



THE UNIVERSITY
of NORTH CAROLINA
at CHAPEL HILL

Making OpenVX Really “Real Time”

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700 ms

OpenVX™

A new approach for



graph scheduling

Shorter response time

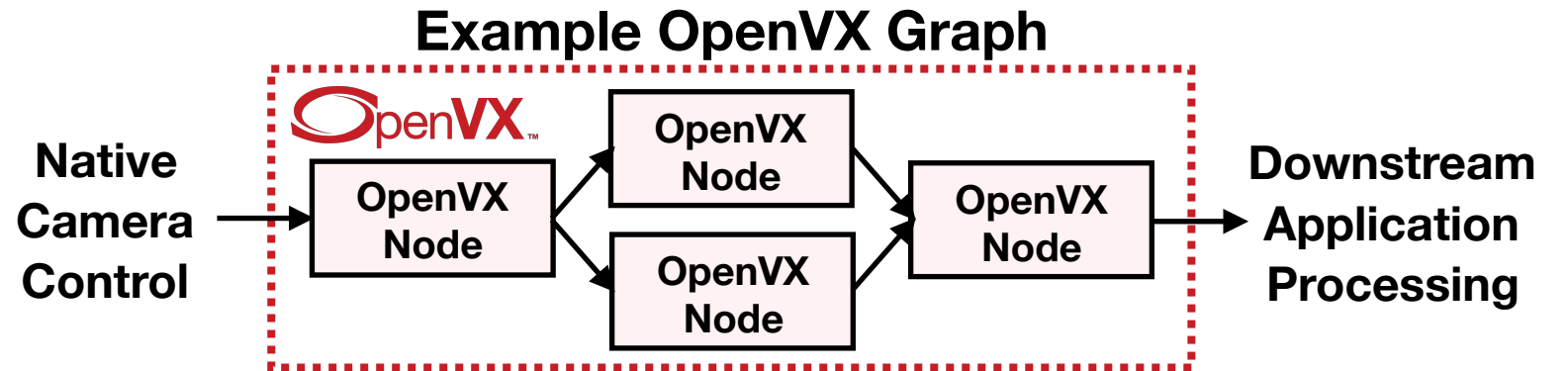
+

Less capacity loss

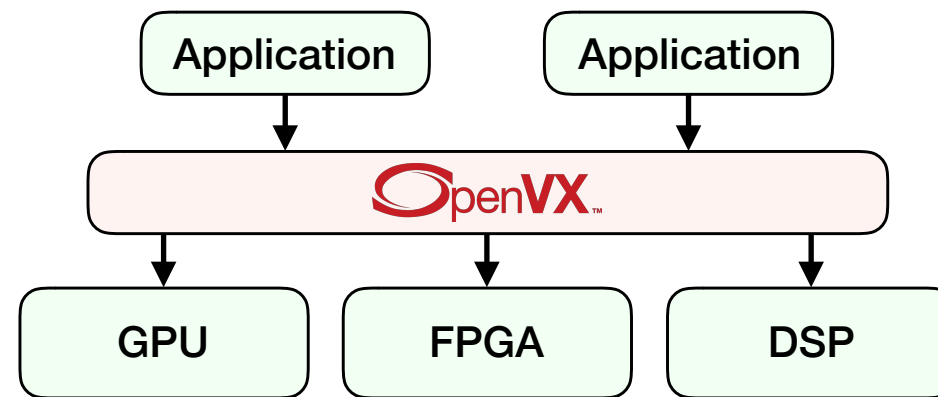
1. State of the art
2. Our approach
3. Future work



Graph-based architecture



Portability to diverse hardware

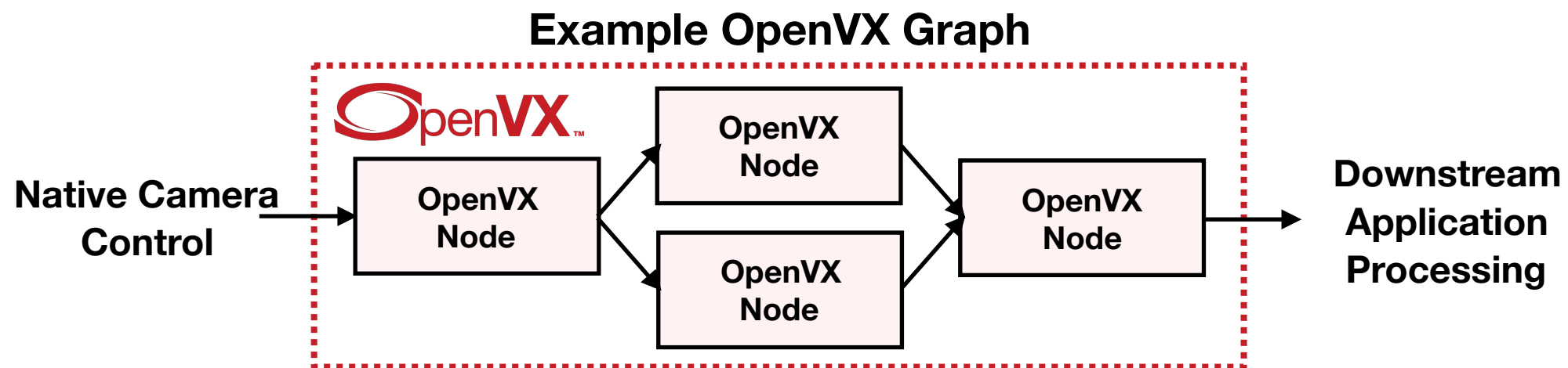


Does OpenVX really target “real-time” processing?



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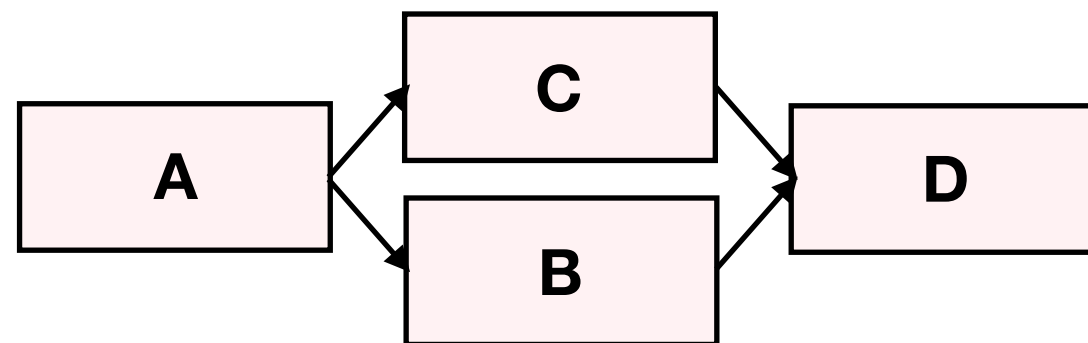
1. It lacks real-time concepts
2. Entire graphs = monolithic schedulable entities





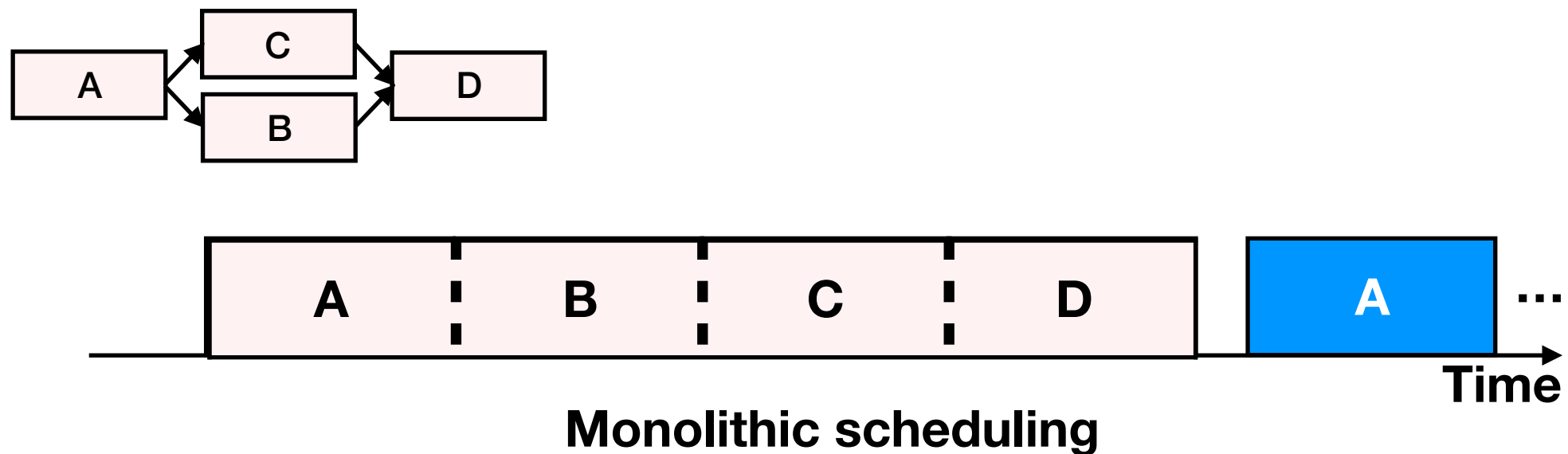
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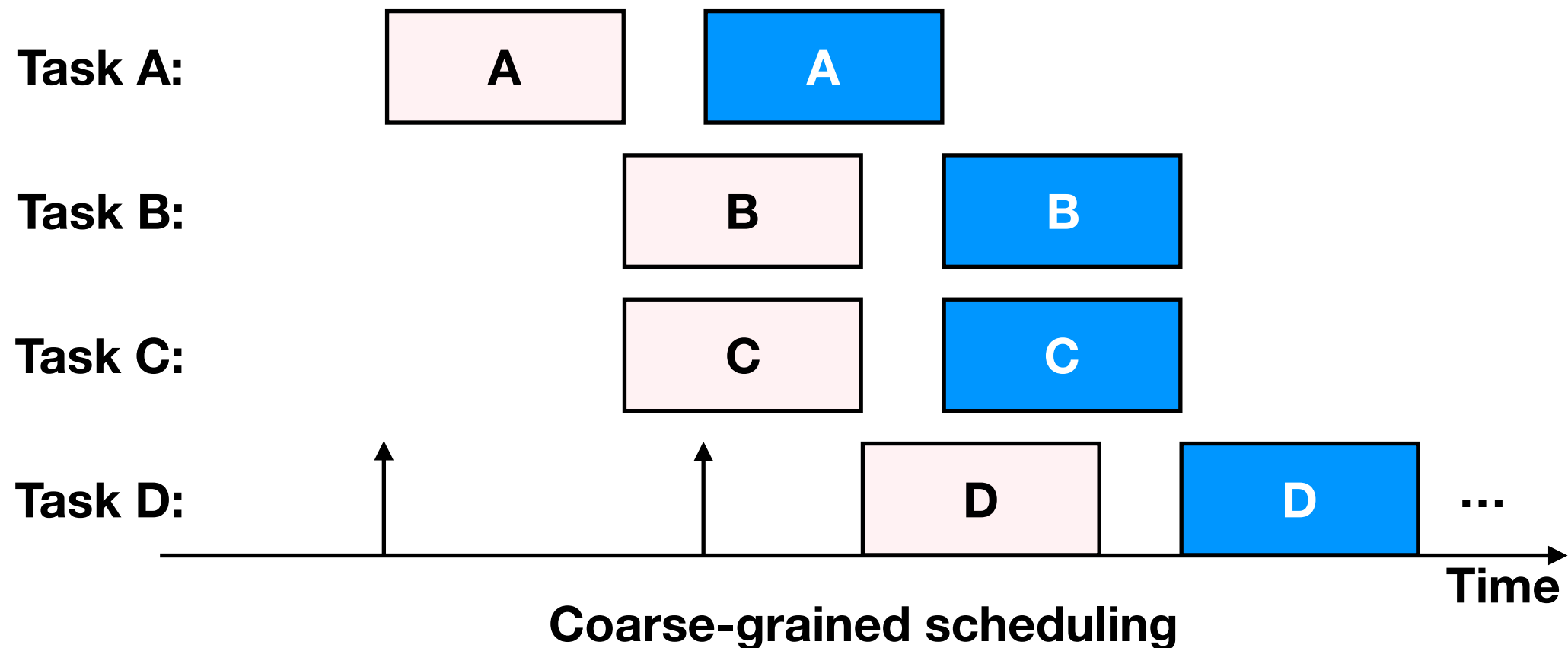
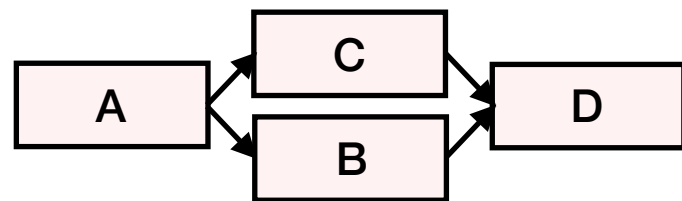
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Prior Work

