

# Partitioning Large Workflows onto Multiple Sites with Storage Constraints

Weiwei Chen, Ewa Deelman

{wchen, deelman}@isi.edu

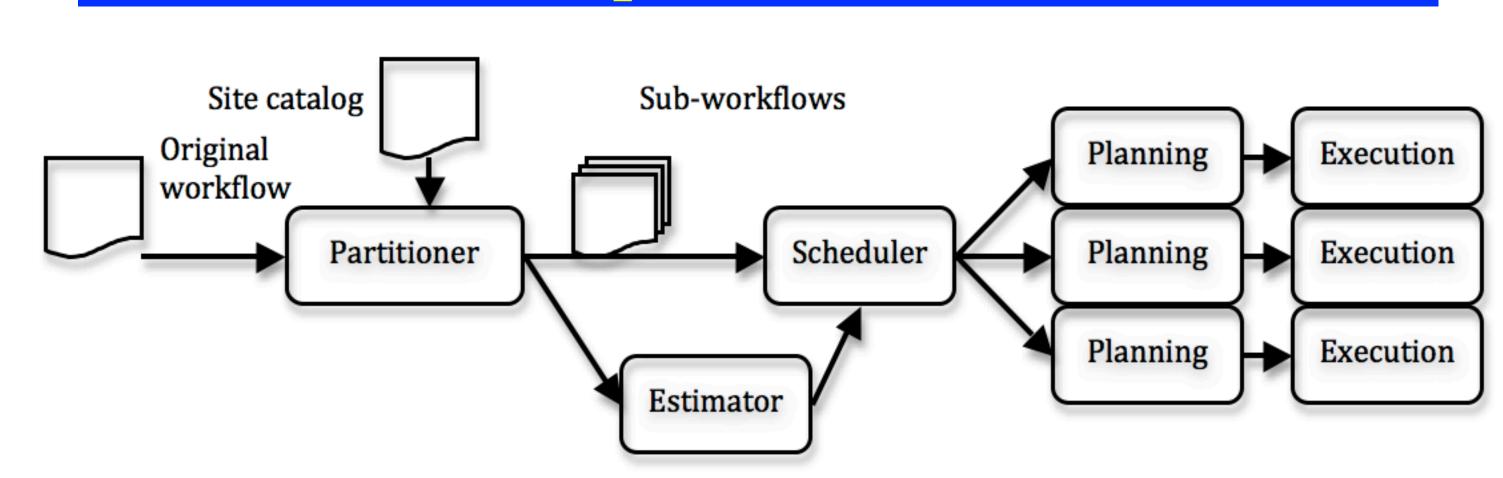
# Information Sciences Institute, University of Southern California



#### **Problem Statement**

- •A Scientific Workflow describes the application components and their dependencies. Large-scale workflows require significant amount of storage and needs to use multiple execution sites and consider the storage constraints.
- •We have developed a three-phase scheduling approach integrated with the Pegasus Workflow Management System to partition, estimate, and schedule workflows.
- •Partitioning workflows into sub-workflows first reduces the complexity of the workflow mappings. The entire CyberShake workflow has 16,000 sub-workflows and each sub-workflow has more than 24,000 individual jobs.

