 - End Time
 - [Duration]

Availability of Execution State

State of the workflow execution. E.g., running, completed, error

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BenchFlow Framework





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BenchFlow Framework WfMSs' specific characteristics

- Manages the Automatic WfMS deployment;
- Provides a "plugin" mechanism to add new WfMSs;
- Performs automatic Process Models deployment;
- Collects Client and Server-side data and metrics;
- Automatically computes performance metrics and statistics.

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Applications of the Methodology and Framework



[CAiSE'16]

Micro-Benchmarking BPMN 2.0 Workflow Management Systems with Workflow Patterns.



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Micro-Benchmarking with Workflow Patterns research questions

- I. What is the impact of individual or a mix of workflow patterns on the performance of each one of the benchmarked BPMN 2.0 WfMSs?
- 2. Are there performance bottlenecks for the selected WfMSs?

Selected three WfMSs: popular open-source WfMSs actually used in industry

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Sequence Pattern [SEQ]

Pattern Reference:

• N. Russell et al, Workflow Control-Flow Patterns: A Revised View, 2006

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Sequence Pattern [SEQ]



Exclusive Choice and Simple Merge [EXC]

Pattern Reference:

N. Russell et al, Workflow Control-Flow Patterns: A Revised View, 2006

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Mix Mix Mix Mix



Pattern Reference:

• N. Russell et al, Workflow Control-Flow Patterns: A Revised View, 2006

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Pattern Reference:

N. Russell et al, Workflow Control-Flow Patterns: A Revised View, 2006

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Pattern Reference:

• N. Russell et al, Workflow Control-Flow Patterns: A Revised View, 2006

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Micro-Benchmarking with Workflow Patterns

workload mix design decisions

- I. Maximise the simplicity of the model expressing the workflow pattern
- 2. Omit the interactions with external systems by implementing all tasks as script tasks

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# of Instance Producers	u	stance oducers	1500	Example for $u=1500$	
Think Time	1 sec		1200 900 600		
Max User req/sec (r)	1				
Load Time (T_l)	10 min	Pro Pro	300		
Ramp-Up Period (T_r)	30 sec		000000000000000000000000000000000000000		
Connection Time-out (T_o)	20 sec	0.0.1.7.3.k.5.6.1.8.0.			

Time (min:sec)







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Micro-Benchmarking with Workflow Patterns

configurations: WfMS environments













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Micro-Benchmarking with Workflow Patterns

configurations: WfMS environments

MySQL: Community Server 5.6.26













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Micro-Benchmarking with Workflow Patterns

configurations: WfMS environments

MySQL: Community Server 5.6.26



O.S.: Ubuntu 14.04.01 **J.V.M.:** Oracle Serv. 7u79



Ubuntu 14.04.01 Oracle Serv. 7u79



Ubuntu 14.04.01 Oracle Serv. 7u79







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Micro-Benchmarking with Workflow Patterns

configurations: WfMS environments

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Ubuntu 14.04.01 Oracle Serv. 7u79 Wildfly 8.1.0. Final







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Max Java Heap: 32GB



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Max DB Connections Number: 100







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WfMS's Containers: official ones, if available on DockerHub






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Ubuntu 14.04.01 Oracle Serv. 7u79 Wildfly 8.1.0. Final

Max DB Connections Number: 100

WfMS's Containers: official ones, if available on DockerHub WfMS's Configuration: as suggested by vendor's documentation







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Micro-Benchmarking with Workflow Patterns

configurations: WfMS deployment

Load Drivers		WfMS		DBMS	
CPU	64 Cores @ 1400 MHz	CPU	12 Cores @ 800 MHz	CPU	64 Cores @ 2300 MHz
RAM	128 GB	RAM	64 GB	RAM	128 GB

TEST ENVIRONMENT

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Micro-Benchmarking with Workflow Patterns

configurations: WfMS deployment



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Micro-Benchmarking with Workflow Patterns

configurations: WfMS deployment



O.S.: Ubuntu 14.04.3 LTS

Ubuntu 14.04.3 LTS

Ubuntu 14.04.3 LTS

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Micro-Benchmarking with Workflow Patterns

configurations: WfMS deployment



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Micro-Benchmarking with Workflow Patterns

performed experiments

Individual patterns

 I. 1500 (max) concurrent Instance Producers starting each pattern [SEQ, EXC, CYC, EXT, PAR]

Mix of patterns

2. I 500 concurrent Instance Producers starting an equal number of pattern instances (20% mix of [SEQ, EXC, CYC, EXT, PAR])

