

A Subexponential Time Algorithm for Makespan Scheduling of Unit Jobs with Precedence Constraints

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MPI

$$P3|prec,p_j=1|C_{\max}$$



 $P3|prec,p_j=1|C_{
m max}$ 3 identical parallel machines



$$P3|prec, p_j = 1|C_{\max}|$$

Given:

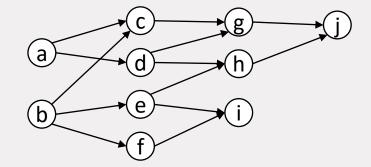
n jobs of length 1



$P3|prec, p_j = 1|C_{\max}|$

Given:

- n jobs of length 1
- A precedence graph G



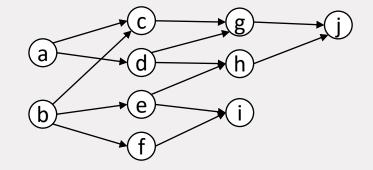


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Given:

- *n* jobs of length 1
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- $T \in \mathbb{N}$

Q: Is there a schedule of makespan *T*?



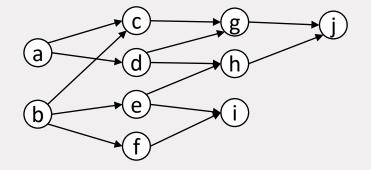


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	time				
	1	2	3	4	
1	а	С	f	i	
2	b	d	g	j	
3		e	h		



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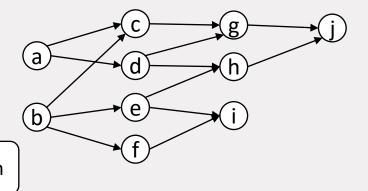
G defines the problem

• $T \in \mathbb{N}$

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Observation:

Jobs of length one ⇒ 'timeslots'



		• • • • • • • • • • • • • • • • • • • •			
	1	2	3	4	
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time



- 1. Graph Isomorphism
- 2. Subgraph Homeomorphism
- 3. Graph genus
- 4. Chordal graph completion
- 5. Chromatic index
- 6. Spanning tree parity problem
- 7. Partial order dimension

- Precedence constrained 3-processor scheduling
- 9. Linear Programming
- 10. Total unimodularity
- 11. Composite number
- 12. Minimum length triangulation



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 $2^{O((\log n)^3)}$

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- **Graph Isomorphism**
- Subgraph Homeon
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- $2^{O((\log n)^3)}$ time [Babai 2017] Chordal graph
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Precedence constrained 3-processor scheduling

 $2^{O(\sqrt{n} \cdot \log n)}$ time

This talk

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Literature overview $Pm|prec, p_j = 1|C_{\text{max}}|$



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• NP-complete¹ m = # machines given as input

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• ???? for $m \ge 3$ constant OPEN³

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Before:

 $Pm|prec, p_j = 1|C_{\max}$ can be solved in $O\left(2^n \cdot \binom{n}{m}\right)$ time.



Our Result

Our result:

$$Pm|prec, p_j = 1|C_{\max}$$
 can be solved in $\left(1 + \frac{n}{m}\right)^{O(\sqrt{nm})}$ time.



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Corollary:

$$P3|prec, p_j = 1|C_{\max}$$
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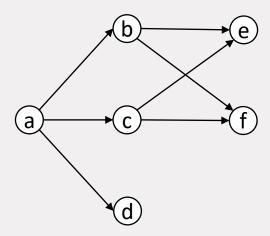
Corollary:

$$P3|prec, p_j = 1|C_{\max}$$
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Two ways to explain, but main insights:

- 1. Use of look-up table
- 2. Keeping track of number of isolated vertices
- 3. Finding win-win strategy



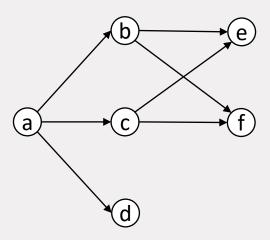


Precedence Constraints Graph G



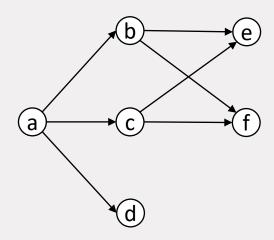
$$G \Rightarrow$$
 partial order:

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$$i < j$$
 if $(i,j) \in G$



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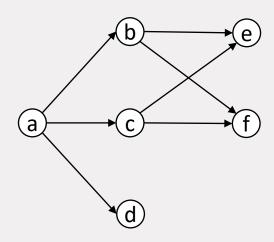
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<u>Definitions:</u> Let A be a set of jobs.

$$pred[A] =$$

$$succ[A] =$$





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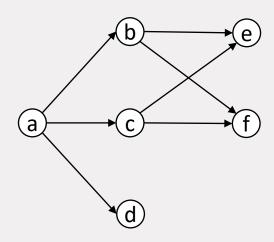
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<u>Definitions:</u> Let *A* be a set of jobs.

