

# Complexity and Inapproximability Results for Parallel Task Scheduling and Strip Packing

Sören Henning, Klaus Jansen, *Malin Rau*, Lars  
Schmarje



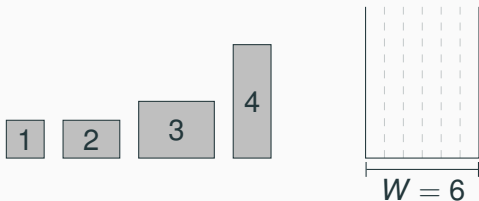
Kiel University  
Faculty of Engineering  
Department of Computer Science

## Given:

- Strip with width  $W \in \mathbb{N}$  and infinite height
- Set of  $n$  items  $I$  with width  $w_i \in \mathbb{N}_{\leq W}$  height  $h_i \in \mathbb{N}$

## Objective:

Find a *feasible* packing into the strip with minimal height

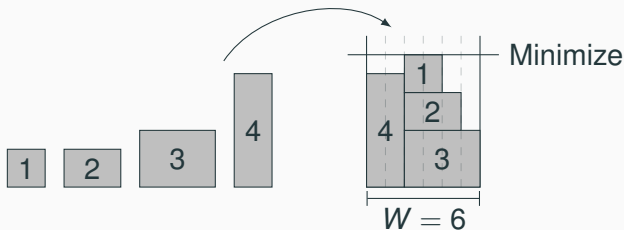


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## Polynomial Time



- [1] Baker, Coffman, Rivest, 1980
- [2] Coffman, Garey, Johnson, Tarjan, 1980
- [3] Steinberg, 1997
- [4] Schiermeyer, 1994
- [5] Harren, van Stee, 2009
- [6] Harren, Jansen, Prädel, van Stee, 2014

## Pseudo-Polynomial Time



[7] A. Adamaszek, T. Kociumaka, M. Pilipczuk, M. Pilipczuk, 2016

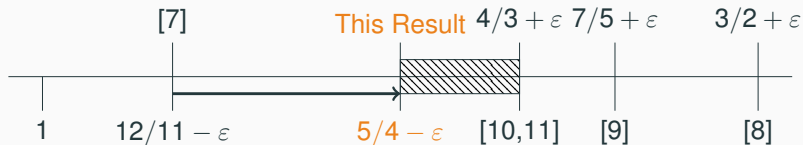
[8] K. Jansen, R. Thöle, 2010

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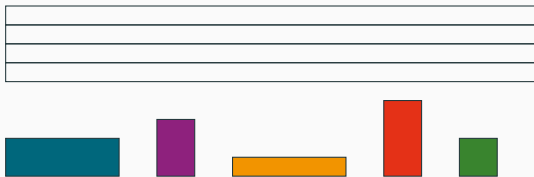
## Given:

- $m \in \mathbb{N}$  parallel machines
- Set of  $n$  jobs  $J$  with width processing time  $p_j \in \mathbb{N}_{\leq w}$   
machine requirement  $q_j \in \mathbb{N}$

## Objective:

Find a *feasible* schedule of the jobs with minimal makespan

$m = 4$

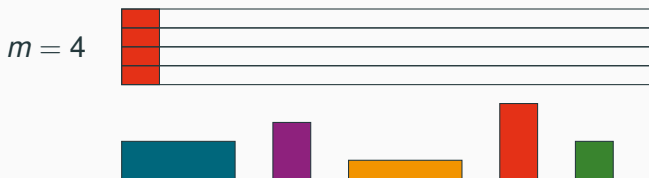


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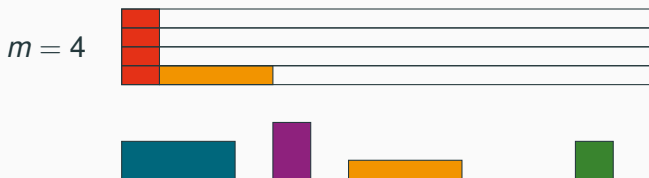


