



# Maximizing Level of Confidence for Non-Equidistant Checkpointing

DIMITAR NIKOLOV AND ERIK LARSSON

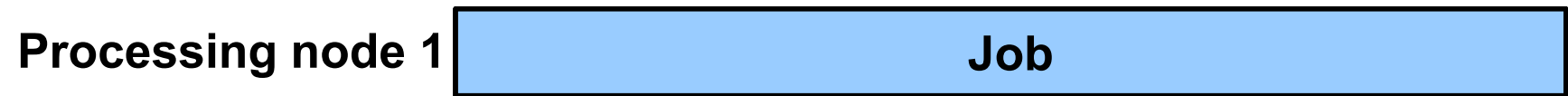


# Roll-back Recovery with Checkpointing

- Efficient technique that copes with soft errors
- Capable of detection and recovery of soft errors
- Checkpoint, an intermediate state of a job
- **Error detection:** compare checkpoints from two processors on which a job is concurrently running
- **Error recovery:** re-execute a portion of the job
- **Introduces a time overhead**

# Roll-back Recovery with Checkpointing

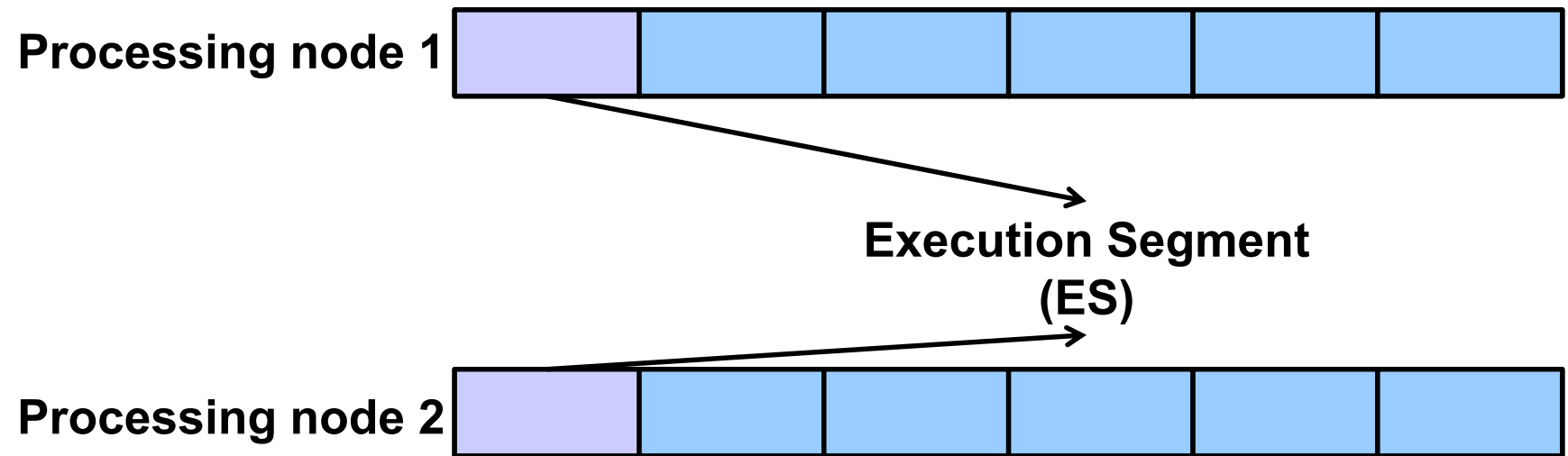
- Job is duplicated and executed concurrently on two processing nodes



