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# Static Scheduling of Parallel Tasks

## - A Quick Review -

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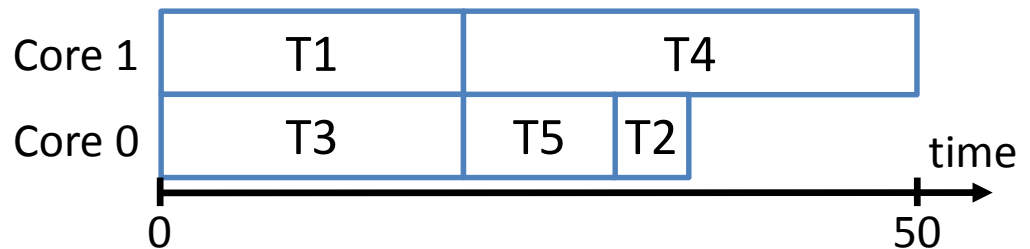
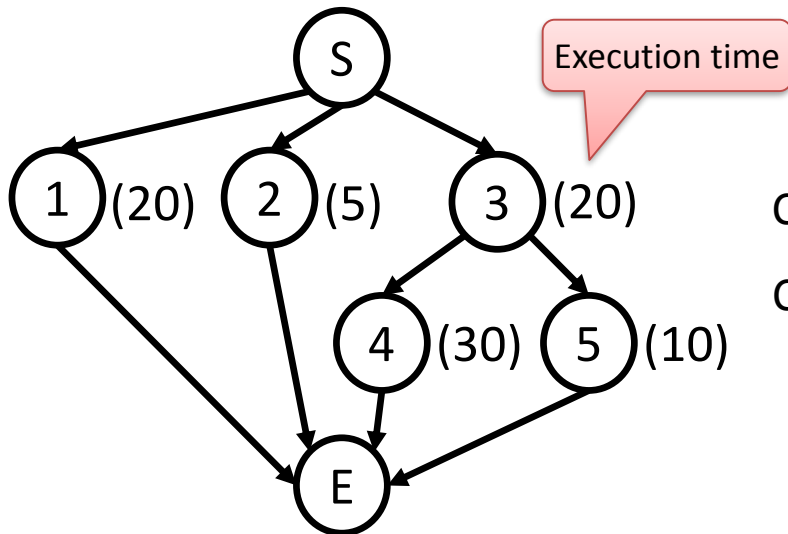
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MPSoC 2019

# Classic Task Scheduling on Multicores

- ◆ Problem
  - ◆ Given: task graph, # cores
  - ◆ Goal: minimization of schedule length
- ◆ NP-hard complexity
- ◆ Many algorithms developed
  - ◆ List scheduling, SA, GA, B&B, ILP, etc.
- ◆ Heuristic algorithms try to execute as many tasks as possible simultaneously on different cores



