



### A Series-Parallel digraph based relaxation for the COMPLETION constraint

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Laboratoire des Sciences pour la Conception, l'Optimisation et la production



### Thesis main objective

- Improve CP integration of scheduling objectives that are not studied a lot in CP, in particular "∑" objectives
- $\sum C_j$  (flowtime) and  $\sum w_j C_j$  (weighted flowtime)

#### Chosen approach and goal

- Cost-based domain filtering: approach that uses filtering algorithms for global constraints which filter combinations of values that cannot lead to a better-cost solution
- A way to do that is to use a lower bound which can be found by using a relaxation for scheduling problems
- Goal: find new such filtering algorithms using new polynomial relaxations



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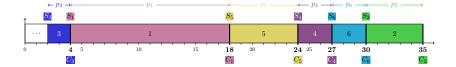
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### The COMPLETION constraint

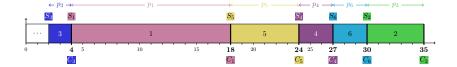
- Defined by Kovács and Beck in 2011
- COMPLETION( $[S_1, \ldots, S_n]$ ,  $[p_1, \ldots, p_n]$ ,  $[w_1, \ldots, w_n]$ , C)  $\stackrel{\text{def}}{\iff} ((S_i + p_i \le S_j \lor S_j + p_j \le S_i) \land \sum_i w_i(S_i + p_i) = C)$ , where  $C = \sum_i w_i C_i$
- The filtering algorithm uses a relaxation:  $1|r_j$ ;  $pmtn|\sum w_iM_i$





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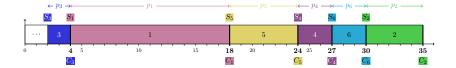
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### Current work

- Definition of a **global constraint** based on COMPLETION for the non-weighted case (not presented here): FLOWTIME
- A second filtering algorithm for COMPLETION using another relaxation: 1|sp-graph|∑ w<sub>i</sub>C<sub>i</sub>



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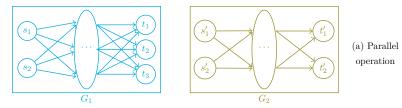
A digraph that can be built exclusively by using two operations starting from single vertex:

(a) Parallel operation

> (b) Series operation



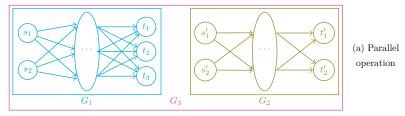
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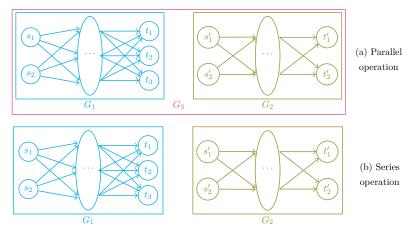
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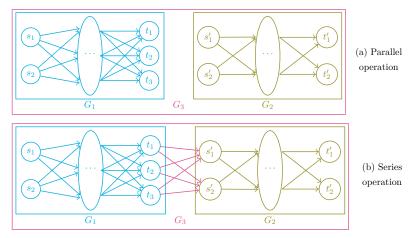


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4/10

# SP-digraph and tree decomposition

(a) SP-digraph  ${\cal G}$ 

(b) Tree decomposition of  ${\cal G}$ 



# SP-digraph and tree decomposition

#### (a) SP-digraph G

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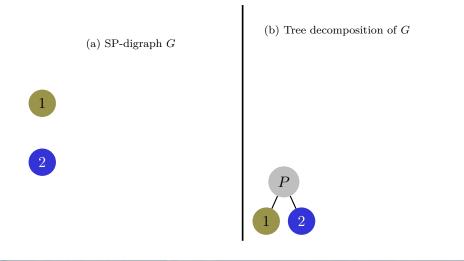
(b) Tree decomposition of  ${\cal G}$ 



G.SCOP

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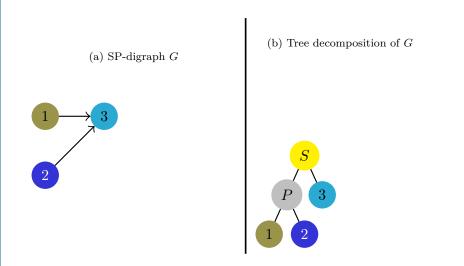
## SP-digraph and tree decomposition



G SCOP

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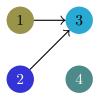