Coarse-grained scheduling

- OpenVX nodes = schedulable entities [23, 51]



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Coarse-grained scheduling

- OpenVX nodes = schedulable entities [23, 51]

Remaining problems:

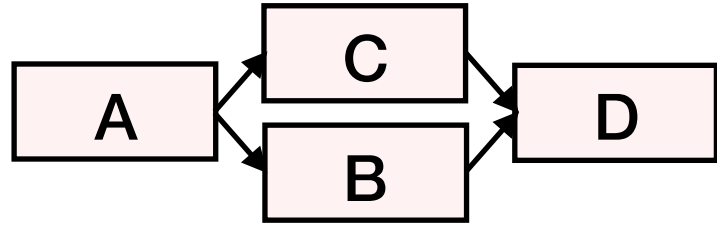
1. More parallelism to be explored
2. Suspension-oblivious analysis was applied and causes capacity loss.


Fine-Grained Scheduling

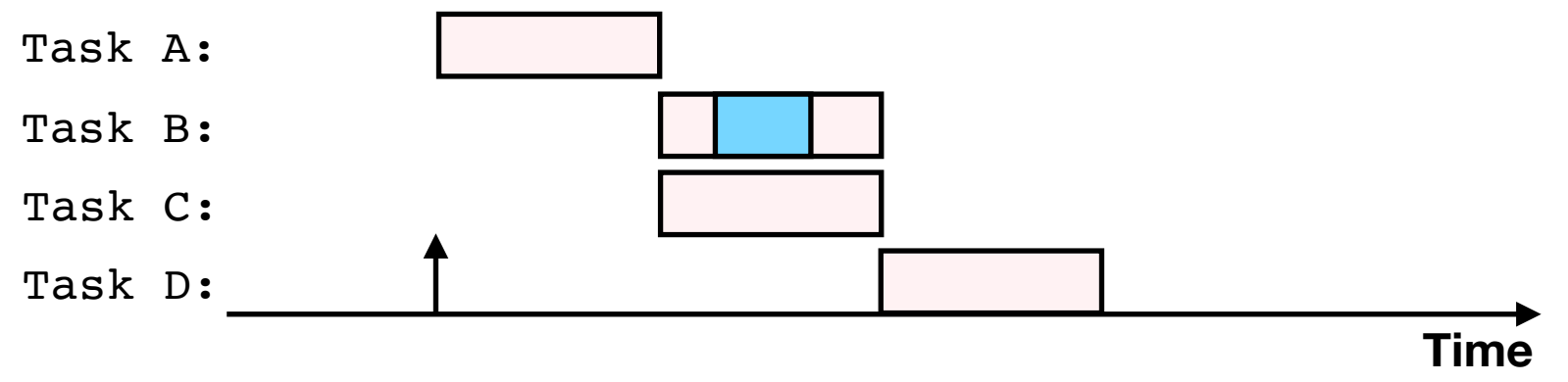
This Work

1. Coarse-grained vs. fine-grained
2. Response-time bounds analysis
3. Case study

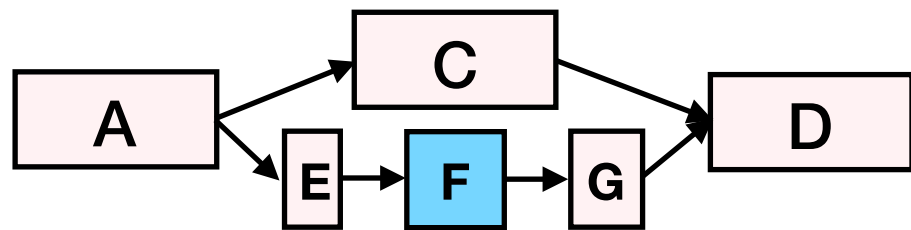
1. Coarse-grained vs. fine-grained
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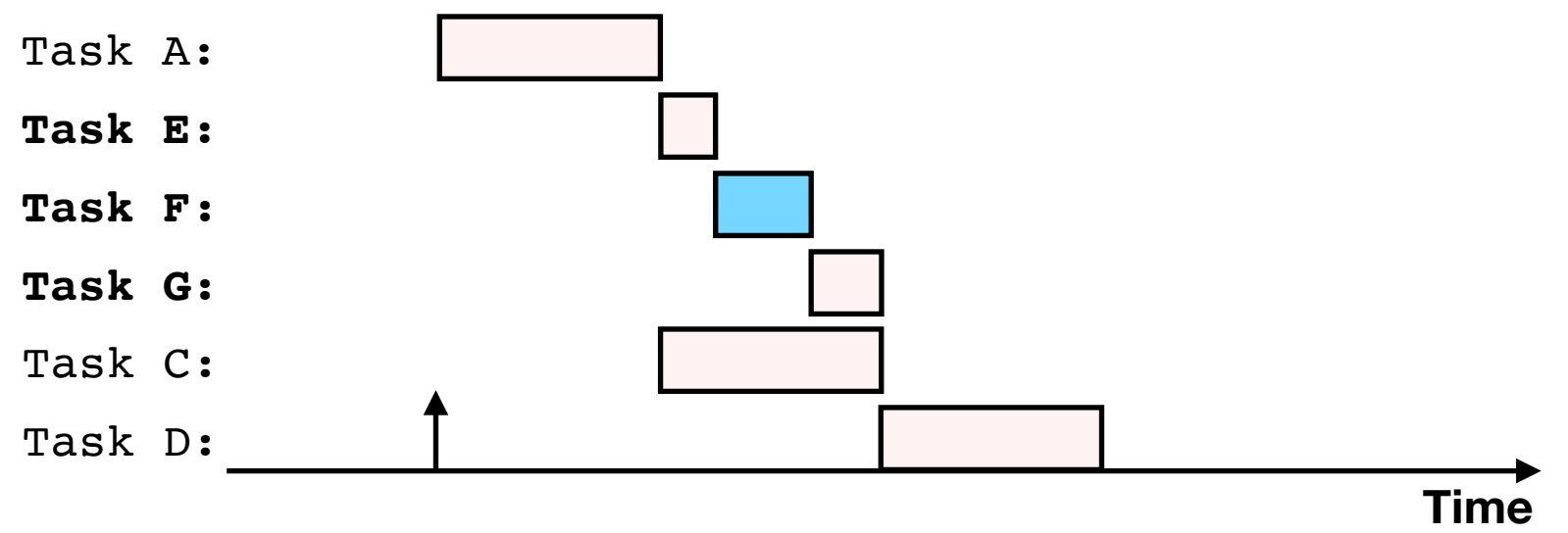
 Suspension for GPU execution



Coarse-Grained Scheduling



 GPU execution



Fine-Grained Scheduling

1. Coarse-grained vs. fine-grained
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Deriving Response-Time Bounds for a DAG*

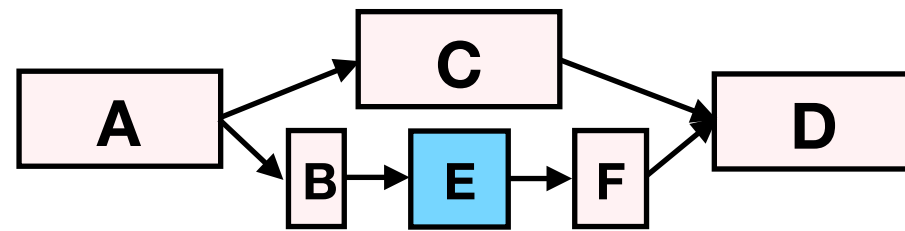
Step 1: Schedule the nodes as sporadic tasks

Step 2: Compute bounds for every node

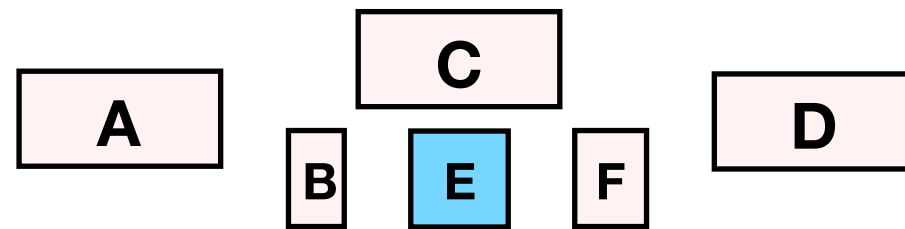
Step 3: Sum the bounds of nodes on the critical path

* C. Liu and J. Anderson, "Supporting Soft Real-Time DAG-based Systems on Multiprocessors with No Utilization Loss," in RTSS, 2013.