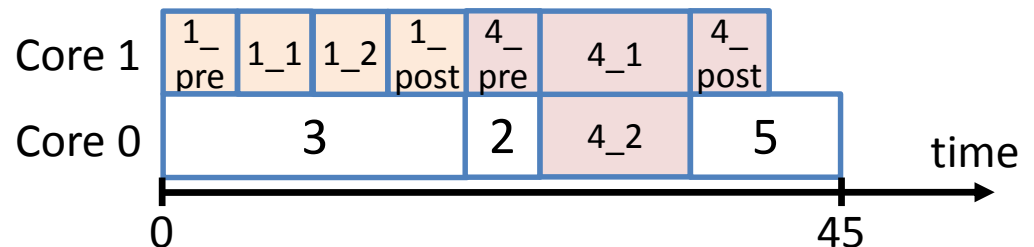
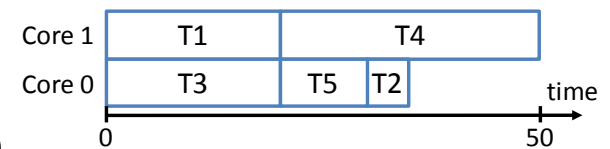
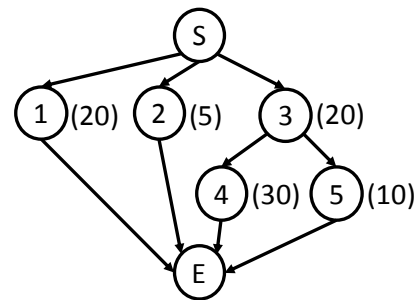
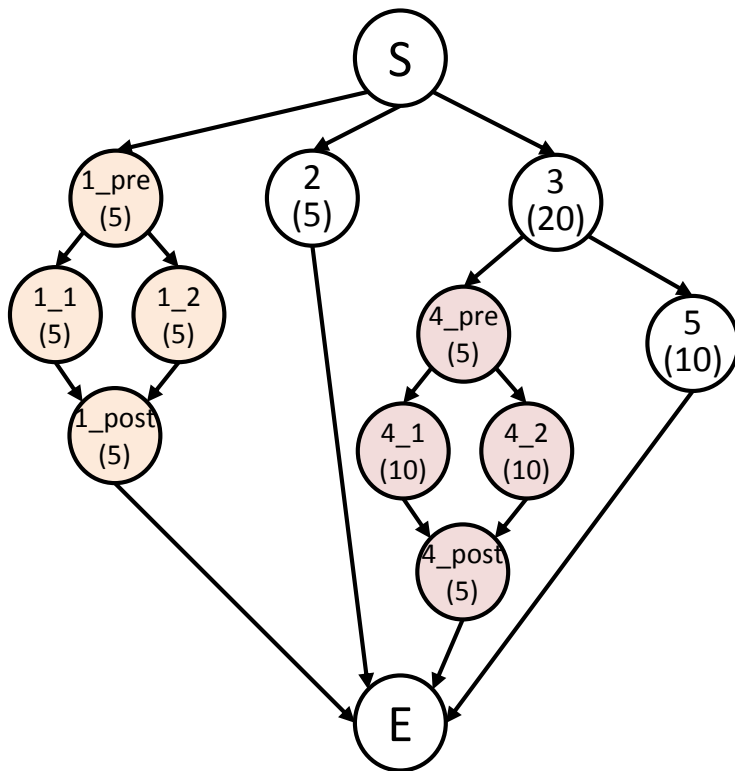
# Lots of Extensions

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- ◆ Inter-task communication
  - ◆ Buses, NoCs, etc.
- ◆ Heterogeneous cores
- ◆ Dynamic power management
- ◆ Dynamic voltage and frequency scheduling
- ◆ Probabilistic execution times of tasks
- ◆ Resource conflicts among running tasks
  - ◆ memory, buses, I/O, etc.
- ◆ Conditional task graphs
- ◆ Pipelined scheduling
- ◆ Deadline constraints for individual tasks
- ◆ Multiple task graphs with different execution rates
- ◆ **Intra-task data parallelism**
  - ◆ **Individual tasks may run on multiple cores**
- ◆ Much more

