

# Starting Workflow Tasks Before They're Ready

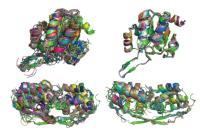
Wladislaw Gusew, Björn Scheuermann

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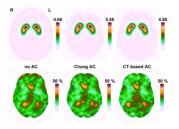
# Agenda

- Introduction
- Execution semantics
- Methods and tools
- Simulation results
- Experimental results
- ► Conclusion

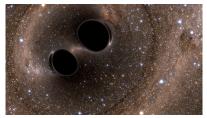
# BIG DATA IN RESEARCH



Life sciences



Medicine

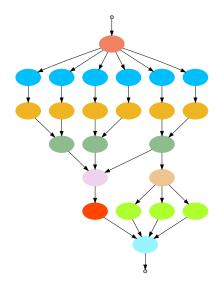


Natural sciences



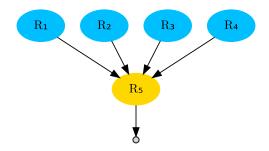
Engineering

#### Scientific workflow example

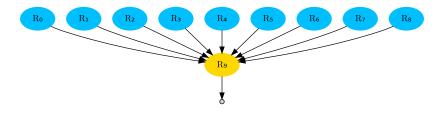


- Directed Acyclic Graph (DAG)
- Executed on distributed systems
- Aggregation and broadcast types of tasks
- Demanding for network resources

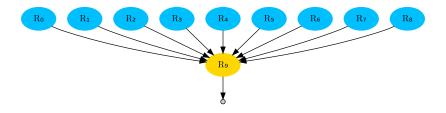
### EXECUTION SEMANTICS



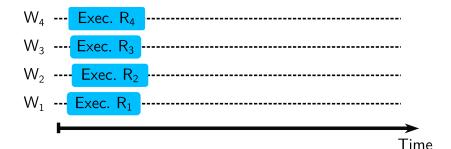
## EXECUTION SEMANTICS

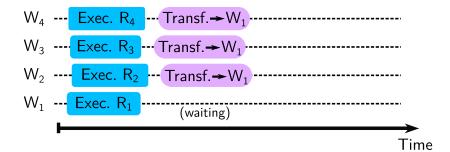


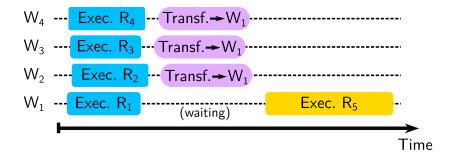
# EXECUTION SEMANTICS

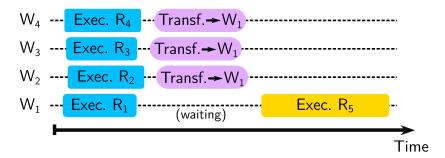


- But in reality resources are limited
- Execute only a subset of parent tasks concurrently (insufficient number of workers)
- ► Congestion of network (all parent tasks have the same priority)





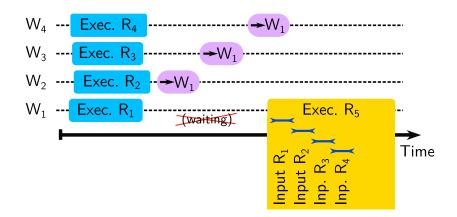


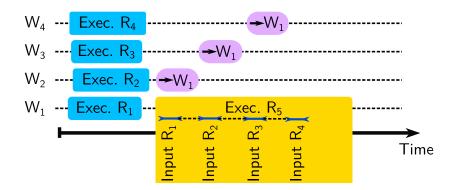


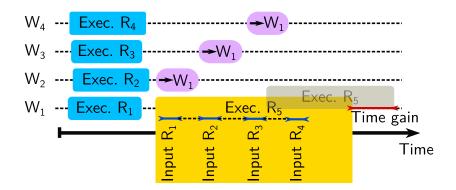
- Network congestion can slow down processing even further (effects of data losses at the transport protocol layer)
- High delay to the start of the aggregation task
- Low performance and high execution costs (e.g., in computation clouds)

$$W_{4} \xrightarrow{} exec. R_{4} \xrightarrow{} exec. R_{4} \xrightarrow{} exec. R_{3} \xrightarrow{} W_{1} \xrightarrow{} W_{1} \xrightarrow{} W_{1} \xrightarrow{} W_{2} \xrightarrow{} exec. R_{3} \xrightarrow{} exec. R_{2} \xrightarrow{} exec. R_{1} \xrightarrow{} W_{1} \xrightarrow{$$

