

Partitioned Fixed-Priority Scheduling of Parallel Tasks **Without** Preemptions

Daniel Casini^{*}, **Alessandro Biondi^{*}**, **Geoffrey Nelissen[†]**,
and **Giorgio Buttazzo^{*}**

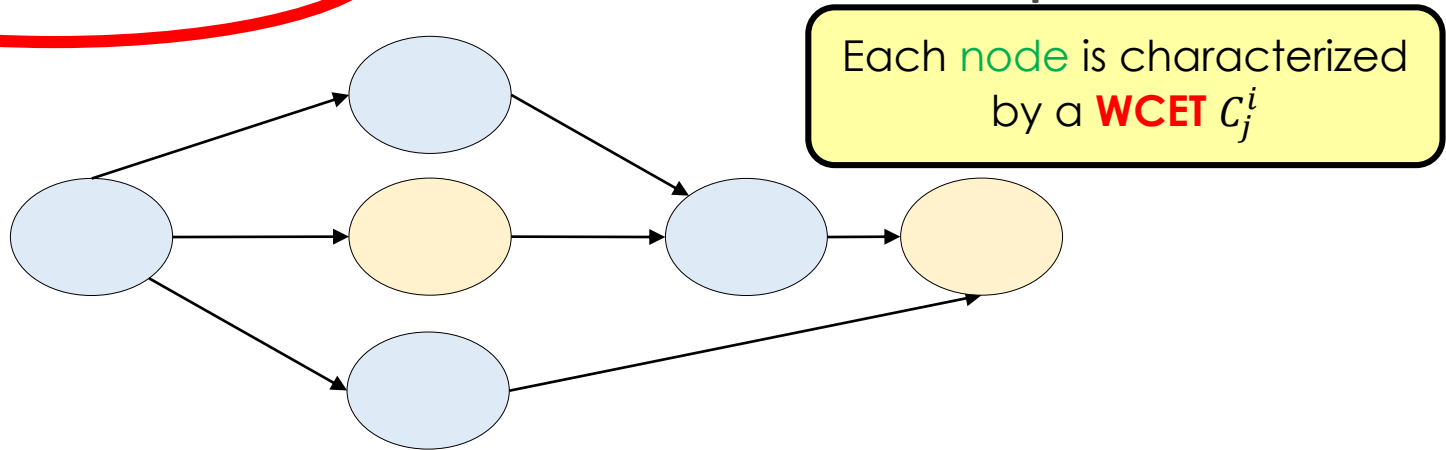
^{} ReTiS Lab, Scuola Superiore Sant'Anna, Pisa, Italy*

[†] CISTER, ISEP, Polytechnic Institute of Porto, Portugal



Overview

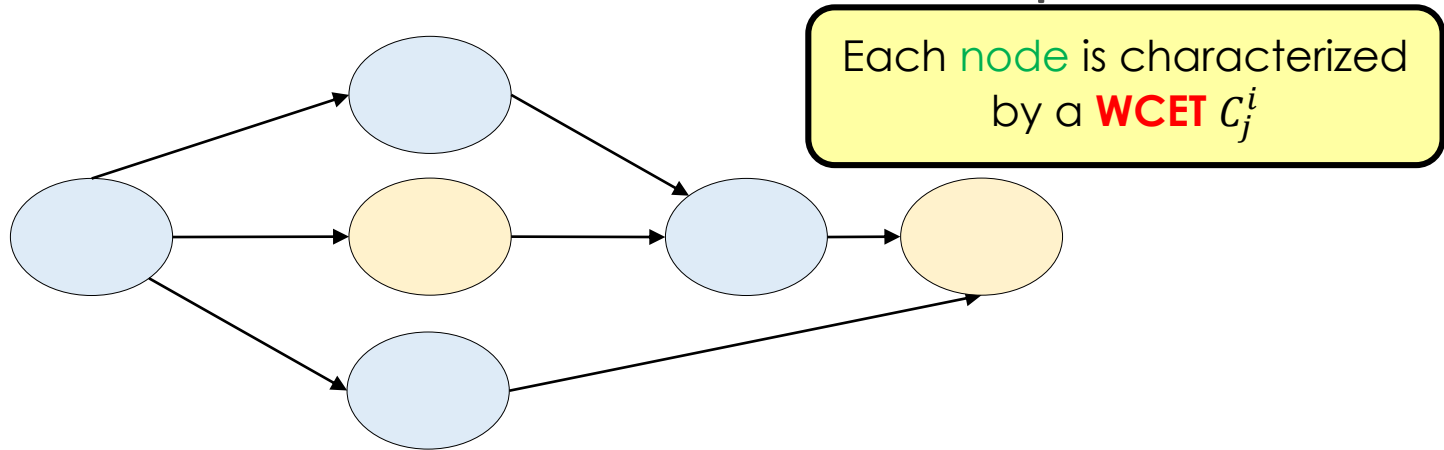
Partitioned Fixed-Priority Scheduling of **Parallel Tasks** Without Preemptions



- Each task is represented by a **Direct Acyclic Graph**, and is characterized by
 - i. a minimum inter-arrival time T_i
 - ii. a **constrained** deadline $D_i \leq T_i$
 - iii. a **fixed priority** π_i

Overview

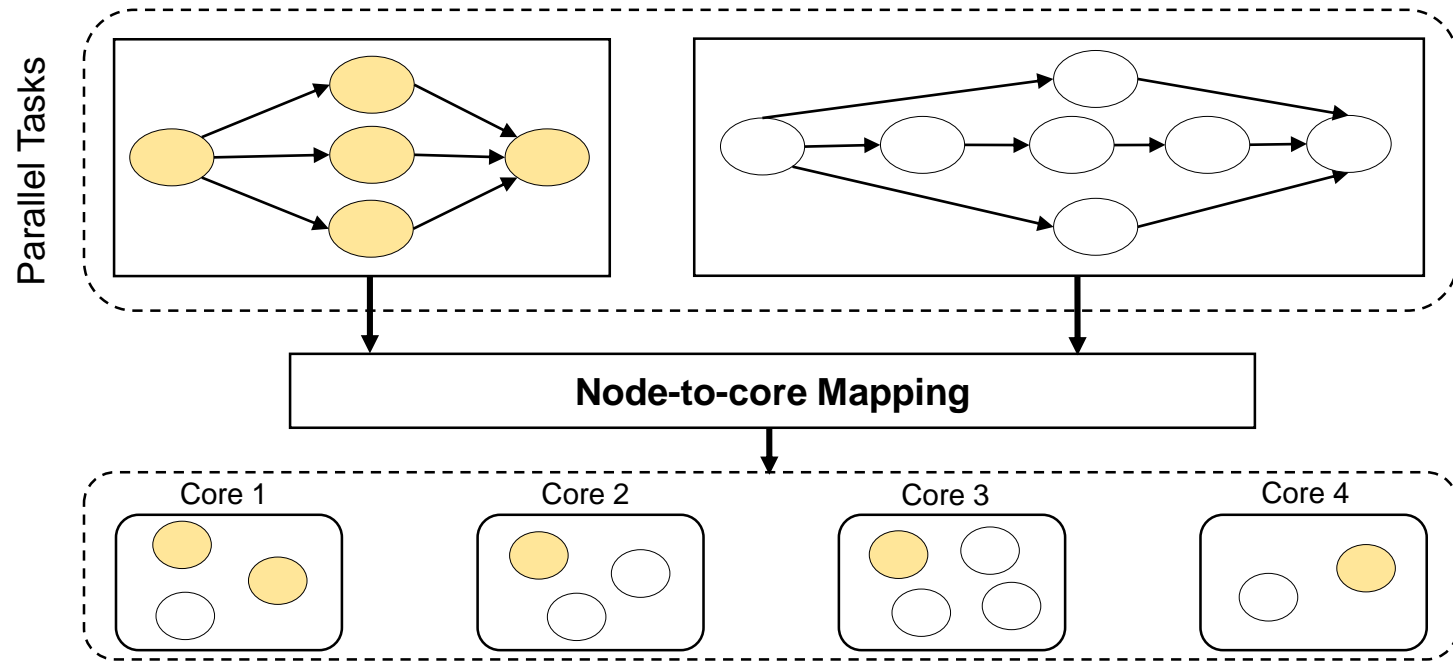
Partitioned **Fixed-Priority** Scheduling of Parallel Tasks Without Preemptions



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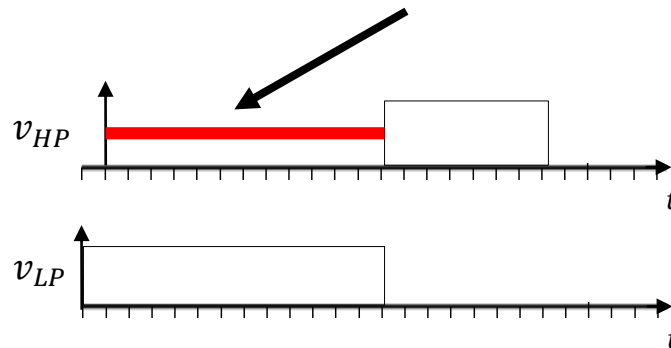


- Each **node** is **statically** assigned to a **core**
- Nodes of the **same task** can be allocated to **different cores**

Overview

Partitioned Fixed-Priority Scheduling of Parallel Tasks **Without Preemptions**

Non-preemptive blocking



As soon a **node** starts executing, it
cannot be preempted

Why non-preemptive scheduling?



Predictable management of local memories

e.g., nodes can pre-load data from scratchpads before start executing

Memory Feasibility Analysis of Parallel Tasks
Running on Scratchpad-Based Architectures

Daniel Casini, Alessandro Biondi, Geoffrey Nelissen and Giorgio Buttazzo

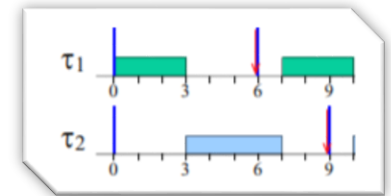
This morning @ RTSS

Why non-preemptive scheduling?



Predictable management of local memories

Reduces context-switch overhead



Simplifies WCET Analysis

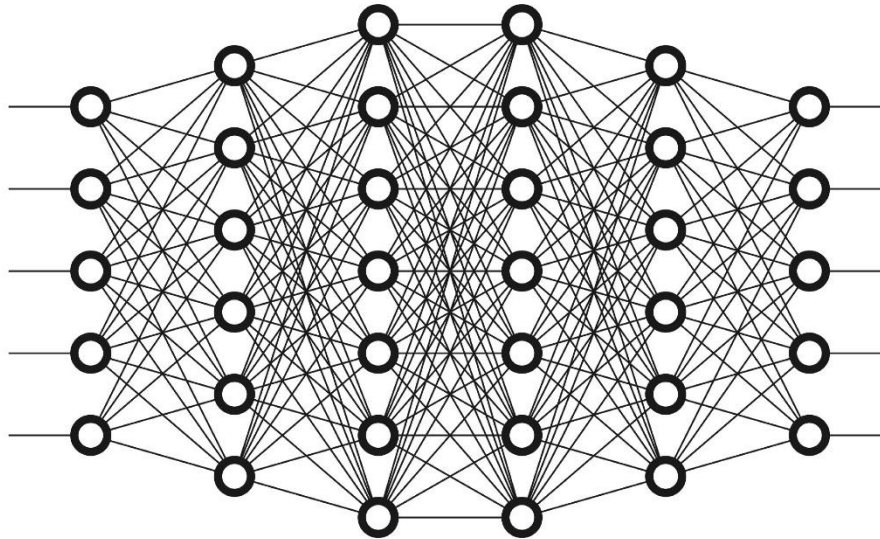
Use of HW accelerators and GPUs



Can be a good choice for executing
deep neural networks

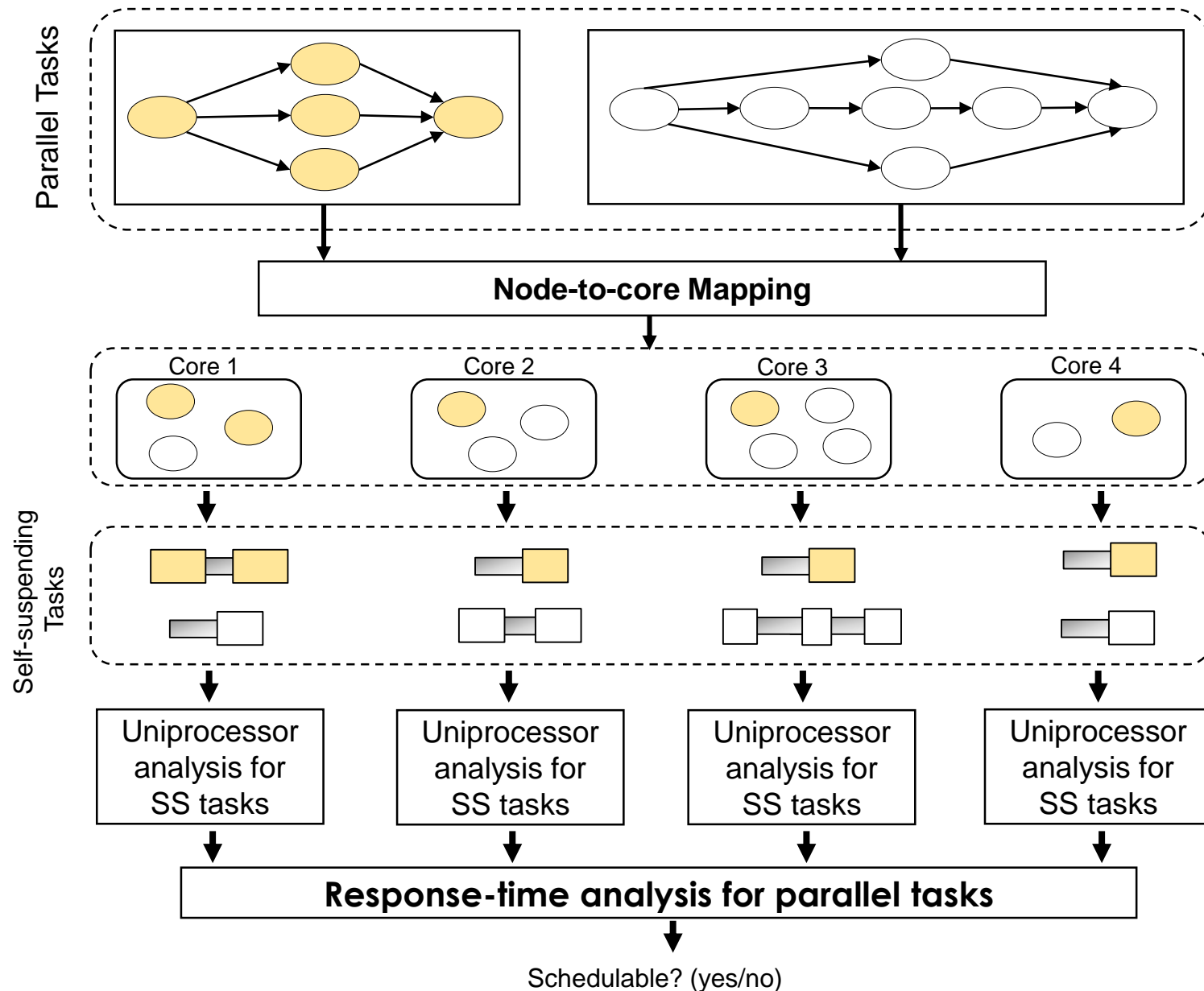
Why non-preemptive scheduling?