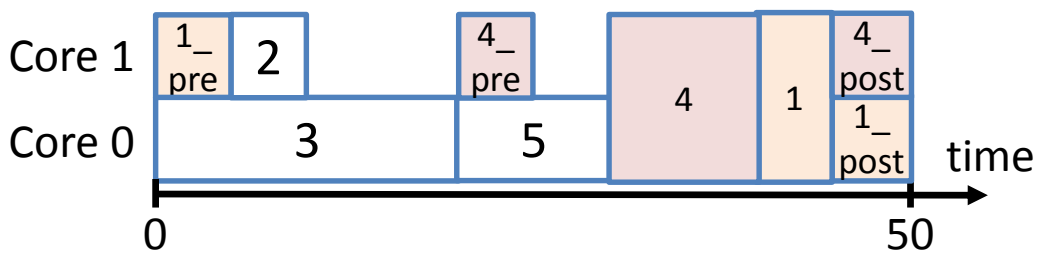
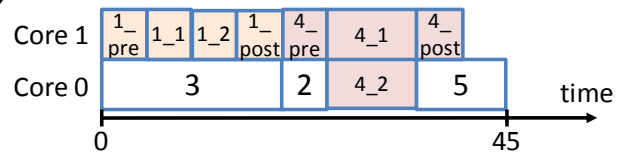
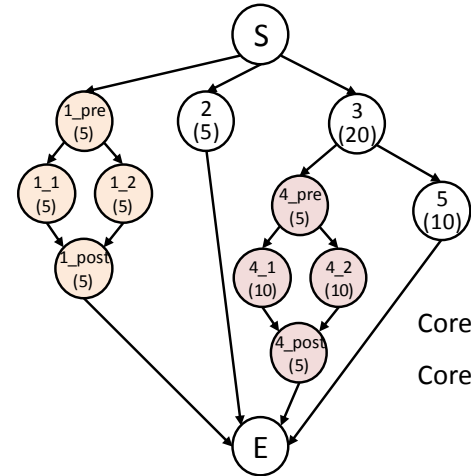
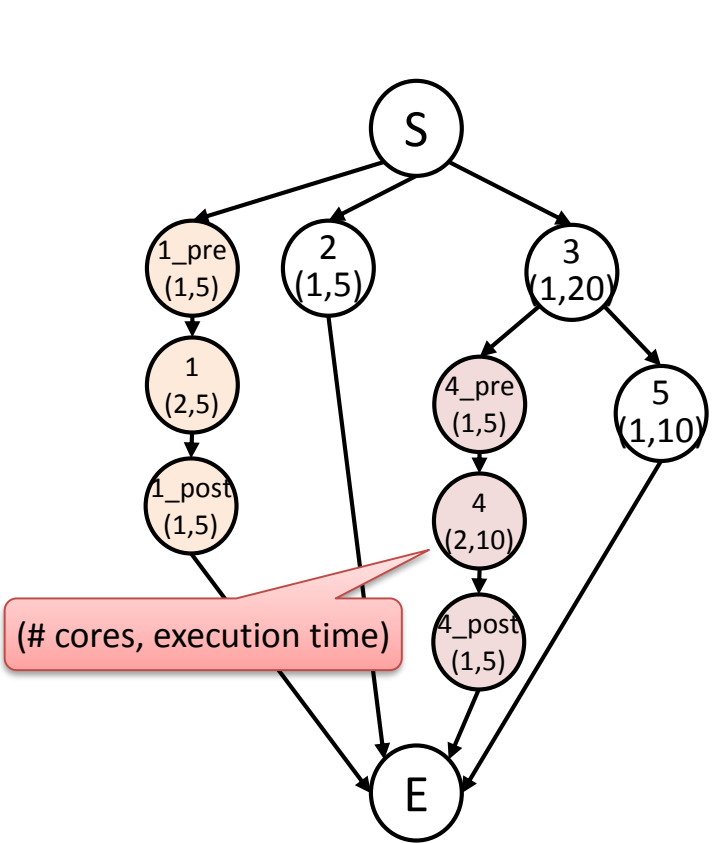
# Fork-Join Parallel Tasks

- ◆ In many application domains such as multimedia, individual tasks have inherent data parallelism
- ◆ A task can be split into multiple threads (sub-tasks) to allow data parallel execution in a fork-join manner
- ◆ No extension is necessary in scheduling algorithms