$$pred[A] = \{x \mid \exists \ a \in A \ s. \ t. \ x \le a\}$$

$$succ[A] = \{x \mid \exists \ a \in A \ s. \ t. \ x \geqslant a\}$$



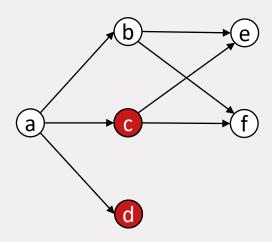


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 $G \Rightarrow$ partial order: • i < j if $(i, j) \in G$

Definitions: Let A be a set of jobs. pred $[A] = \{x \mid \exists \ a \in A \ s. \ t. \ x \le a\}$ sinks $(A) = \max\{A\}$ succ $[A] = \{x \mid \exists \ a \in A \ s. \ t. \ x \ge a\}$ sources $(A) = \min\{A\}$





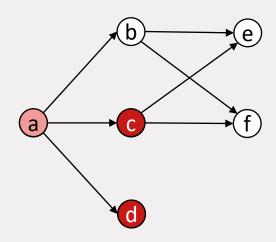
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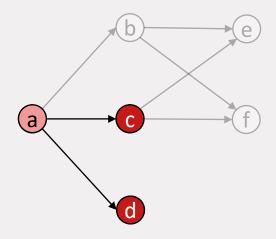
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Ex. $\{c, d\}$, then:

• $pred[\{c,d\}] = \{a,c,d\}$





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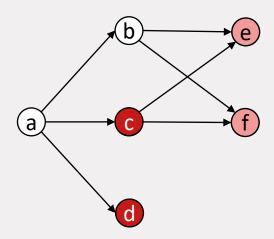
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- $pred[\{c,d\}] = \{a,c,d\}$
- $sinks({a, c, d}) = {c, d}$





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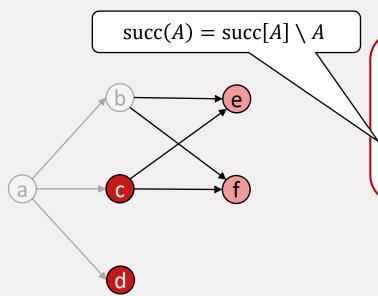
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- $pred[\{c,d\}] = \{a,c,d\}$
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Precedence Constraints Graph G

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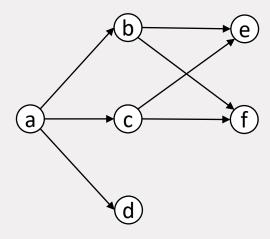
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- $pred[\{c,d\}] = \{a,c,d\}$
- $sinks({a, c, d}) = {c, d}$
- $succ[\{c,d\}] = \{c,d,e,f\}$
- sources($\{c, d, e, f\}$) = $\{c, d\}$

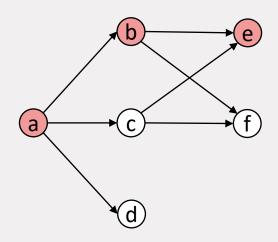




Precedence Constraints Graph G

Def: A *chain* is a set A whose elements are pairwise **comparable**.



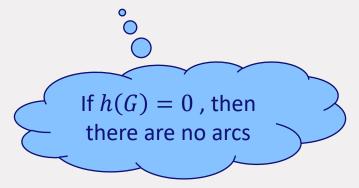


Precedence Constraints Graph G

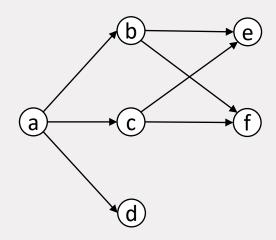
Def: A *chain* is a set *A* whose elements are pairwise **comparable**.

Def: The *height* h(G) is the size of the longest chain (in #arcs).

In the example h(G) = 2







Precedence Constraints Graph G

Def: A *chain* is a set *A* whose elements are pairwise **comparable**.

Def: The *height* h(G) is the size of the longest chain (in #arcs).

In the example h(G) = 2

Def: An *antichain* is a set A whose elements are pairwise **incomparable**.