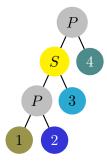
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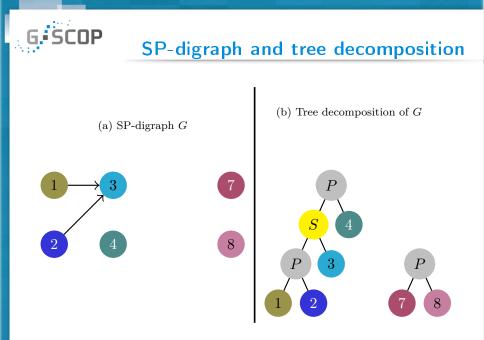
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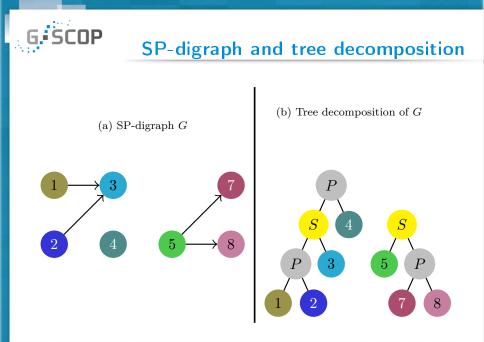


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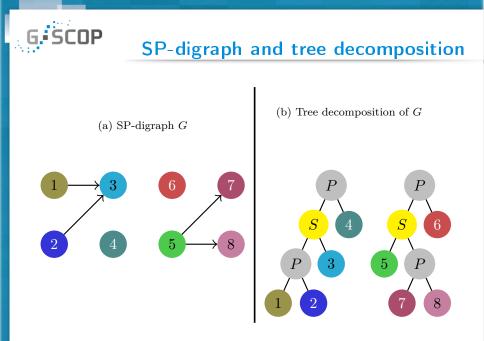




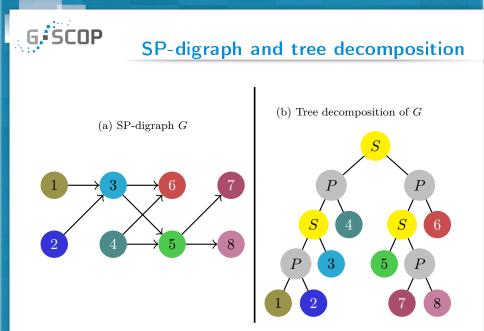
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4/10



4/10



4/10



### Polynomial relaxation

- General problem  $1|r_j; d_j| \sum w_j C_j$  is  $\mathcal{NP}$ -hard
- Polynomial relaxation of COMPLETION:  $1|r_j$ ; *pmtn* $|\sum w_j M_j$
- 1|sp-graph|∑ w<sub>j</sub>C<sub>j</sub> can be solved in polynomial time (O(n log n)) by Lawler's algorithm using the tree decomposition of SP-digraphs

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#### Cost-based domain filtering approach

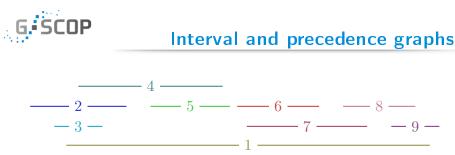
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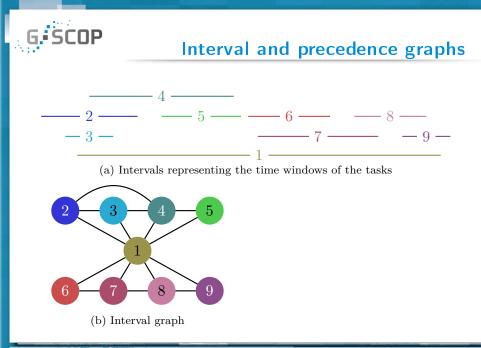
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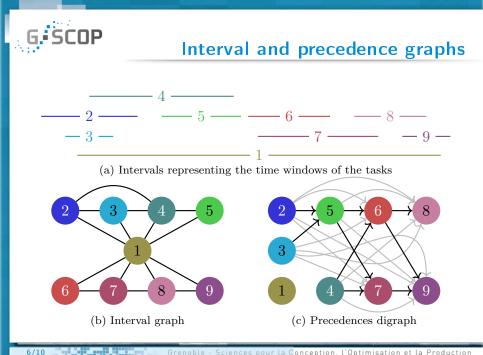
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(a) Intervals representing the time windows of the tasks







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### Non-preemptive relaxations of $1|r_j; d_j| \sum w_j C_j$

- General problem  $1|r_j; d_j| \sum w_j C_j$  is  $\mathcal{NP}$ -hard
- Relaxation  $1|interval \ order| \sum w_j C_j$  is also  $\mathcal{NP}$ -hard
- Relaxation  $1|sp-graph| \sum w_j C_j$  is polynomial