- We profiled a **deep neural network** executed by **Tensorflow** on a **8-core** Intel i7 machine @ 3.5GHz

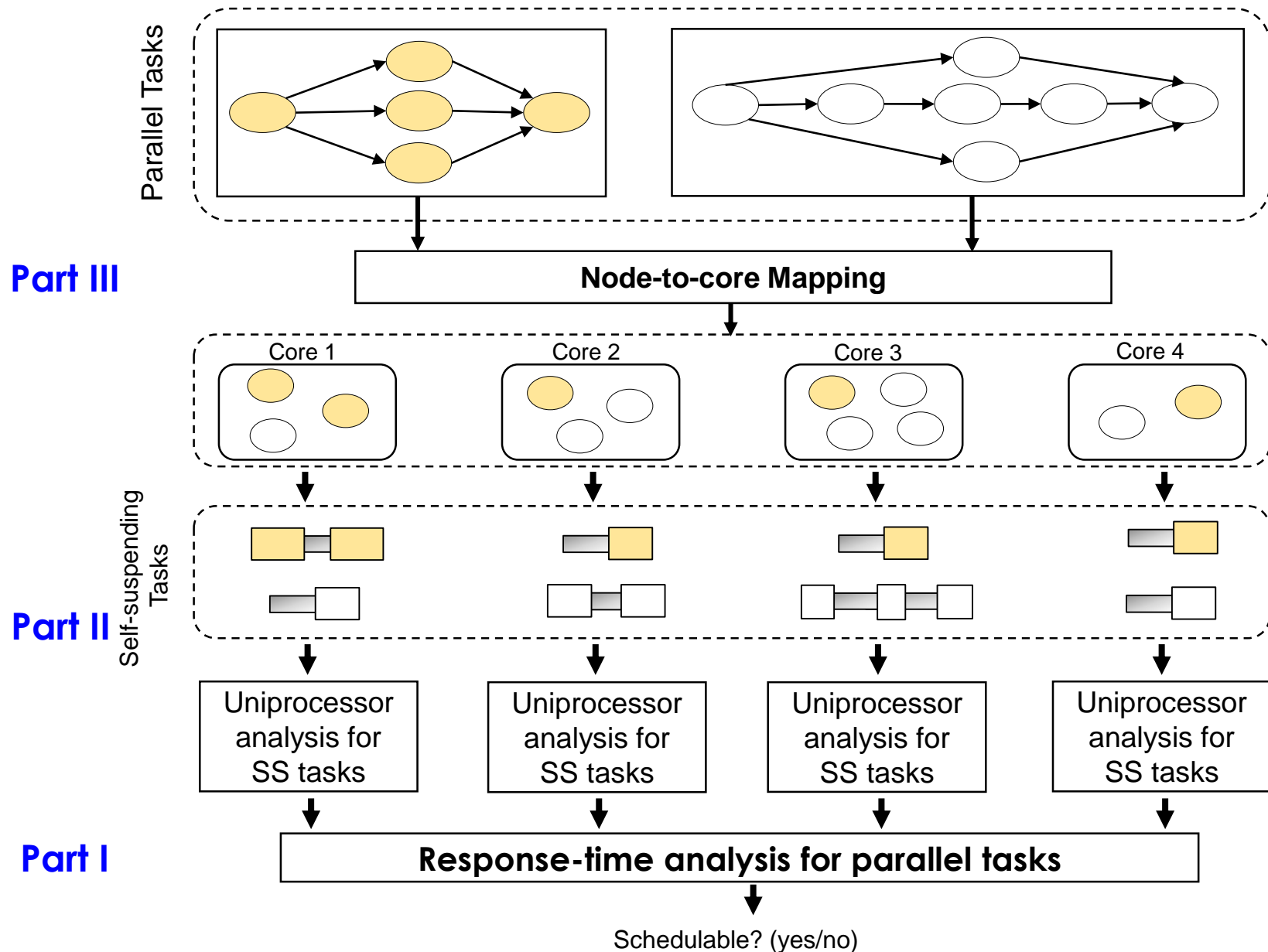


More than 34000 nodes where only about **1.2%** of them have **execution times** larger than **100 microseconds**

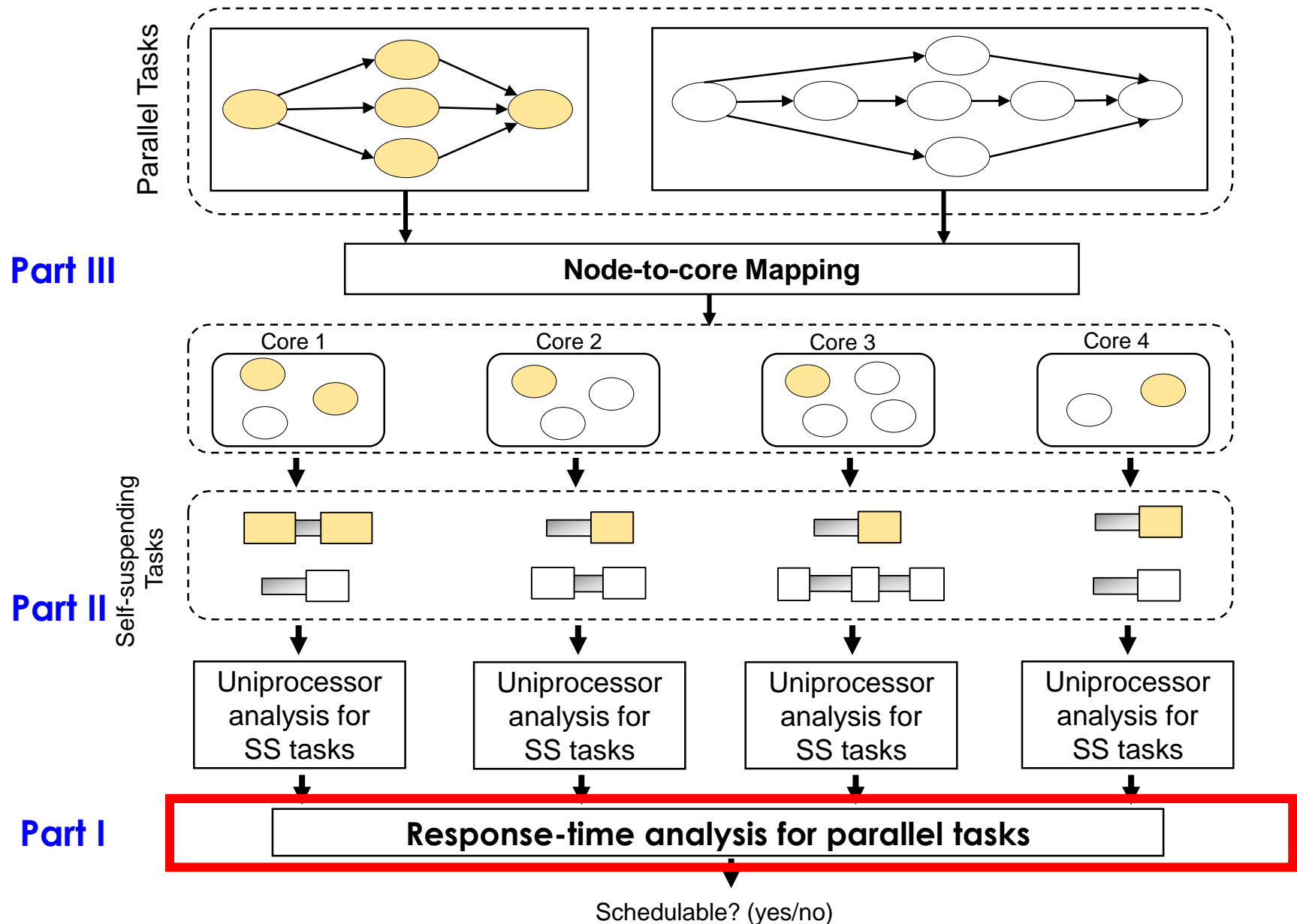
Overview of the analysis framework



Overview of the analysis framework



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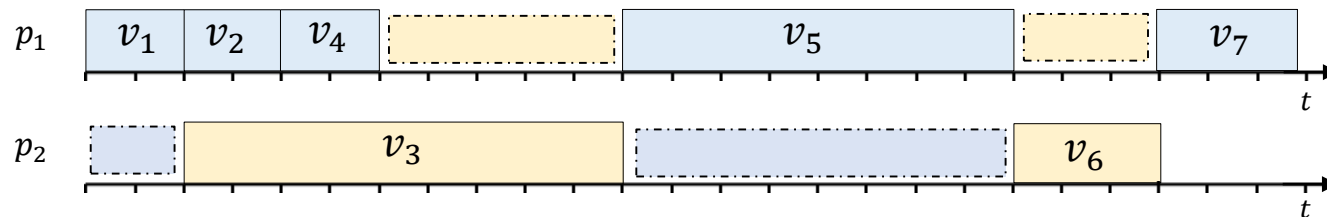
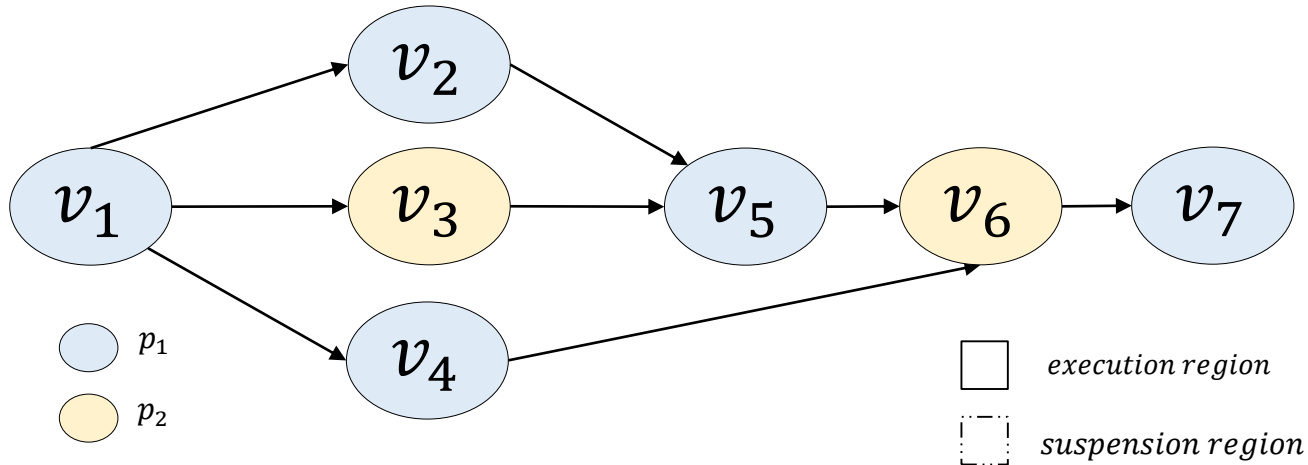


Part I:

Response-time analysis for parallel tasks

Intuition

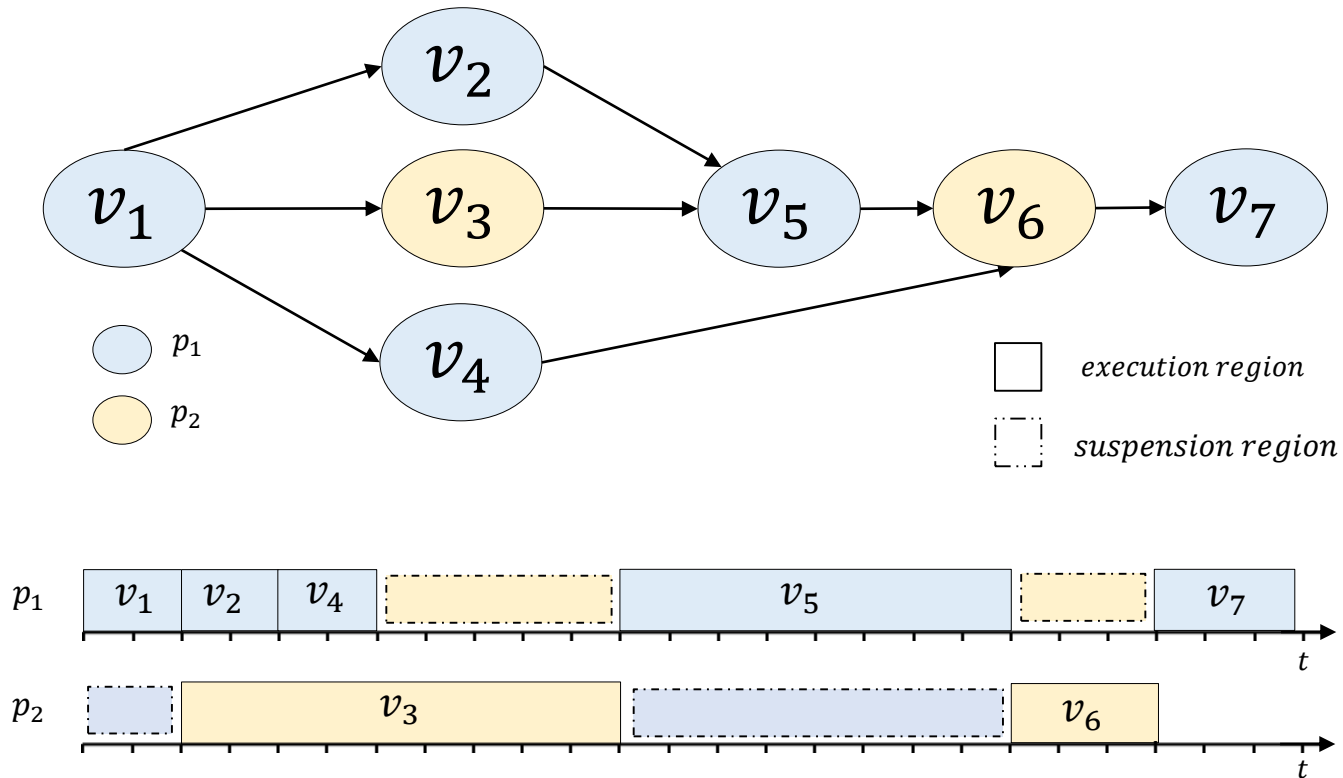
- Each **core** ‘perceives’ the execution of a **parallel task** as an interleaved **sequence** of **execution** and **suspension** regions