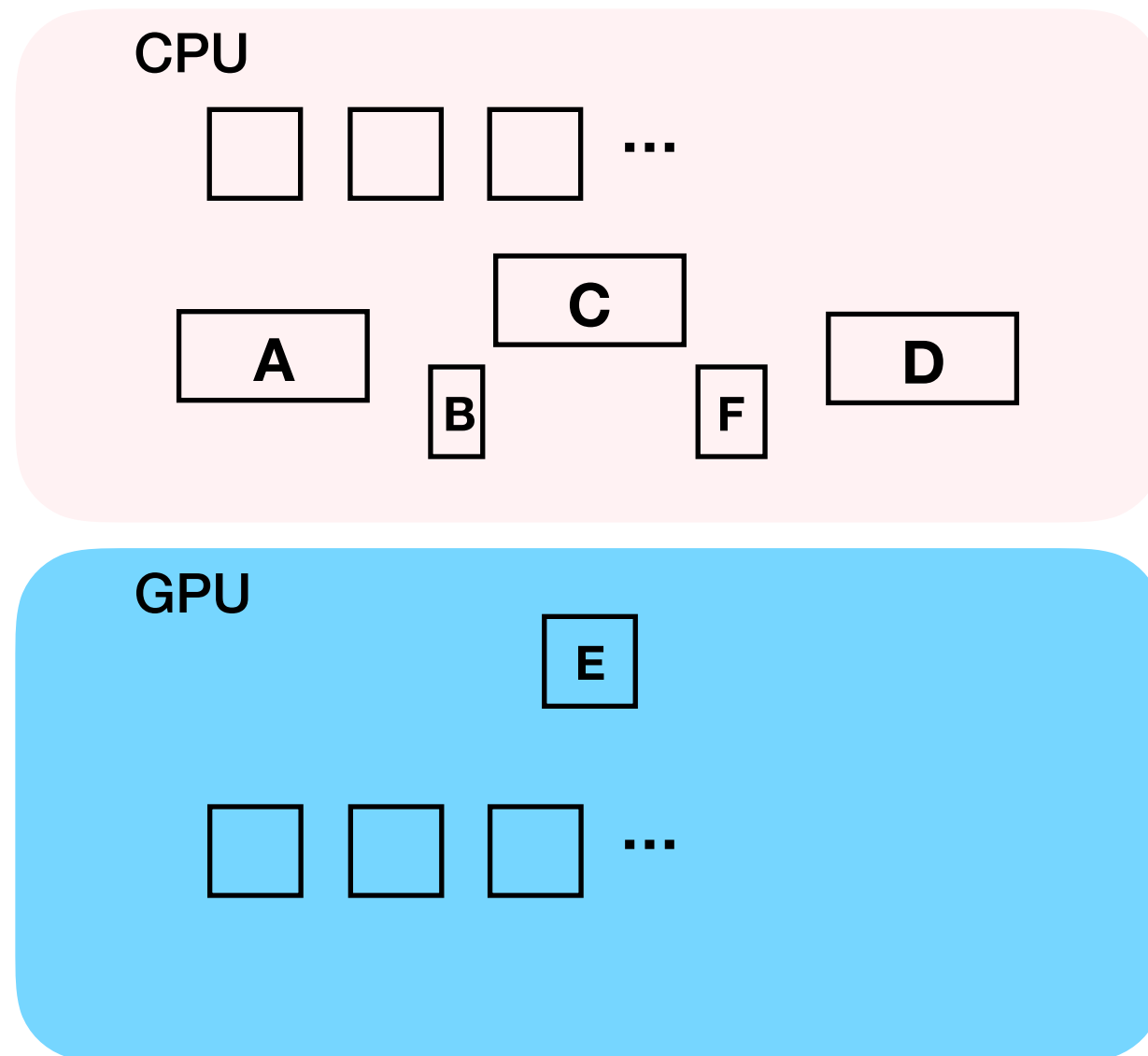
Deriving Response-Time Bounds for a DAG



Deriving Response-Time Bounds for a DAG

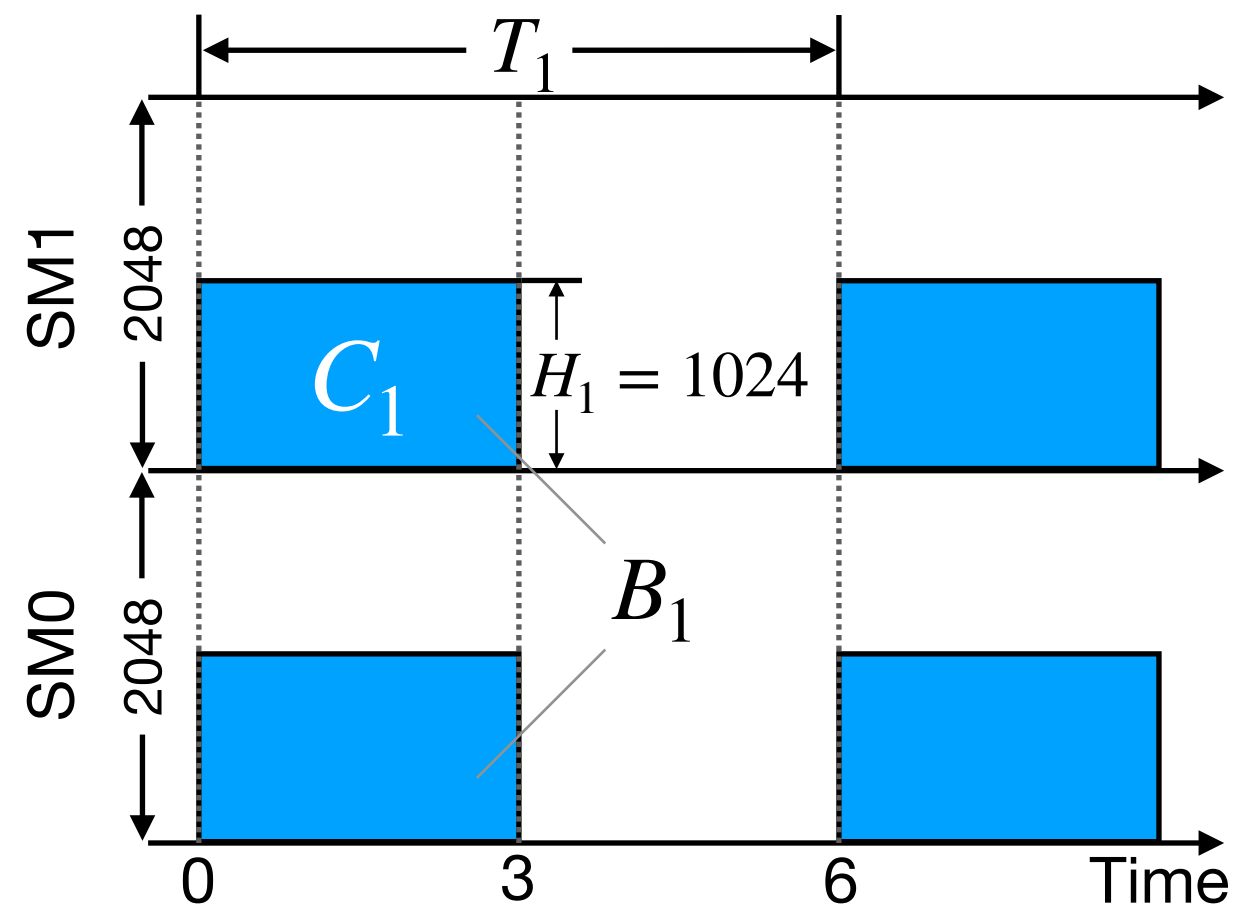
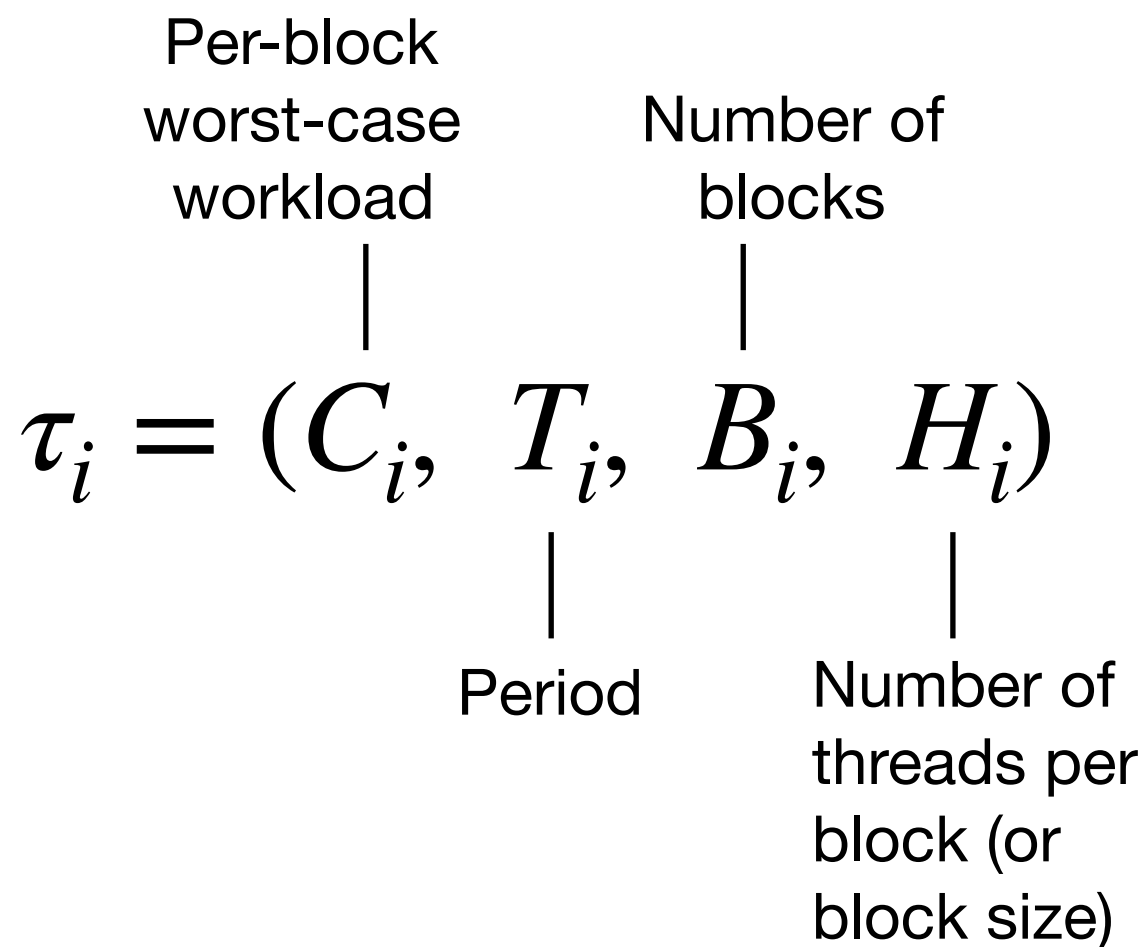