#### Consequence

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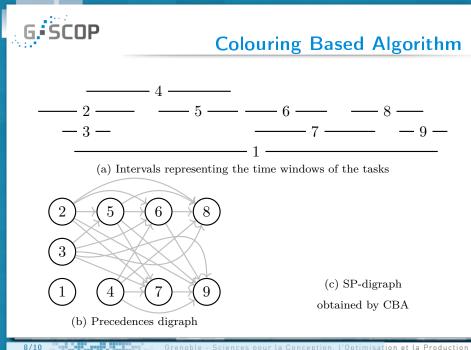
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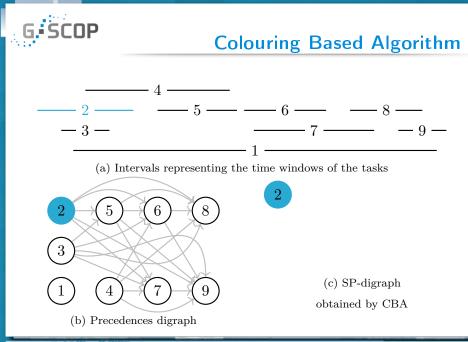
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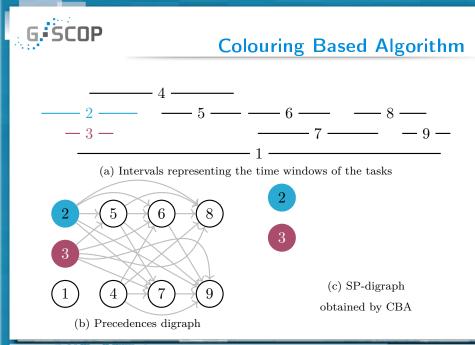
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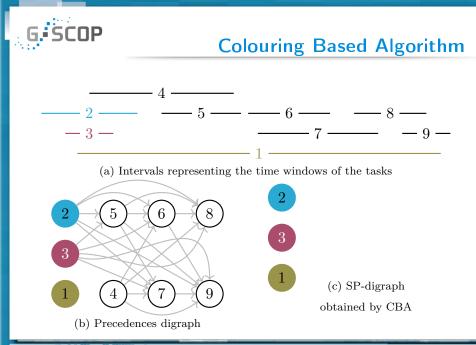
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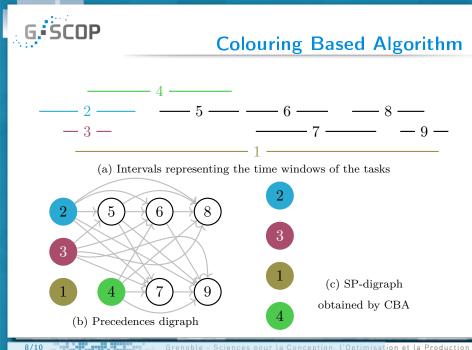
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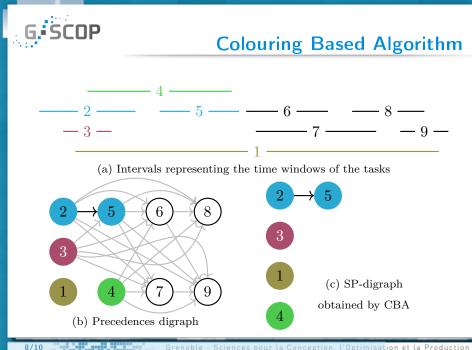