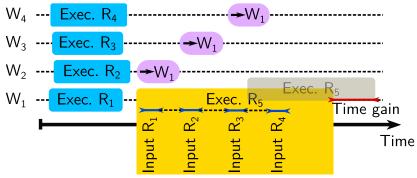
$$W_{4} \xrightarrow{} exec. R_{4} \xrightarrow{} exec. R_{5} \xrightarrow{} exec. R_{6} \xrightarrow{} exec. R_{7} \xrightarrow{} ex$$





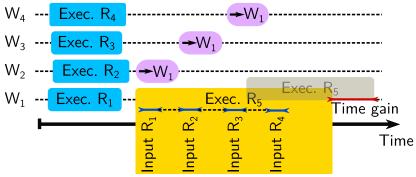


What can we do to improve this?



List of actions:

- 1. Obtain information on task's input characteristics
- 2. Refine the workflow and inform the execution engine
- 3. Let the aggregation task "feel comfortable" in changed setting



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#### **OBTAINING INPUT CHARACTERISTICS**

- 1. Annotations to workflows
- 2. Manual code review
- 3. Automated profiling

## AUTOMATED PROFILING

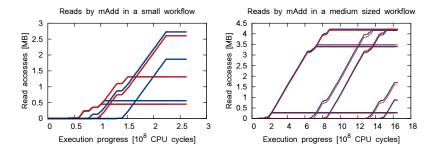


- Operating system instrumentation tool
- Enables interception of system calls (file open, read/write, file close)
- Record and evaluate logfiles with traces of conducted file accesses.

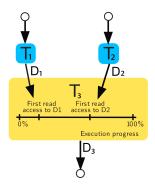
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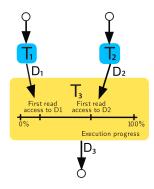


# REFINING WORKFLOW BY TRANSFORMING DAG



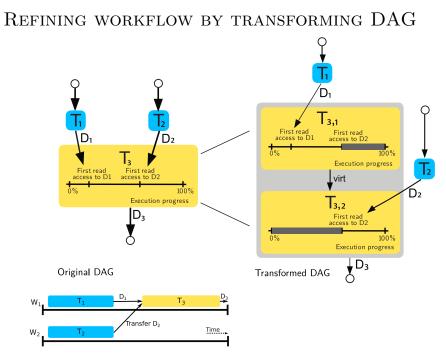
Original DAG

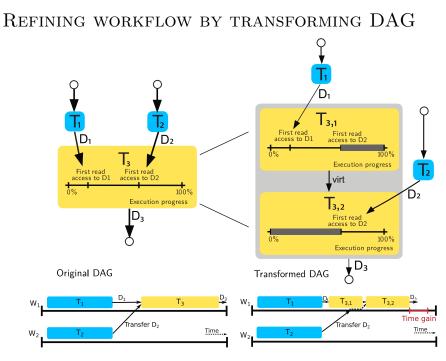
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Original DAG





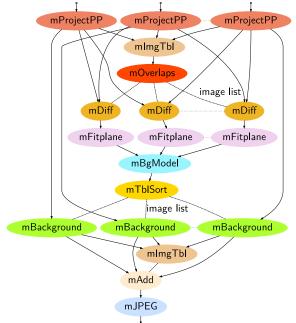


#### REALIZING VIRTUAL TASK SPLIT



- Real task is transparently wrapped
- FUSE enables the setup of a virtual File system in USEr space
- Access to input files is performed through our wrapper
- Wrapper is responsible for maintaining the correct execution logic

#### EVALUATION WITH THE MONTAGE WORKFLOW



#### SIMULATING WORKFLOW EXECUTION



- Java-based simulation framework for scientific workflows
- ► Simulates an execution on a Pegasus/HTCondor stack
- ► Use provided Montage workflows with 25, 50, 100, 1000 tasks
- Python script conducted DAG transformation of DAX files
- Network configured as bottleneck (by bandwidth limitation)

W. Chen and E. Deelman, "WorkflowSim: A toolkit for simulating scientific workflows in distributed environments," in eScience'12.

