

# Checkpointing workflows for fail-stop errors



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Revised version just made it!

- Scheduling workflows for **fail-stop errors**
- Decide
  - (i) allocation of tasks to processors
  - (ii) which task to checkpoint
- **Go beyond linear chains** (ok, with parallel tasks)
  - ⇒ analysis with unique (powerful, error-prone) super-processor
- **Go beyond linear algebra kernels**
  - ⇒ extensive re-use of input/output files

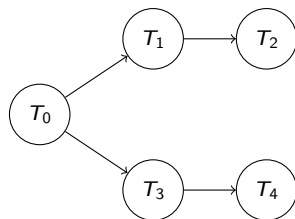
# Outline

- 1 CKPTNONE
- 2 CKPTALL
- 3 CKPTSOME
- 4 Experiments
- 5 Conclusion

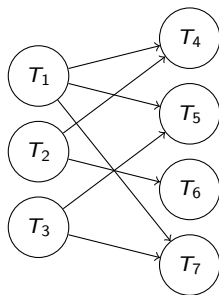
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- No task is checkpointed



With one processor



With one processor





With several processors

ALLOCATION & ORDERING GIVEN

⇒ compute makespan



With several processors

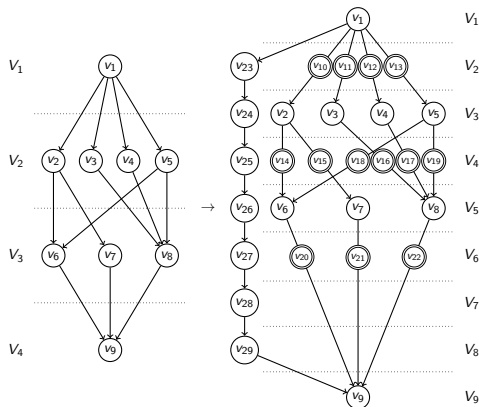
ONE PROCESSOR PER TASK

⇒ compute makespan



ONE PROCESSOR PER TASK,  
UNIT-SIZE TASKS, NO COMMUNICATION COST  
 $\Rightarrow$  compute makespan





# #P-COMPLETE

ONE PROCESSOR PER TASK,  
UNIT-SIZE TASKS, NO COMMUNICATION COST

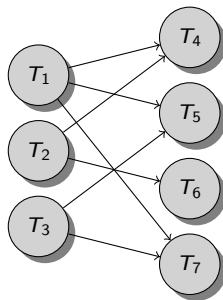
⇒ compute makespan

# Outline

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- Each task is checkpointed
- De-facto standard for Workflow Management Systems
- Problem 1: find an allocation and ordering (**solution**)
- Problem 2: given a solution, compute the makespan?

## Problem 2: Makespan of a solution



- Each task is checkpointed:  
expected makespan  $\Rightarrow$  longest path of probabilistic DAGs
- Equivalent to having one processor per task



# Longest path of probabilistic DAGs

- Also known as PERT problems
- Task weights = random variables
- Unlimited resources (one processor per task)
- Expected length of longest path?
  - #P-complete problem (reduction from reliability)
  - #P-complete if each task has two possible values

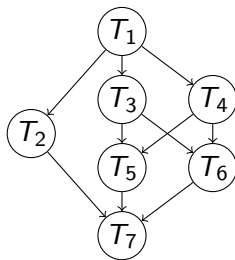
# Longest path of probabilistic DAGs

## Evaluation methods

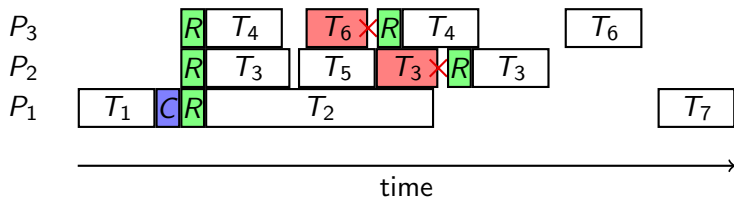
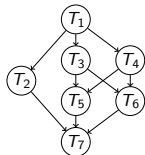
- MONTECARLO
- DODIN
- NORMAL