Deriving Response-Time Bounds for a DAG



★ Need a response-time bound analysis for GPU tasks

A system model of GPU Tasks



$$\tau_1 = (3076, 6, 2, 1024)$$

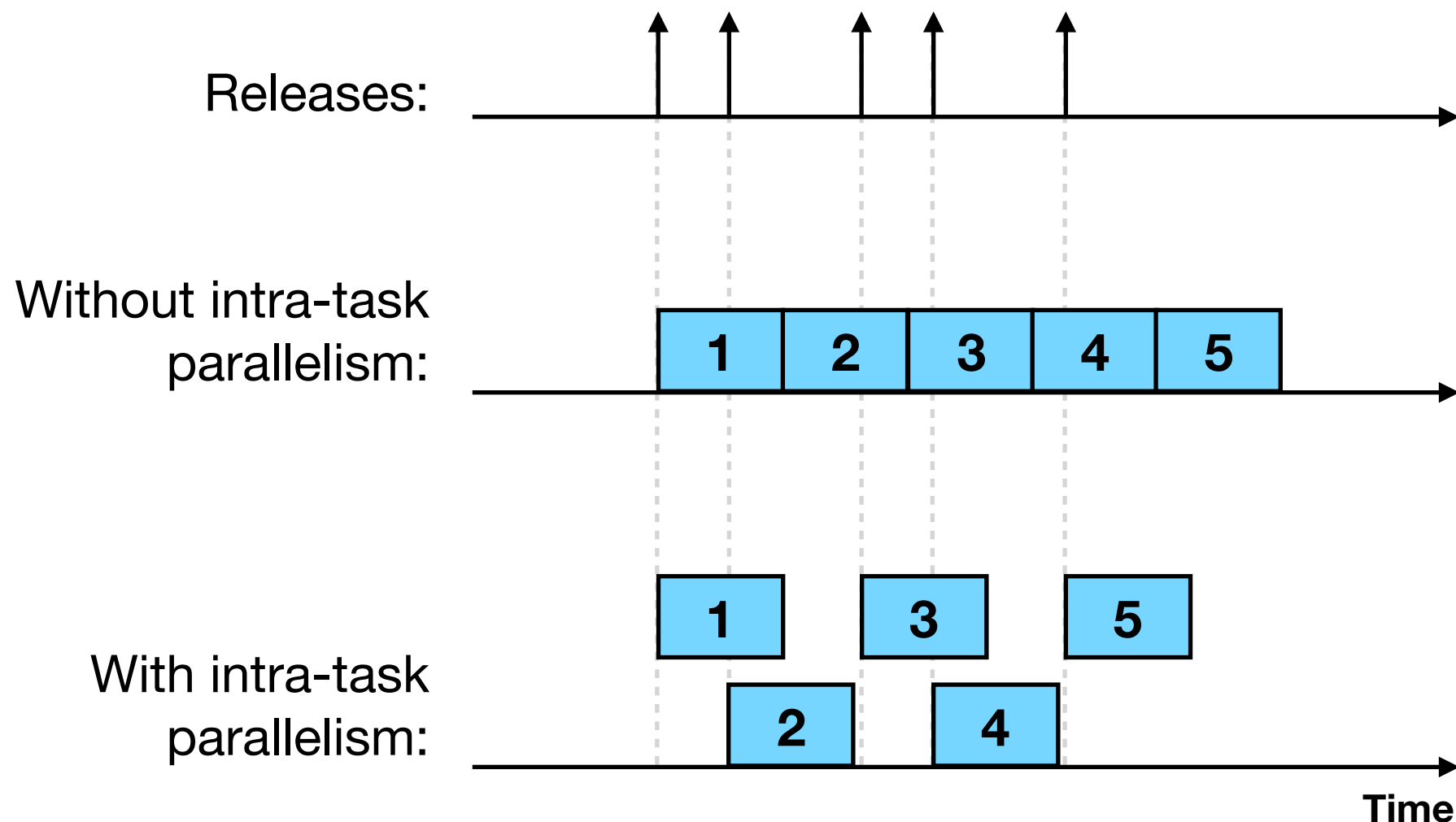
Response-Time Bounds

Proof Sketch

1. We first show the necessity of a **total utilization bound** and **intra-task parallelism** via counterexamples.

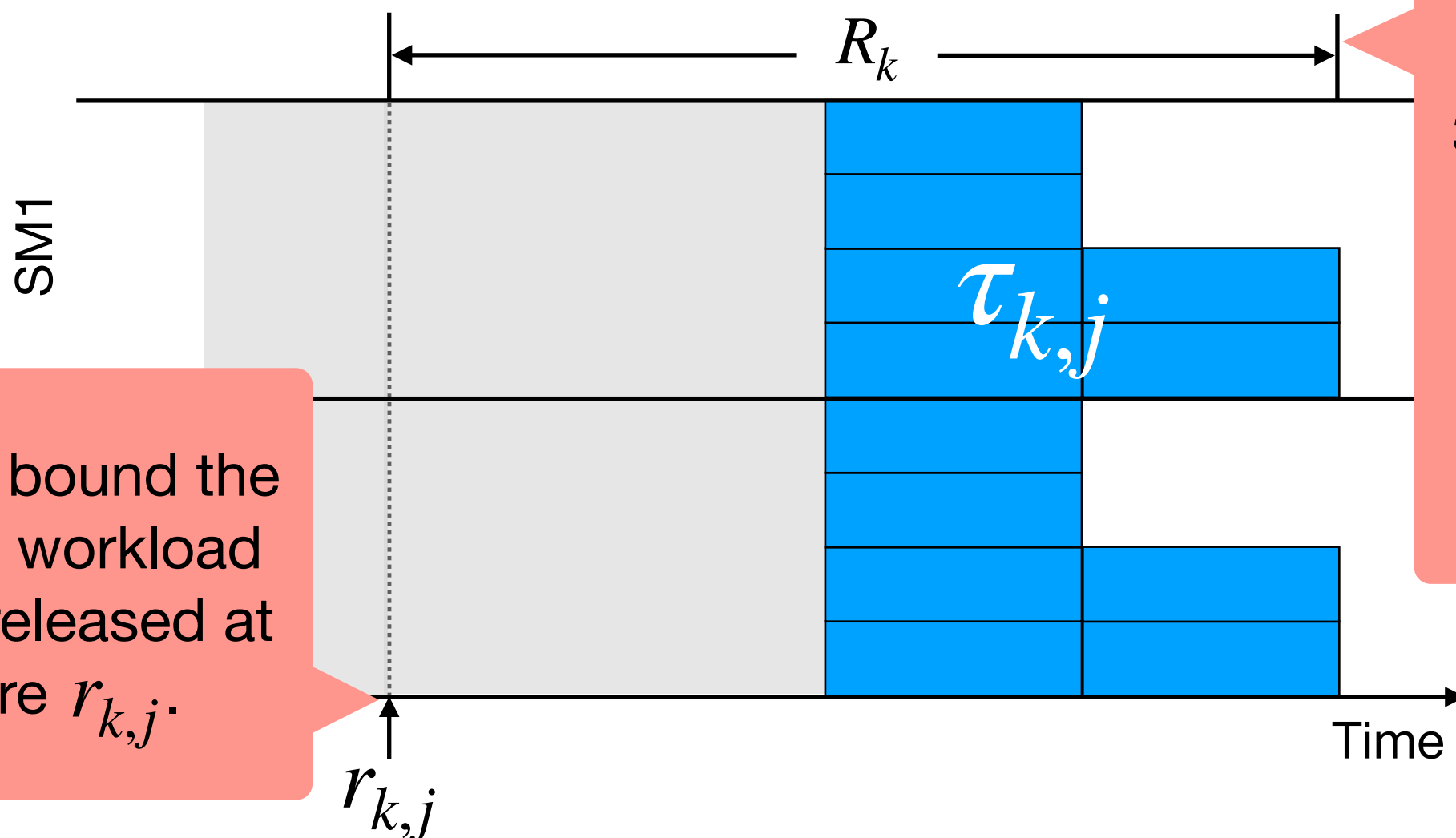
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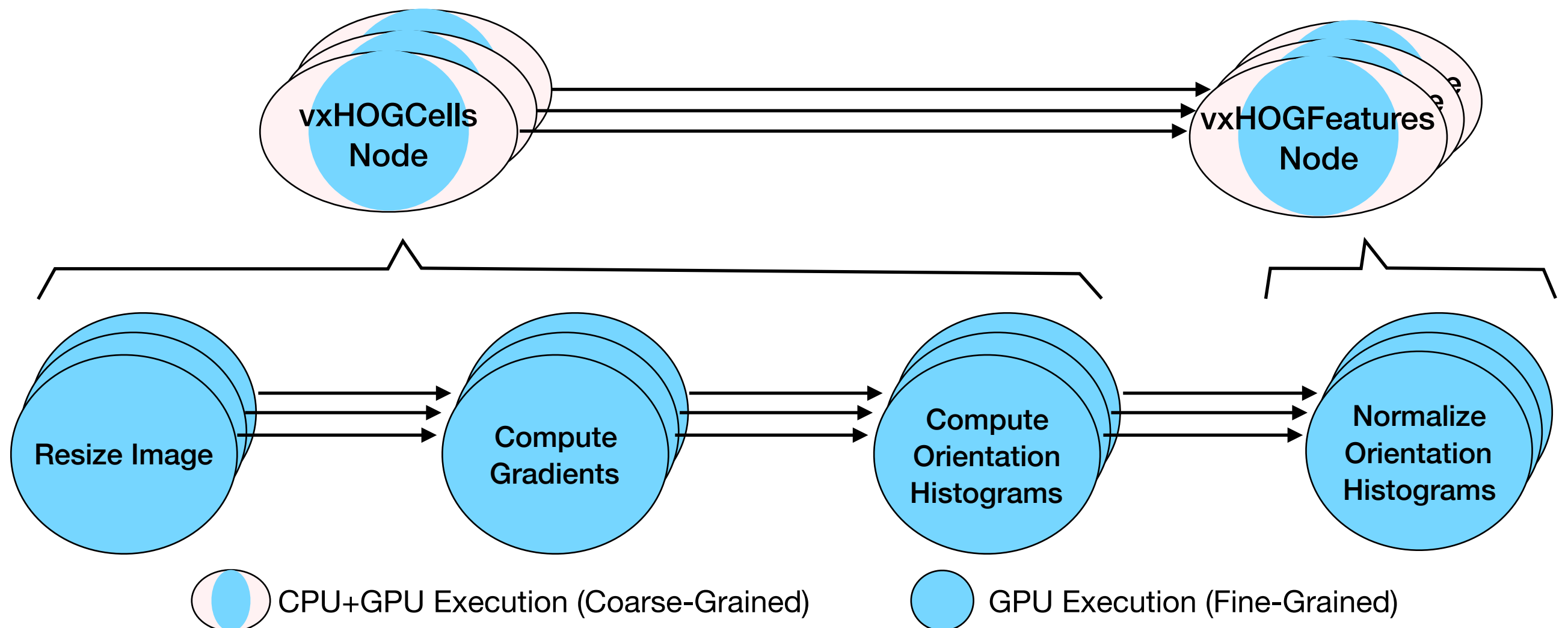
2. We then bound the unfinished workload from jobs released at or before $r_{k,j}$.