Processing node 2

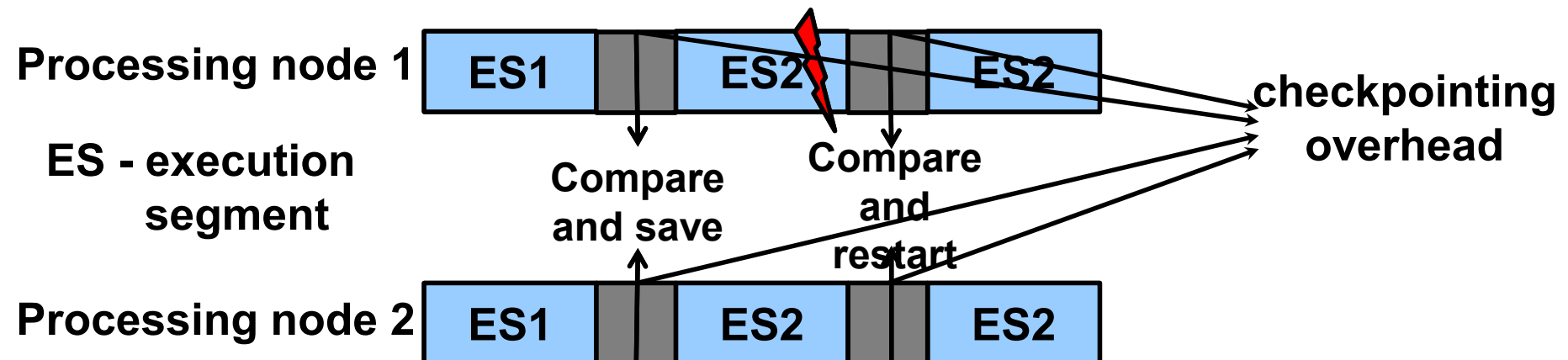
# Roll-back Recovery with Checkpointing

- Job is divided into execution segments, based on the number of checkpoints



# Roll-back Recovery with Checkpointing

- After each execution segment, the checkpoints from both processing nodes are compared
- If the checkpoints match, they are saved, and the job continues with its execution
- If the checkpoints do not match, the job is restarted from the latest saved checkpoint



# Roll-back Recovery with Checkpointing in Real-Time Systems

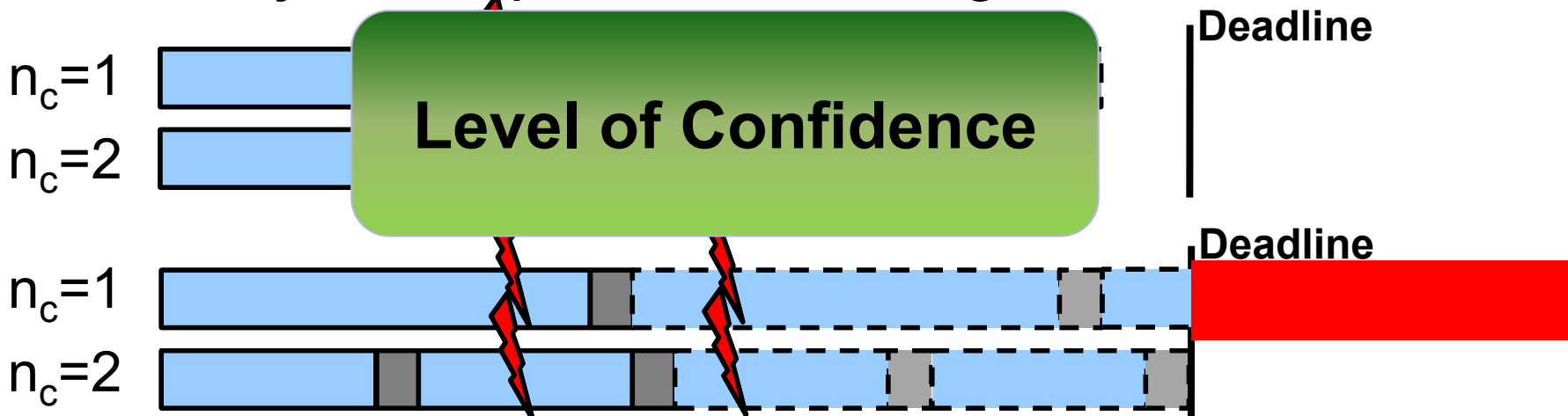
- The number of checkpoints,  $n_c$ , may be the reason to cause deadline violation