# Outline

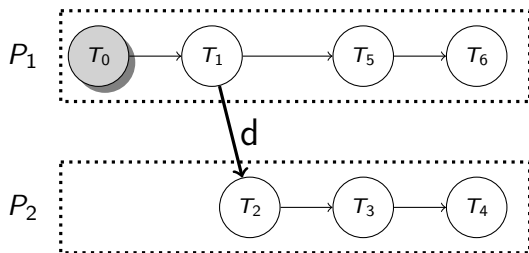
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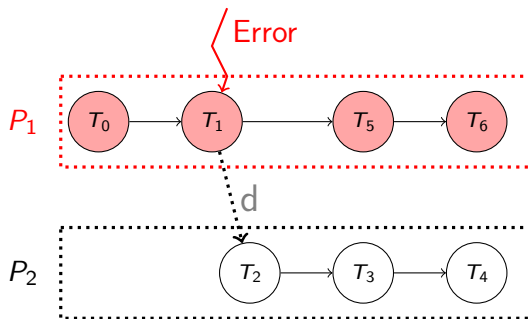
# CKPTSOME



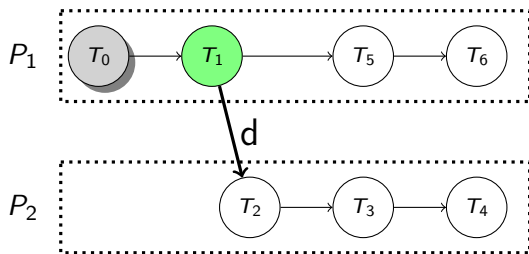
# Crossover dependency



# Crossover dependency

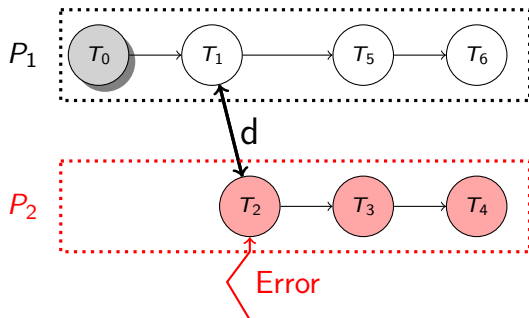


# Crossover dependency



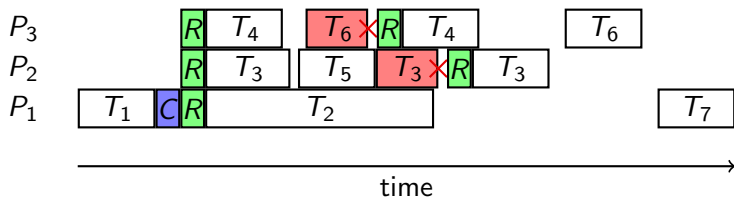


# Crossover dependency



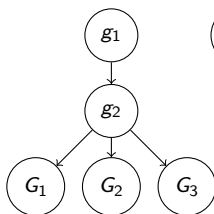
- Each processor is scheduled to execute many tasks
- Due to crossover dependencies, a few crashes can lead to many task re-executions and data re-transfers, during which other crashes can occur
- **Avoid crossover dependencies!**

## Back to the example

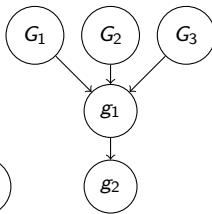


**Checkpoint every task except  $T_2$  and  $T_7$   
to avoid cross-dependencies**

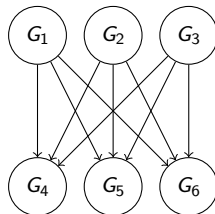
- Series-parallel graphs without merging sources/sinks
- Examples:



(a)

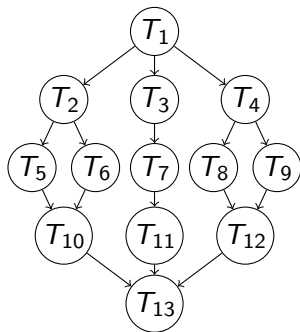


(b)