3. We prove the job finishes before $r_{k,j} + R_k$.

1. Coarse-grained vs. fine-grained
2. Response-time bounds analysis
3. **Case study**

Case Study: Comparing Fine-Grained/ Coarse-Grained/Monolithic Scheduling

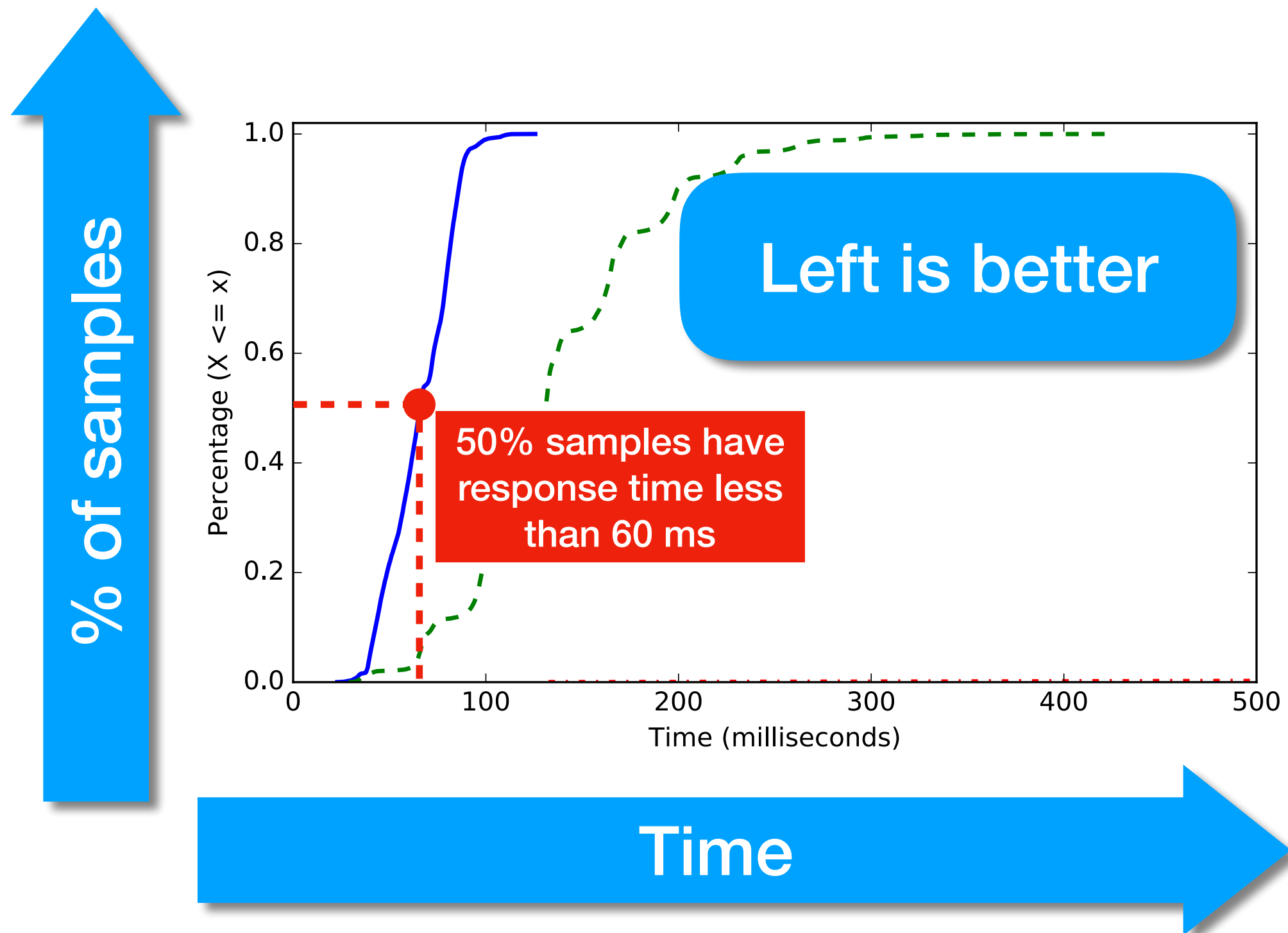
- Application: Histogram of Oriented Gradients (HOG)



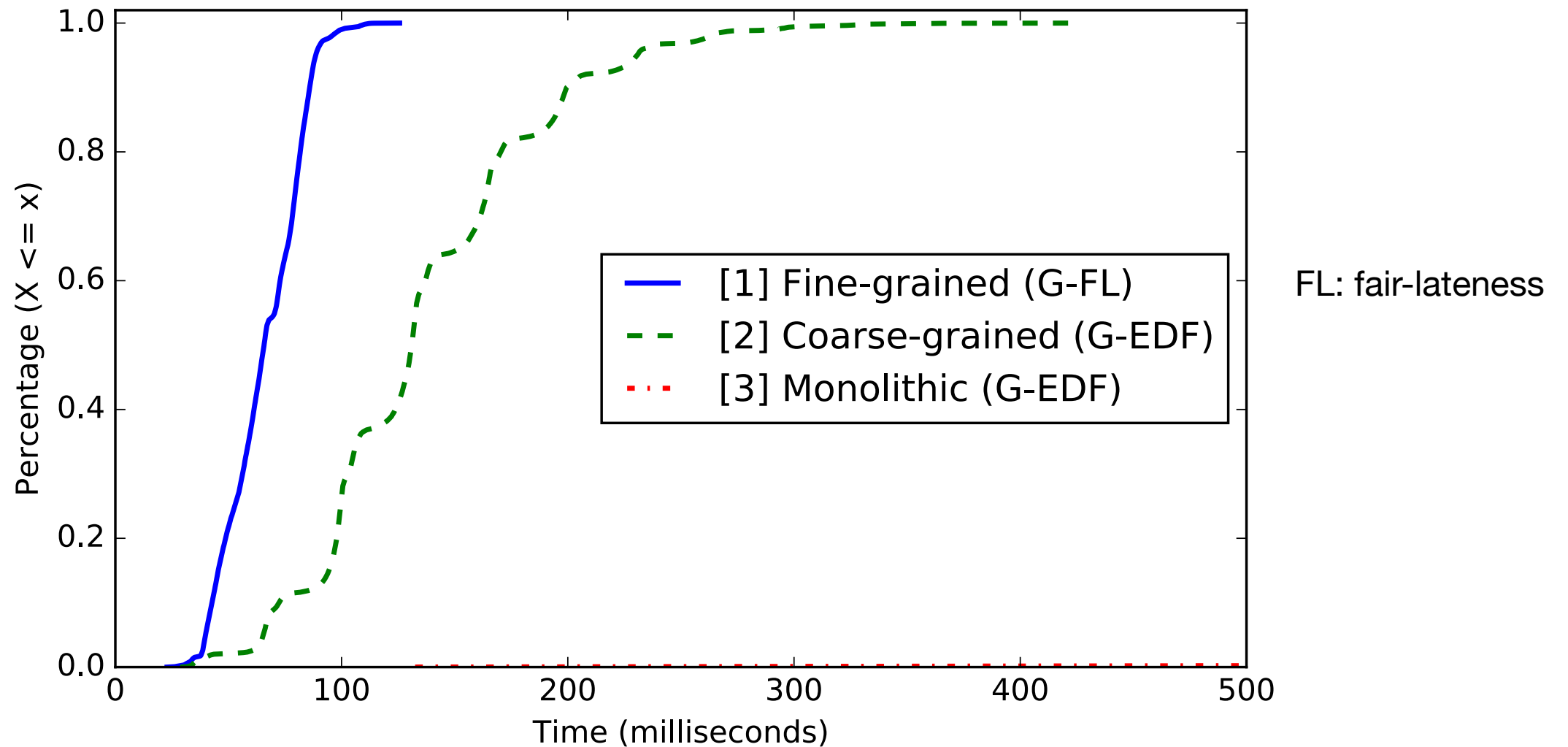
Case Study: Comparing Fine-Grained/ Coarse-Grained/Monolithic Scheduling

- Application: Histogram of Oriented Gradients (HOG)
 - 6 instances
 - 33 ms period
 - 30,000 samples
- Platform: NVIDIA Titan V GPU + Two eight-core Intel CPUs.
- Schedulers: **G-EDF**, **G-FL** (fair-latency)