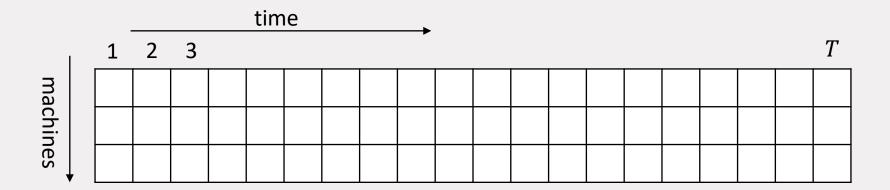
Examples of antichains in *G*

- $\checkmark \{b,c,d\}$
- $\checkmark \{b,c\}$
- $\checkmark \{d,f\}$

Jobs in one timeslot always form an antichain



Zero-Adjusted Schedule (D&W)

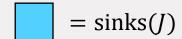


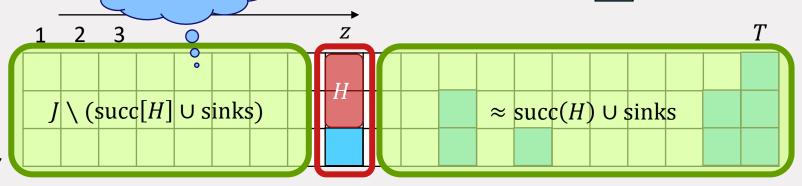




No sinks

Assumption: $n = 3 \cdot T$





Let $z \in [1, T]$ be the first moment with a sink.

D&W: W.m.a. Each job x after z is a sink or a successor of a job at time z.



machines

Dolev and Warmuth



Schedule(*J*):

- 1. if $h(G[J]) \le 0$ (i.e. sinks(J) = J) return $\left| \frac{|J|}{3} \right|$
- 2. **else return** $\min_{H \in \text{Sep}(J)} \{ \text{Schedule}(\text{left}(J, H)) + \text{Schedule}(\text{right}(J, H)) + 1 \}$

```
Sep(J) := { H \subseteq J s.t.

(1) |H| \le 3,

(2) H is antichain,

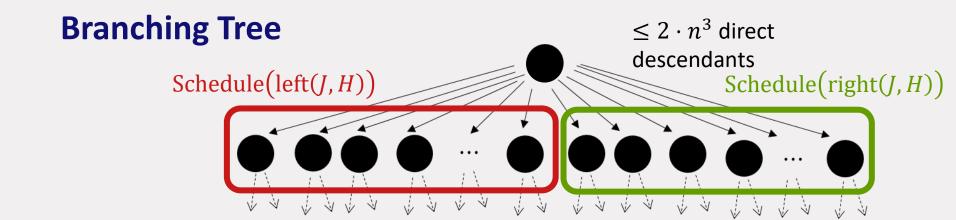
(3) |H \setminus \text{sinks}(J)| < 3}
```

$$left(J, H) := J \setminus (succ[H] \cup sinks(J))$$

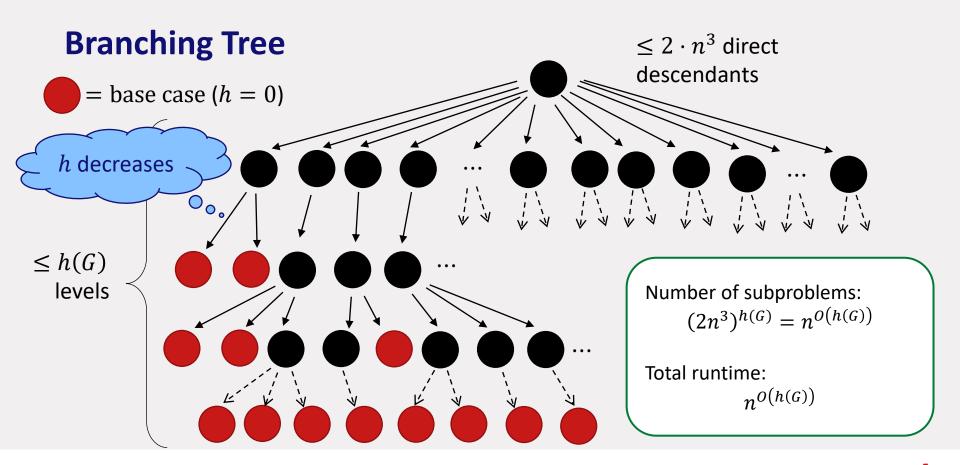
right(J, H) := J \cap ((succ(H) \cup sinks(J)) \cap H

Each subproblem: height decreases by $\geq 1!$











D&W

Schedule(*J*):

- 1. if $h(G[J]) \leq 0$ return $\left\lceil \frac{|J|}{3} \right\rceil$
- 2. **for each** $H \in \text{Sep}(J)$ **do:**
- 3. OPT[left(J, H)] := Schedule(left(J, H))
- 4. OPT[right(J, H)] := Schedule(right(J, H))
- 5. $OPT[J] := \min_{H \in Sep(J)} \{OPT[left(J, H)] + OPT[right(J, H)] + 1\}$
- 6. Return OPT[*J*]

Sep
$$(J) \coloneqq \{ H \subseteq J \text{ s.t.}$$

 $(1) |H| \le 3,$
 $(2) H \text{ is antichain,}$
 $(3) |H \setminus \text{sinks}(J)| < 3 \}$