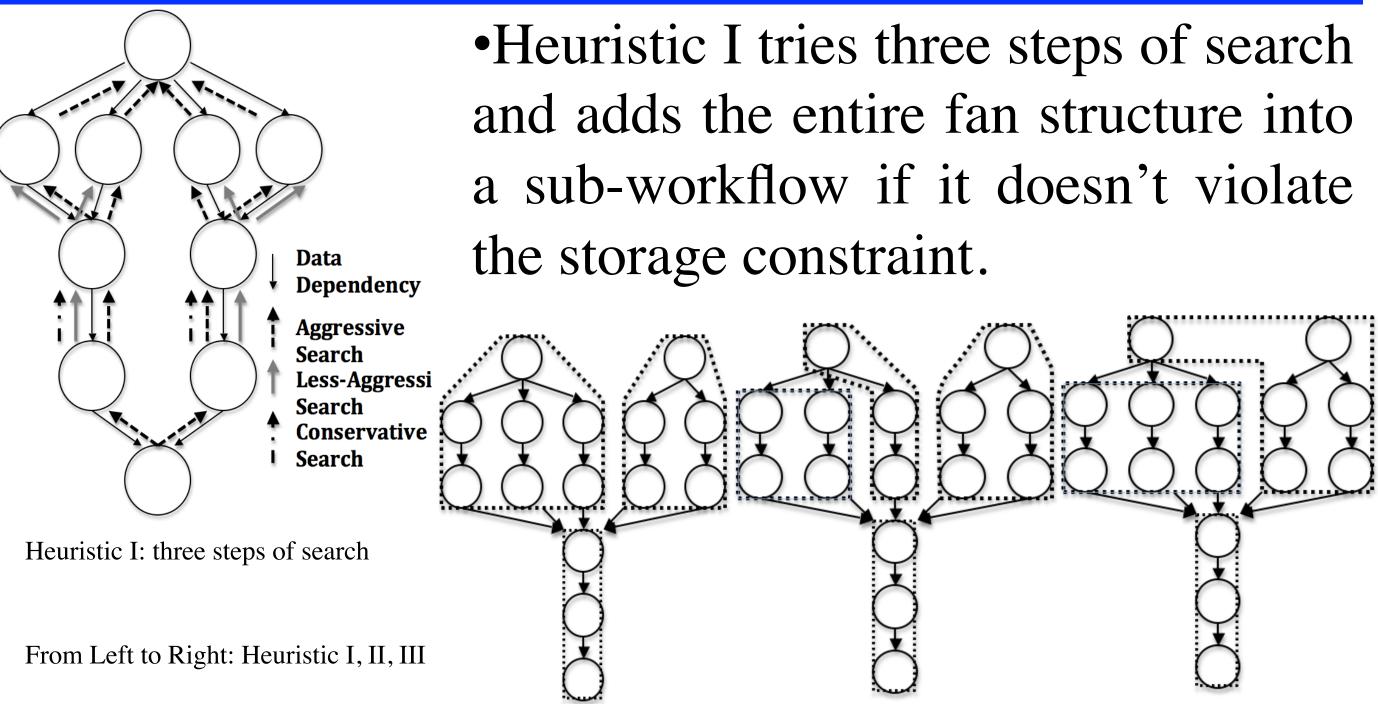
## Implementation



- •Partitioner separates workflows into several subworkflows within the storage constraints based on different heuristics.
- •Estimator provides three methods to estimate the makespan of sub-workflows.
- •Critical Path is defined as the longest depth of the subworkflow weighted by the runtime of each job.
- •Average CPU Time is the quotient of cumulative CPU time of all jobs divided by the number of available resources.
- The **HEFT** method uses the calculated earliest finish time of the last sink job as makespan of sub-workflows assuming we use HEFT algorithm to schedule them.

•Scheduler selects appropriate resources for the subworkflows satisfying the storage constraints and optimizes the runtime performance. HEFT and MinMin scheduling algorithms are examined and compared.

### Heuristics for Partitioning



- •Heuristic II adds a job to a sub-workflow if all of its unscheduled children can be added to that sub-workflow without causing cross dependencies or exceed the storage constraint.
- •Heuristic III adds a job to a sub-workflow if each child of it has been scheduled and adding this job to the sub-workflow doesn't exceed the storage constraint.

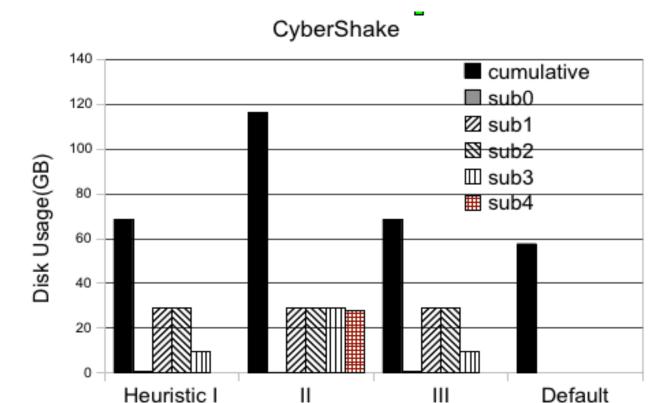
# Experiments

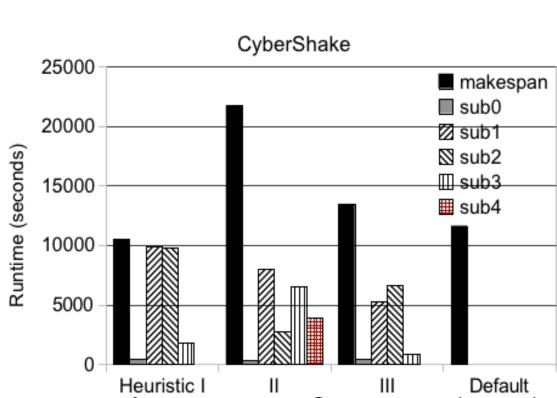
- •Three workflows are examined on a cluster with 32 Condor slots and Glidein WMS is installed. We use Pegasus to plan the workflows and then submit them to Condor DAGMan that provides the execution engine.
- •Montage is an astronomy application that is used to construct large image mosaics of the sky. We ran the 8 degree square Montage case. It's I/O intensive.
- •CyberShake calculates Probabilistic Seismic Hazard curves for several geographic sites in the Southern California area. We ran one partition of a geographic site. It's memory intensive.
- Epigenomics maps short DNA segments collected with high-through gene sequencing machines to a reference genome. It's CPU intensive.