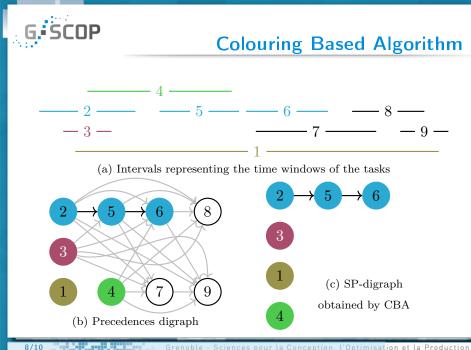


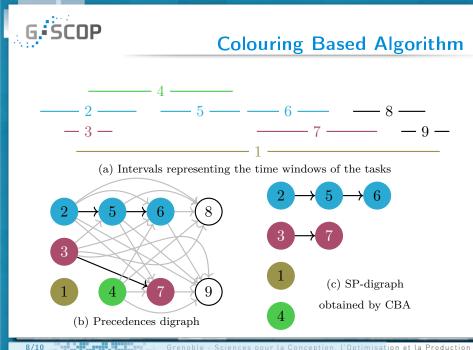


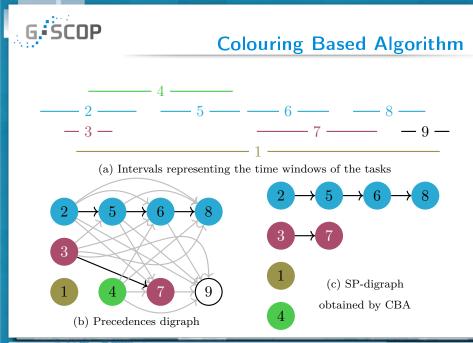




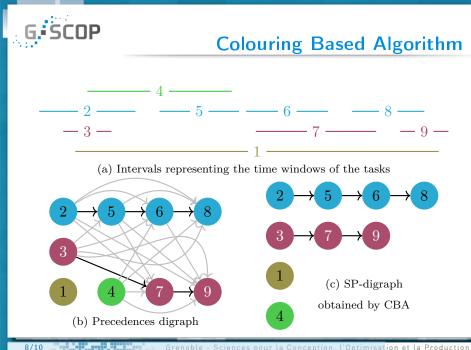


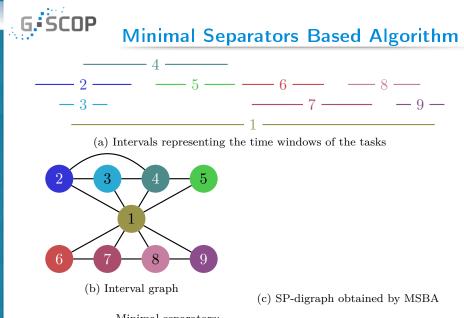






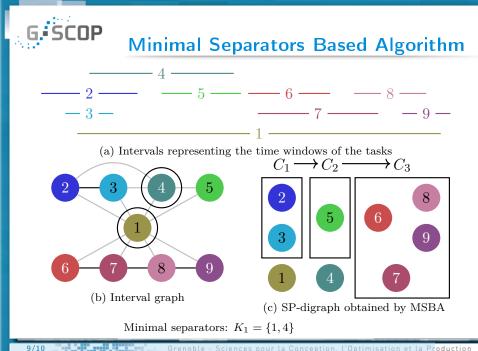
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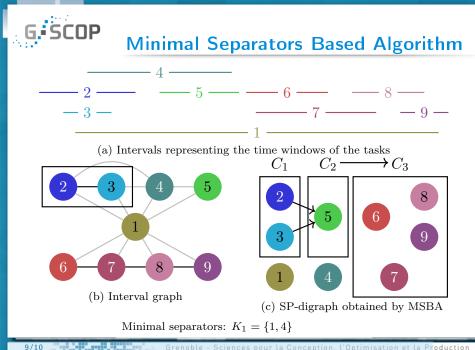


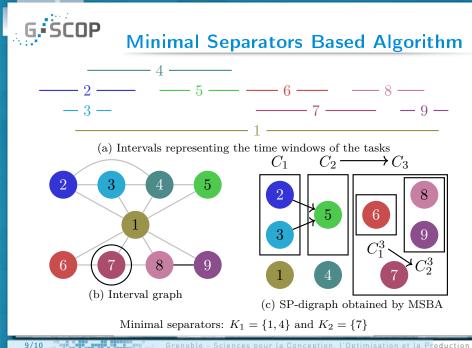


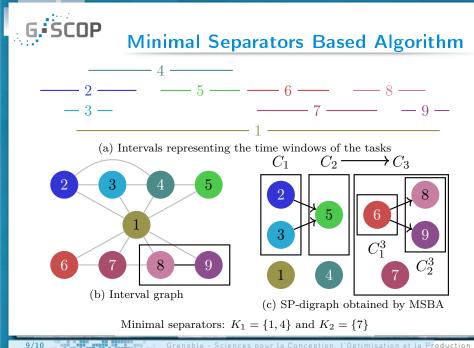
Minimal separators:

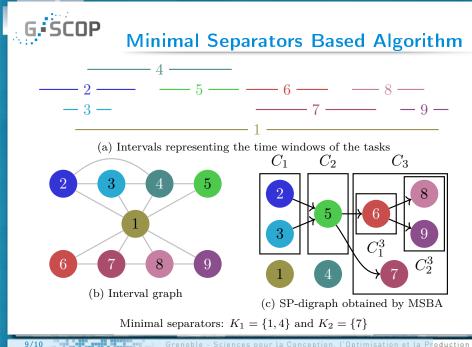
9/10













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- Relaxation  $1|sp-graph| \sum w_j C_j$  is polynomial
- 2 algorithms for extracting an instance of  $1|sp-graph| \sum w_j C_j$ from  $1|r_j; d_j| \sum w_j C_j$

- Implement new filtering algorithms for COMPLETION
- Compare the filtering algorithms.
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