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D&W + LookUp Table

Schedule(*J*):

- 1. **return** LUT[*J*] if it was already set
- 2. if $h(G[J]) \le 0$ return $\left\lceil \frac{|J|}{3} \right\rceil$
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- 6. $OPT[J] := \min_{H \in Sep(J)} \{OPT[left(J, H)] + OPT[right(J, H)] + 1\}$
- 7. LUT[J] = OPT[J]

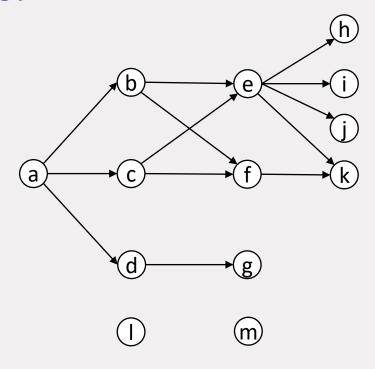
8. Return OPT[*J*]

Sep(J) := { $H \subseteq J$ s.t. (1) $|H| \le 3$, (2) H is antichain, (3) $|H \setminus \text{sinks}(J)| < 3$ }

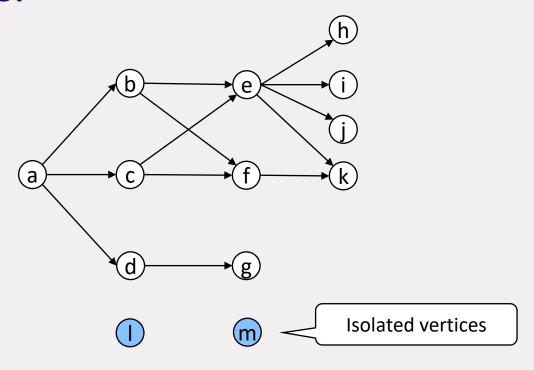
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Too many different problems!

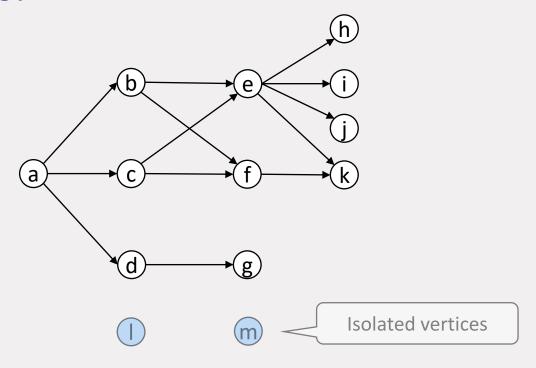




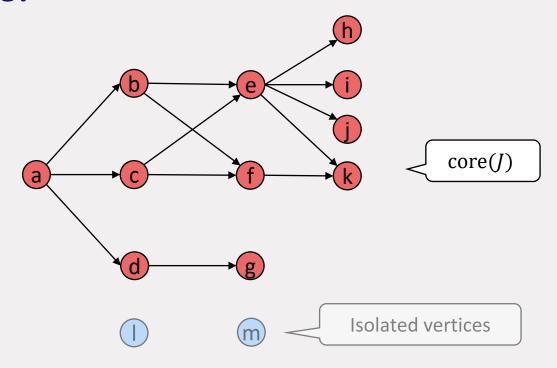














D&W + LookUp Table

Schedule(*J*):

- 1. **return** LUT[core(J), #iso(J)] if it was already set
- 2. if $J = \emptyset$ return 0
- 3. for each $H \in Sep(J)$ do:
- 4. OPT[left(J, H)] := Schedule(left(J, H))
- 5. OPT[right(J, H)] := Schedule(right(J, H))
- 6. $OPT[J] := \min_{H \in Sep(J)} \{OPT[left(J, H)] + OPT[right(J, H)] + 1\}$
- 7. LUT[core(J), #iso(J)] = OPT[J]
- 8. Return OPT[*J*]

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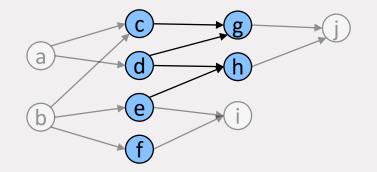
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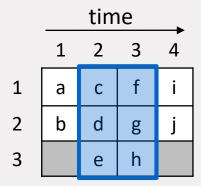
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How does this help?

Let *J* be a *feasible set of jobs*.