Case Study: Comparing Fine-Grained/ Coarse-Grained/Monolithic Scheduling

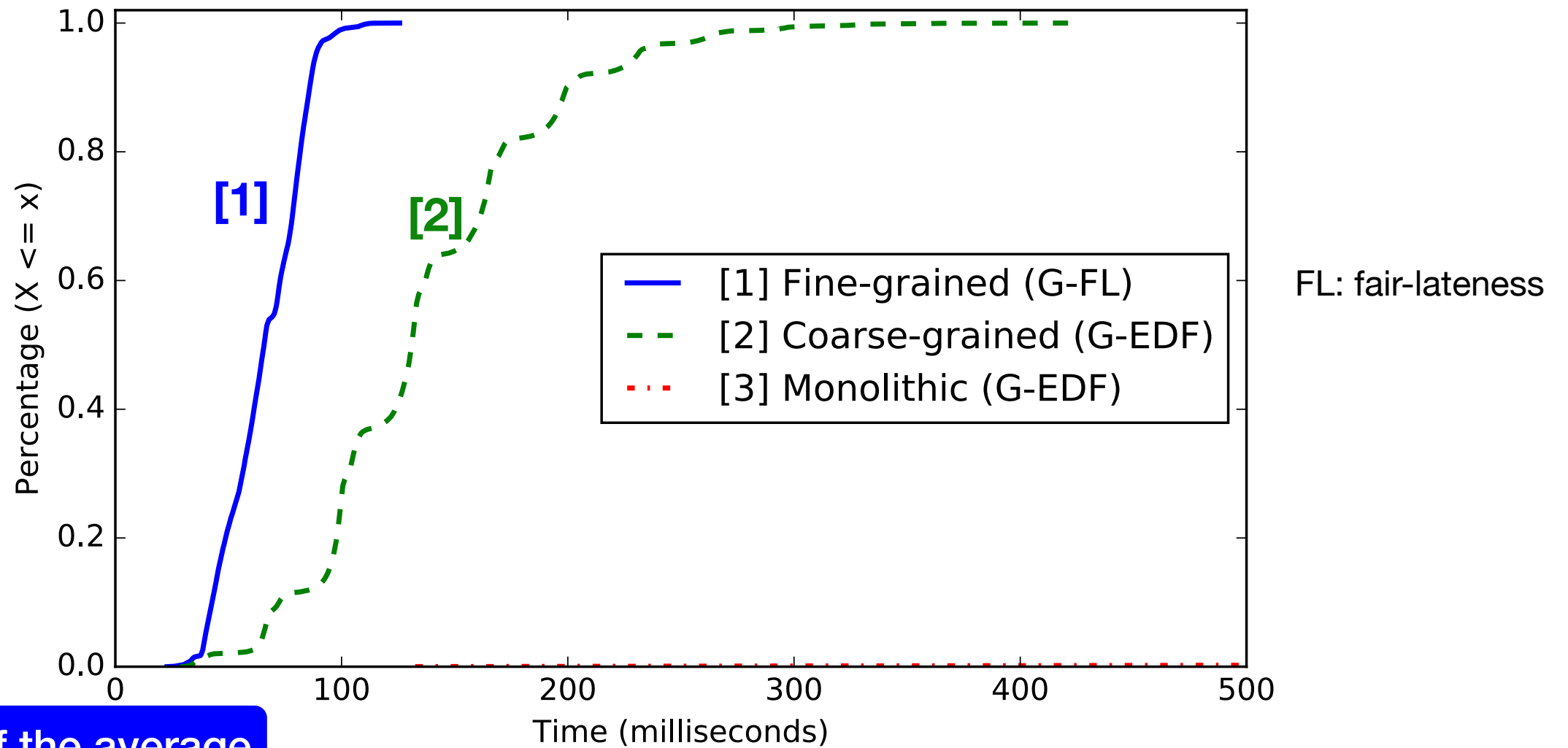


Case Study: Comparing Fine-Grained/ Coarse-Grained/Monolithic Scheduling



	[1] Fine-grained (G-FL)	[2] Coarse-grained (G-EDF)	[3] Monolithic (G-EDF)
Average Response Time (ms)	65.99	136.57	84669.47
Maximum Response Time (ms)	125.66	427.07	170091.06

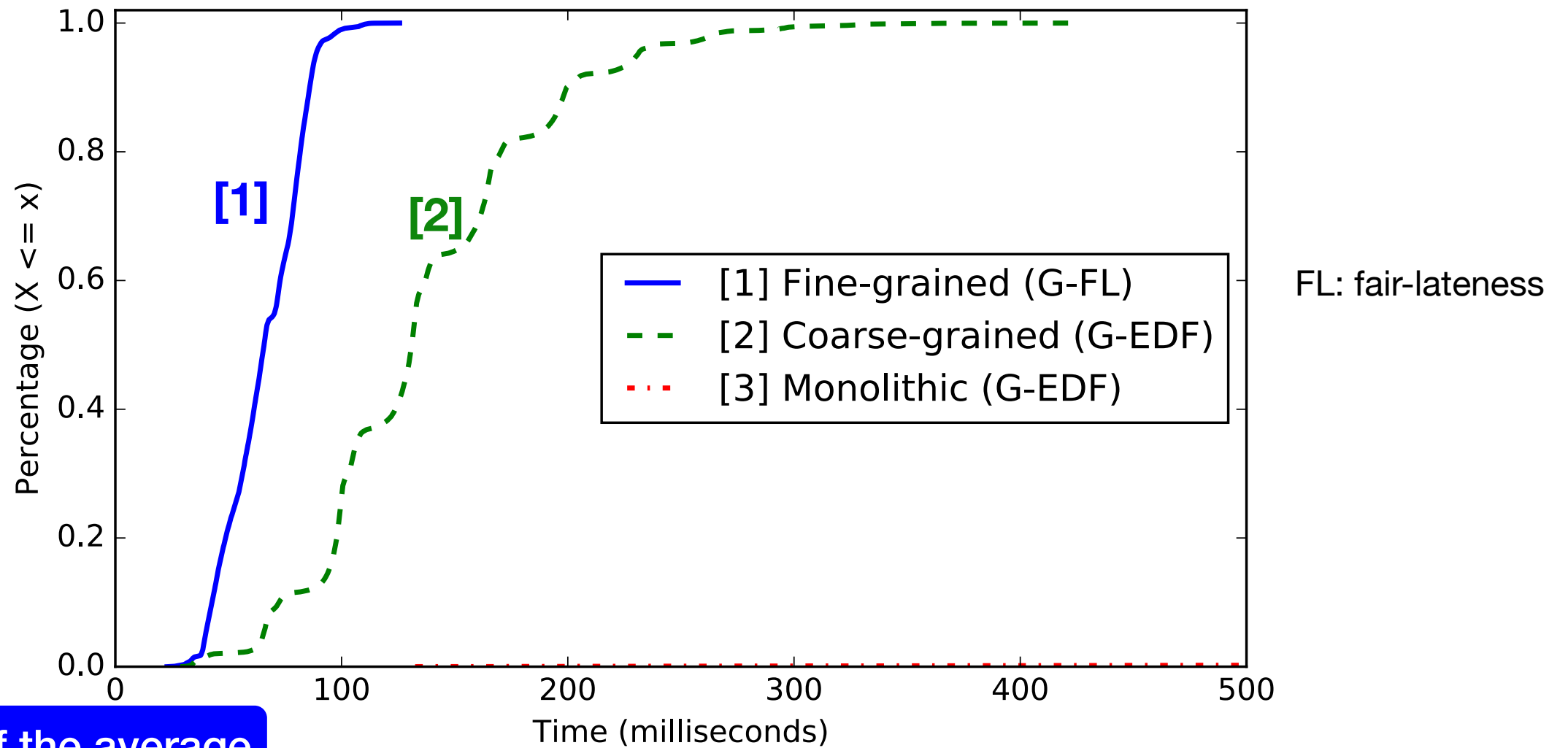
Case Study: Comparing Fine-Grained/Coarse-Grained/Monolithic Scheduling



Half the average response time

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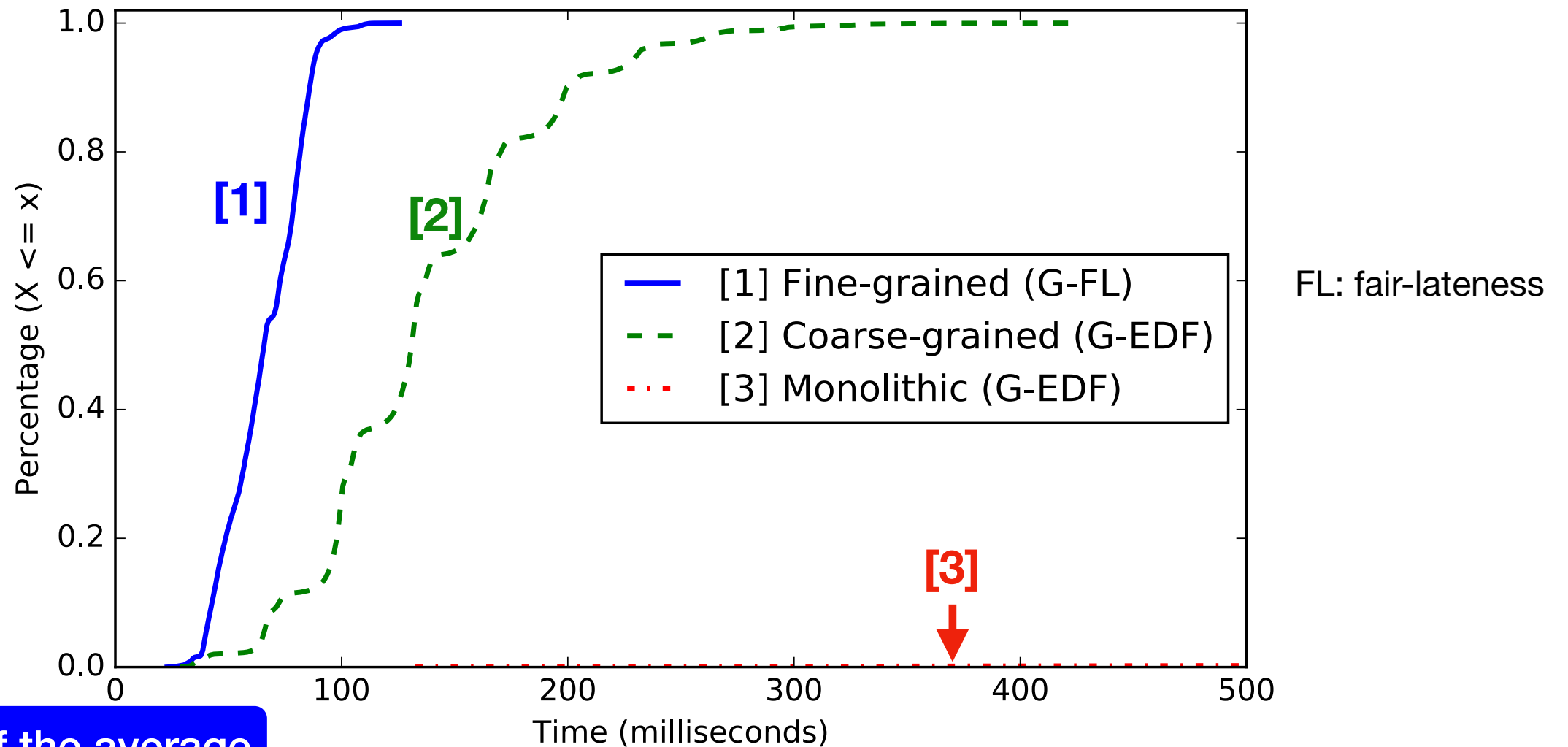
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One-third the maximum response time