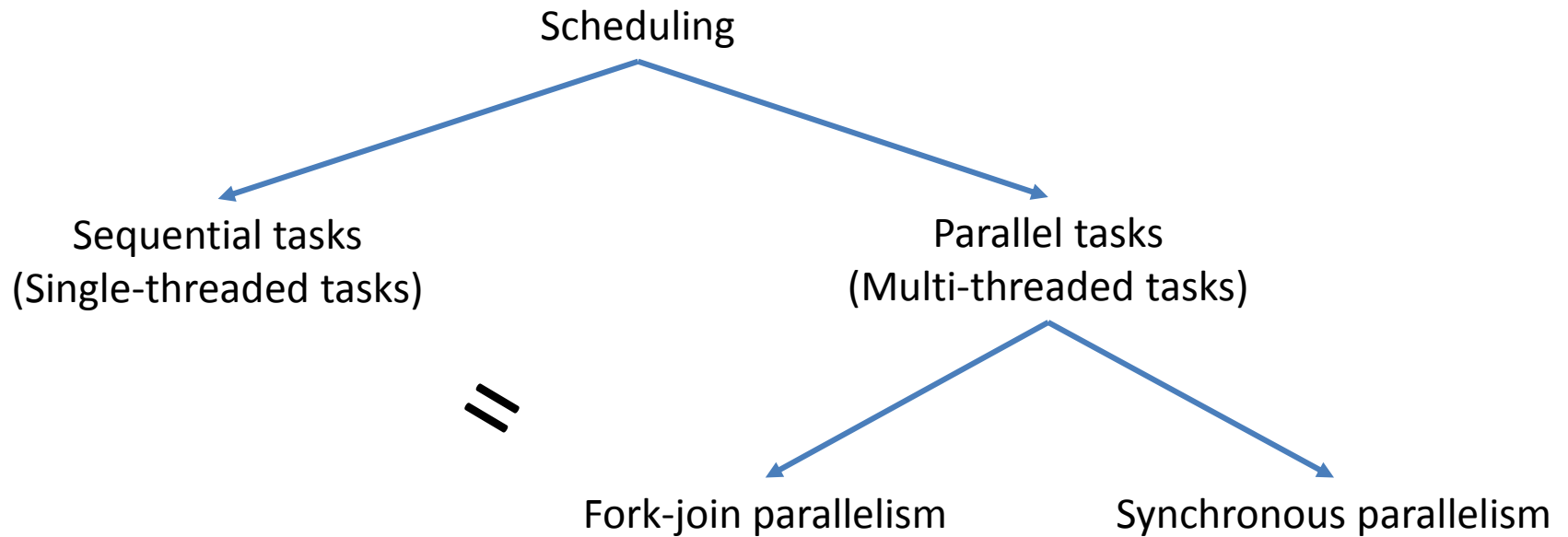
# Synchronous Parallel Tasks

- ◆ Sub-tasks may communicate and synchronize with each other very frequently
- ◆ Such sub-tasks need to be executed in parallel at the same time
- ◆ Several algorithms extended
  - ◆ List scheduling, B&B, GA, etc.
  - ◆ Yang Liu, *Scheduling Algorithms for Data-Parallel Tasks on Multicore Architectures*, Ph.D. thesis, Ritsumeikan University, 2018.



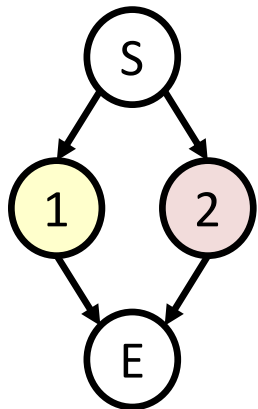
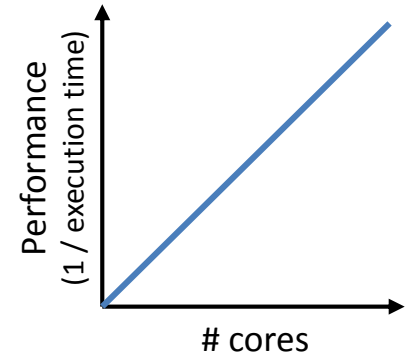
# Classification of Multicore Task Scheduling

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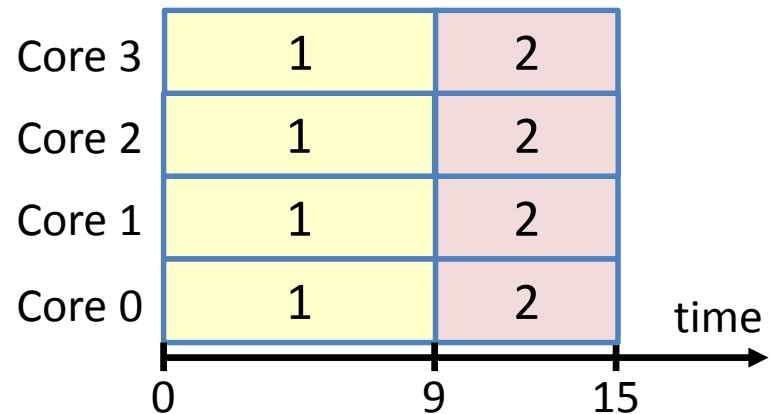
# Question

- ◆ For each task, who decides the number of sub-tasks, and how?
- ◆ Ideal case
  - ◆ All tasks are parallelizable and scalable
  - ◆ Best schedule is
    - ◆ Assign all cores to the tasks
    - ◆ Schedule the tasks sequentially



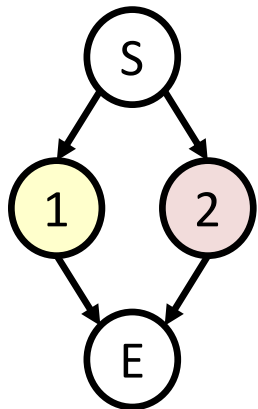
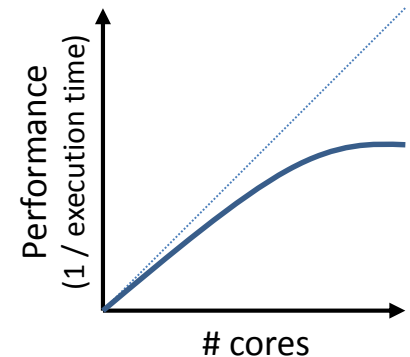
Execution time