$n_c =$   
 $n_c =$



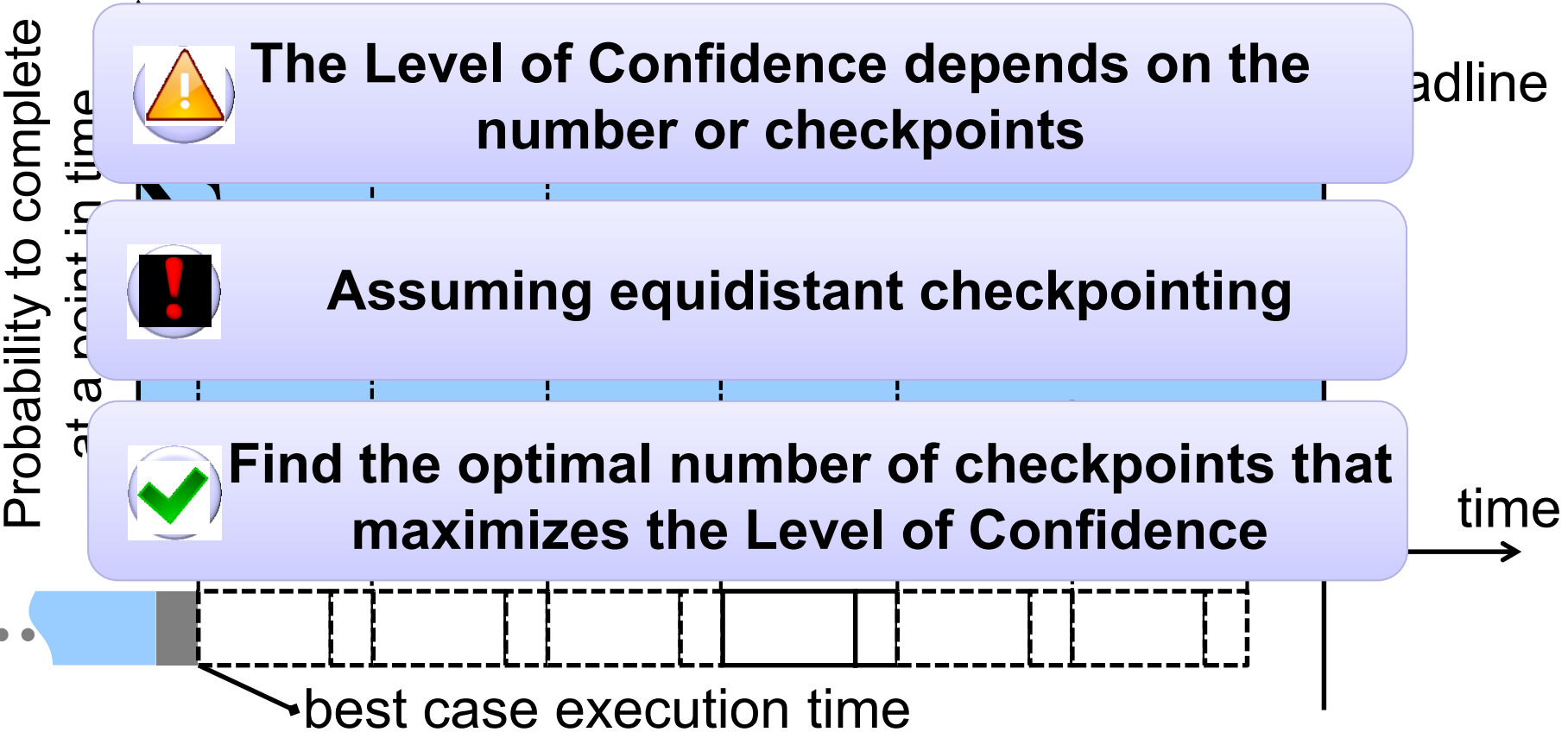
To what extent a deadline is met?

- The number of checkpoints impacts the probability that the job completes before a given deadline