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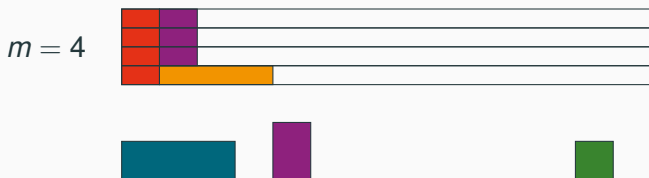


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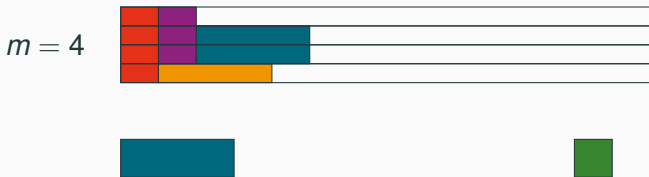


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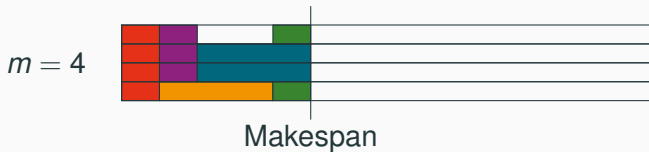


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	Lower Bound	Algorithm
$m$ arbitrary	$3/2$ [12]	$3/2 + \varepsilon$ [13]
$m \in \text{poly}(n)$	strongly NP-hard [14]	PTAS [15]
constant $m \geq 5$	strongly NP-hard [14]	PTAS [16,17]
$m \in \{2, 3\}$	NP-hard [12]	pseudo polynomial algorithm [14]

[12] folklore, Partition-Problem

[13] Jansen, 2012

[14] Du, Leung 1989

[15] Jansen, Thöle, 2010

[16] Amoura, Bampis, Kenyon, Manoussakis, 2002

[17] Jansen, Porkolab, 2002



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## Open Question

Is the problem strongly NP-hard when  $m = 4$  ?



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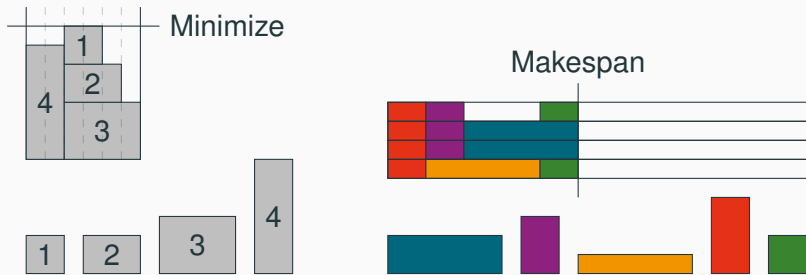
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Is the problem strongly NP-hard when  $m = 4$  ?

## Our Answer

Yes, it is.





## Scheduling Parallel Tasks

Is there a schedule on 4 Machines with makespan  $W$  (in which all jobs are scheduled on contiguous machines)?

## Strip Packing

Given a Strip with width  $W$ , can we find a feasible packing with height at most 4?



### Given

$3z$  integral numbers  $I$  with  $\sum_{i \in I} i = zD$  and  $\frac{1}{4}D < i < \frac{1}{2}D$  for each  $i \in I$

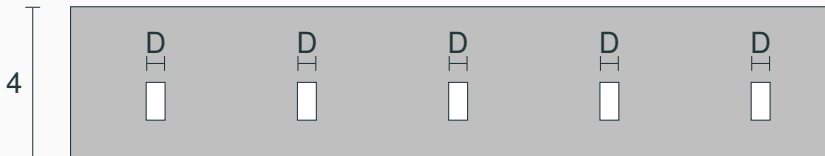
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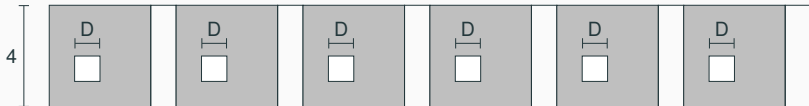
Can we partition the set  $I$  into sets  $I_1, \dots, I_z$  such that  $\sum_{i \in I_j} i = D$  for each  $j = 1, \dots, z$ ?