# cores	Task 1	Task 2
1	36	24
2	18	12
3	12	8
4	9	6



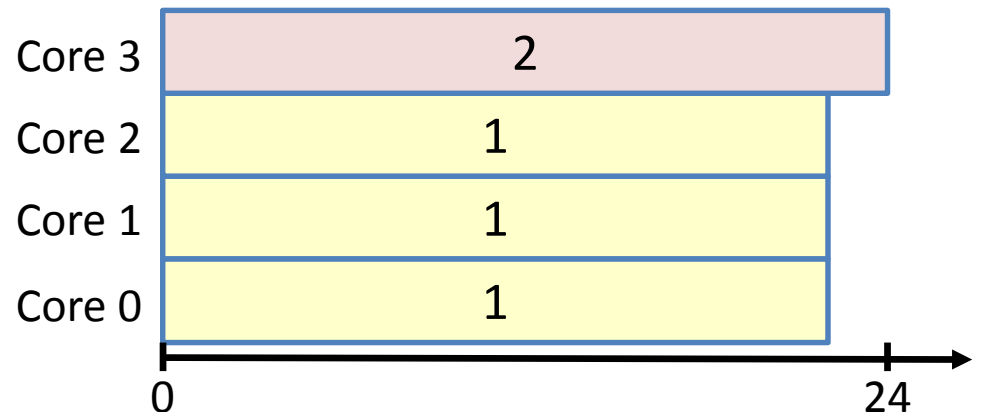
# Question

- ◆ For each task, who decides the number of sub-tasks, and how?
- ◆ Reality
  - ◆ Performance of parallel processing is rarely proportional to the number of cores
- ◆ The number of sub-tasks should be determined at the same time as task scheduling
  - ◆ **Malleable** (or moldable) task scheduling