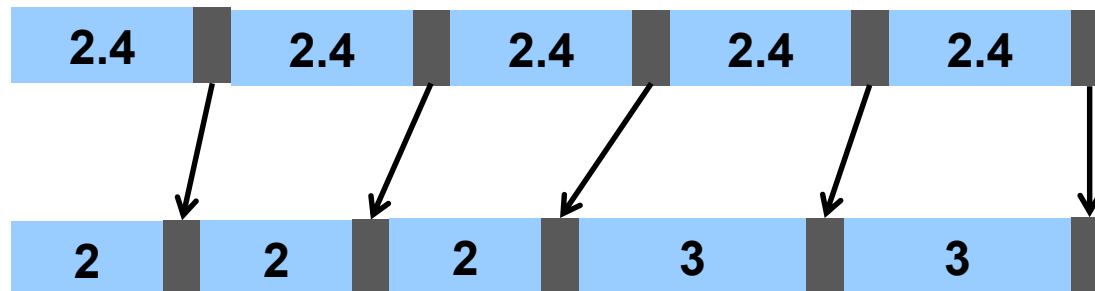
# Level of Confidence

- Probability that a job completes before a deadline



# Motivation

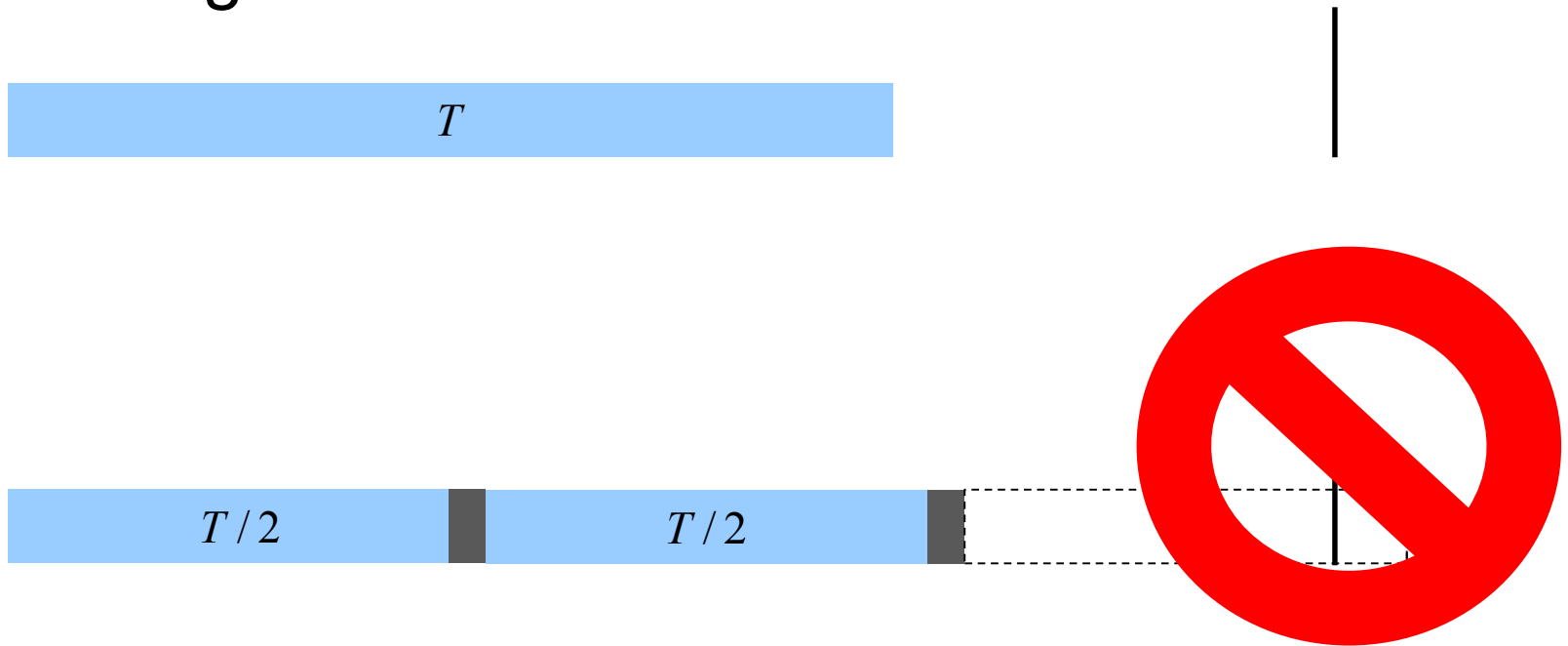
- A checkpoint cannot be taken before an on-going instruction completes
- Assumption: each instruction takes one time unit to complete
-  **Non-equidistant checkpointing has to be considered** y?
- Consider that  $n_c=5$  and the processing time  $t=12$  time unites