### Properties

strongly NP-complete  $\Rightarrow$  no pseudo polynomial algorithm, unless  $P = NP$

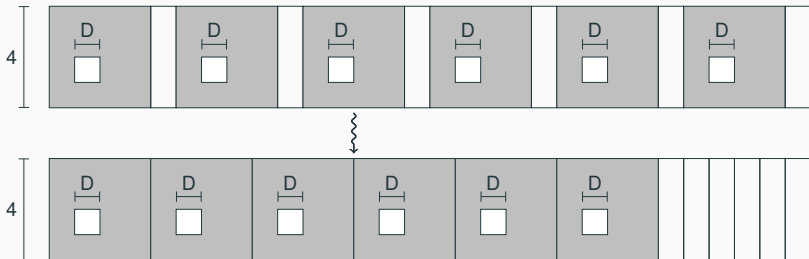
Find a set of items forcing the 3-Partition instance to be a yes-instance, if there is a packing with height 4





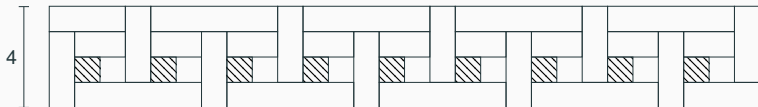
## Properties

- Items with height 4 are not helpful



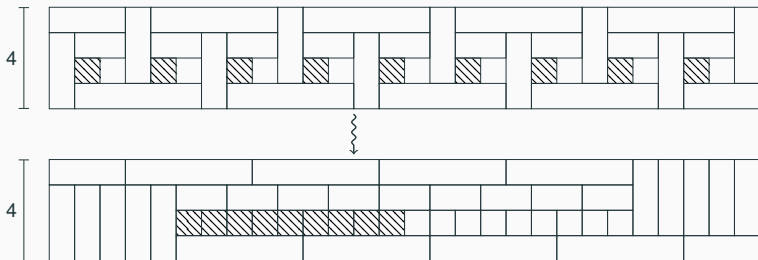
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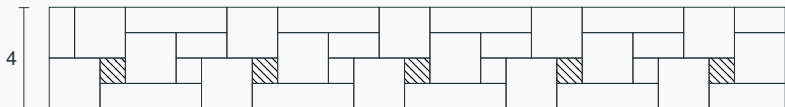
## Properties

- Items with height 4 are not helpful
- No items with height 2: reordering is always possible



## Properties

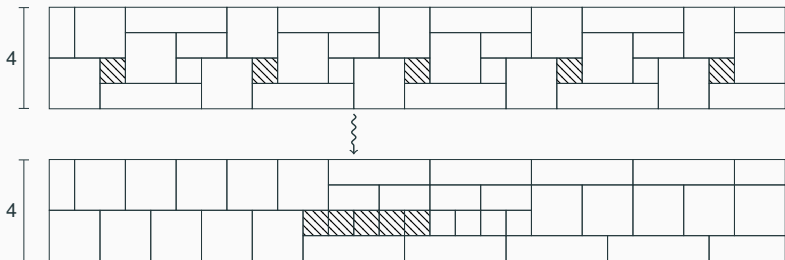
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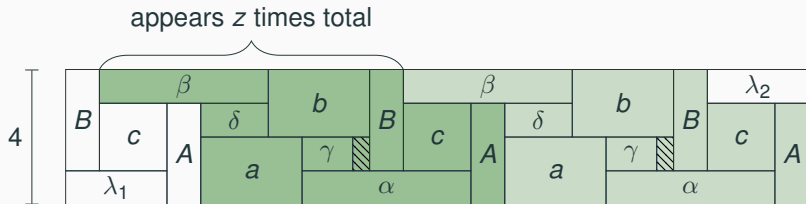
- Items with height 4 are not helpful
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- No items with height 3: reordering is always possible



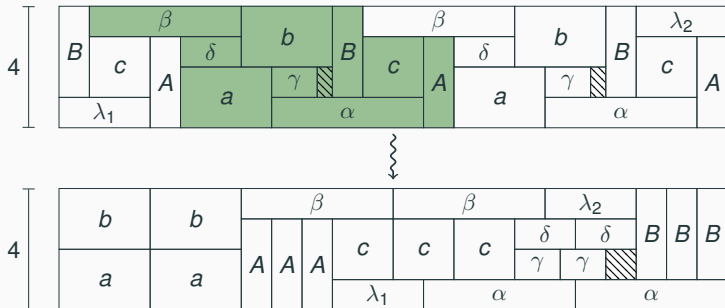


## Properties

- Items with height 4 are not helpful
- No items with height 2: reordering is always possible
- No items with height 3: reordering is always possible