Suspension regions correspond to **execution regions** on a **different core**

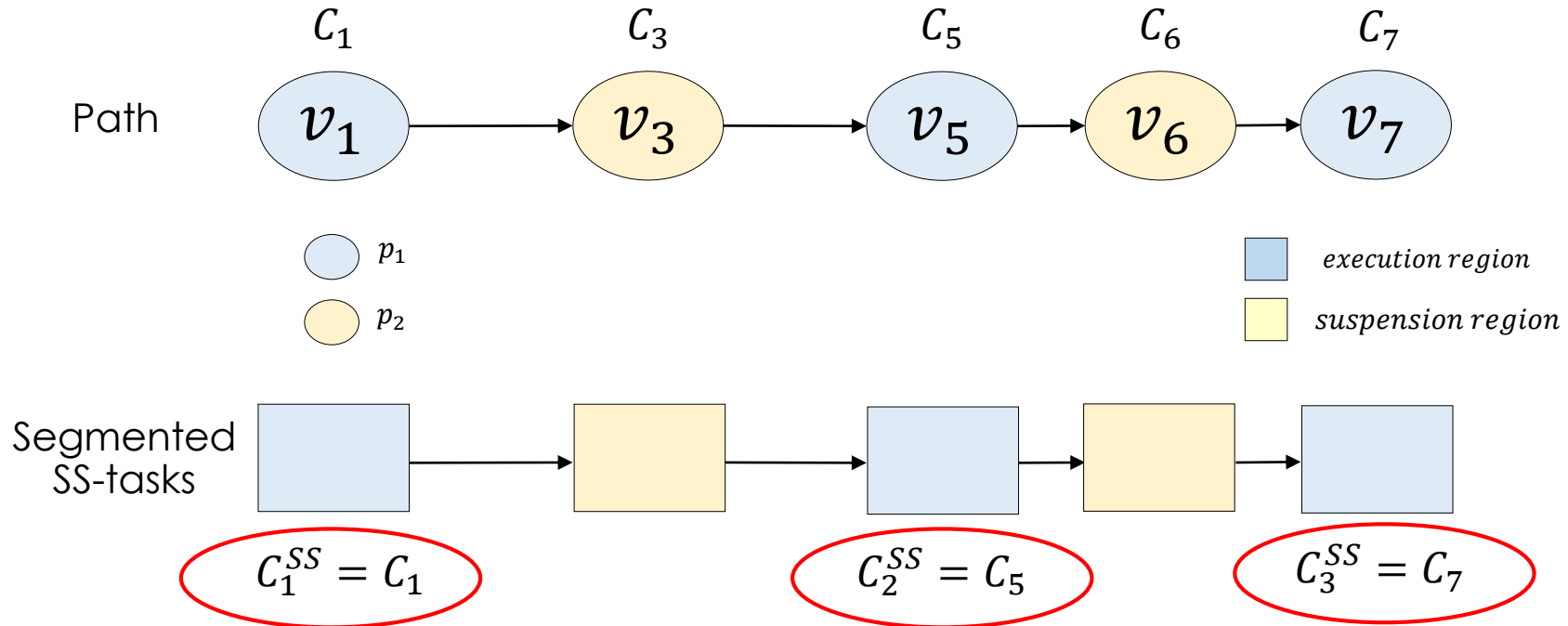
Intuition

- Paths can be mapped to a self-suspending tasks



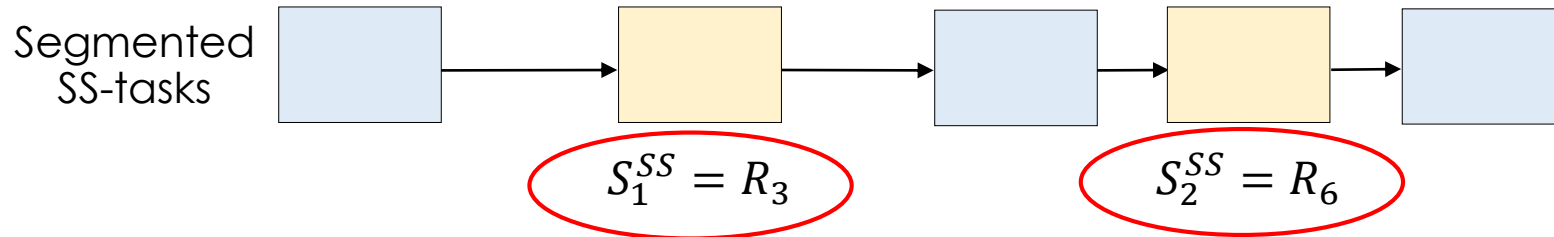
Intuition

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The length of each execution region directly maps to the WCET of a node in the graph

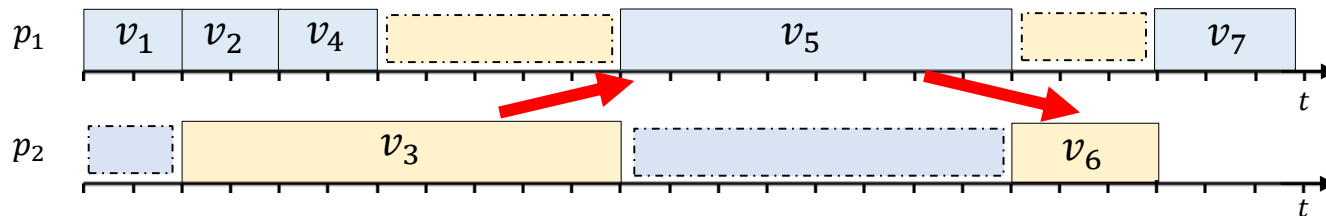
Intuition



The **length** of each **suspension region** depends on the **response time** of nodes allocated to **different cores**

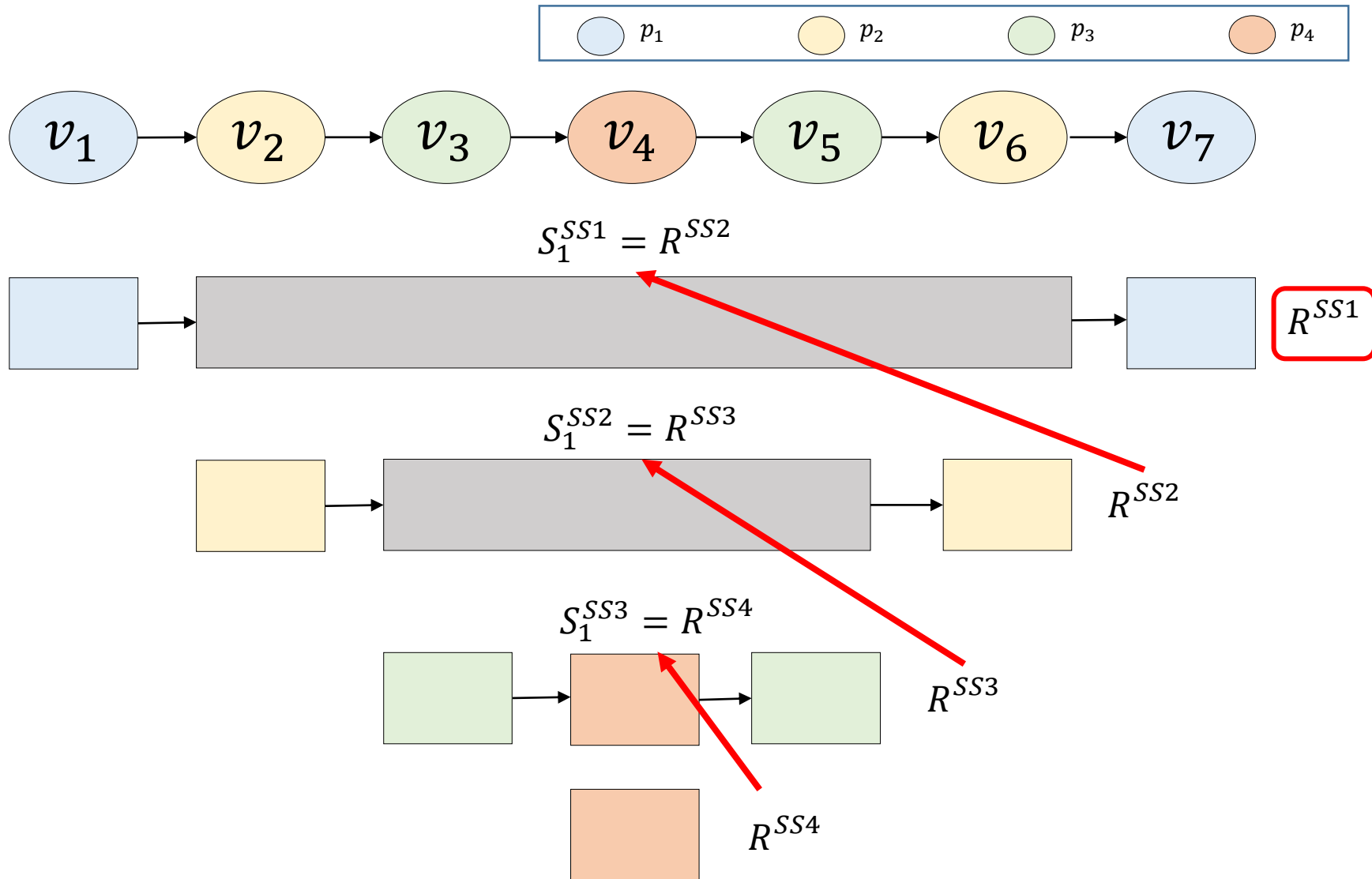


Complex **inter-core dependencies** can arise



Solution (from Fonseca et al. 2017)

- Recursive algorithm to unfold response-time dependencies:



Parallel tasks without preemptions

- We **extended** this approach to work under **non-preemptive scheduling**

Need for a fine-grained **analysis** for **non-preemptive self-suspending** tasks

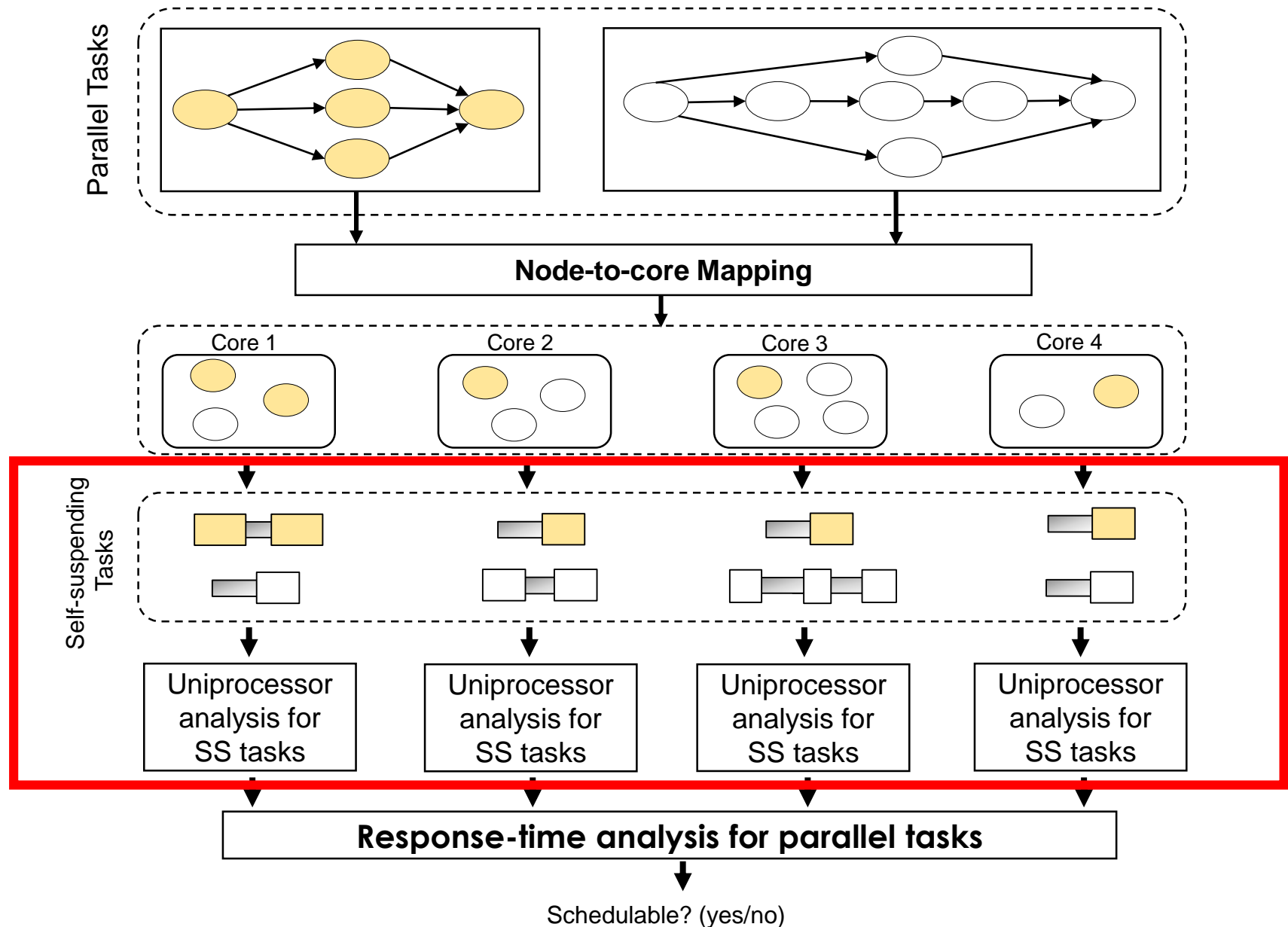


Our next contribution

Part II:

Analysis for non-preemptive self-suspending tasks

Overview of the analysis framework



Overview of the analysis for SS-tasks

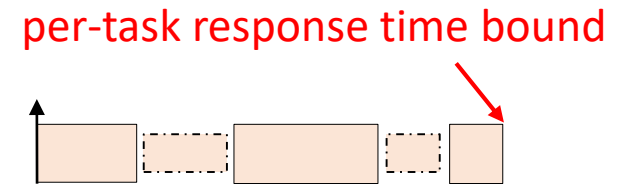
Two different approaches:

1 Holistic analysis

- Computes the RT of a **whole** self-suspending task

$$C_i = \sum_{\text{all segments}} C_{i,j}$$

$$S_i = \sum_{\text{all segments}} S_{i,j}$$

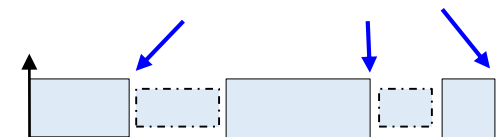


- **Analytically dominates** state-of-the-art **analysis** (Dong et al. 2018)

2 Segment-based analysis

- Computes the RT of **individual segments**

per-segment response time bounds



Overview of the analysis for SS-tasks

Two different approaches:

1 Holistic analysis

- Computes the RT of a **whole** self-suspending task

$$C_i = \sum c_i$$

Hybrid model:

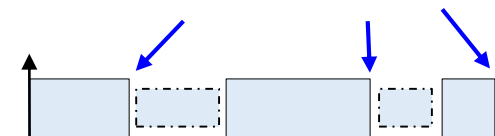
Take the minimum of the two bounds

- **A** **piece-wise** **analysis** (Dong et al. 2018)