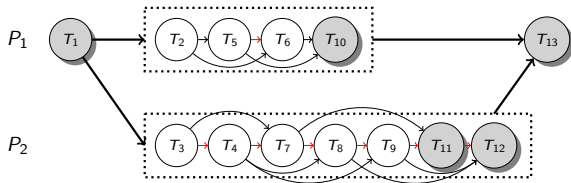
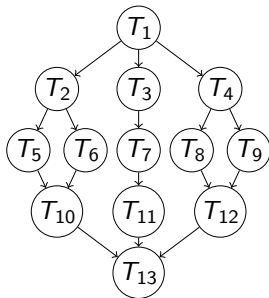
(c)

# Scheduling M-SPGs



- Proportional mapping applied recursively
- Sets of tasks assigned to a single processor are linearized into superchains
- Checkpoint all exit tasks in each superchain

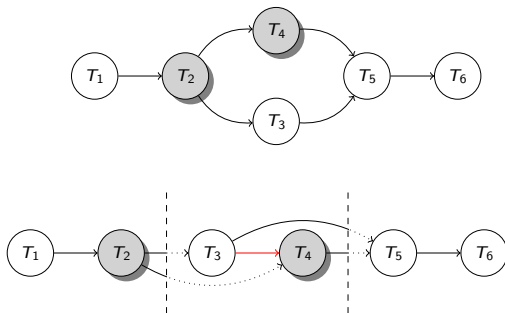
# Scheduling M-SPGs



# First solution

- Coalesce all tasks of a superchain into a single big task
- Checkpoint that big task
- Then use Monte-Carlo to evaluate makespan
- Works but may not use enough checkpoints

# Checkpointing superchains



Checkpoint = saving to stable storage all output data of previously executed but un-checkpointed tasks