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Three runs for each execution of the experiments

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Computed Metrics and Statistics

engine level metrics



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Computed Metrics and Statistics

engine level metrics



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Micro-Benchmarking with Workflow Patterns

individual patterns: throughput (bp/sec)

	SEQ	EXC	EXT	PAR	CYC
WfMS A	1456.79	1417.17	1455.68	1433.12	327.99 u=600
WfMS B	1447.66	1436.03	1426.35	1429.65	644.02 u=800
WfMS C	63.31	49.04	0.38	48.89	13.46 u=1500

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Micro-Benchmarking with Workflow Patterns individual patterns: WfMS C Scalability for SEQ pattern

WfMS C uses a synchronous instantiation API, load drivers must wait for workflows to end before starting new ones



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Micro-Benchmarking with Workflow Patterns individual patterns: WfMS C Scalability for SEQ pattern

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Micro-Benchmarking with Workflow Patterns individual patterns: WfMS C Scalability for SEQ pattern

WfMS C uses a synchronous instantiation API, load drivers must wait for workflows to end before starting new ones



We have found a bottleneck! (~60 bp/sec)



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Computed Metrics and Statistics

process level metrics



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Computed Metrics and Statistics

process level metrics



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Micro-Benchmarking with Workflow Patterns

individual patterns: mean (instance duration time)



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Micro-Benchmarking with Workflow Patterns

individual patterns: mean (instance duration time)



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Micro-Benchmarking with Workflow Patterns

individual patterns: mean (instance duration time)



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Micro-Benchmarking with Workflow Patterns

individual patterns: mean (instance duration time)



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Micro-Benchmarking with Workflow Patterns

individual patterns: mean (instance duration time)



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Computed Metrics and Statistics

environment metrics



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Computed Metrics and Statistics

environment metrics



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Micro-Benchmarking with Workflow Patterns individual patterns: mean (RAM) and mean (CPU) usage

WfMS A WfMS B WfMS C 12,201.1612,025.5412,340.6512,215.912,074.2 100 70.0966.180 57.4260.22,976.372,935.812,747.342,936.62,851.944.624,000 CPU (%) 41.7641.6760 43.275 RAM (MB) 33.34 36. ... 40 824.96 933.31 794.92828.37 $\frac{\infty}{100}$ 2,000..... 807 5.835.735.64204.670.24.... 0 0 SEQ SEQ EXC EXT PAR CYC PAR CYC EXC EXT RAM CPU

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Micro-Benchmarking with Workflow Patterns

performed experiments

Individual patterns

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Micro-Benchmarking with Workflow Patterns

mix of patterns: duration, RAM, CPU



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Micro-Benchmarking with Workflow Patterns summary

Even though the Executed Workflows are Simple

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Micro-Benchmarking with Workflow Patterns

summary

Even though the Executed Workflows are Simple

There are relevant differences in workflows' duration and throughput among the WfMSs



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Micro-Benchmarking with Workflow Patterns

summary

Even though the Executed Workflows are Simple

There are relevant differences in workflows' duration and throughput among the WfMSs

There are relevant differences in resource usage among WfMSs



RAM



10.06 13.29

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10.06 13.29

0.7

PAR

Micro-Benchmarking with Workflow Patterns

summary

Even though the Executed Workflows are Simple

There are relevant differences in workflows' duration and throughput among the WfMSs

There are relevant differences in resource usage among WfMSs







9.3

 $0.85 \\ 0.48$

EXC

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One WfMS has bottlenecks

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Highlights

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Highlights



Benchmarking Process

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Highlights



Benchmarking Process



Benchmarking Methodology

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Highlights



Benchmarking Process



BenchFlow Framework



Benchmarking Methodology

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Highlights



Benchmarking Process



BenchFlow Framework



Benchmarking Methodology



Micro-Benchmark with WP
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Call for Collaboration

WfMSs, process models, process logs

WfMSs

- We want to add more and more WfMSs to the benchmark
- Contact us for collaboration, and BenchFlow framework support

Process Models

- We want to characterise the Workload Mix using Real-World process models
- Share your executable BPMN 2.0 process models, even anonymised

Execution Logs

- We want to characterise the Load Functions using Real-World behaviours
- Share your execution logs, even anonymised

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WORKFLOW ENGINE PERFORMANCE BENCHMARKING WITH BENCHFLOW

benchflow
 benchflow

http://benchflow.inf.usi.ch

⊠ vincenzo.ferme@usi.ch

ESOCC 2016

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BACKUP SLIDES

ESOCC 2016

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Published Work

[SSP '14]

M. Skouradaki, D. H. Roller, F. Leymann, V. Ferme, and C. Pautasso. **Technical open challenges on benchmarking workflow management systems**. In Proc. of the 2014 Symposium on Software Performance, SSP 2014, pages 105–112, 2014.