# SIMULATION RESULTS

		Scheduling and planning algorithms												
#VMs	#Tasks	Min-Min	Max-Min	Round-robin	HEFT	DHEFT	HEFT Random							
5	25	10.5	15.0	12.9	12.7	11.1	40.5	_						
5	50	10.4	13.1	15.5	-22.8	15.2	39.9	[%]						
5	100	10.1	11.1	12.1	8.7	13.4	12.6							
5	1000	11.1	10.3	10.4	7.3	7.5	10.9	tin						
10	25	14.5	14.5	15.7	11.1	11.3	7.7	runtime						
10	50	14.7	18.9	14.8	12.1	13.3	4.8							
10	100	14.5	17.2	21.2	10.3	19.5	11.3	fl						
10	1000	17.0	16.4	16.1	8.6	10.5	-0.1	workflow						
50	25	14.5	14.5	15.7	11.1	11.3	20.6							
50	50	16.1	19.0	20.0	16.3	13.9	0.0	total						
50	100	25.9	24.6	25.2	25.2	16.7	-0.8	of tc						
50	1000	31.1	30.7	31.1	29.9	15.1	20.7							
100	25	14.5	14.5	15.7	11.1	11.3	-8.4	ti.						
100	50	16.1	19.0	20.0	16.3	13.9	1.4	Reduction						
100	100	24.8	26.6	27.6	25.1	16.7	33.9	Sec						
100	1000	34.2	33.5	33.7	33.1	18.8	4.7	-						

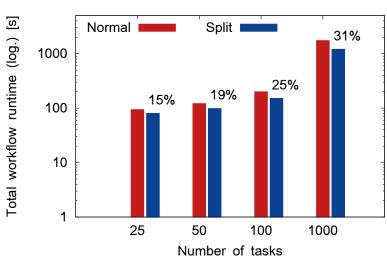
17 14 10 7 4 0 -3 -6 -10 -13 -16 -20 -23

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		Scheduling and planning algorithms												
#VMs	#Tasks	Min-Min	Max-Min	Round-robin	HEFT	HEFT DHEFT								
5	25	10.5	15.0	12.9	12.7	11.1	40.5	1_1						
5	50	10.4	13.1	15.5	-22.8	15.2	39.9	%]						
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100	1000	34.2	33.5	33.7	33.1	18.8	4.7	<u> </u>						