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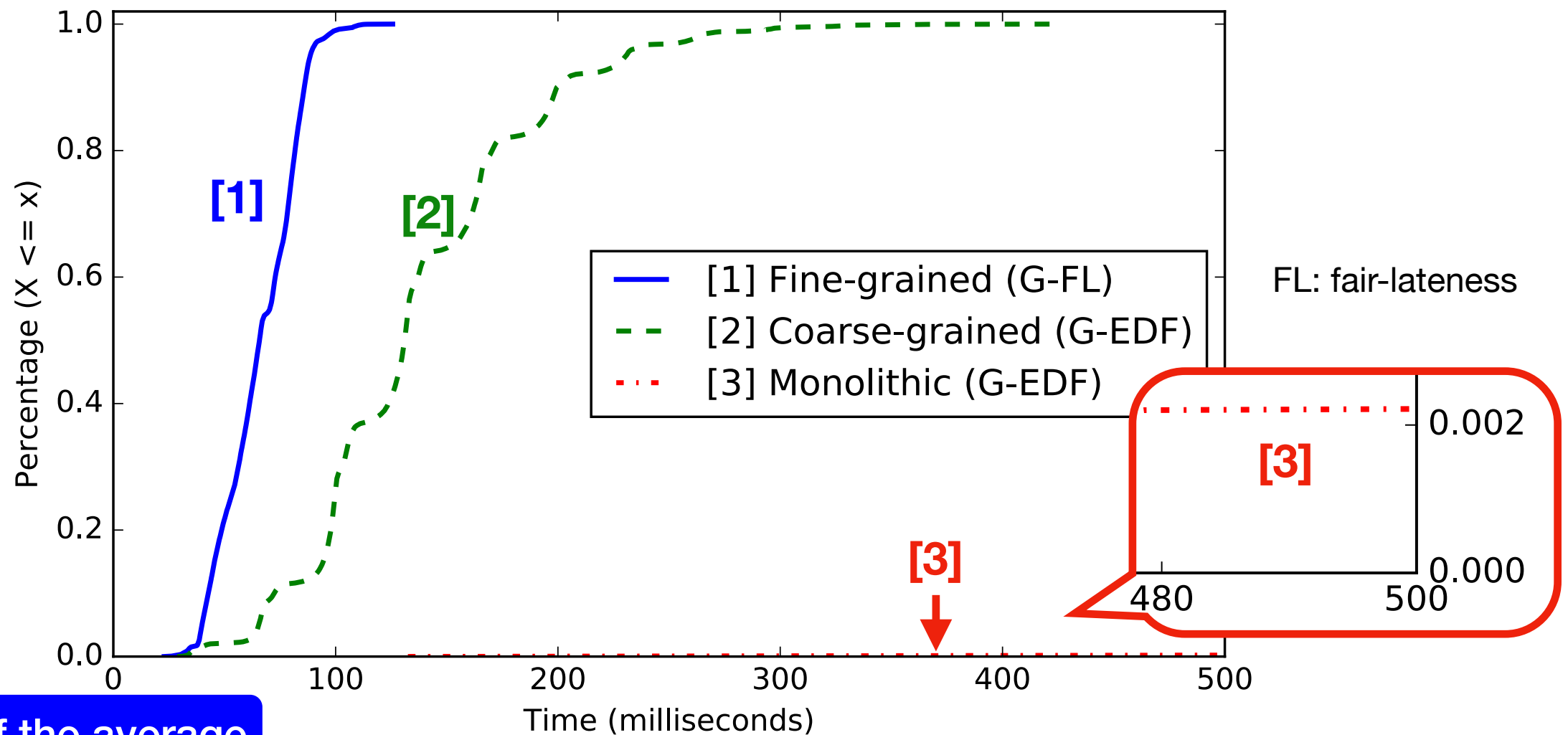


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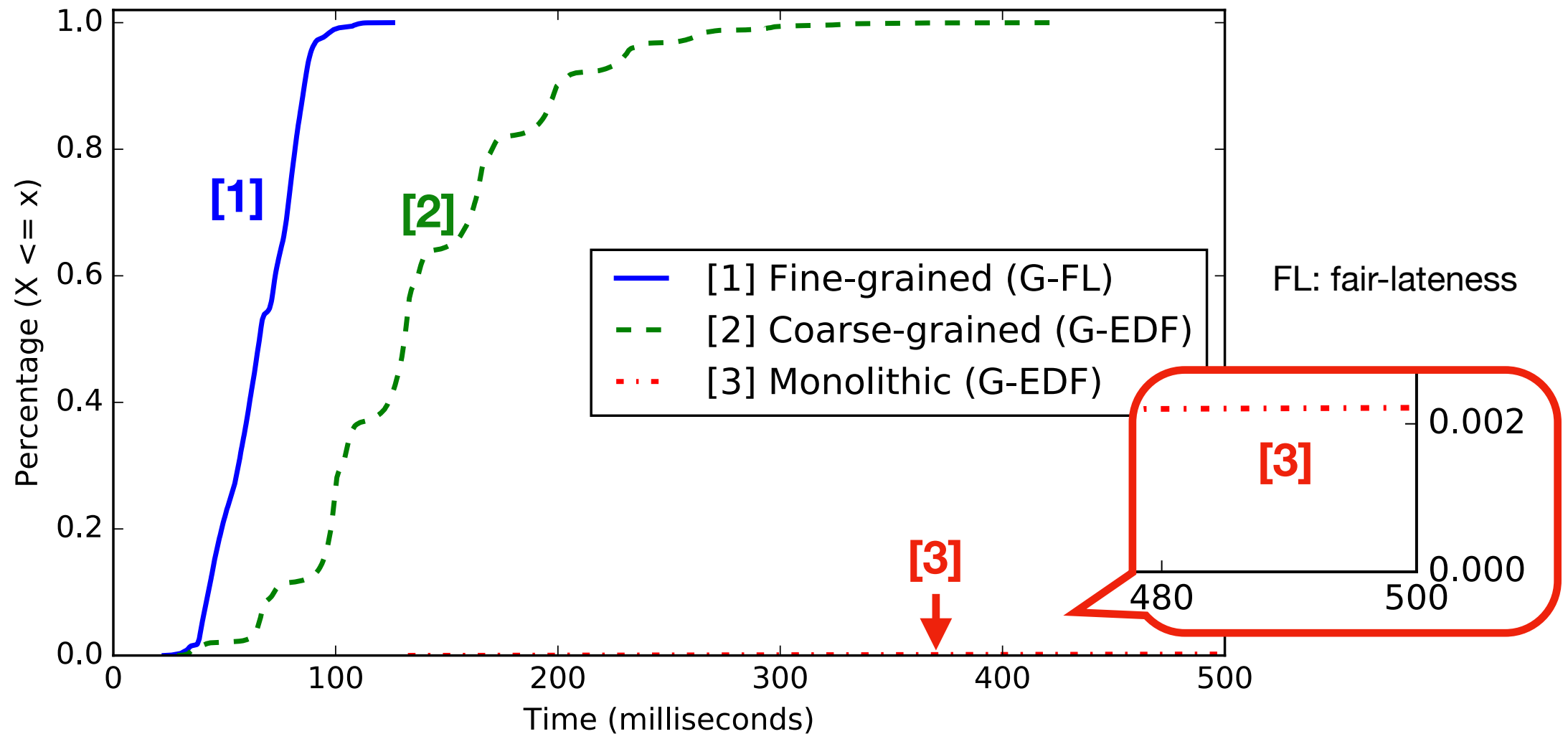