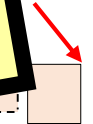
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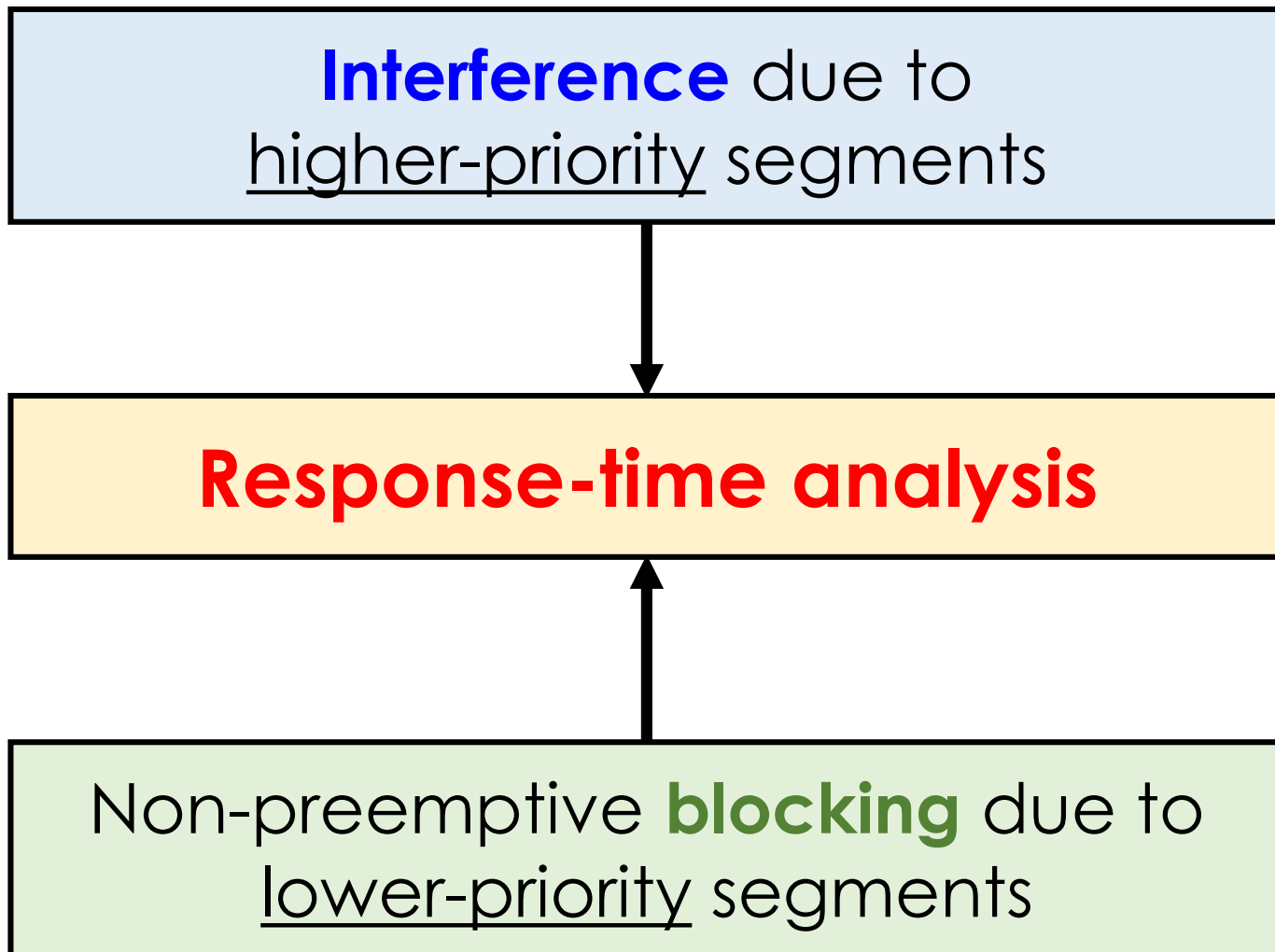
per-segment response time bounds



the bound

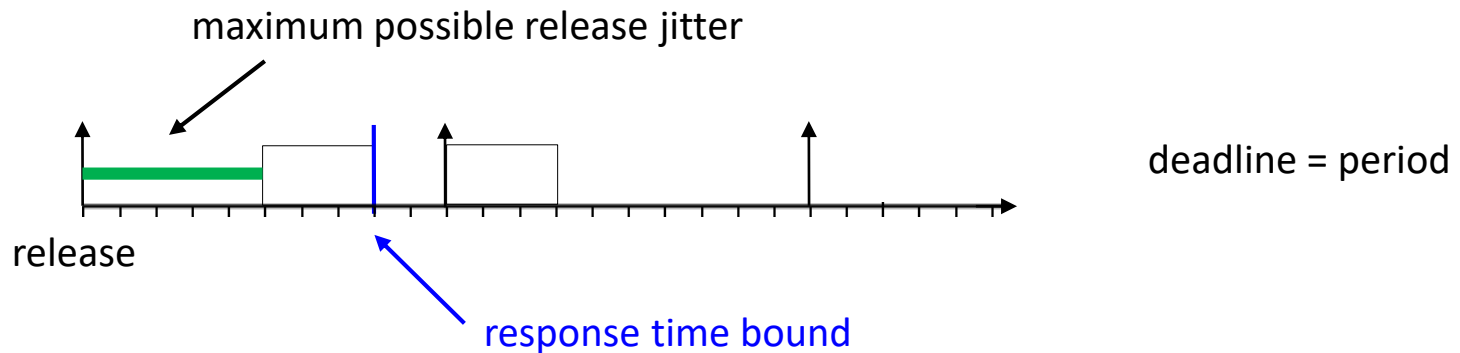


Analysis for SS-tasks



Computing Interference

- **Interference** from **higher-priority** tasks is accounted by means of the following **worst-case scenario***:



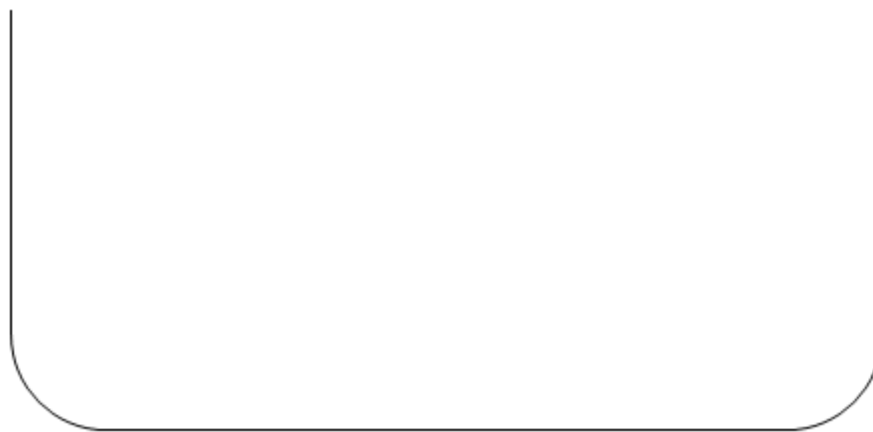
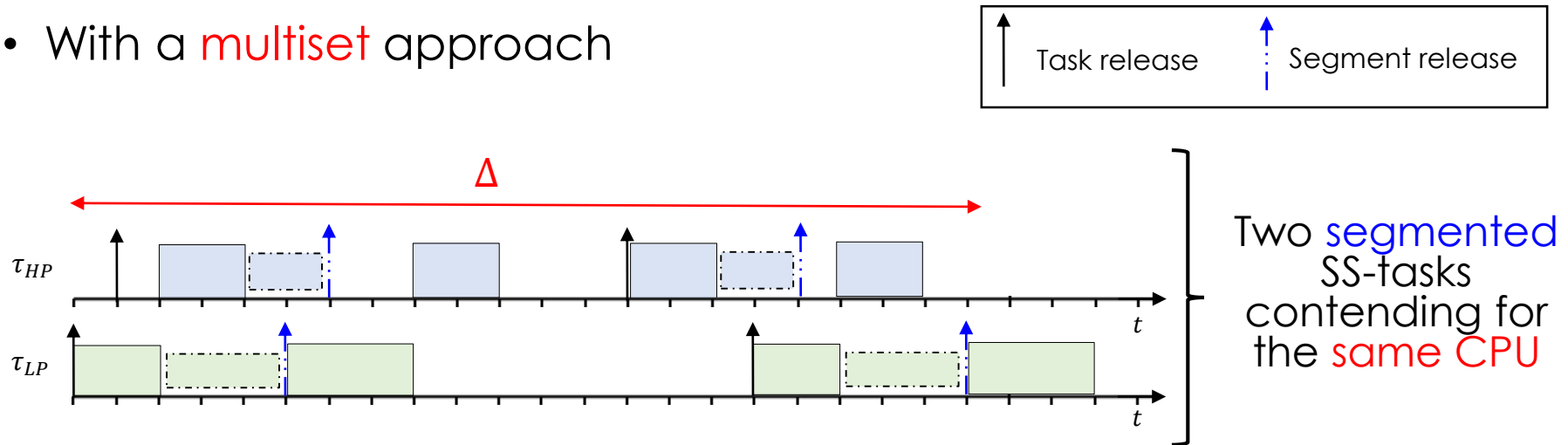
- The **response time bound** can be initially **approximated** to the **task's deadline** and iteratively refined
 - **Holistic** and **segmented** analyses are **combined** during the **iterative refinement**



*Jian-Jia Chen et al., "Many suspensions, many problems: a review of self-suspending tasks in real-time systems", *Real-time System Journal*.

Fine-grained accounting of blocking

- With a **multiset** approach

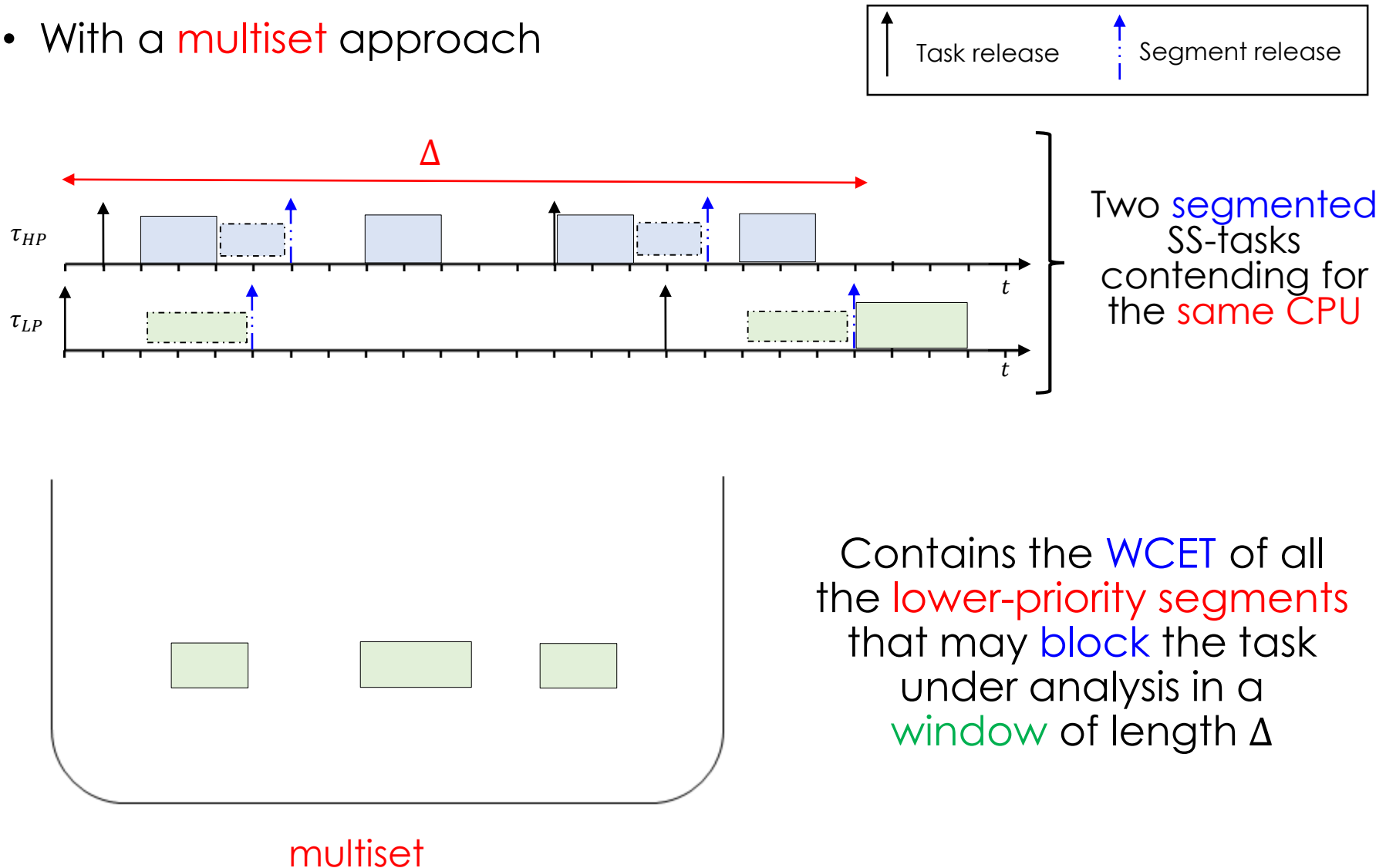


multiset

Contains the **WCET** of all the **lower-priority segments** that may **block** the task under analysis in a **window** of length Δ

Fine-grained accounting of blocking

- With a **multiset** approach



Non-preemptive self-suspending tasks

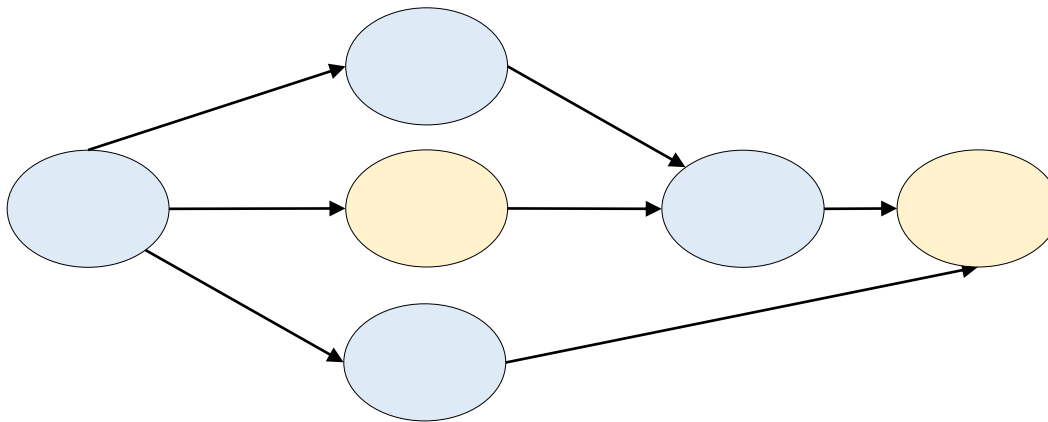
MISSION COMPLETE

Now we have our analysis!