17 14 10 7 4 0 -3 -6 -10 -13 -16 -20 -23

# VARIATION OF NUMBER OF TASKS

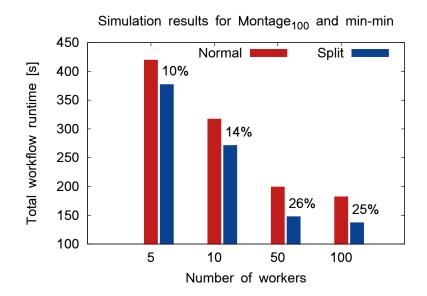


Simulation results for 50 workers and max-min

# VARIATION OF WORKERS

		Scheduling and planning algorithms												
#VMs	#Tasks	Min-Min	-Min Max-Min Rour		HEFT	DHEFT	Random							
5	25	10.5	15.0	12.9	12.7	11.1	40.5							
5	50	10.4	13.1	15.5	-22.8	15.2	39.9	%]						
5	100	10.1	11.1	12.1	8.7	13.4	12.6							
5	1000	11.1	10.3	10.4	7.3	7.5	10.9	Ei.						
10	25	14.5	14.5	15.7	11.1	11.3	7.7	runtime						
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10	100	14.5	17.2	21.2	10.3	19.5	11.3	flo						
10	1000	17.0	16.4	16.1	8.6	10.5	-0.1	workflow						
50	25	14.5	14.5	15.7	11.1	11.3	20.6							
50	50	16.1	19.0	20.0	16.3	13.9	0.0	total						
50	100	25.9	24.6	25.2	25.2	16.7	-0.8	of tc						
50	1000	31.1	30.7	31.1	29.9	15.1	20.7							
100	25	14.5	14.5	15.7	11.1	11.3	-8.4	Reduction						
100	50	16.1	19.0	20.0	16.3	13.9	1.4	fuc						
100	100	24.8	26.6	27.6	25.1	16.7	33.9	Sec						
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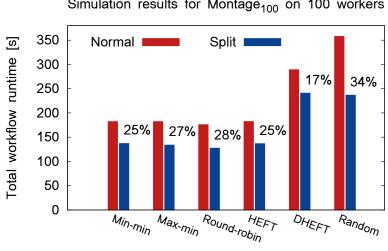
# VARIATION OF WORKERS



# VARIATION OF SCHEDULING ALGORITHMS

		Scheduling and planning algorithms																				
#VMs	#Tasks	Mi	Min-Min		Min-Min		Min-Min		∕lin-Min		Max-Min		Round-rob		HEFT		DHEFT	F	Random			
5	25		10.5		15.0		12.9		12.7		11.1		40.5		_		40					
5	50		10.4		13.1		15.5		-22.8		15.2		39.9		%		37 34					
5	100		10.1		11.1		12.1		8.7		13.4		12.6		le		30					
5	1000		11.1		10.3		10.4		7.3		7.5		10.9		tin		27					
10	25		14.5		14.5		15.7		11.1		11.3		7.7		runtime		24					
10	50		14.7		18.9		14.8		12.1		13.3		4.8				20 17					
10	100		14.5		17.2		21.2		10.3		19.5		11.3		flo		14					
10	1000		17.0		16.4		16.1		8.6		10.5		-0.1		workflow		10					
50	25		14.5		14.5		15.7		11.1		11.3		20.6				7					
50	50		16.1		19.0		20.0		16.3		13.9		0.0		total		4					
50	100		25.9		24.6		25.2		25.2		16.7		-0.8				-3					
50	1000		31.1		30.7		31.1		29.9		15.1		20.7		n of		-6					
100	25		14.5		14.5		15.7		11.1		11.3		-8.4		tioi		-10					
_100	50		16.1		19.0		20.0		16.3		13.9		1.4		Inc		-13 -16					
100	100		24.8		26.6		27.6		25.1		16.7		33.9		Reduction		-20					
100	1000		34.2		33.5		33.7		33.1		18.8		4.7	_	щ		-23					

#### VARIATION OF SCHEDULING ALGORITHMS



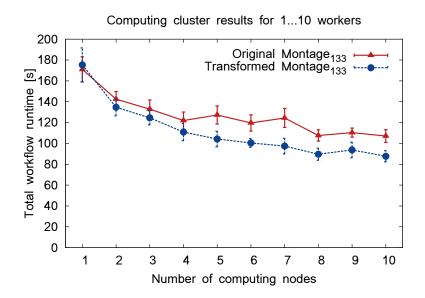
Simulation results for Montage<sub>100</sub> on 100 workers

Scheduling algorithm

#### EVALUATION IN A COMPUTING CLUSTER

- ► Small cluster of up to 10 compute nodes
- Intel i7 CPU@ 2.5GHz, 8GB RAM, connected to common network switch with 1Gbit/s
- ► Execute Montage\_133 workflow in Pegasus/HTCondor
- Network bandwidth was limited on application layer to 10Mbit/s
- ▶ 10 repetitions, mean values with 95% confidence intervals

## Measurement results



#### CONCLUSION

- Many "legacy" workflows exist which are executed with classic semantics
- Our approach is applicable to aggregation tasks that are often the most time intensive tasks in a workflow
- By using DAG transformation, no changes to task implementations and execution engines are required

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- Many "legacy" workflows exist which are executed with classic semantics
- Our approach is applicable to aggregation tasks that are often the most time intensive tasks in a workflow
- By using DAG transformation, no changes to task implementations and execution engines are required
- Simulation and real experiment show that performance can be improved by up to 15%
- Potential of outperforming the original workflow grows with increasing #workers and #tasks