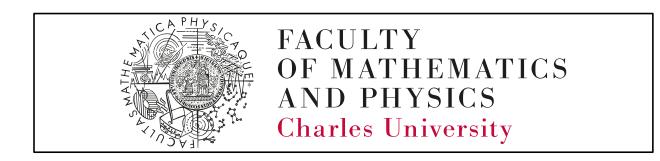






Complexity of Scheduling Few Types of Jobs on Related and Unrelated Machines

Martin Koutecký and Johannes Zink



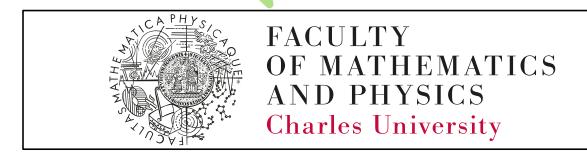






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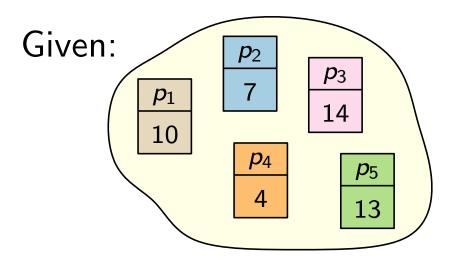


Scheduling old fundamental task in combinatorial optimization

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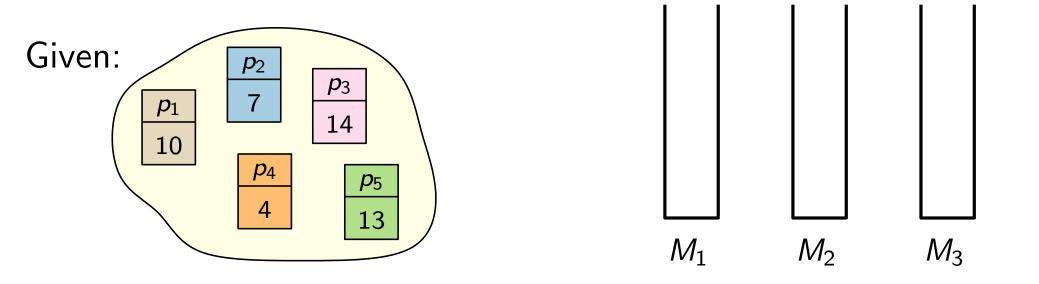
Given:

Scheduling old fundamental task in combinatorial optimization



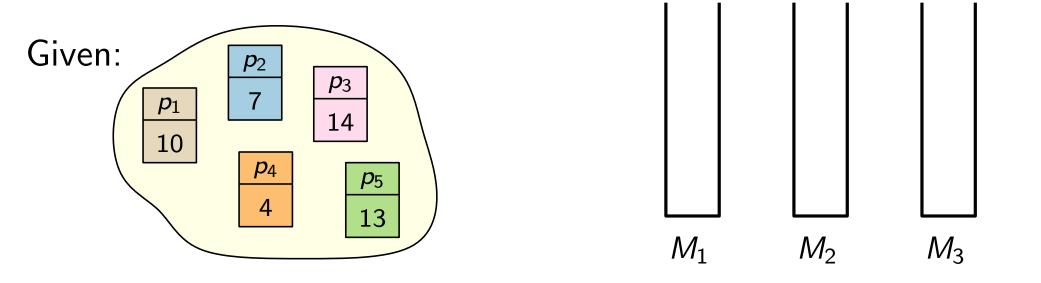
set of *n* jobs with individual processing times

Scheduling old fundamental task in combinatorial optimization



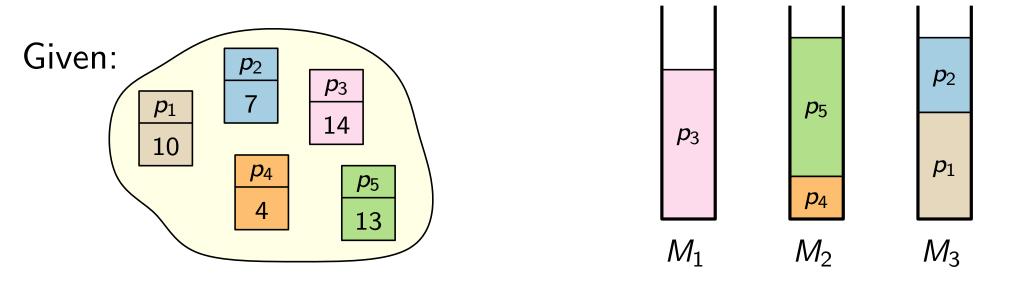
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set of n jobs with individual processing times m identical machines