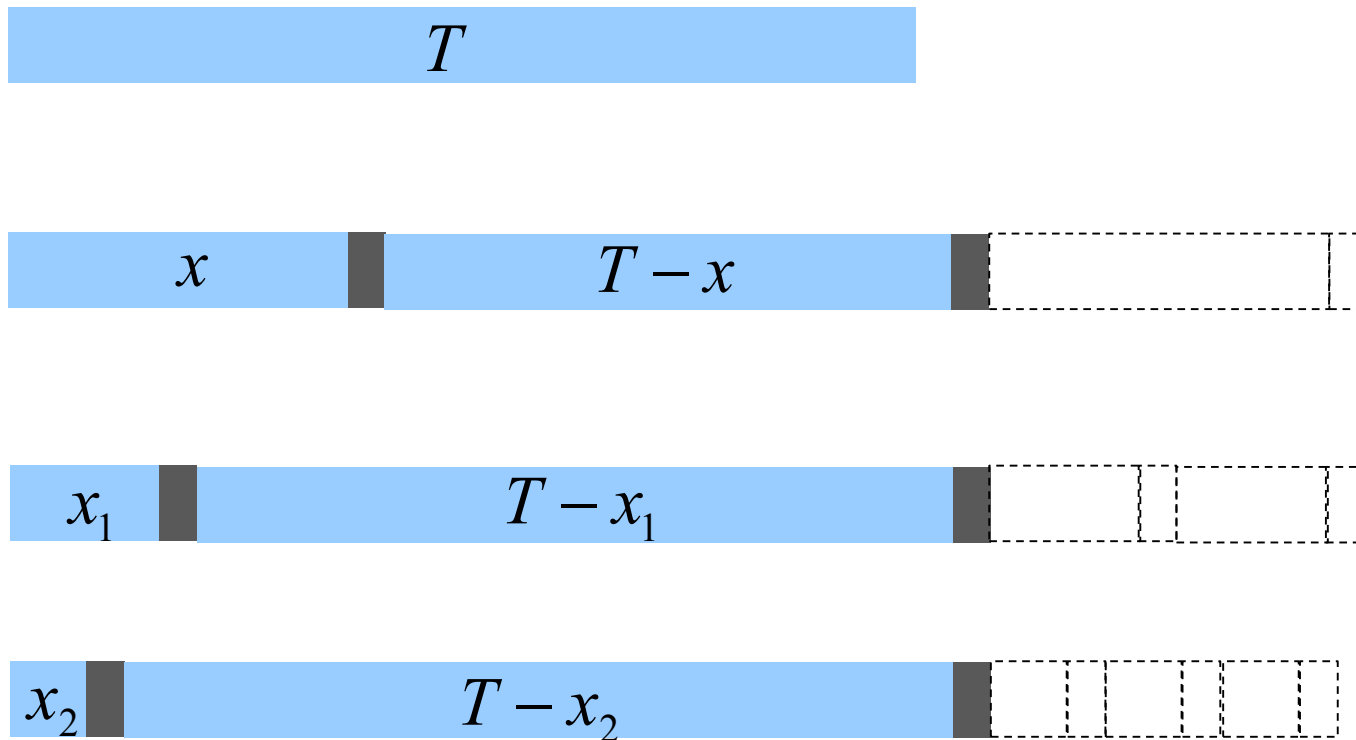
# Motivation

- Given that  $n_c=2$ , what is the Level of Confidence to meet a given deadline



# Motivation

- Given that  $n_c=2$ , what is the Level of Confidence to meet the given deadline



# Problem Formulation

- Given the following inputs:
  - $T$ , processing time
  - $D$ , deadline
  - $\tau$ , checkpointing overhead
  - $P_T$ , probability that no soft errors occur in interval  $T$
  - $n_c$ , number of checkpoints

find the optimal distribution of the given number of checkpoints that maximizes the Level of Confidence

# Overview

- Exhaustive Search
- Clustered Checkpointing
- Results
- Conclusion

# Exhaustive Search

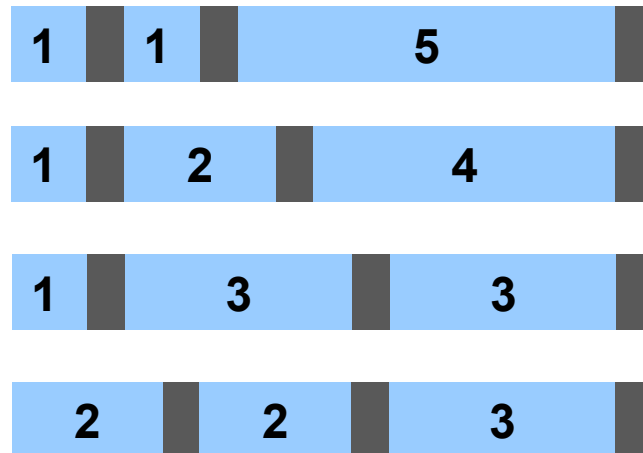
- Explore all possible distributions of a number of checkpoints and for each distribution calculate the Level of Confidence with respect to the deadline
- Guarantees to find the optimal solution
- Some distributions are equivalent