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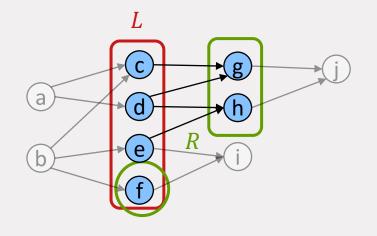
Jobs / can be described as

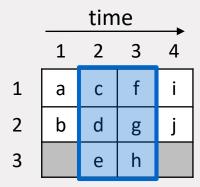
$$J = \operatorname{succ}[L] \cap \operatorname{pred}[R]$$

where

L = minimal elements = sources of J

R = maximal elements = sinks of J







```
Let J be a feasible set of jobs.
```

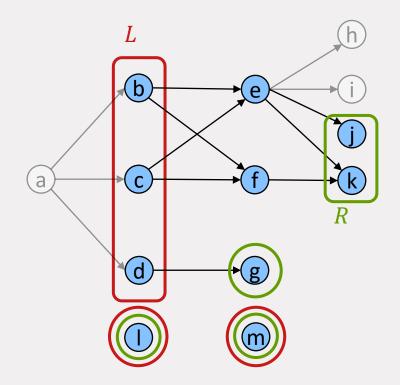
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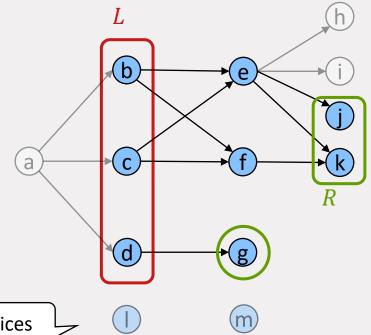


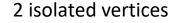
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Jobs J can be described as