Non-preemptive self-suspending tasks

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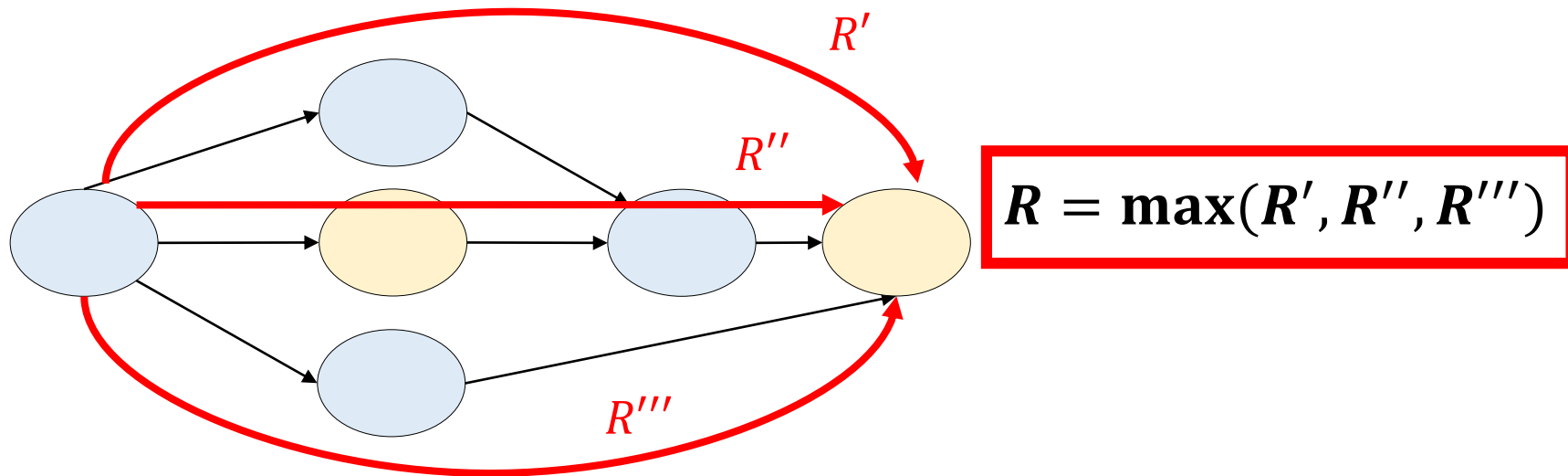
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Non-preemptive self-suspending tasks

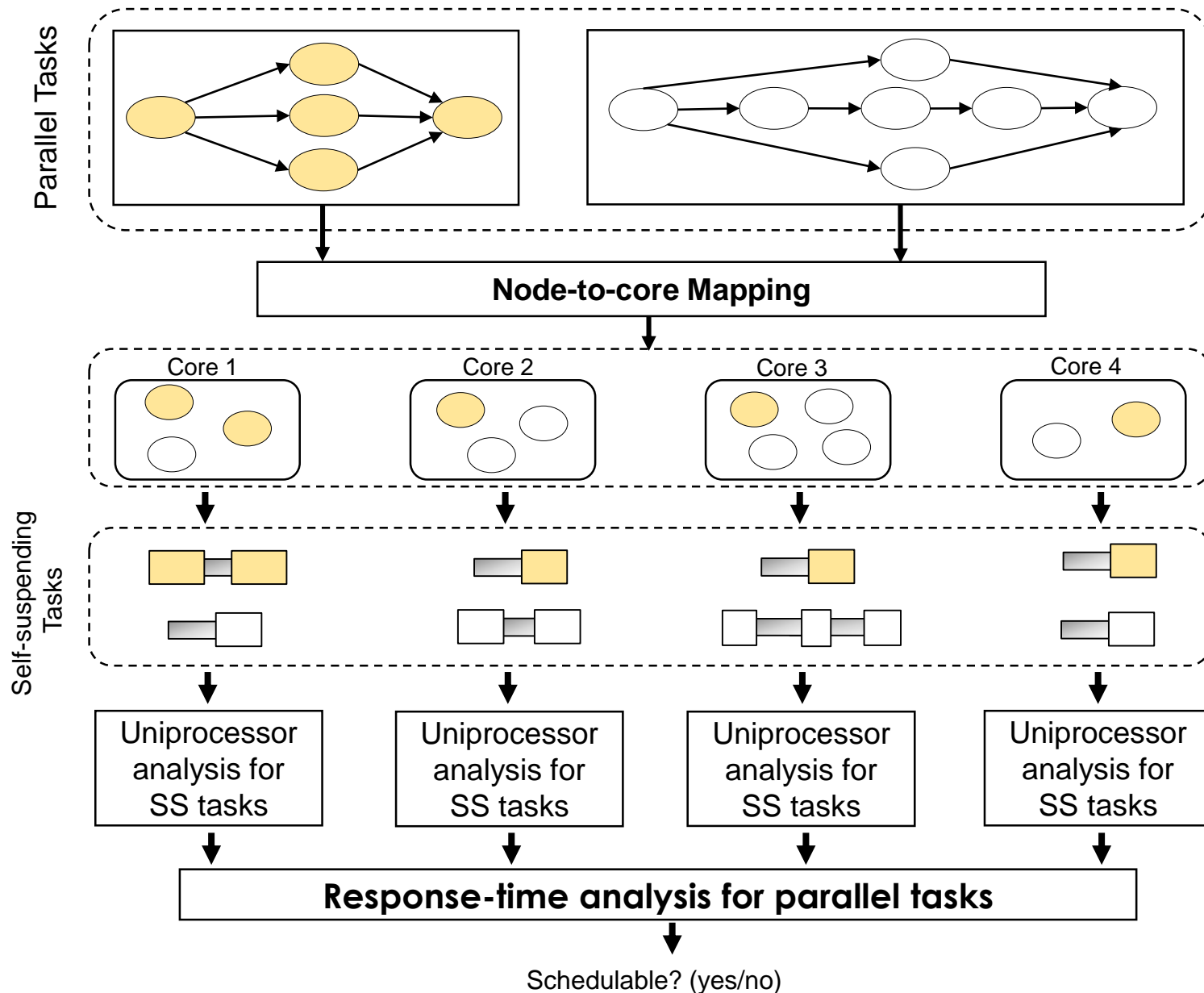
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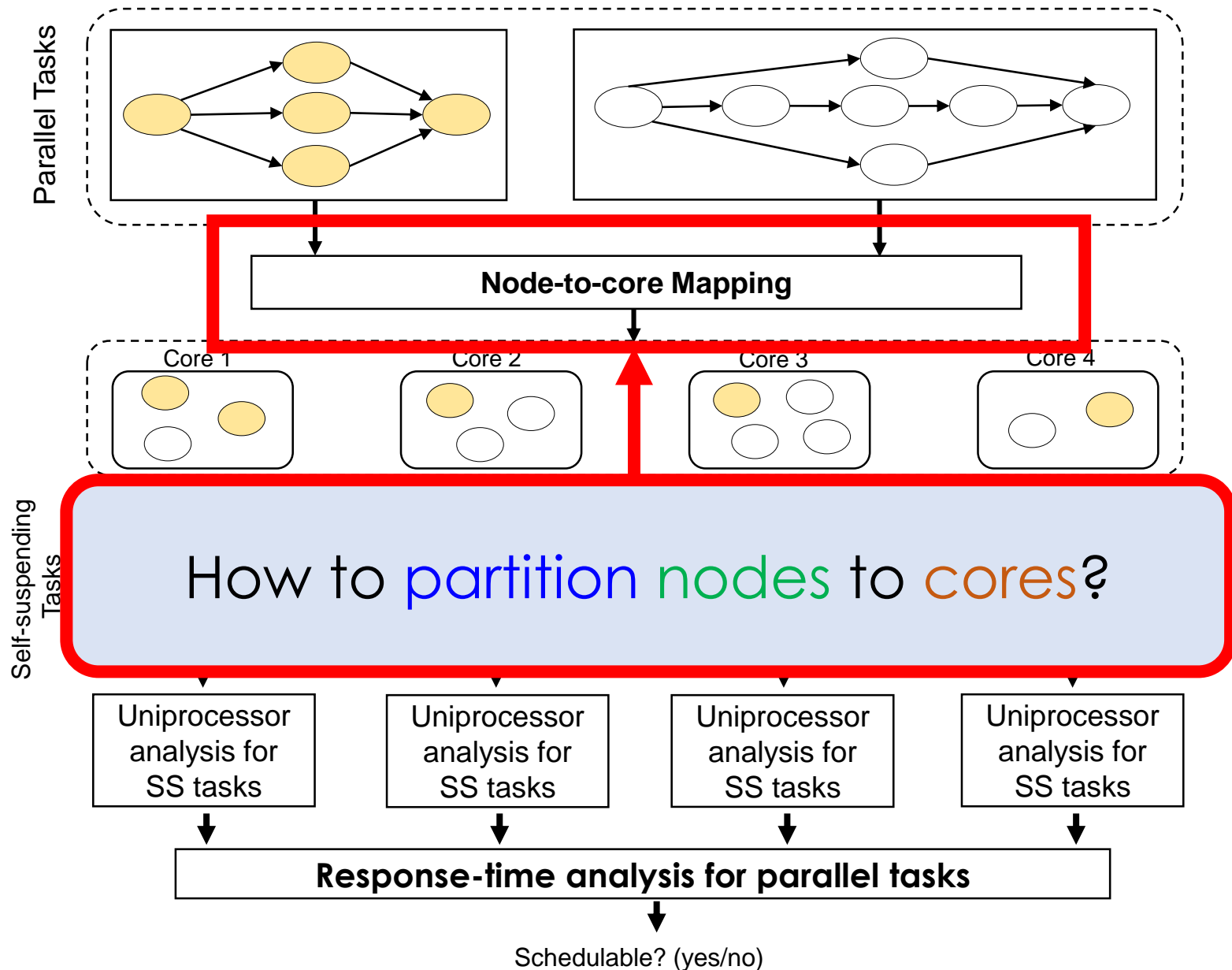


The **RT** of a **parallel task** can be derived from the **maximum RT** of all its **paths**

Overview of the analysis framework



Overview of the analysis framework



Partitioning (meta-)algorithm

IDEA: Analyzing schedulability **incrementally**, adding one node at a time, and perform **schedulability analysis** on a subgraph

Inputs:

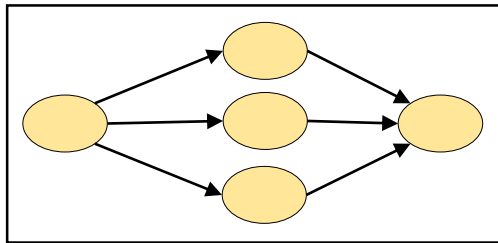
1. Strategy for ordering **tasks**
2. Strategy for ordering **cores**

Output:

1. Node **partitioning**

Example:

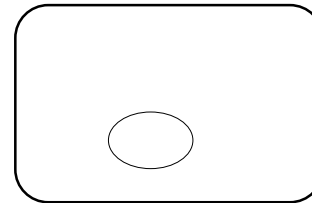
Task under
analysis



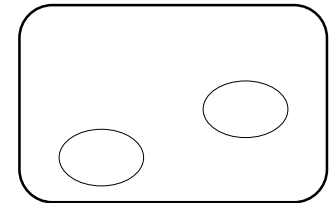
Task under
analysis (during
partitioning)



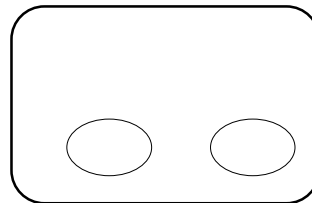
Core 1



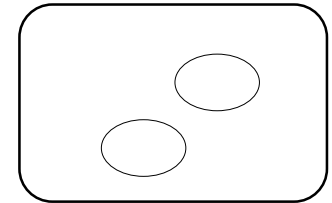
Core 2



Core 3



Core 4



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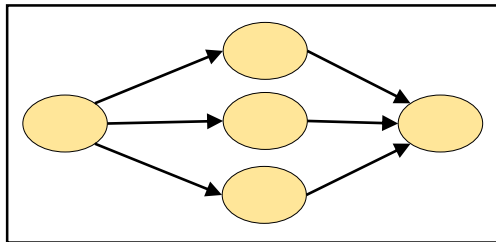
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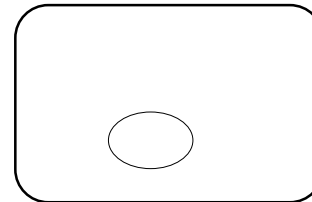
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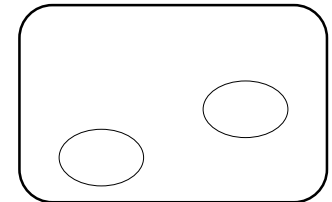
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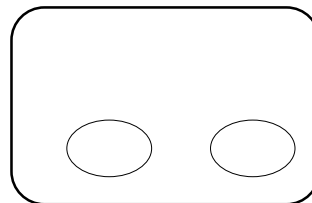
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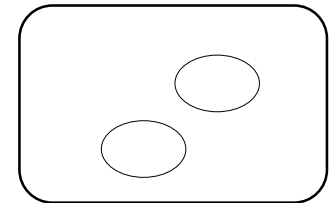
Core 2