Optimal dynamic programming algorithm

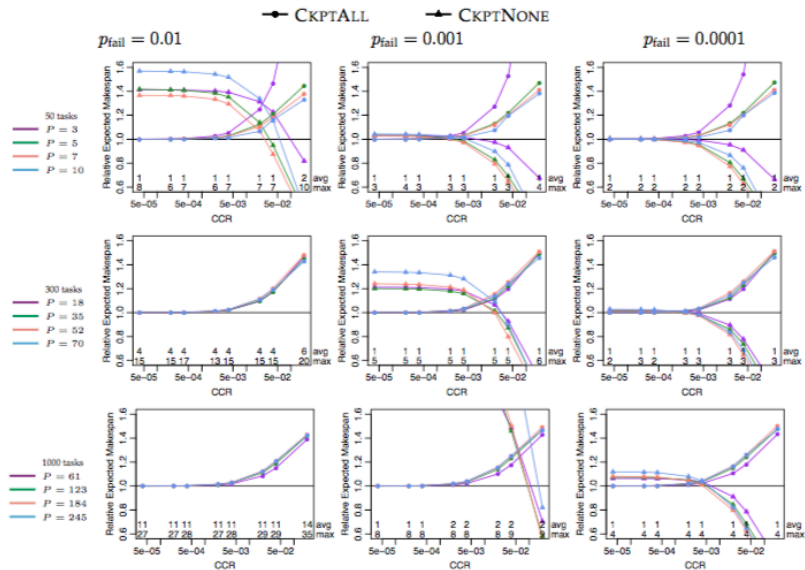


# Outline

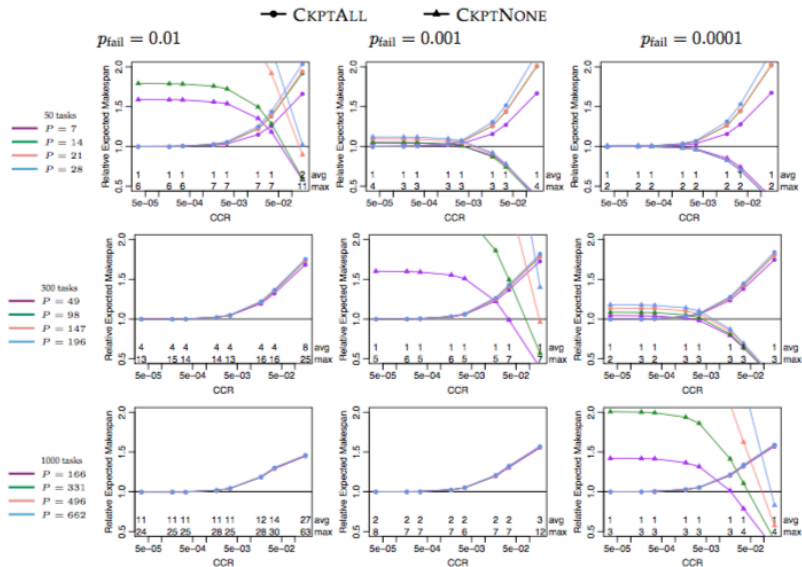
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- Pegasus workflows: MONTAGE, LIGO, GENOME
- Task weights in seconds, file sizes in bytes  
⇒ vary Communication-to-Computation Ratio CCR
- Each task fails with probability  $p_{\text{fail}} \in \{1\%, 0.1\%, 0.01\%\}$

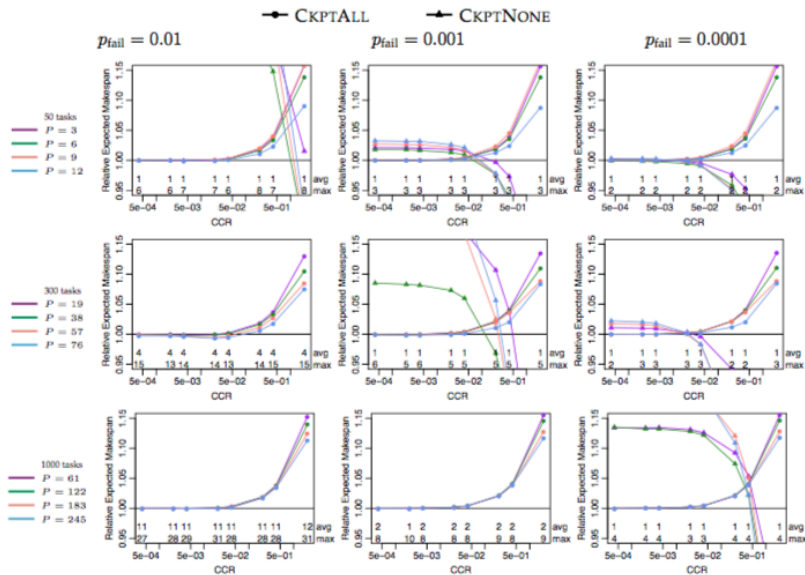
# Results for GENOME



# Results for MONTAGE



# Results for LIGO



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## Summary

- M-SPGs broadly relevant to production workflows
- M-SPGs structure key to design CKPTSome
- Attractive compromise between CKPTAll and CKPTNone:
  - CKPTSome always outperforms CKPTAll
  - CKPTSome outperformed by CKPTNone only when checkpoints are expensive and/or failures are rare

## Future work

- Extension to parallel (moldable) tasks
- Extension to General Series Parallel Graphs (transitive reduction is an M-SPG)
- Refine linearization algorithm (related to sum-cut problem)

## Summary

- M-SPGs broadly relevant to production workflows
- M-SPGs structure key to design CKPTSOME
- Attractive compromise between CKPTALL and CKPTNONE:
  - CKPTSOME always outperforms CKPTALL
  - CKPTSOME outperformed by CKPTNONE only when checkpoints are expensive and/or failures are rare

## Future work

Candid conclusion

Disappointing to be stuck with specific graphs

Problem still open 😞

(related to sum-cut problem)



This is my 10th trip to Hawai'i



MAHALO!

# This is my 100th trip to Knoxville



# THANK YE ALL!