\mathbf{core}(J)
J = \mathbf{succ}[L] \cap \mathbf{pred}[R]
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R = \mathbf{maximal\ elements} = \mathbf{sinks\ of\ } J
```



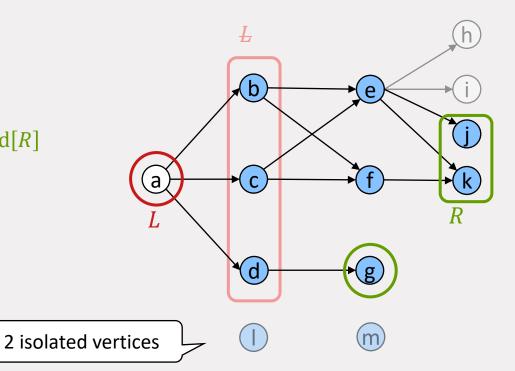




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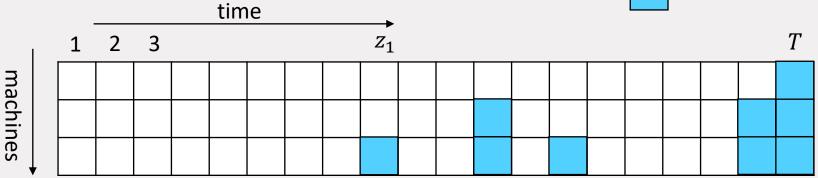
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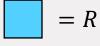
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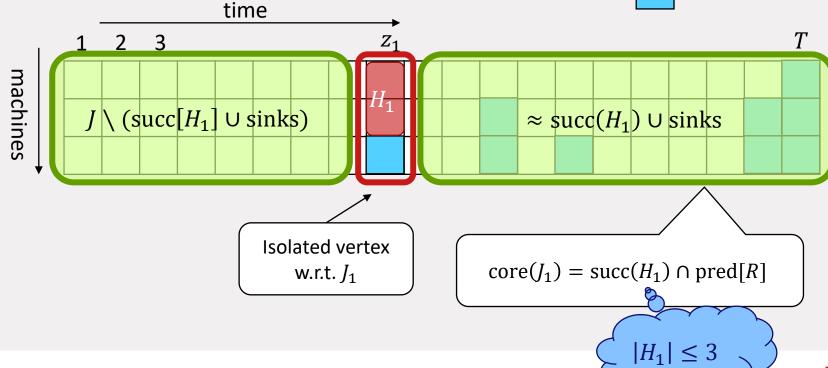






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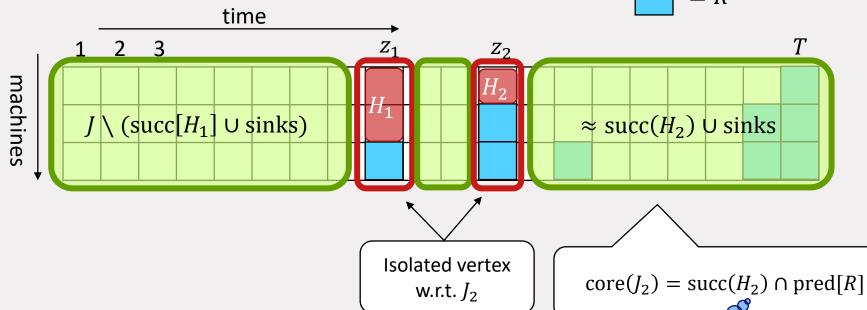






Assumption: $n = 3 \cdot T$

$$=R$$



 $|H_2| \le 3$



Assumption: $n = 3 \cdot T$

= R

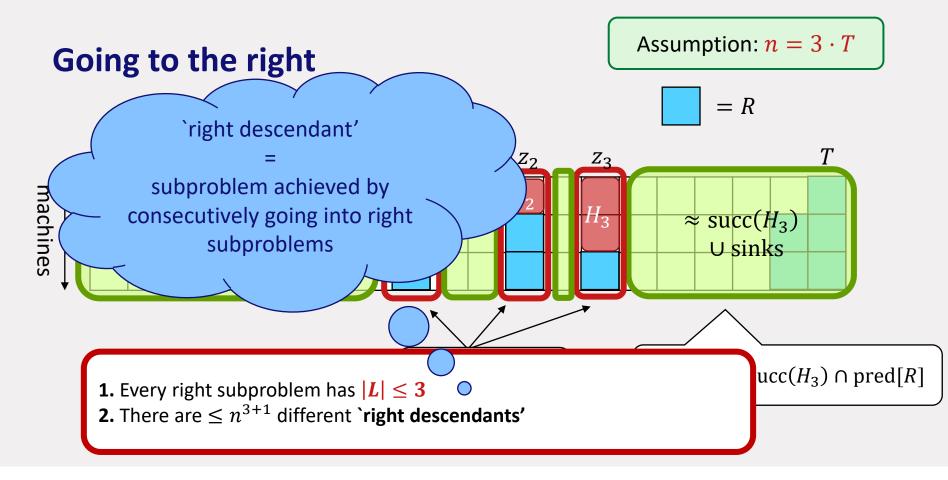
 $core(J_3) = succ(H_3) \cap pred[R]$

Isolated vertex

w.r.t. J_3

 $|H_3| \leq 3$

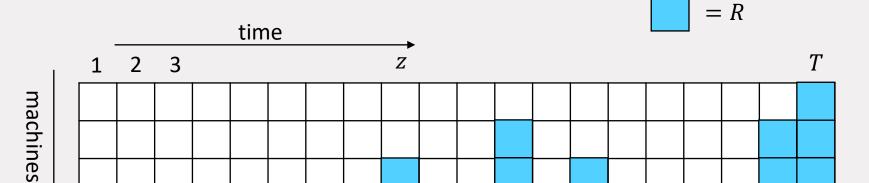






Going to the left

Assumption: $n = 3 \cdot T$

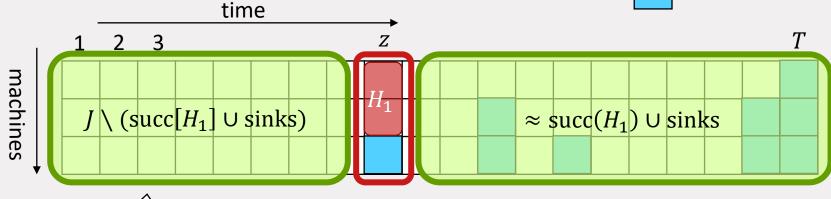




Going to the left

Assumption: $n = 3 \cdot T$





 $core = \mathbf{succ}(\mathbf{L}) \cap \mathrm{pred}[R_{\mathrm{new}}]$

- **1.** Every left subproblem has $|L| \leq 3$
- **2.** Problem size decreases by |R|



Win-Win strategy

Case $ R \leq \sqrt{n}$	Case $ R > \sqrt{n}$
\Rightarrow only $\binom{n}{\sqrt{n}} = 2^{O(\sqrt{n} \cdot \log n)}$ different R' s	In next <u>left</u> step: make \sqrt{n} jobs progress!