- Sufficient to explore distributions where the execution segments are ordered in ascending order according to their size

# Exhaustive Search

- How many ways to distribute  $n_c=3$  checkpoints for a job with a processing time is  $T=7$  time units, assuming that a checkpoint can be taken only at integer time units?



# Exhaustive Search

- How many ways to distribute  $n_c=10$  checkpoints when the processing time is  $T=1000$ ?



**Not efficient!!!**

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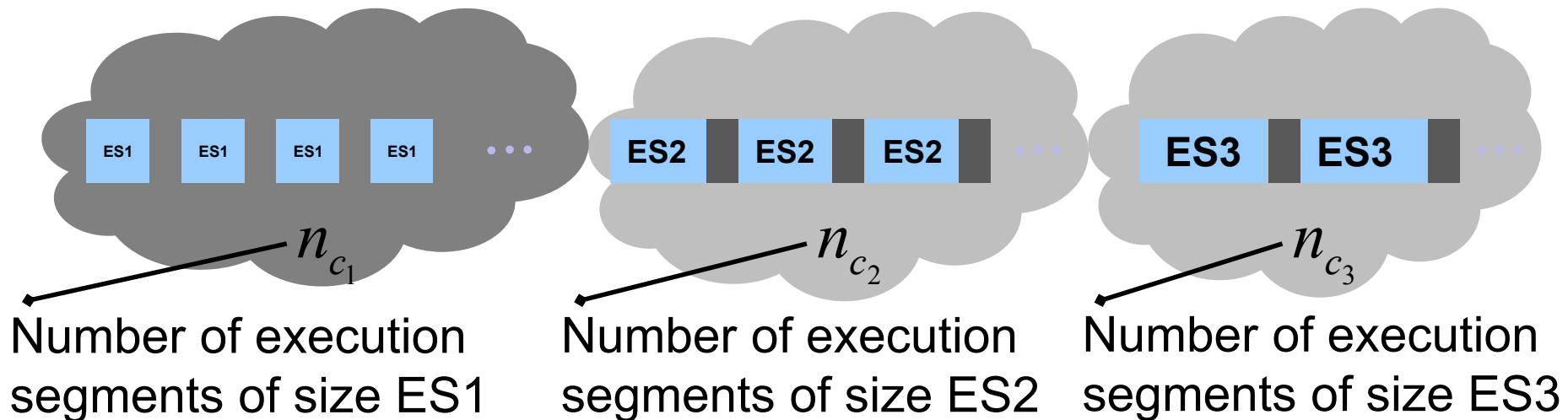


# Clustered Checkpointing

- It is a heuristic, thus does not guarantee optimality
- Explores only a limited set of distributions of a given number of checkpoints
- Number of distributions is of the same order as the processing time of the job which is given as input
- Arrives at a solution at much shorter computation time when compared against exhaustive search
- **In most cases, provides the optimal solution**

# Clustered Checkpointing

- Explores only distributions made out of clusters, such that all the execution segments that belong to the same cluster have the same size
- Distributions made out of at most 3 clusters



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# Results

- Comparing the achieved Level of Confidence (LoC) at various number of checkpoints for:
  - EQC (equidistant checkpointing)
  - EXS (Exhaustive search, \*optimal solution)
  - CC (Clustered Checkpointing, heuristic)
- Given inputs:
  - $T = 100$  t.u. (time units)
  - $D = 150$  t.u.
  - $\tau = 2$  t.u.
  - $P_T = 0.99999$