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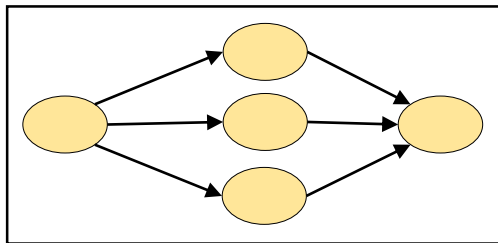
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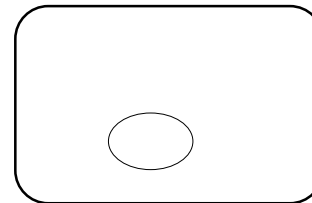
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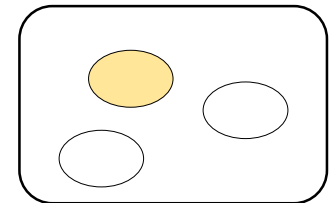
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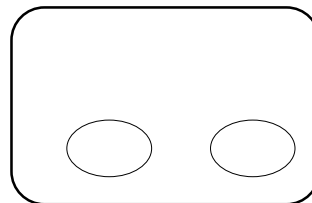
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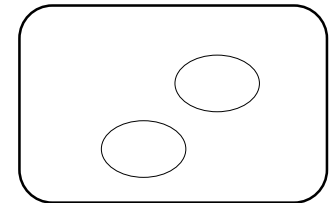
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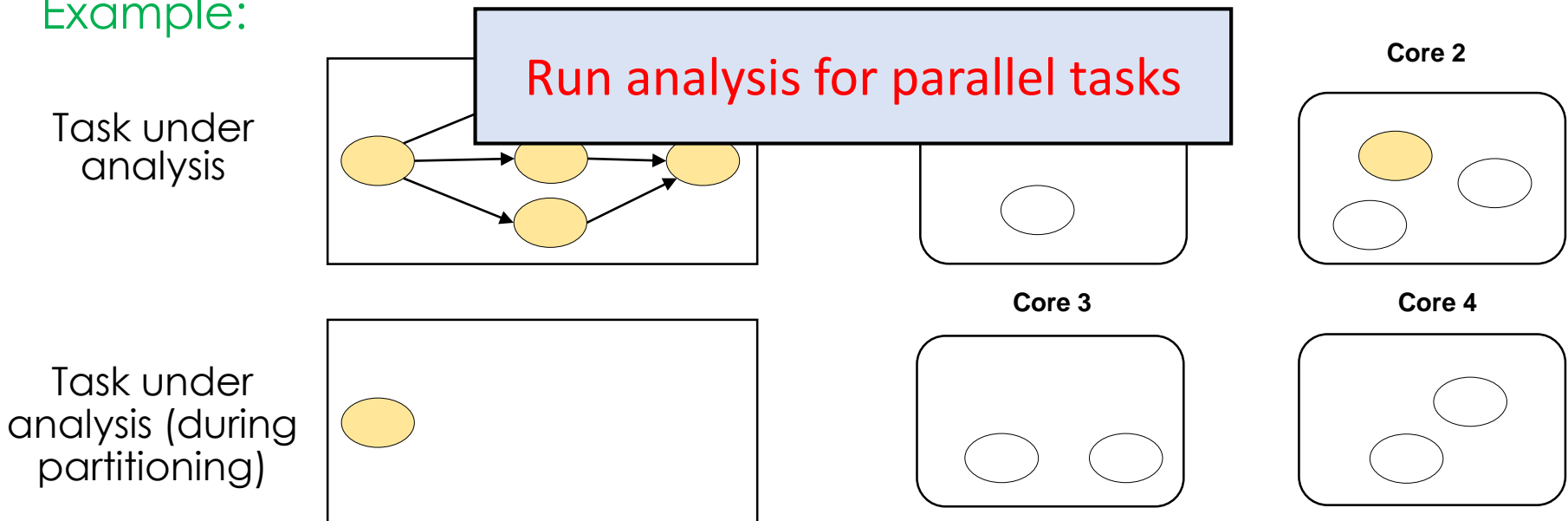
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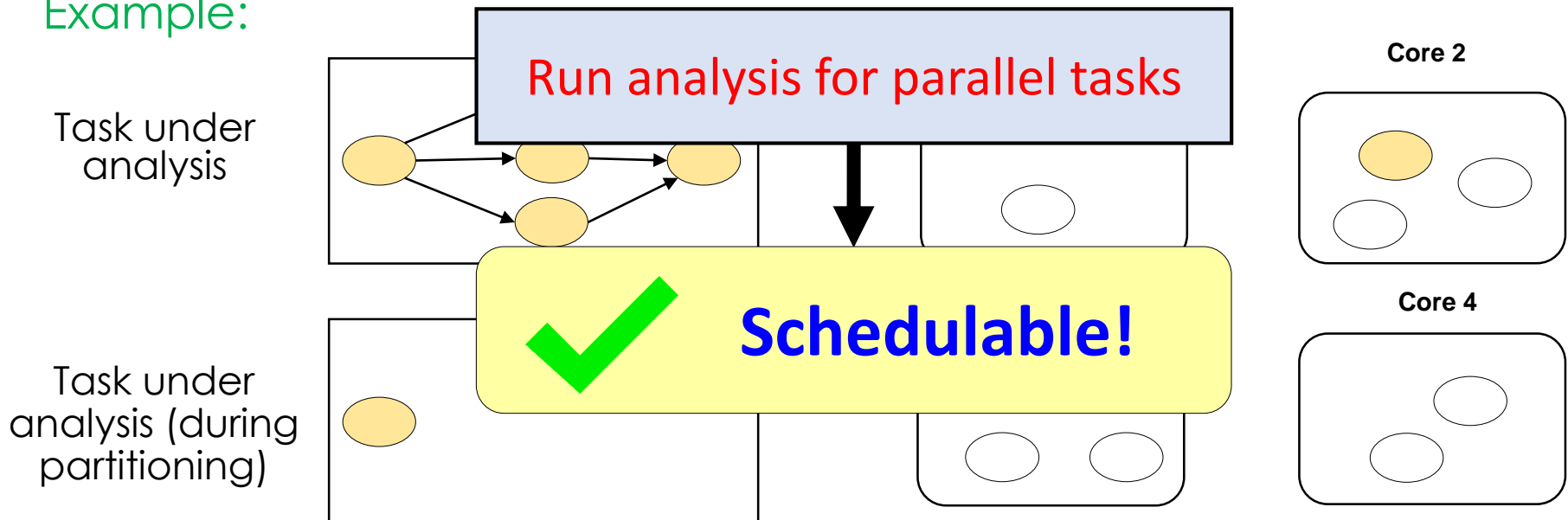
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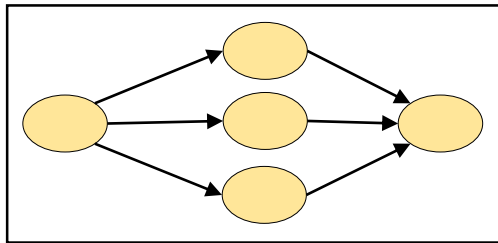
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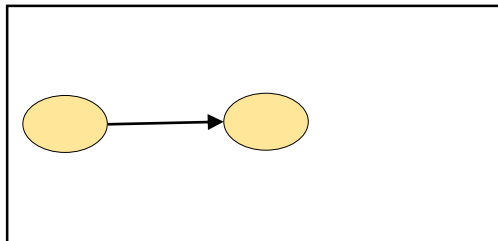
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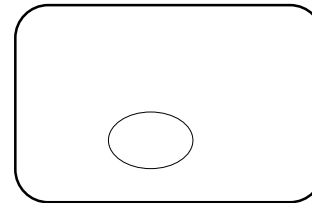
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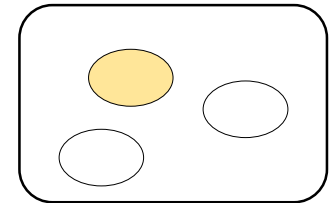
Task under analysis (during partitioning)



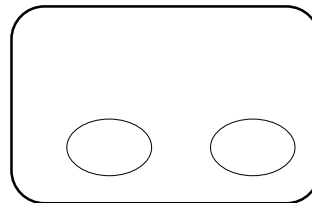
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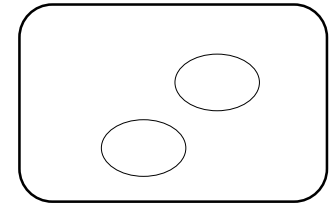
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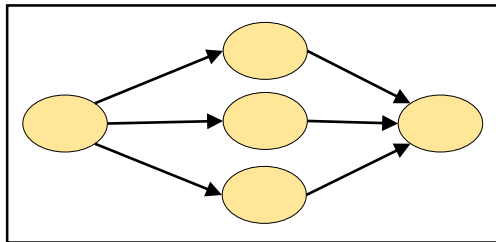
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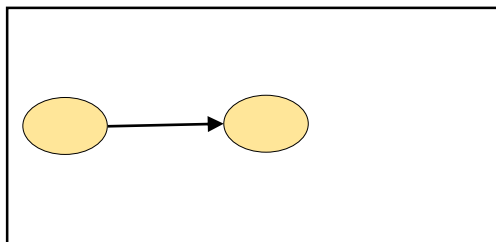
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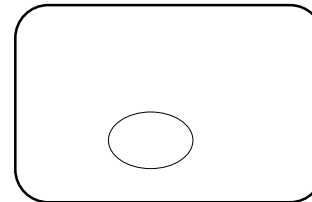
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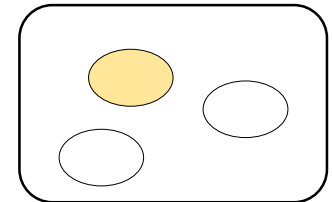
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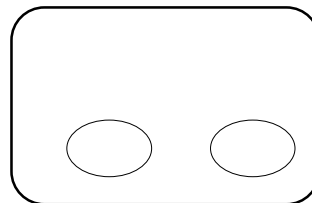
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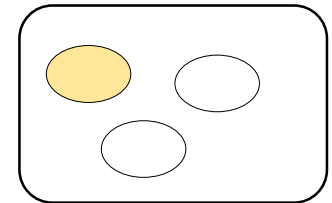
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Partitioning (meta-)algorithm

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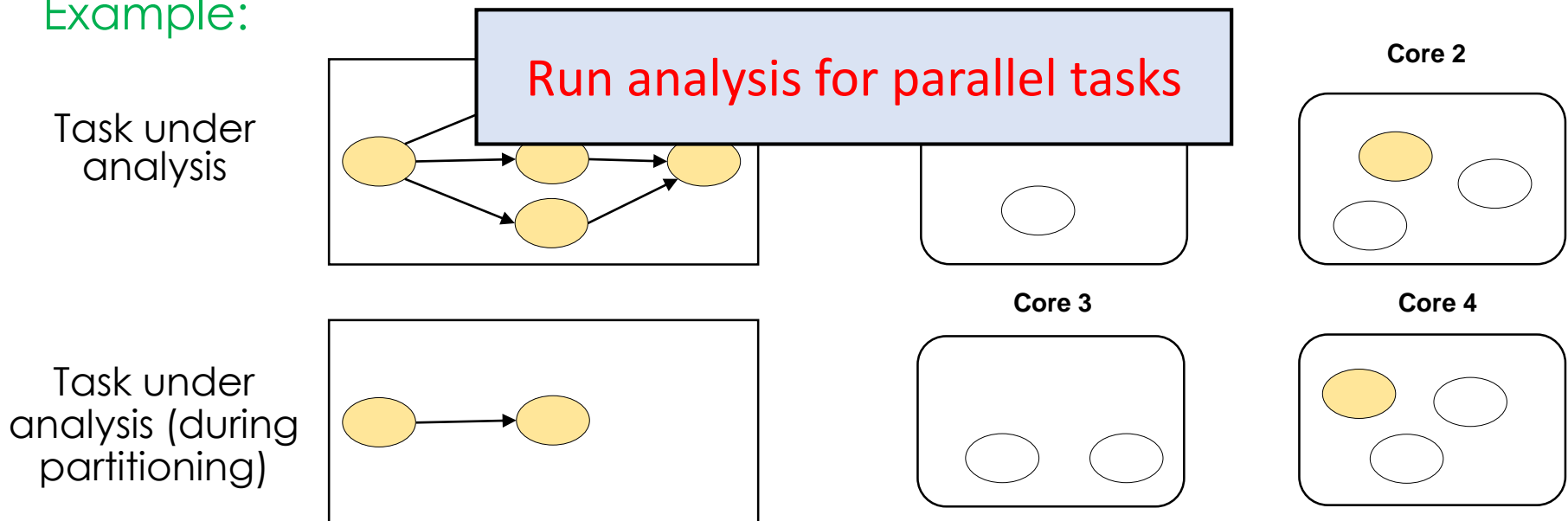
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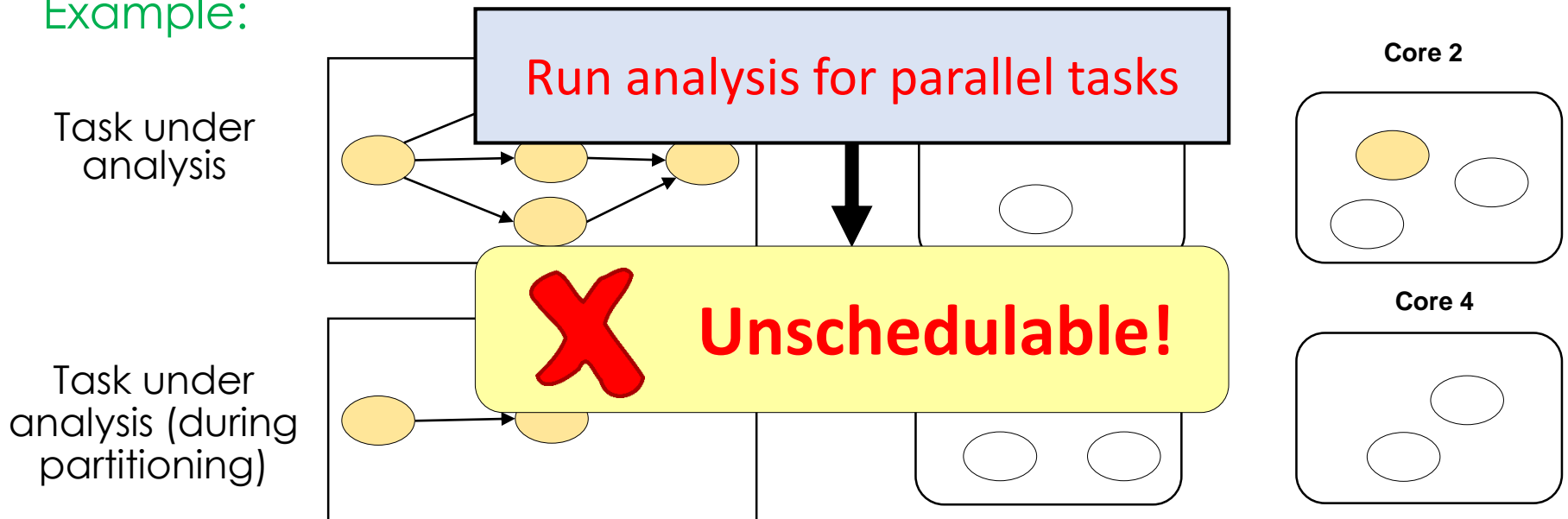
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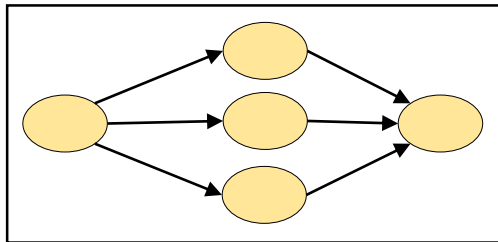
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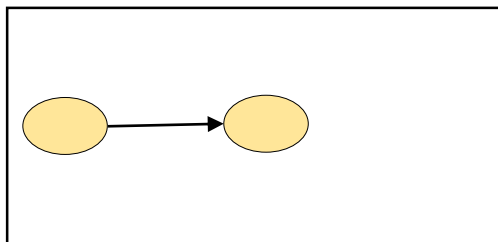
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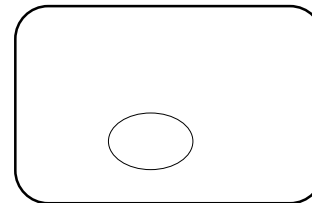
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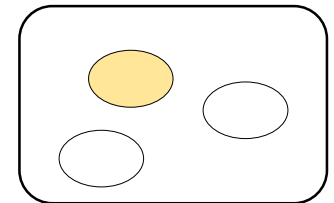
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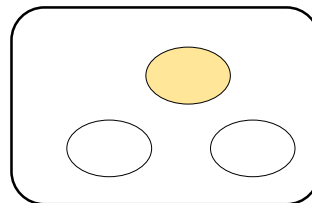
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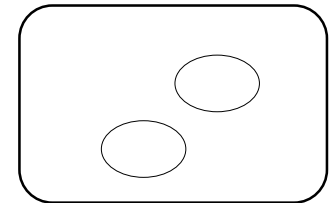
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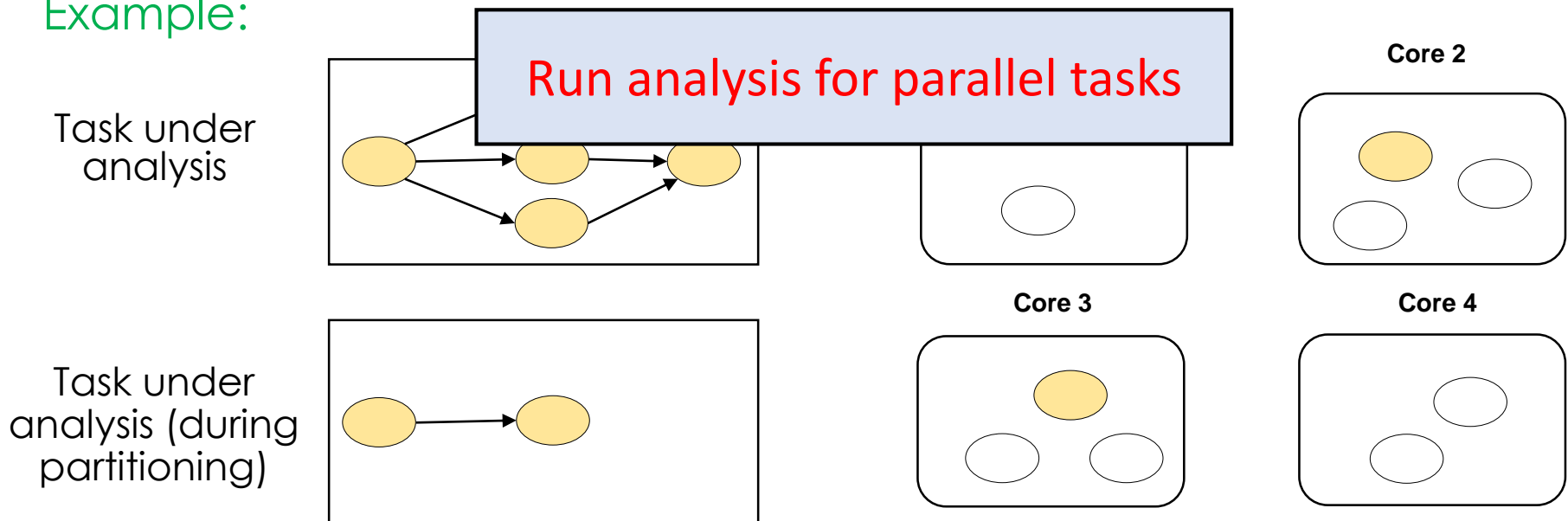
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Partitioning (meta-)algorithm