Branching Tree Either already in Lookup Table: - Base case

$$= |R| \le \sqrt{n}$$
$$= |R| > \sqrt{n}$$

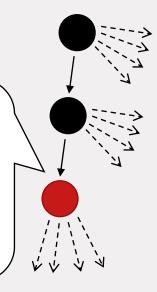


Branching Tree

Either already in Lookup Table:

- Base case

Or not yet in Lookup Table:



$$= |R| \le \sqrt{n}$$

$$= |R| > \sqrt{n}$$



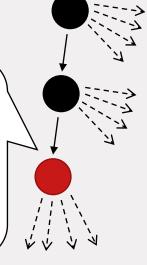
Branching Tree

Either already in Lookup Table:

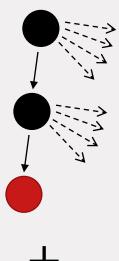
- Base case

Or not yet in Lookup Table:

- View as its 'own tree'
- $\Rightarrow n^{\sqrt{n}}$ such trees











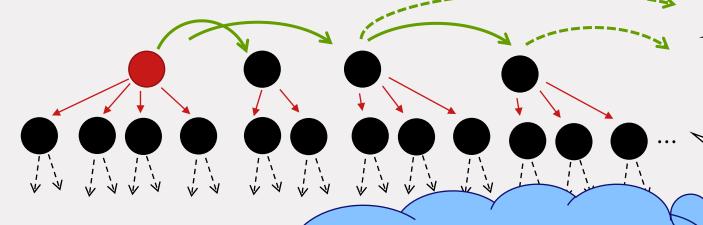
$$= |R| \le \sqrt{n}$$

$$=|R|>\sqrt{n}$$









 $\leq n^4$ right descendants

 $\leq n^4 \cdot n^3$ Simplify in the second secon

 $=|R| \le \sqrt{n}$ subp

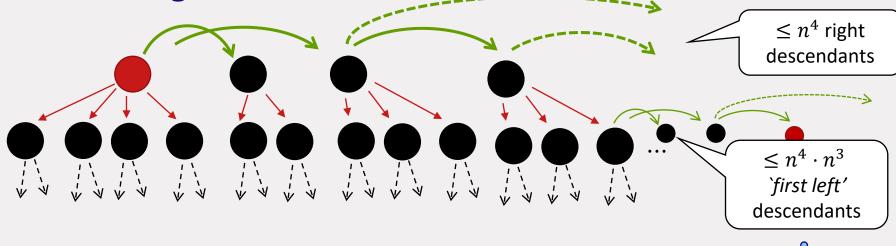
 $= |R| > \sqrt{n}$

subproblem achieved by consecutively going into right subproblems, then **once left**

`first left descendant'

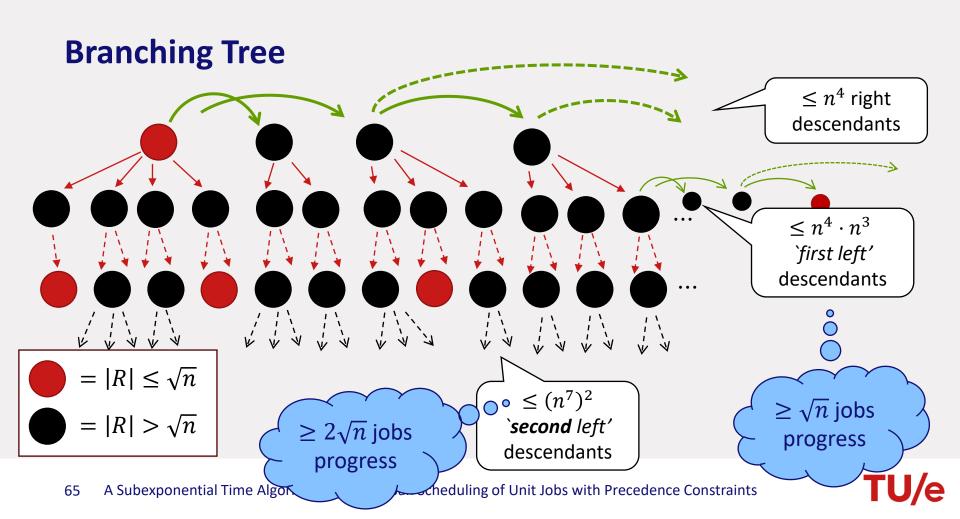
 $\geq \sqrt{n}$ jobs progress

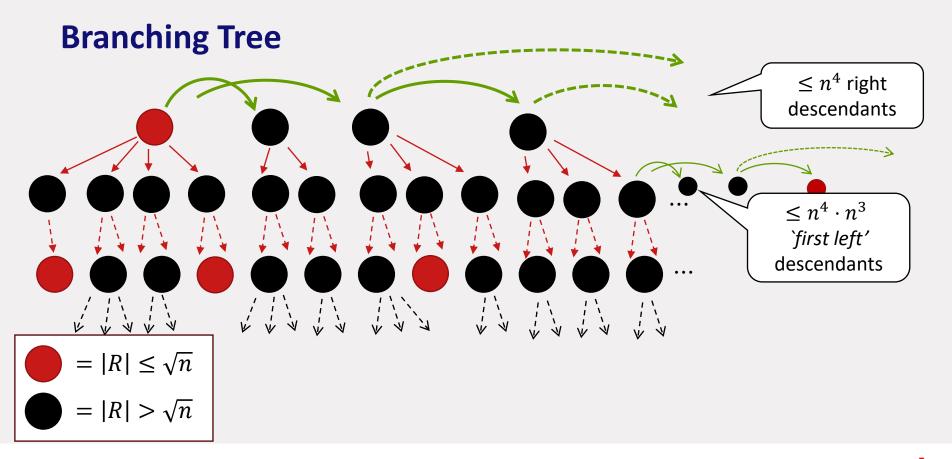




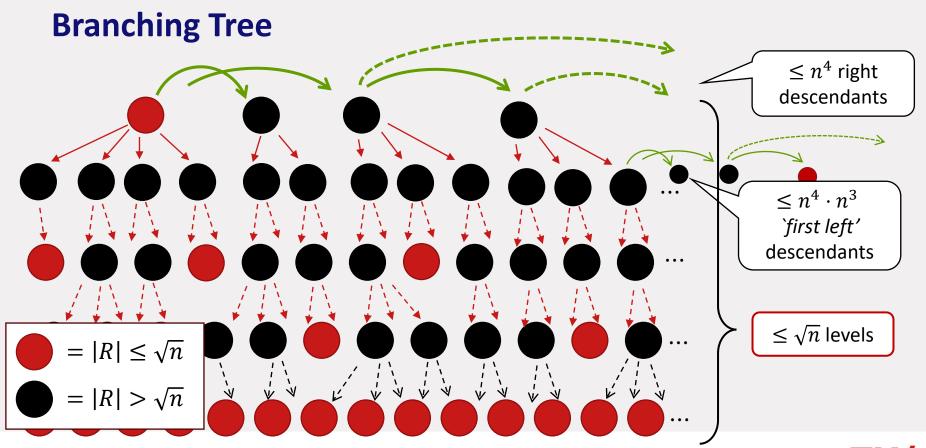
$$= |R| \le \sqrt{n}$$
$$= |R| > \sqrt{n}$$

 $\geq \sqrt{n}$ jobs progress

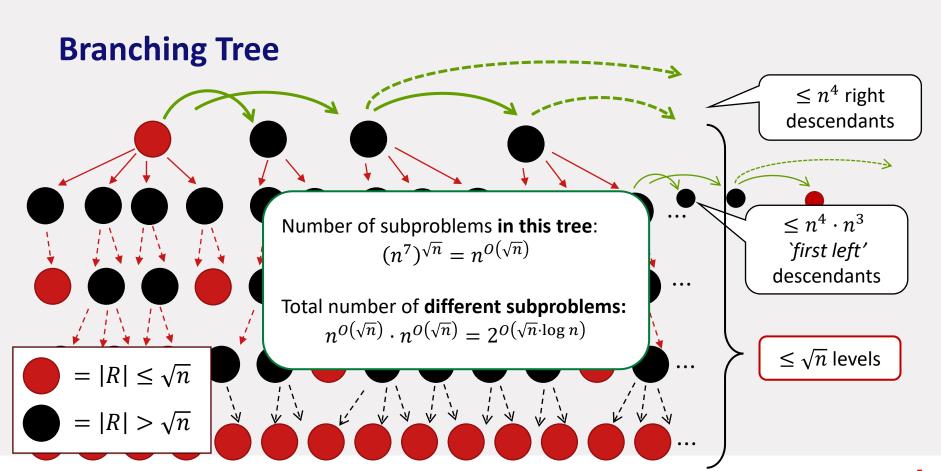














Algorithm

Schedule(*J*):

- Sep $(J) \coloneqq \{ H \subseteq J \text{ s.t.}$ (1) $|H| \le 3$, (2) H is antichain,(3) $|H \setminus \text{sinks}(J)| < 3 \}$