[BTW '15]

C. Pautasso, V. Ferme, D. Roller, F. Leymann, and M. Skouradaki. **Towards workflow benchmarking: Open research challenges**. In Proc. of the 16th conference on Database Systems for Business, Technology, and Web, BTW 2015, pages 331–350, 2015.

[ICPE 'I5]

M. Skouradaki, D. H. Roller, L. Frank, V. Ferme, and C. Pautasso. **On the Road to Benchmarking BPMN 2.0 Workflow Engines**. In Proc. of the 6th ACM/SPEC International Conference on Performance Engineering, ICPE '15, pages 301–304, 2015.

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Published Work

[CLOSER'15]

M. Skouradaki, V. Ferme, F. Leymann, C. Pautasso, and D. H. Roller. "**BPELanon'': Protect business processes on the cloud.** In Proc. of the 5th International Conference on Cloud Computing and Service Science, CLOSER 2015. SciTePress, 2015.

[SOSE '15]

M. Skouradaki, K. Goerlach, M. Hahn, and F. Leymann. **Application of Sub-Graph Isomorphism to Extract Reoccurring Structures from BPMN 2.0 Process Models**. In Proc. of the 9th International IEEE Symposium on Service-Oriented System Engineering, SOSE 2015, 2015.

[BPM '15]

V. Ferme, A. Ivanchikj, C. Pautasso. **A Framework for Benchmarking BPMN 2.0 Workflow Management Systems**. In Proc. of the 13th International Conference on Business Process Management, BPM '15, pages 251-259, 2015.

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Published Work

[BPMD '15]

A. Ivanchikj, V. Ferme, C. Pautasso. **BPMeter: Web Service and Application for Static Analysis of BPMN 2.0 Collections**. In Proc. of the 13th International Conference on Business Process Management [Demo], BPM '15, pages 30-34, 2015.

[ICPE '16] V. Ferme, and C. Pautasso. **Integrating Faban with Docker for Performance Benchmarking**. In Proc. of the 7th ACM/SPEC International Conference on Performance Engineering, ICPE '16, 2016.

[CLOSER '16]

V. Ferme, A. Ivanchikj, C. Pautasso., M. Skouradaki, F. Leymann. **A Container-centric Methodology for Benchmarking Workflow Management Systems**. In Proc. of the 6th International Conference on Cloud Computing and Service Science, CLOSER 2016. SciTePress, 2016.

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Published Work

[ICWE'16]

C. Jürgen, V. Ferme, H.C. Gall. Using Docker Containers to Improve Reproducibility in Software and Web Engineering Research. In Proc. of the 16th International Conference on Web Engineering, 2016.

[CAiSE '16]

M. Skouradaki, V. Ferme, C. Pautasso, F. Leymann, A. van Hoorn. **Micro-Benchmarking BPMN 2.0 Workflow Management Systems with Workflow Patterns**. In Proc. of the 28th International Conference on Advanced Information Systems Engineering, CAiSE '16, 2016.

[ICWS '16]

M. Skouradaki, V. Andrikopoulos, F. Leymann. **Representative BPMN 2.0 Process Model Generation from Recurring Structures**. In Proc. of the 23rd IEEE International Conference on Web Services, ICWS '16, 2016.

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Published Work

[SummerSOC '16]

M. Skouradaki, T. Azad, U. Breitenbücher, O. Kopp, F. Leymann. **A Decision Support System for the Performance Benchmarking of Workflow Management Systems**. In Proc. of the 10th Symposium and Summer School On Service-Oriented Computing, SummerSOC '16, 2016.

[BPM Forum '16]

V. Ferme, A. Ivanchikj, C. Pautasso. Estimating the Cost for Executing Business **Processes in the Cloud**. In Proc. of the 14th International Conference on Business Process Management, BPM Forum '16, 2016. (to appear)

[OTM '16]

M. Skouradaki, V. Andrikopoulos, O. Kopp, F. Leymann. **RoSE: Reoccurring Structures Detection in BPMN 2.0 Process Models Collections.** In Proc. of On the Move to Meaningful Internet Systems Conference, OTM '16, 2016. (to appear)





Docker Performance

[IBM '14]

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W. Felter, A. Ferreira, R. Rajamony, and J. Rubio. An updated performance comparison of virtual machines and Linux containers. IBM Research Report, 2014.