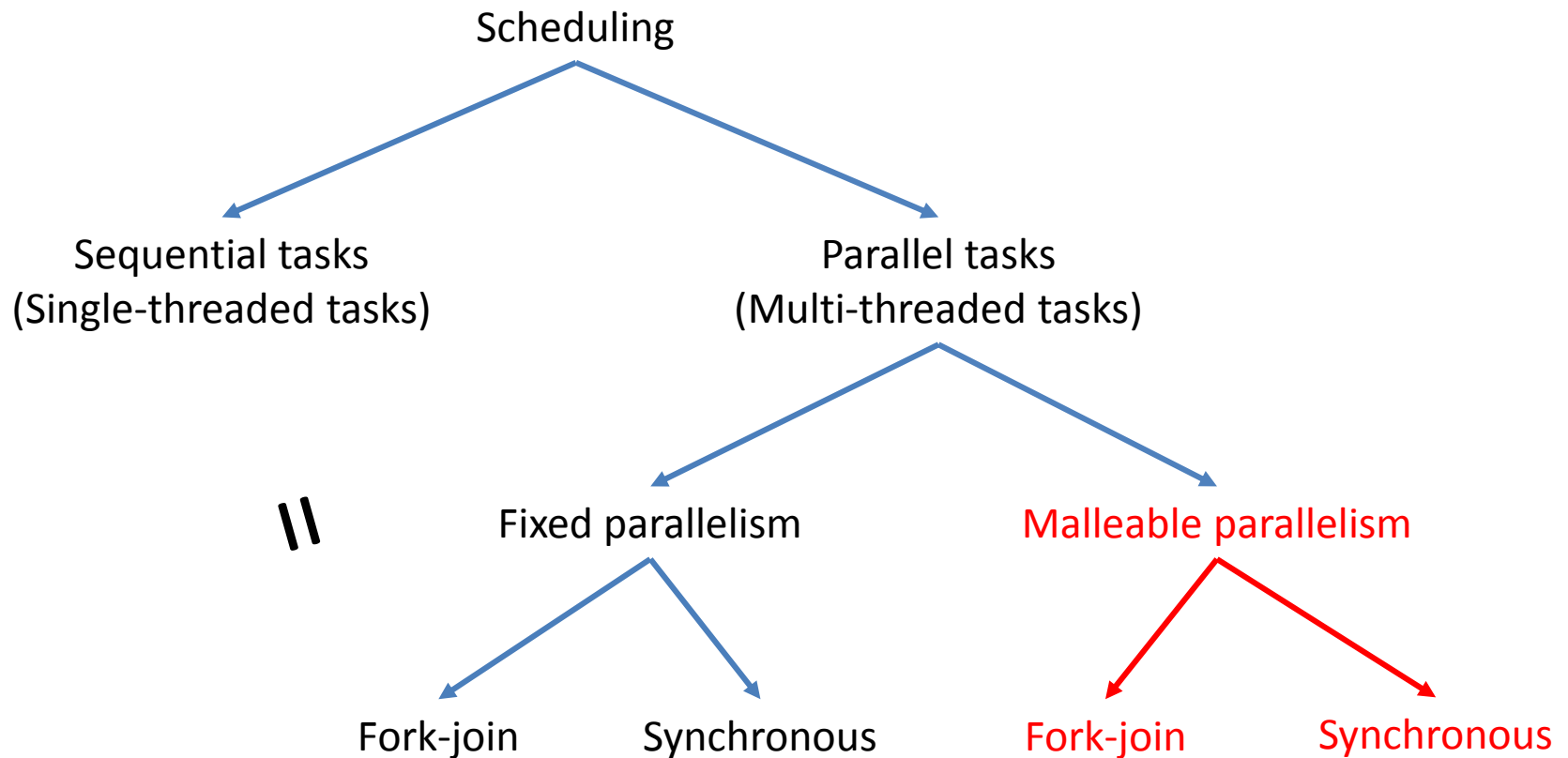
Execution time

# cores	Task 1	Task 2
1	36	24
2	28	18
3	22	14
4	18	12





# Classification of Multicore Task Scheduling

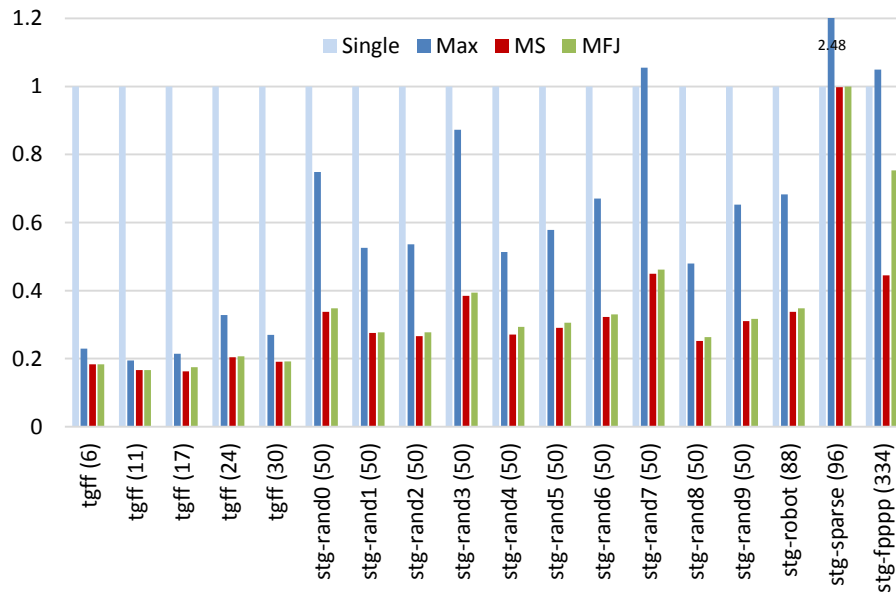


# Experiments on Malleable Task Scheduling

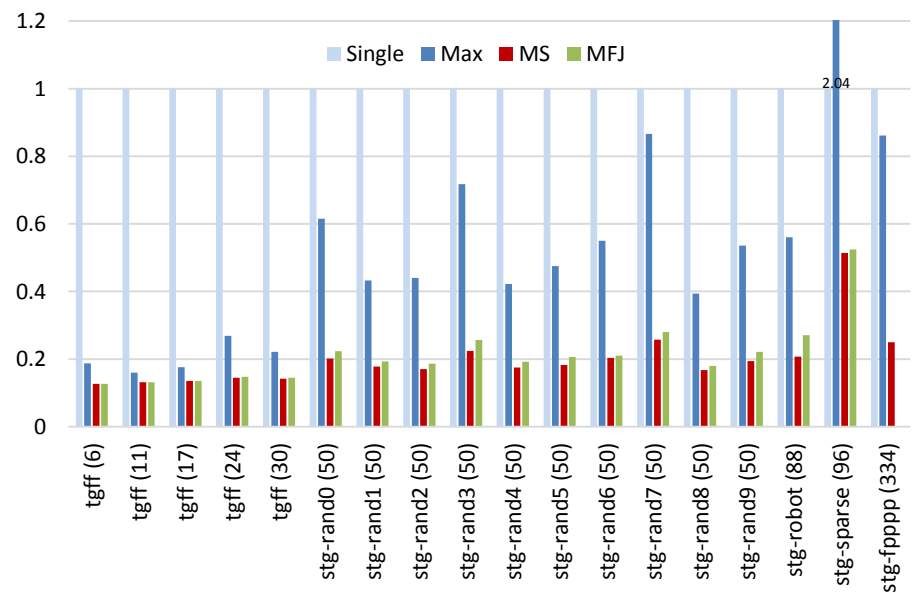
- ◆ Our approach
  - ◆ Constraint programming
  - ◆ IBM CP Optimizer
    - ◆ CPU time limited to 10 hours
- ◆ Benchmark task graphs
  - ◆ TGFF (task graph for free)
  - ◆ STG (standard task graphs) from Waseda University

- ◆ Compared methods
  - ◆ Single
    - ◆ Single core for each task
  - ◆ Max
    - ◆ All cores for each task, sequential order
  - ◆ MS
    - ◆ Malleable synchronous scheduling
  - ◆ MFJ
    - ◆ Malleable fork-join scheduling

Schedule length on 16 cores

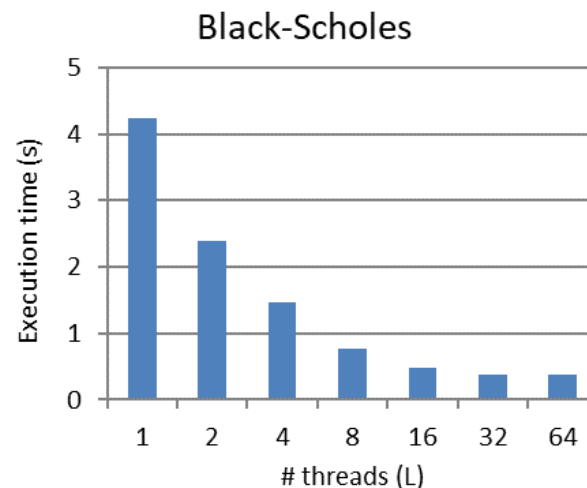
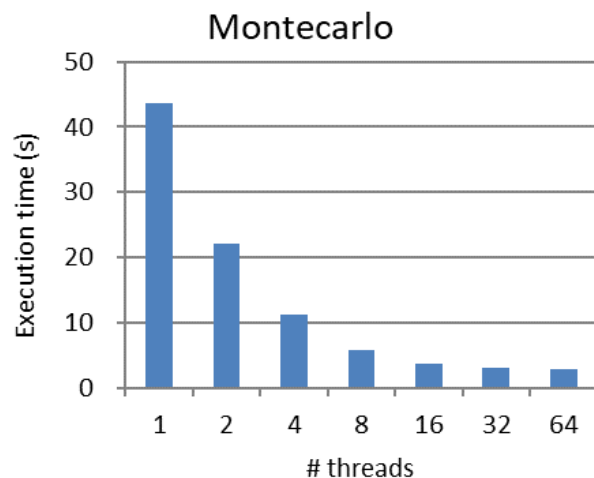


Schedule length on 32 cores



# Our OpenCL Framework for Multicores

- ◆ In OpenCL, data is split into *work-items*
- ◆ A work-item is the minimum unit of parallel execution
  - ◆ On GPU, a work-item corresponds to a thread
- ◆ Our OpenCL framework aggregates work-items to form **the user-specified number of threads**
  - ◆ A thread has a *for*-loop to iteratively process the work-items
- ◆ We are now working on automatic optimization of the number of threads



# Summary

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- ◆ Task scheduling should take account of both inter-task parallelism and intra-task parallelism in order to take advantage of manycore architecture
- ◆ The degree of intra-task parallelism (the number of cores for each task) should be determined at the same time as task scheduling
- ◆ Future work
  - ◆ Lots of extensions
    - ◆ Communication, heterogeneous cores, DPM, DVFS, probabilistic execution times, resource conflicts, deadline constraints, and more
  - ◆ Online task scheduling with online learning