- 1. **return** LUT[core(J), #iso(J)] if it was already set
- 2. if $J = \emptyset$ return 0
- 3. **for each** $H \in \text{Sep}(J)$ **do:**

- $left(J, H) := J \setminus (succ[H] \cup sinks(J))$ right(J, H) := J \cap ((succ(H) \cup sinks(J)) \cap H
- 4. OPT[left(J, H)] := Schedule(left(J, H))
- 5. OPT[right(J, H)] := Schedule(right(J, H))
- 6. $OPT[J] := \min_{H \in Sep(J)} \{OPT[left(J, H)] + OPT[right(J, H)] + 1\}$
- 7. LUT[core(J), #iso(J)] = OPT[J]
- 8. Return OPT[*J*]

Only $2^{O(\sqrt{n} \cdot \log n)}$ different problems encountered



Corollaries

Our result:

$$Pm | prec, p_j = 1 | C_{\max}$$
 can be solved in $\left(1 + \frac{n}{m}\right)^{O(\sqrt{nm})}$ time.

Corollary 1

 $Pm|prec, p_j = 1|C_{\max}$ can be solved in subexponential time whenever m = o(n).

Corollary 2

 $P|prec, p_j = 1|C_{max}$ can be solved in $1.997^n \cdot poly(n)$ time.





Main result:

$$P3|prec, p_j = 1|C_{\max} \text{ in } 2^{O(\sqrt{n} \cdot \log n)} \text{ time.}$$



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- 1. Use of look-up table
- 2. Keeping track of core + # isolated vertices
- 3. Finding win-win strategy using number of sinks



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Future Research:

$$P3|prec, p_j = 1|C_{\text{max}}$$
 in quasi-polynomial time?



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