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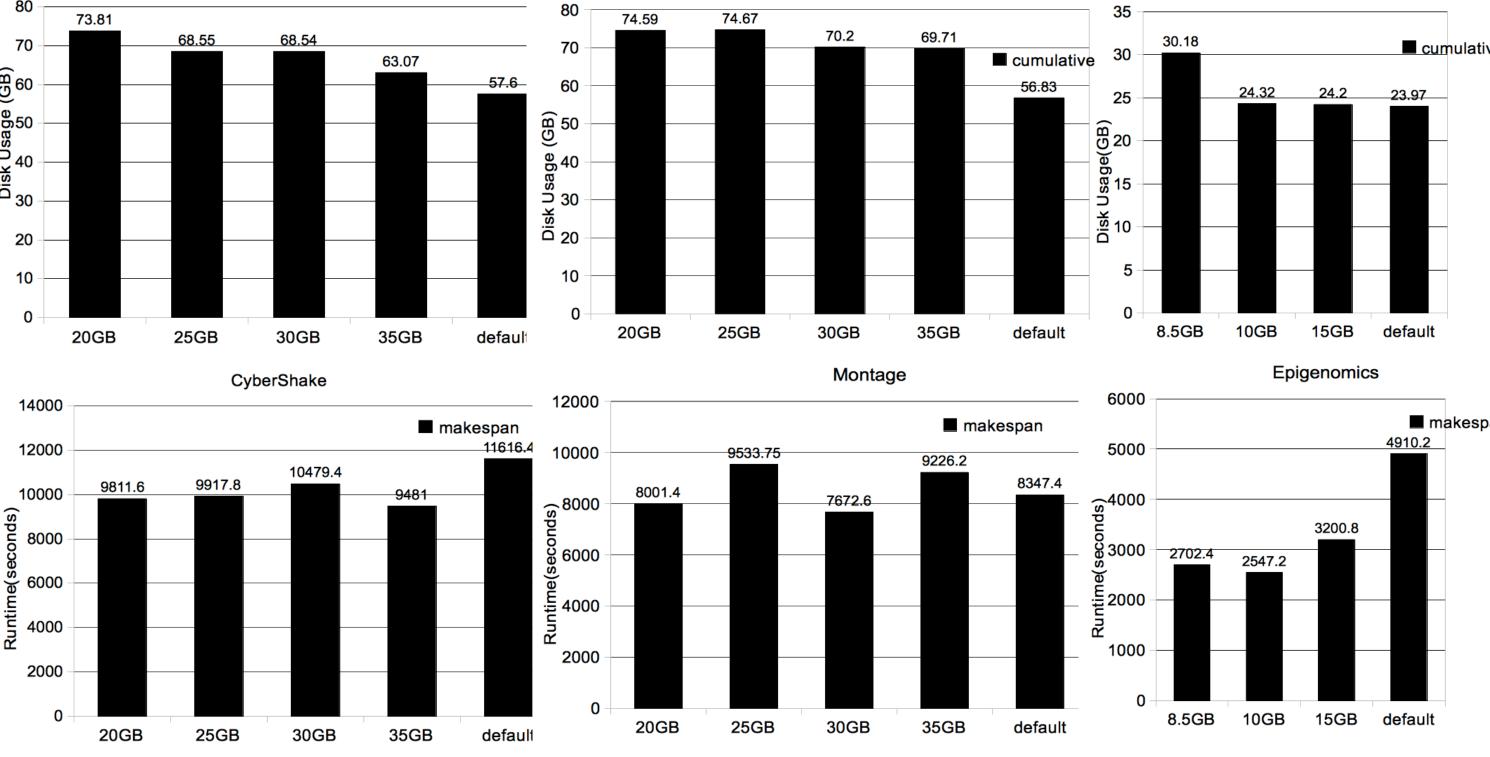
#### Performance

- •Heuristic I, II, III improve the runtime by 9.79%, -15.87% and -86.86% compared to the default case running workflows on a single site.
- •The reason is that Heuristic I avoids extra inter communication between sub-workflows





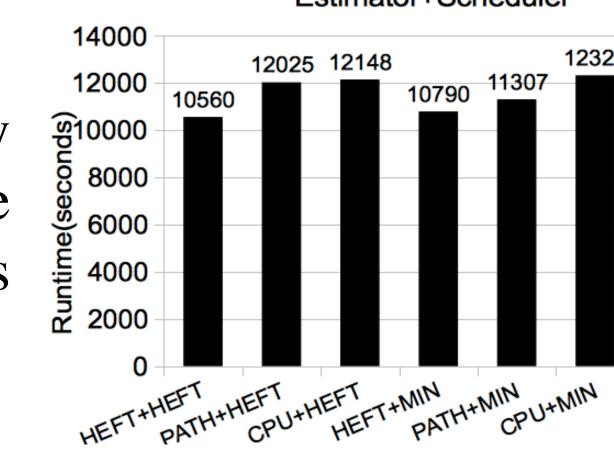
•Workflows across two or three sites perform the best in our experiments. More sites require more data transfers even though the computation part is improved.



- •HEFT+HEFT improves the runtime by up to 14.3%.
- •Average CPU Time and Critical Path don't consider the resource availability.

  Estimator+Scheduler

•HEFT scheduler is slightly better than MinMin since the number of sub-workflows has been reduced a lot.



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