A wrong choice of width can open the possibility to a reordering of the items:

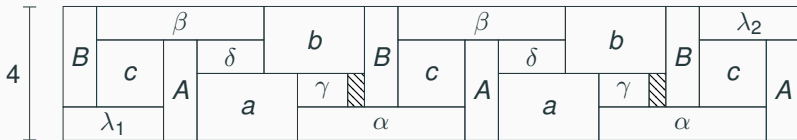


## Objective

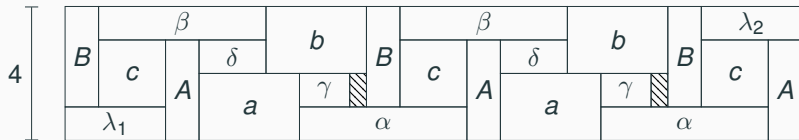
Find fitting widths for the items which preclude a reordering, that fuses areas for 3-partition items



Each x-coordinate of any item is defined by a combination of width of other items



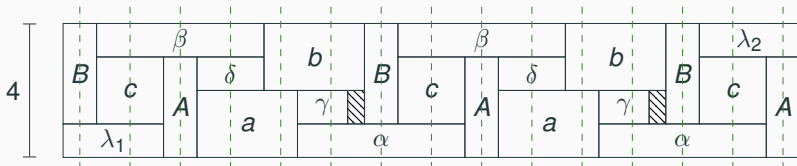
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**Idea:**

Give each set of items which can be cut by a vertical line an individual token, which is added to the width of these items

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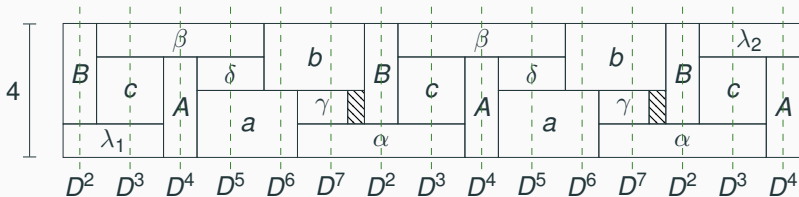


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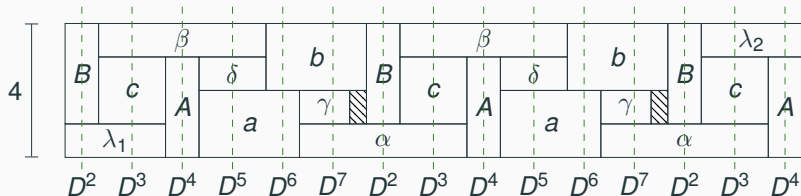
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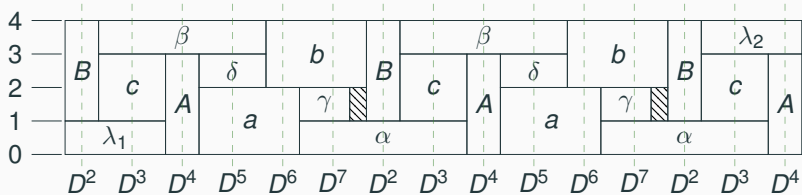
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**Requirement**

$D$  has to be large, e.g.,  $D > 4(z + 1)$ .