# Equidistant vs Non-Equidistant Checkpointing

$n_c$	EQC	Non-Equidistant Checkpointing		$n_c$	EQC	Non-Equidistant Checkpointing	
		EXS	CC			EXS	CC
2	1.99999e-5 $\tilde{n}_c = [50^2]$			11	1.71943e-15 $\tilde{n}_c = [9^{10}, 10^1]$		
3	2.66678e-10 $\tilde{n}_c = [33^2, 34^1]$			12	1.68642e-15 $\tilde{n}_c = [8^8, 9^4]$		
9	$\tilde{n}_c = [11, 12]$				$\tilde{n}_c = [5, 6]$		
10	1.75999e-15 $\tilde{n}_c = [10^{10}]$			19	2.10599e-10 $\tilde{n}_c = [5^{14}, 6^5]$		

**Non-Equidistant Checkpointing provides higher or at least equal LoC, but never worse, when compared against Equidistant Checkpointing**

Numbers represent the probability to miss the deadline, thus lower values indicate higher LoC

# Exhaustive Search vs. Clustered Checkpointing

$n_c$	Non-Equidistant Checkpointing		$n_c$	Non-Equidistant Checkpointing	
	EXS	CC		EXS	CC
2			11		1.58908e-15 $\tilde{n}_c = [5^4, 11^4, 12^3]$
3			12		
4			13		
5			14		
6			15		
7			16		
8			17		
9			18		
10			19		

**Clustered Checkpointing finds, in most cases, the optimal distribution of checkpoints in much shorter computation time than Exhaustive Search**

# Maximal LoC

$n_c$	EQC
2	1.99999e-5 $\tilde{n}_c = [50^2]$
3	2.66678e-10 $\tilde{n}_c = [33^2, 34^1]$
4	2.49998e-10 $\tilde{n}_c = [25^4]$
5	2.39998e-10 $\tilde{n}_c = [20^5]$
6	2.07477e-15 $\tilde{n}_c = [16^2, 17^4]$
7	1.95991e-15 $\tilde{n}_c = [14^5, 15^2]$
8	1.87599e-15 $\tilde{n}_c = [12^4, 13^4]$
9	1.81113e-15 $\tilde{n}_c = [11^8, 12^1]$
10	1.75999e-15 $\tilde{n}_c = [10^{10}]$

$n_c$	EQC
11	1.71943e-15 $\tilde{n}_c = [9^{10}, 10^1]$
12	1.68642e-15 $\tilde{n}_c = [8^8, 9^4]$
13	1.65807e-15 $\tilde{n}_c = [7^4, 8^9]$
14	1.63343e-15 $\tilde{n}_c = [7^{12}, 8^2]$
15	1.61335e-15 $\tilde{n}_c = [6^5, 7^{10}]$
16	1.59510e-15 $\tilde{n}_c = [6^{12}, 7^4]$
18	1.75199e-10 $\tilde{n}_c = [5^8, 6^{10}]$
19	2.10599e-10 $\tilde{n}_c = [5^{14}, 6^5]$