⁶⁶Our results show that containers result in equal or better performance than VMs in almost all cases.

Although containers themselves have almost no overhead, Docker is not without performance gotchas. Docker volumes have noticeably better performance than files stored in AUFS. Docker's NAT also introduces overhead for workloads with high packet rates. These features represent a tradeoff between ease of management and performance and should be considered on a case-by-case basis.

BenchFlow Configures Docker for Performance by Default

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Benchmarking Requirements

- Relevant
- Representative
- Portable
- Scalable
- Simple

- Repeatable
- Vendor-neutral
- Accessible
- Efficient
- Affordable

- K. Huppler, The art of building a good benchmark, 2009
- J. Gray, The Benchmark Handbook for Database and Transaction Systems, 1993
- S. E. Sim, S. Easterbrook et al., Using benchmarking to advance research: A challenge to software engineering, 2003









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BenchFlow Benchmarking Methodology

requirements from the WfMS





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Context » Benchmarking Requirements » Methodology Overview » Methodology Details » Advantage of Containers » 1st Application » Future Work ③ Vincenzo Ferme









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BenchFlow Benchmarking Methodology

requirements from the WfMS

Initialisation APIs



CORE











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BenchFlow Benchmarking Methodology

requirements from the WfMS



User APIs





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Context » Benchmarking Requirements » Methodology Overview » Methodology Details » Advantage of Containers » 1st Application » Future Work ③ Vincenzo Ferme







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BenchFlow Benchmarking Methodology

requirements from the WfMS

		Functionality	Min Response Data
Core APIs	Initialisation APIs	Deploy a process Start a process instance	Deployed process ID Process instance ID
Non-core APIs	User APIs	Create a user Create a group of users Access pending tasks Claim a task* Complete a task	User ID User group ID Pending tasks IDs
	Event APIs	Access pending events Issue events	Pending events IDs
	Web service APIs	Map tasks to Web service endpoints	

*Optional depending on the WfMS implementation

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BenchFlow Framework

system under test



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BenchFlow Framework

system under test



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BenchFlow Framework

system under test



Docker Machine



Docker Engine Containers

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BenchFlow Framework

system under test



Docker Machine





Docker Engine Containers

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BenchFlow Framework

system under test



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BenchFlow Framework

system under test





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BenchFlow Framework

system under test



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Server-side Data and Metrics Collection

asynchronous execution of workflows



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Server-side Data and Metrics Collection

asynchronous execution of workflows



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Server-side Data and Metrics Collection

asynchronous execution of workflows



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Server-side Data and Metrics Collection

monitors





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monitors



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Server-side Data and Metrics Collection

monitors

Monitors' Characteristics:

- RESTful services
- Lightweight (written in Go)
- As less invasive on the SUT as possible

Examples of Monitors:

- CPU usage
- Database state

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Server-side Data and Metrics Collection

monitors

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Server-side Data and Metrics Collection

collect data

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Server-side Data and Metrics Collection

collect data

Collectors' Characteristics:

- **RESTful** services •
- Lightweight (written in Go)
- Two types: online and offline
- Buffer data locally •

Examples of Collectors:

- Container's Stats (e.g., CPU usage) •
- Database dump •
- Applications Logs •

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Server-side Data and Metrics Collection

collect data

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- **Applications** Logs •

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Synchronisation with the Analyses

schedule analyses

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Synchronisation with the Analyses

schedule analyses

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Synchronisation with the Analyses

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Synchronisation with the Analyses

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Synchronisation with the Analyses

schedule analyses





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Performance Metrics and KPIs

amount of data



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Performance Metrics and KPIs

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amount of data



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Micro-Benchmarking with Workflow Patterns

mix of patterns: throughput (bp/sec)

MIX

WfMS A 1061.27

WfMS B 1402.33

WfMS C





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Computed Metrics and Statistics

feature level metrics





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Computed Metrics and Statistics

feature level metrics





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Computed Metrics and Statistics

interactions metrics





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Computed Metrics and Statistics

interactions metrics



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Computed Metrics and Statistics

descriptive and homogeneity statistics

- Descriptive Statistics (e.g., Mean, Confidence Interval, Standard Deviation, Percentiles, Quartiles, ...)
- Coefficient of Variation across trials
- Levene Test on trials