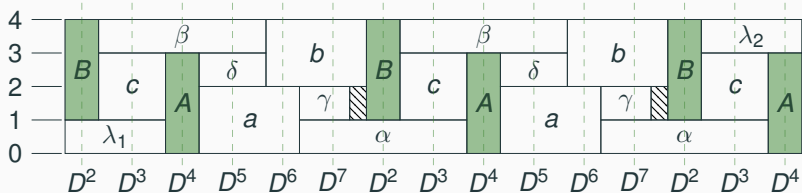


# Consequences



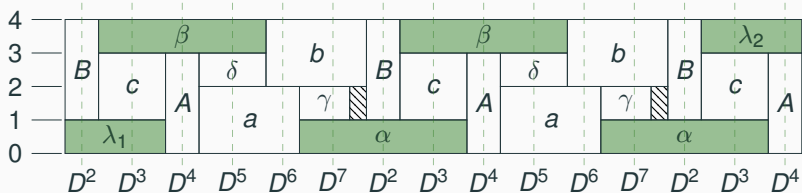
- Total width:  $(z + 1)(D^2 + D^3 + D^4) + z(D^5 + D^6 + D^7)$

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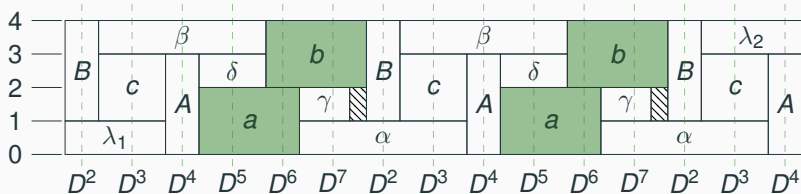
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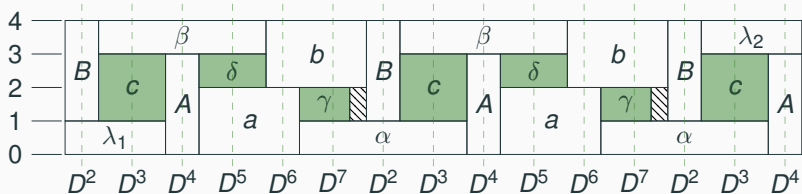
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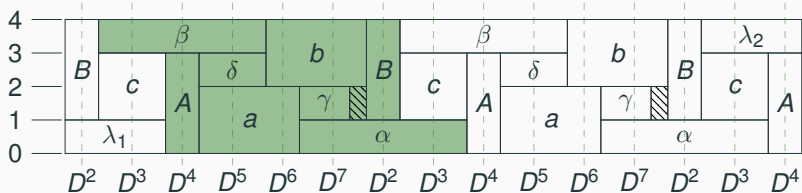


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- There have to be  $z$  items of type  $a$  or  $b$  which overlap the height 3 to 4 and  $z$  other, which overlap 0 to 1.

# Consequences



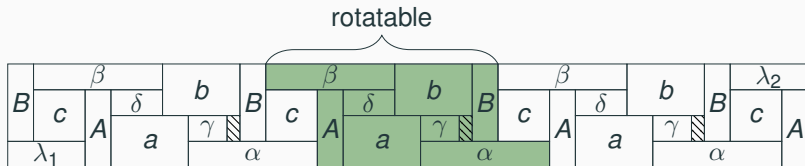
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- $c, \gamma$  and  $\delta$  have to overlap heights 1 to 3.



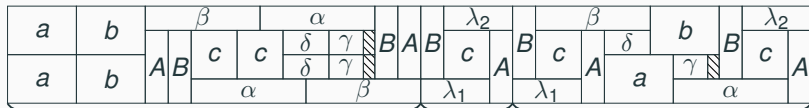
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**These conditions are not enough**

# Reordering is still possible:



Rotate each second rotatable block:

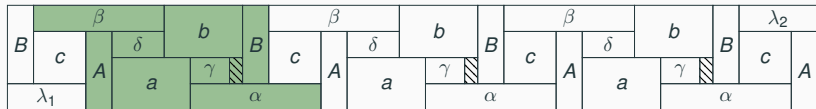


repeat each job  $\lfloor z/2 \rfloor$  times  
before processing the next

if  $z$  is even

if  $z$  is odd

# Use a new token $D^8$ to prevent swapping

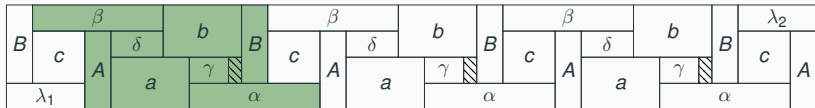


**Idea: add  $D^8$  to  $\alpha$ ,  $\beta$  and  $\lambda$ , such that:**

- $x_1 D^8(\alpha) + x_2 D^8(\beta) + x_3 D^8(\lambda_1) + x_4 D^8(\lambda_2) = (z D^8(\alpha) + z D^8(\beta) + D^8(\lambda_1) + D^8(\lambda_2))/2$
  - $x_1 + x_2 + x_3 + x_4 = z + 1$
  - $x_1 \in \{0, z\}$ ,  $x_2 \in \{0, z\}$ ,  $x_3 \in \{0, 1\}$ , and  $x_4 \in \{0, 1\}$
- has exactly two solutions
- $x_1 = z$ ,  $x_2 = 0$ ,  $x_3 = 1$  and  $x_4 = 0$  and  
 $x_1 = 0$ ,  $x_2 = z$ ,  $x_3 = 0$  and  $x_4 = 1$ .



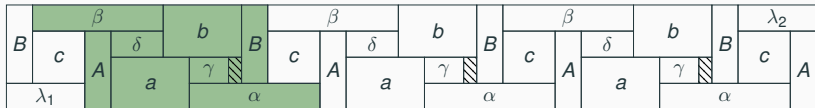
# Use a new token $D^8$ to prevent rotation



**Idea: use varying values for  $c$ ,  $\delta$  and  $\gamma$  to create a different amount of  $D^8$  for  $\alpha$  and  $\beta$**

- $D^8(c_i) = z + i, \forall i = 0, \dots, z$
- $D^8(\delta_i) = 3z - i, \forall i = 1, \dots, z$
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**Consequence:**

- $D^8(\alpha) = 4z; D^8(\beta) = (4z - 1); D^8(\lambda_1) = z; D^8(\lambda_2) = 2z;$
- Total Width:

$$(z + 1)(D^2 + D^3 + D^4) + z(D^5 + D^6 + D^7) + (7z^2 + z)D^8$$



- add a token for each vertical line to force certain items to be placed on these lines
- add an additional token  $D^8$  to force certain items to be placed on a horizontal line
- Requirement:  $D > 4(7z^2 + z)$   
→ scale the partition instance



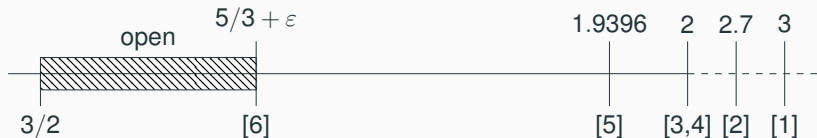
## Theorem

*For each  $\varepsilon > 0$ , there is no pseudo polynomial algorithm, which approximates strip packing with ratio  $(\frac{5}{4} - \varepsilon)\text{OPT}$ , unless  $P = NP$*

## Theorem

*Parallel Task Scheduling is strongly NP-complete for the case of  $m = 4$*

## polynomial time



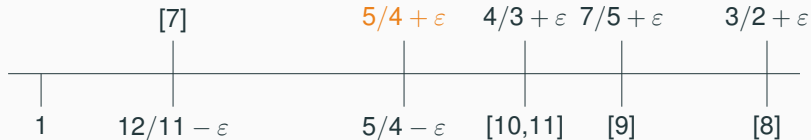
## pseudo polynomial time



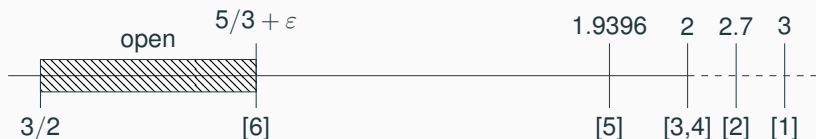
## polynomial time



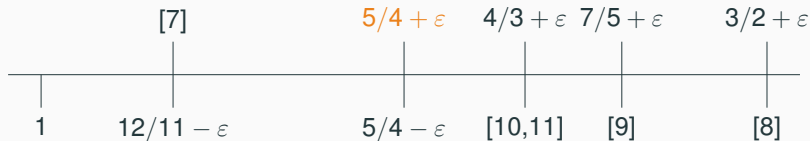
## pseudo polynomial time



## polynomial time



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Thank you very much!