IDEA: Analyzing schedulability **incrementally**, adding one node at a time, and perform **schedulability analysis** on a subgraph

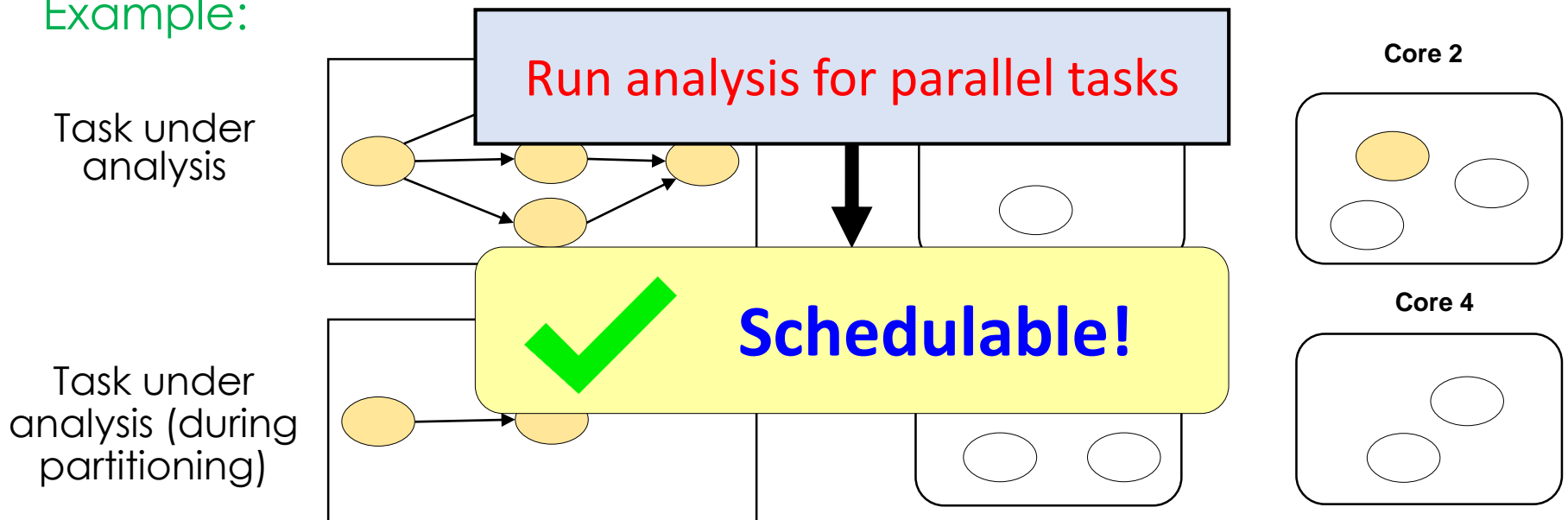
Inputs:

1. Strategy for ordering **tasks**
2. Strategy for ordering **cores**

Output:

1. Node **partitioning**

Example:



Partitioning (meta-)algorithm

IDEA: Analyzing schedulability **incrementally**, adding one node at a time, and perform **schedulability analysis** on a subgraph

Inputs:

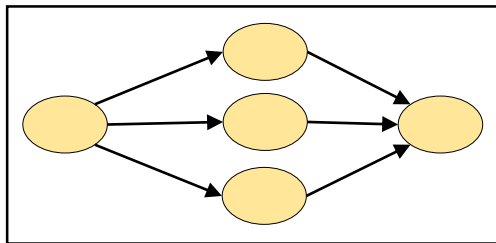
1. Strategy for ordering **tasks**
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Output:

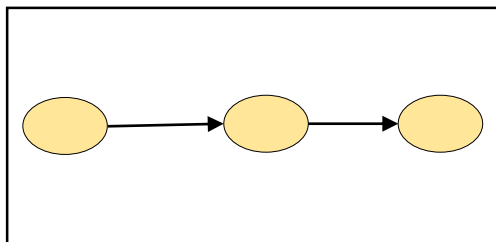
1. Node **partitioning**

Example:

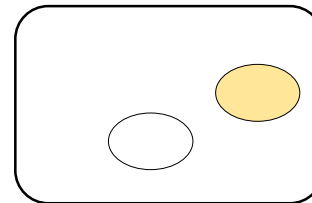
Task under analysis



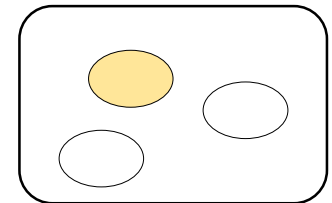
Task under analysis (during partitioning)



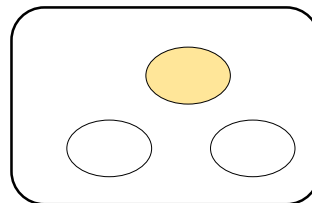
Core 1



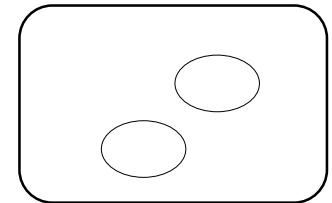
Core 2



Core 3



Core 4



Partitioning (meta-)algorithm

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Inputs:

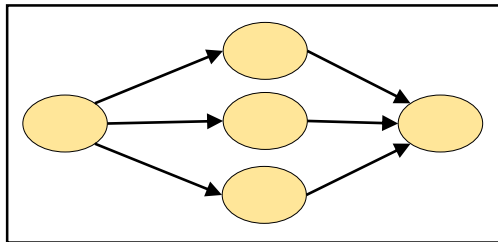
1. Strategy for ordering **tasks**
2. Strategy for ordering **cores**

Output:

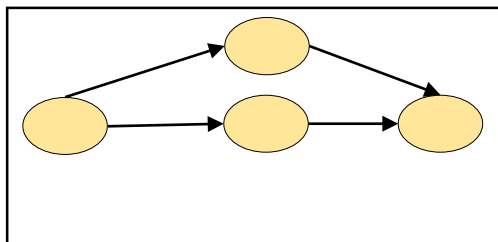
1. Node **partitioning**

Example:

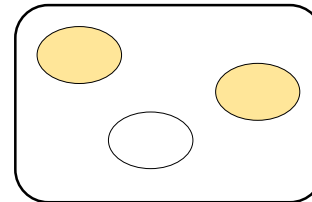
Task under analysis



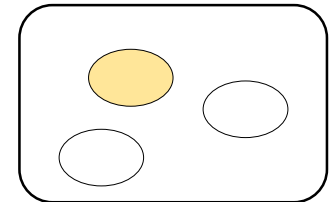
Task under analysis (during partitioning)



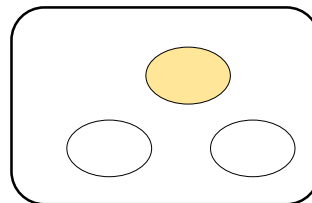
Core 1



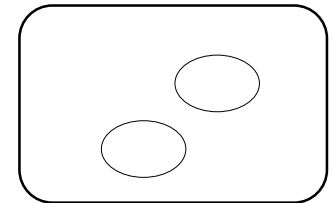
Core 2



Core 3



Core 4



Partitioning (meta-)algorithm

IDEA: Analyzing schedulability **incrementally**, adding one node at a time, and perform **schedulability analysis** on a subgraph

Inputs:

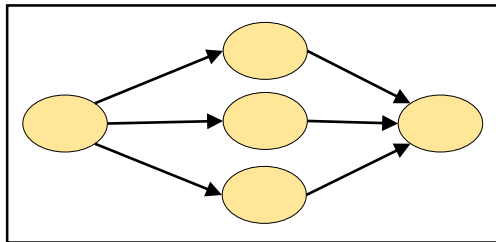
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2. Strategy for ordering **cores**

Output:

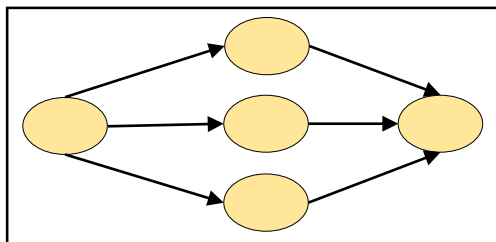
1. Node **partitioning**

Example:

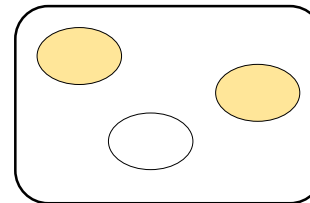
Task under analysis



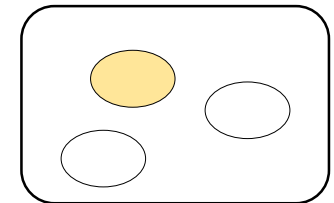
Task under analysis (during partitioning)



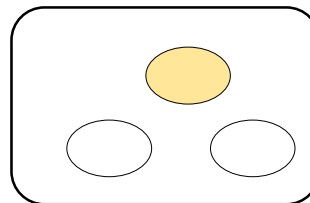
Core 1



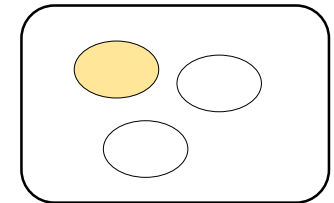
Core 2



Core 3



Core 4



Partitioning (meta-)algorithm

IDEA: Analyzing schedulability **incrementally**, adding one node at a time, and perform **schedulability analysis** on a subgraph

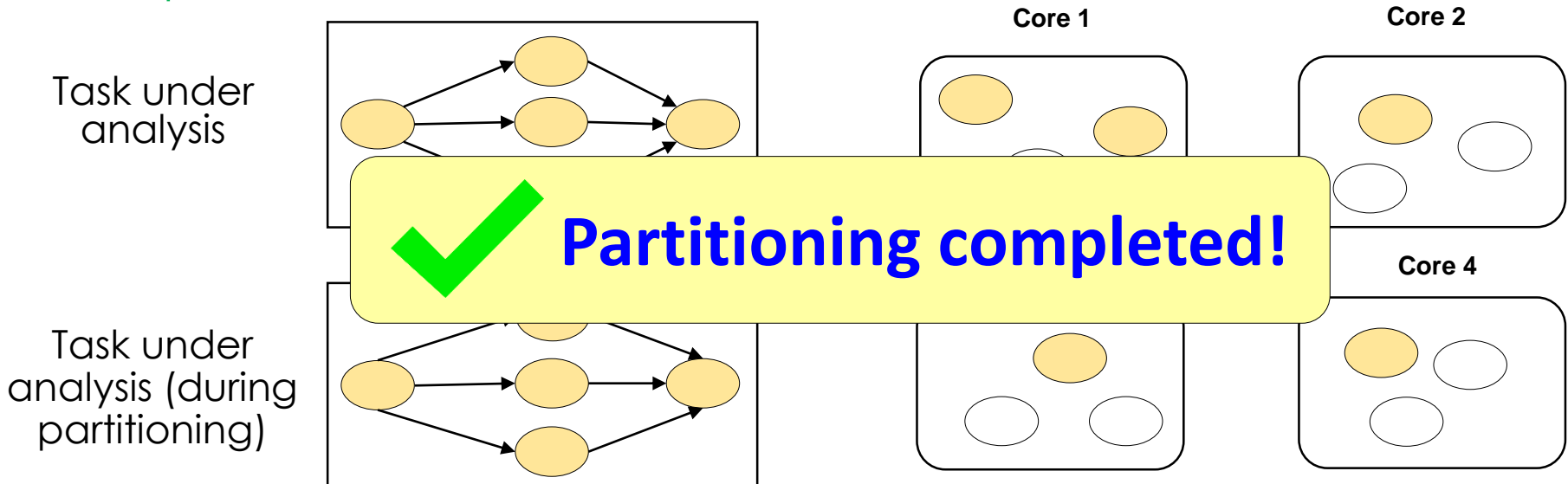
Inputs:

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Output:

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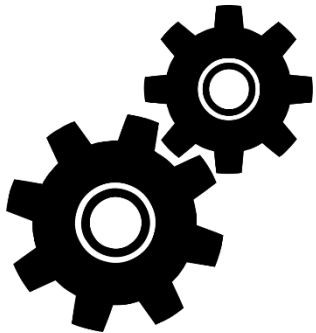
Example:



Experimental Results

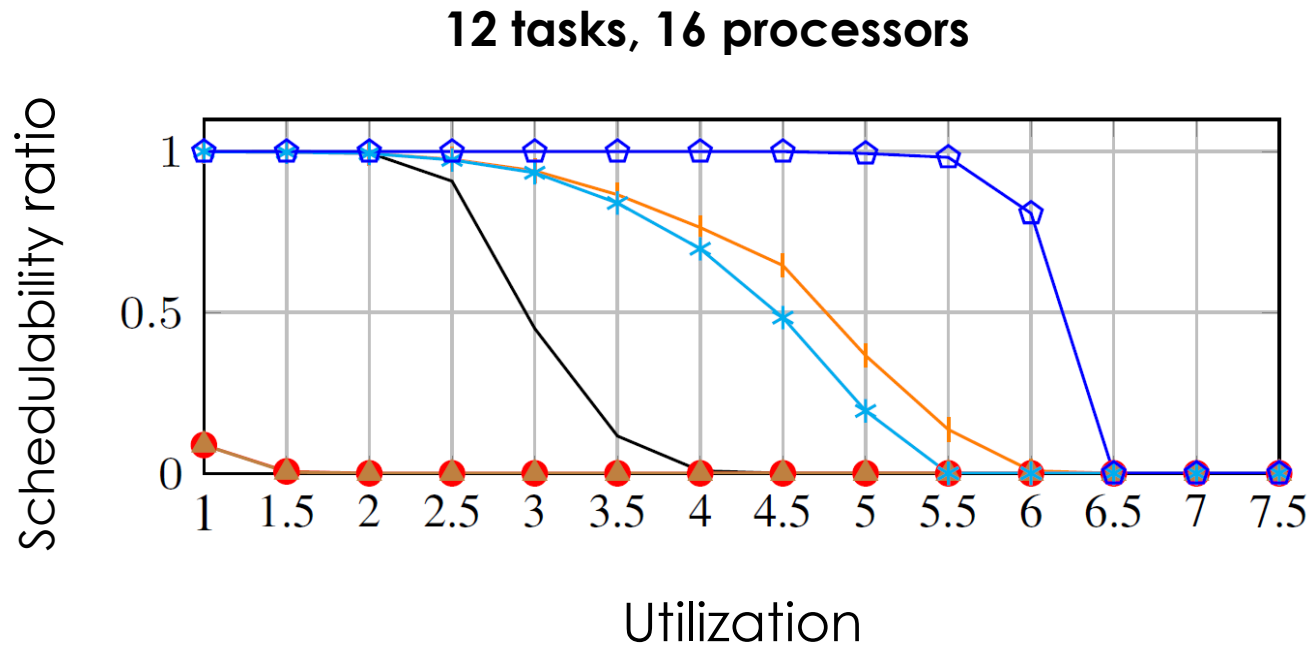
Experimental Study

- Experimental study based on synthetic workload
 - We compared against the only previous work targeting non-preemptive scheduling of parallel tasks, which targets global scheduling (Serrano et al. 2017)
 - Same DAG generator used in [Serrano et al. 2017]



- WCETs randomly generated in $(0,100]$ with uniform distribution
- Tasks utilizations obtained with U-Unifast
- Tasks periods computed as $T_i = U_i \sum_{nodes} C_{i,j}$

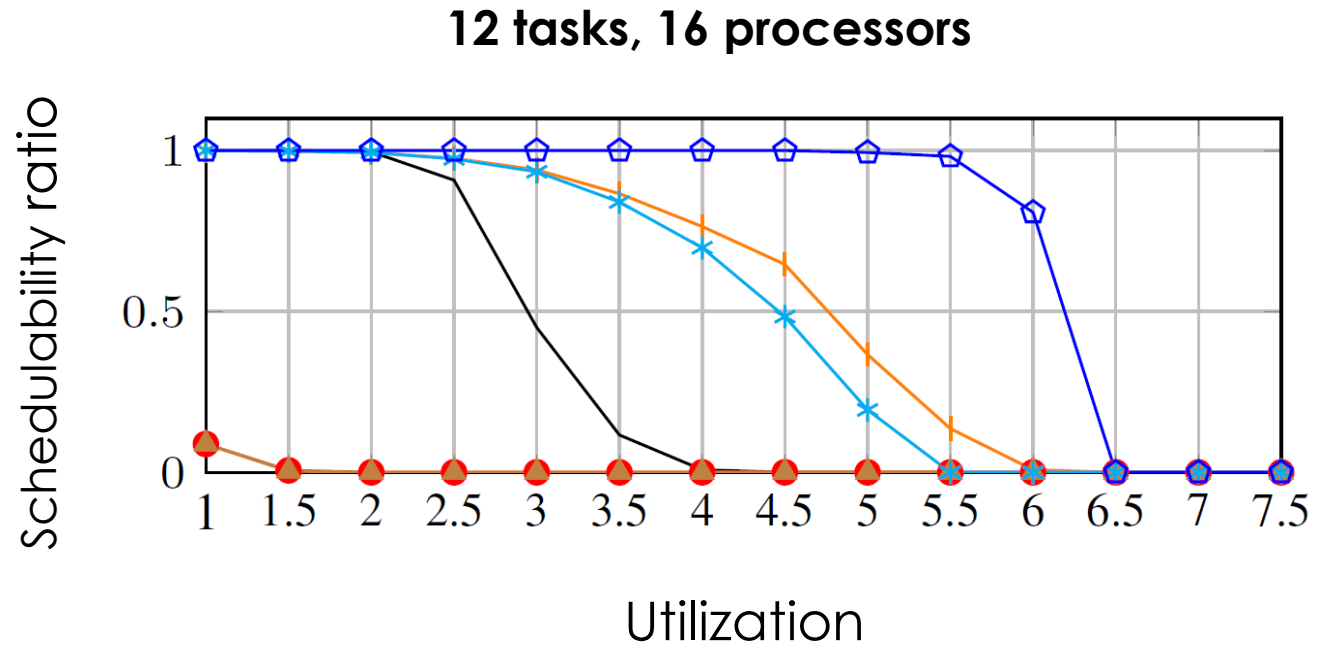
Experimental Results



The higher the better

— GLOBAL —+— WF_UTIL —●— FF_ALGO —▲— BF_ALGO —*— WF_ALGO —◑— PARTITIONED

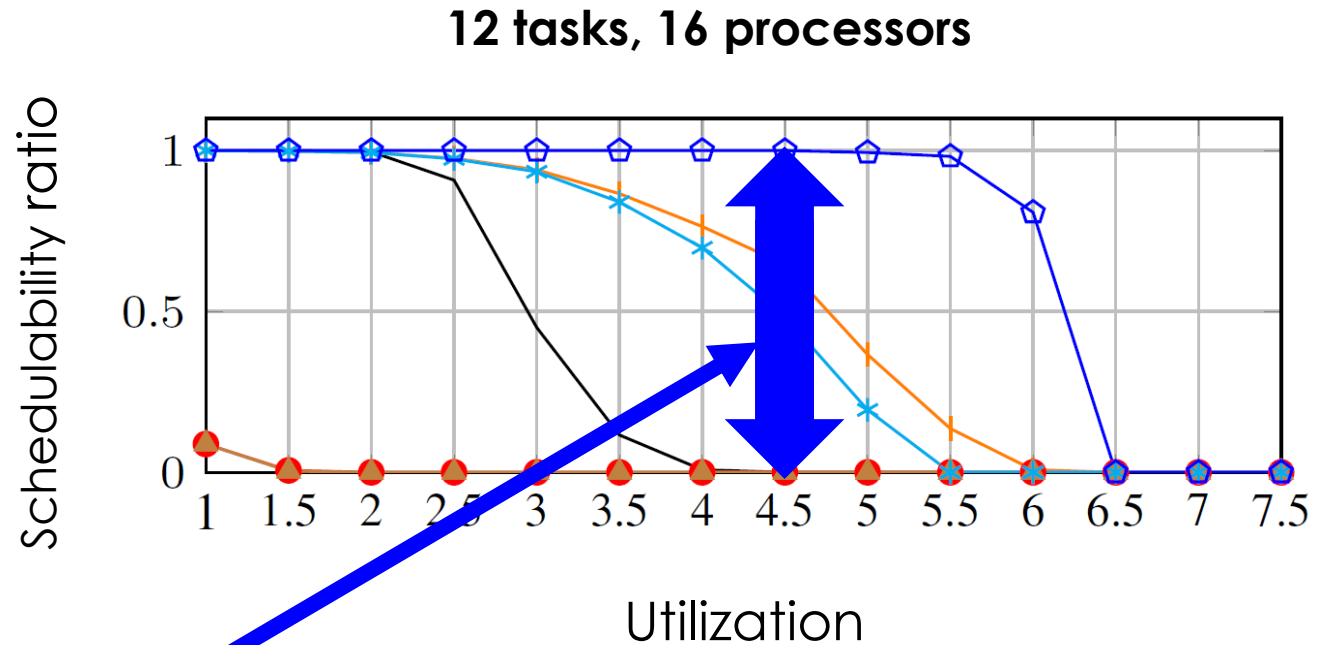
Experimental Results



Increasing task-set utilization



Experimental Results



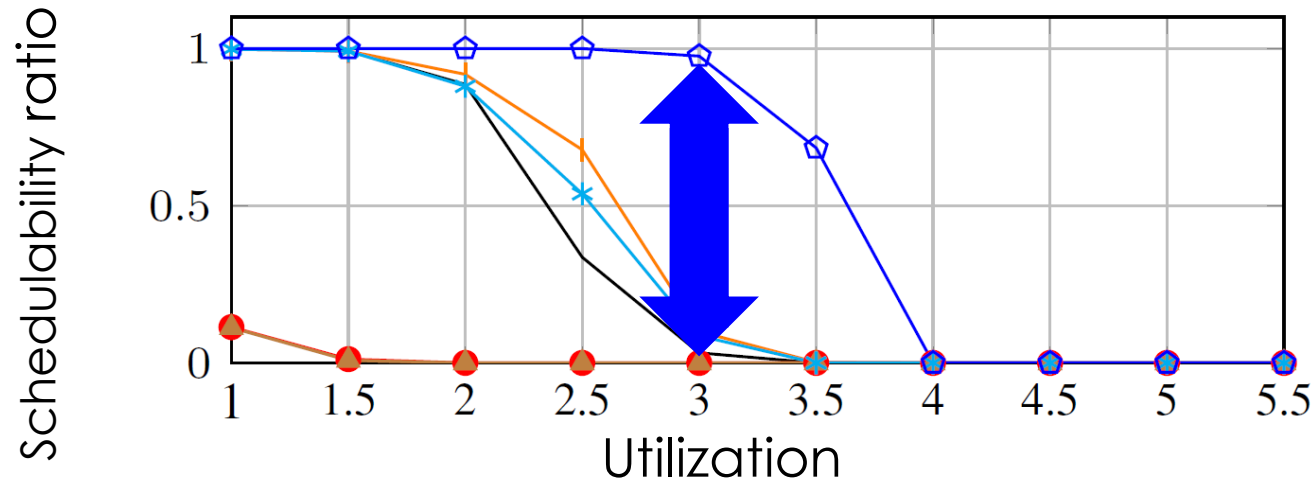
Improvement up to 100 percentage points over [Serrano et al. 2017]

— GLOBAL —+— WF_UTIL —●— FF_ALGO —▲— BF_ALGO —*— WF_ALGO —◇— PARTITIONED

Experimental Results

Our experimental study revealed a similar trend varying the number of tasks and processor, e.g.,

10 tasks, 8 processors



— GLOBAL —+— WF_UTIL —●— FF_ALGO —▲— BF_ALGO —*— WF_ALGO —◇— PARTITIONED

Conclusions

1

Methodology for analyzing non-preemptive parallel tasks as a set of self-suspending tasks

2

Analysis for non-preemptive self-suspending tasks which analytically dominates the only previous result

3

Partitioning algorithm to allocate nodes to the available processors

4

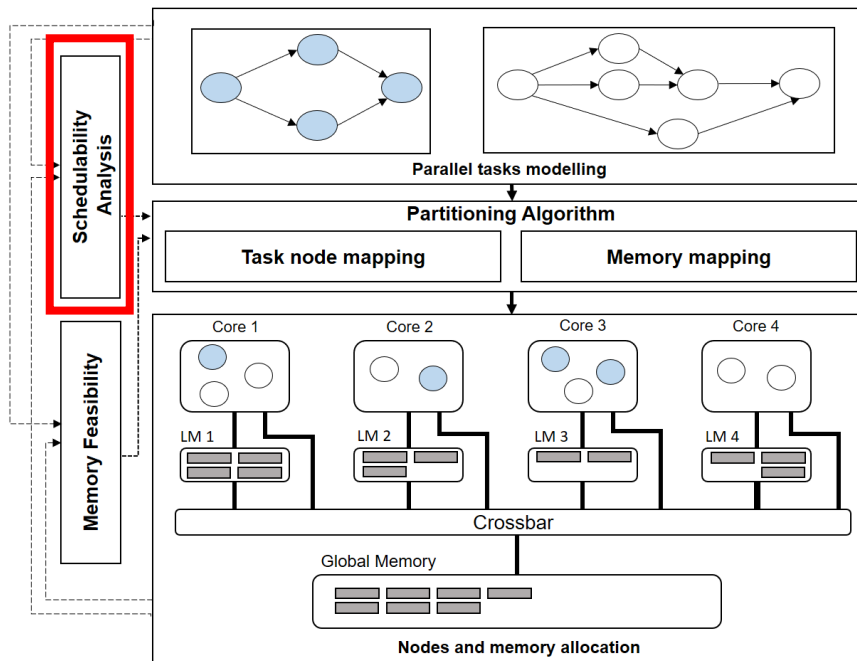
Experimental study to assess the improvement in terms of schedulability – up to 100 p.p. w.r.t. the only existing previous work for global scheduling

Future Work

Deeper investigation of **partitioning strategies**

Improvement in the **analysis precision**

Integration of **communication delays** in the analysis



Memory Feasibility Analysis of Parallel Tasks
Running on Scratchpad-Based Architectures

Daniel Casini, Alessandro Biondi, Geoffrey Nelissen and
Giorgio Buttazzo

This morning @ **RTSS**

Thank you!

Daniel Casini

daniel.casini@sssup.it