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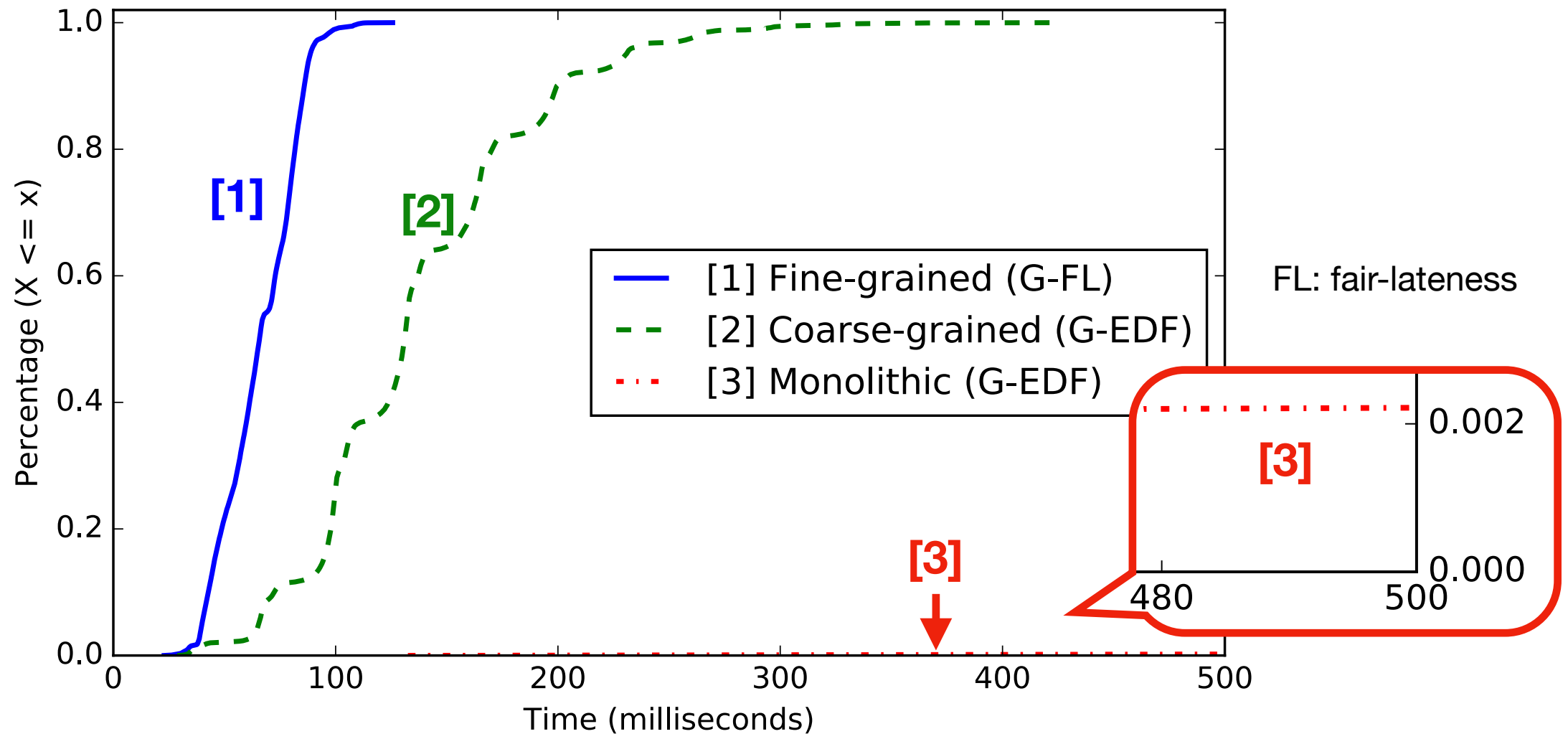
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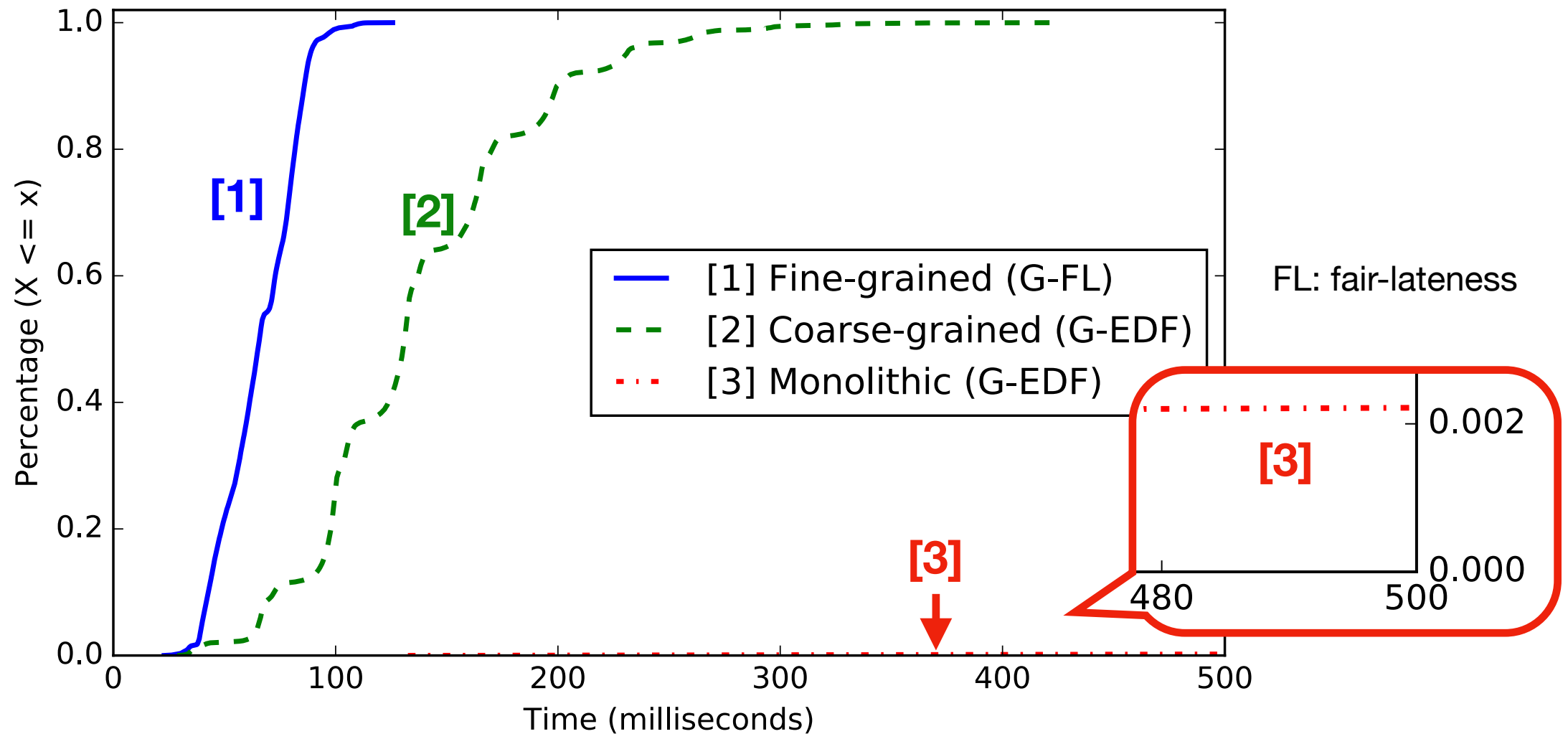
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Analytical Bound (ms)			N/A

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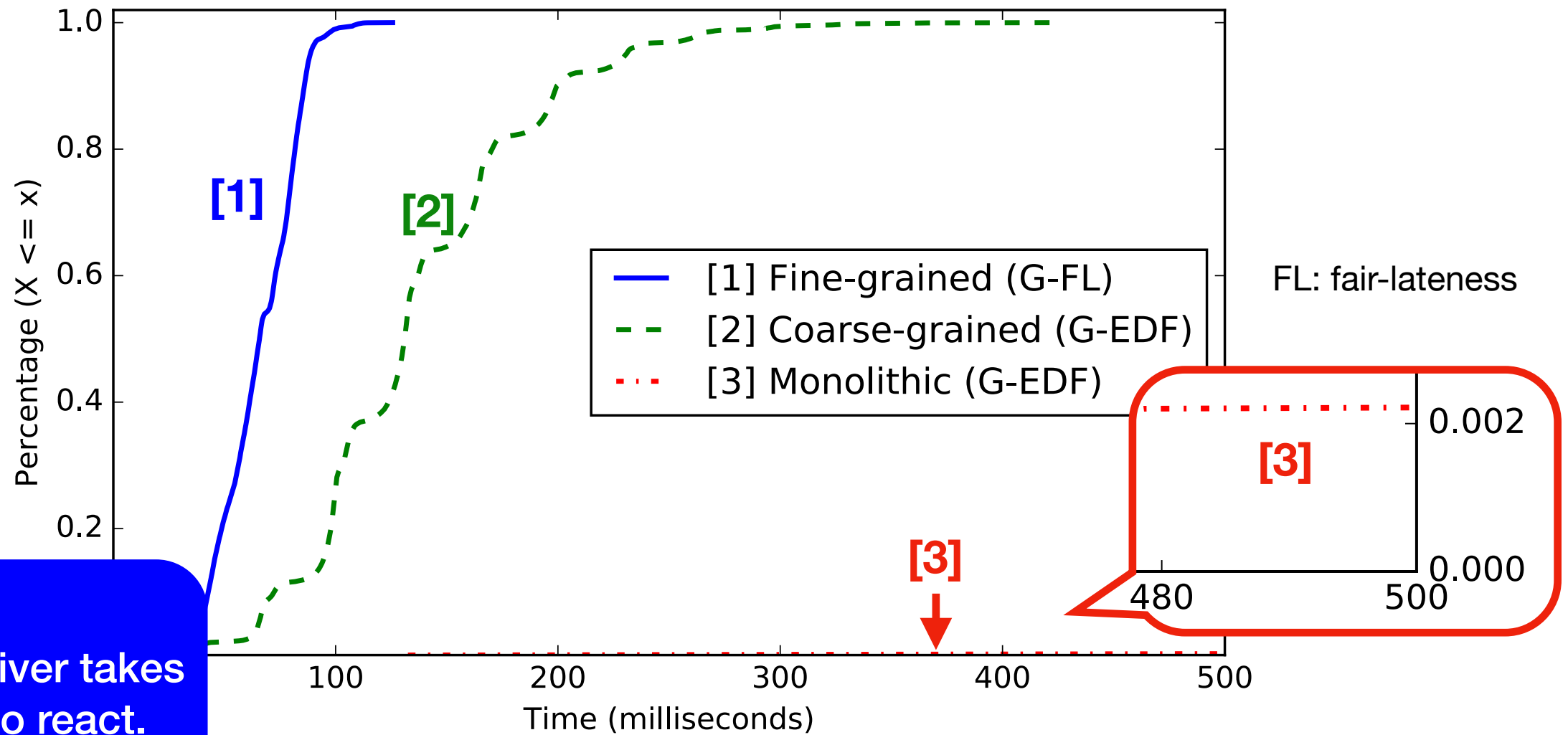
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Analytical Bound (ms)		N/A	N/A

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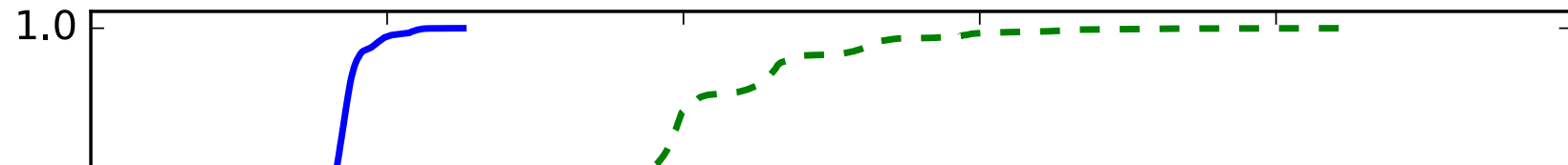
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Average Response Time (ms)	65.99	136.57	84669.47
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Analytical Bound (ms)	542.39	N/A	N/A

Case Study: Comparing Fine-Grained/Coarse-Grained/Monolithic Scheduling



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Analytical Bound (ms)	542.39	N/A	N/A

Case Study: Comparing Fine-Grained/Coarse-Grained/Monolithic Scheduling



- Fair-lateness-based scheduler is beneficial as it reduced node response times by up to 9.9%.
- Overheads of supporting fine-grained scheduling was 14.15%.

An
7

			(G-EDF)
Average			0.47
Maximum Response Time (ms)	125.66	427.07	170091.06
Analytical Bound (ms)	542.39	N/A	N/A

Conclusions

1. Fine-grained scheduling
2. Response-time bounds analysis for GPU tasks
3. Case study

Future Work

1. Cycles in the graph
2. Other resource constraints
3. Schedulability studies

Thanks!