Maximal LoC for EQC achieved for  $n_c=17$

# Maximal LoC

$n_c$	EQC	Non-Equidistant Checkpointing		$n_c$	EQC	Non-Equidistant Checkpointing		
		EXS	CC			EXS	CC	
2	1.99999e-5 $\tilde{n}_c = [50^2]$	1.12000e-5 $\tilde{n}_c = [44^1, 56^1]$	1.12000e-5 $\tilde{n}_c = [44^1, 56^1]$	11	1.71943e-15 $\tilde{n}_c = [9^{10}, 10^1]$	1.58463e-15 $\tilde{n}_c = [5^4, 8^1, 12^6]$	1.58908e-15 $\tilde{n}_c = [5^4, 11^4, 12^3]$	
3	2.66678e-10 $\tilde{n}_c = [33^2, 34^1]$	2.55998e-10 $\tilde{n}_c = [20^1, 40^2]$	2.55998e-10 $\tilde{n}_c = [20^1, 40^2]$		1.68642e-15 $\tilde{n}_c = [8^8, 9^4]$		1.65807e-15 $\tilde{n}_c = [7^4, 8^9]$	
4	2.49998e-10 $\tilde{n}_c = [25^4]$	2.09559e-10 $\tilde{n}_c = [19^2, 31^2]$	2.09559e-10 $\tilde{n}_c = [19^2, 31^2]$		1.63343e-15 $\tilde{n}_c = [7^{12}, 8^2]$			
5	2.39998e-10 $\tilde{n}_c = [20^5]$	1.12000e-10 $\tilde{n}_c = [18^4, 28^1]$	1.12000e-10 $\tilde{n}_c = [18^4, 28^1]$		1.61335e-15 $\tilde{n}_c = [6^5, 7^{10}]$			
6	2.07477e-15 $\tilde{n}_c = [16^2, 17^4]$	2.07477e-15 $\tilde{n}_c = [16^2, 17^4]$	2.07477e-15 $\tilde{n}_c = [16^2, 17^4]$		1.59510e-15 $\tilde{n}_c = [6^{12}, 7^4]$		1.59510e-15 $\tilde{n}_c = [6^{12}, 7^4]$	
7	1.95991e-15 $\tilde{n}_c = [14^5, 15^2]$	1.95161e-15 $\tilde{n}_c = [7^1, 15^3, 16^3]$	1.95161e-15 $\tilde{n}_c = [7^1, 15^3, 16^3]$		1.57863e-15 $\tilde{n}_c = [5^2, 6^{15}]$	1.57863e-15 $\tilde{n}_c = [5^2, 6^{15}]$	1.57863e-15 $\tilde{n}_c = [5^2, 6^{15}]$	
8	1.87599e-15 $\tilde{n}_c = [12^4, 13^4]$	1.83839e-15 $\tilde{n}_c = [7^2, 14^4, 15^2]$	1.83839e-15 $\tilde{n}_c = [7^2, 14^4, 15^2]$		1.75199e-10 $\tilde{n}_c = [5^8, 6^{10}]$	7.60007e-11 $\tilde{n}_c = [5^{16}, 10^2]$	7.60007e-11 $\tilde{n}_c = [5^{16}, 10^2]$	7.60007e-11 $\tilde{n}_c = [5^{16}, 10^2]$
9	1.81113e-15 $\tilde{n}_c = [11^8, 12^1]$	1.70906e-15 $\tilde{n}_c = [6^3, 13^2, 14^4]$	1.70906e-15 $\tilde{n}_c = [6^3, 13^2, 14^4]$	19	2.10599e-10 $\tilde{n}_c = [5^{14}, 6^5]$	1.36000e-10 $\tilde{n}_c = [4^{15}, 10^4]$	1.36000e-10 $\tilde{n}_c = [4^{15}, 10^4]$	
	1.75999e-15 $\tilde{n}_c = [10^{10}]$							

Higher LoC than the maximal LoC achieved for EQC



# Maximal LoC

$n_c$	EOC	Non-Equidistant Checkpointing		$n_c$	EOC	Non-Equidistant Checkpointing	
5	2.39998e-10 $\tilde{n}_c = [20^5]$	1.12000e-10 $\tilde{n}_c = [18^4, 28^1]$	1.12000e-10 $\tilde{n}_c = [18^4, 28^1]$	14	1.63343e-15 $\tilde{n}_c = [7^{12}, 8^2]$	1.57695e-15 $\tilde{n}_c = [4^3, 8^{11}]$	1.57695e-15 $\tilde{n}_c = [4^3, 8^{11}]$
6	2.07477e-15	2.07477e-15	2.07477e-15		1.61335e-15	1.57695e-15	1.57695e-15
10	1.73999e-15 $\tilde{n}_c = [10^{10}]$	1.55958e-15 $\tilde{n}_c = [8^6, 13^4]$	1.55958e-15 $\tilde{n}_c = [8^6, 13^4]$	19	2.10599e-10 $\tilde{n}_c = [5^{14}, 6^5]$	1.56000e-10 $\tilde{n}_c = [4^{15}, 10^4]$	1.56000e-10 $\tilde{n}_c = [4^{15}, 10^4]$

**An LoC requirement can be satisfied with lower number of checkpoints when Non-Equidistant Checkpointing is used**

**The best case completion time, i.e. when no errors occur, can be reduced when Non-Equidistant Checkpointing is used**

The maximal LoC can be achieved for  $n_c=13$

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# Conclusion

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- By using non-equidistant checkpointing, the LoC can be improved in comparison to the LoC obtained when equidistant checkpointing is used
- An LoC requirement can be satisfied for a lower number of checkpoints if non-equidistant checkpointing is used
- The best case completion time, i.e. the time required for a job to complete when no errors occur, can be reduced while at the same time a given LoC requirement is satisfied



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