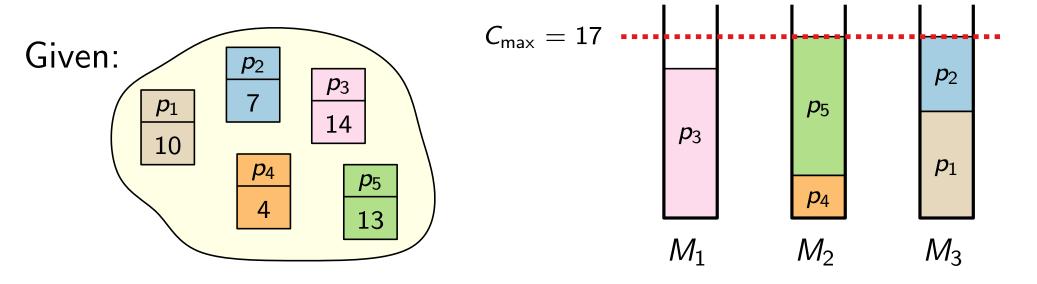
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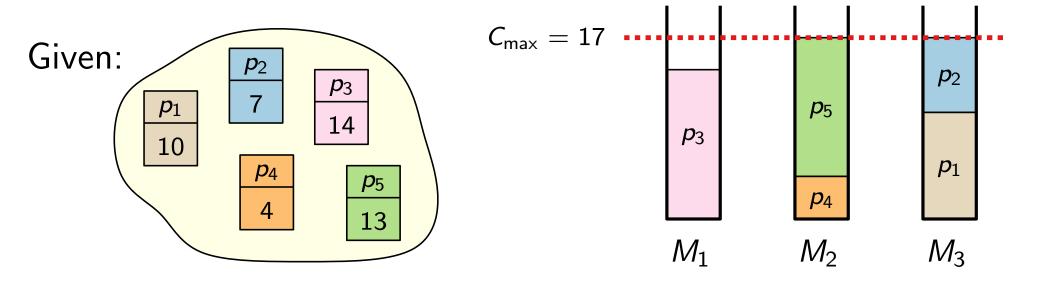
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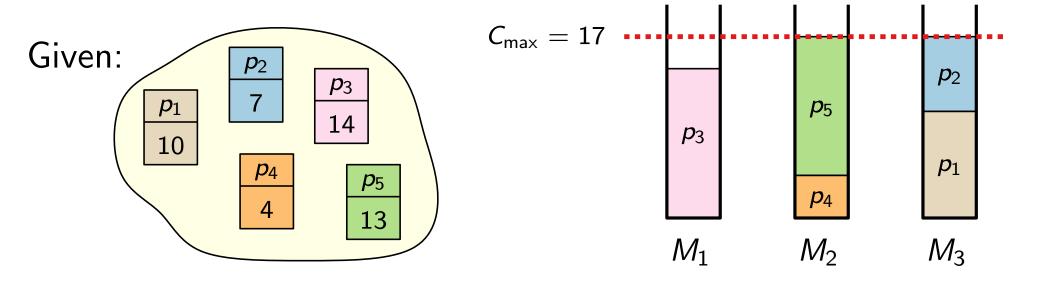


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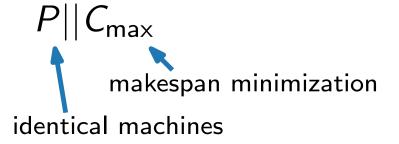
$$P||\mathit{C}_{\mathsf{max}}$$

Scheduling old fundamental task in combinatorial optimization

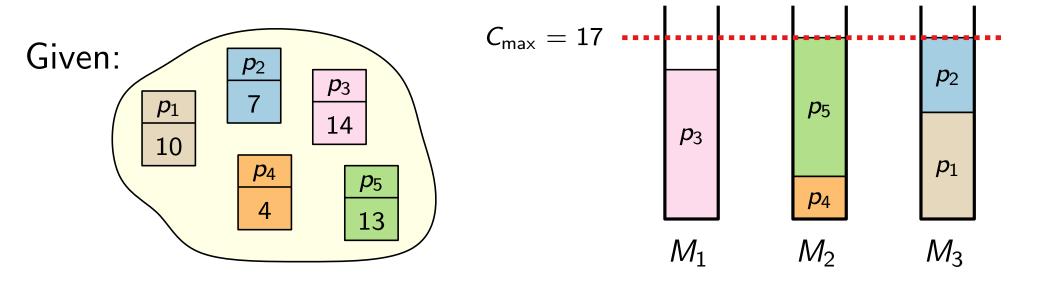


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Scheduling old fundamental task in combinatorial optimization



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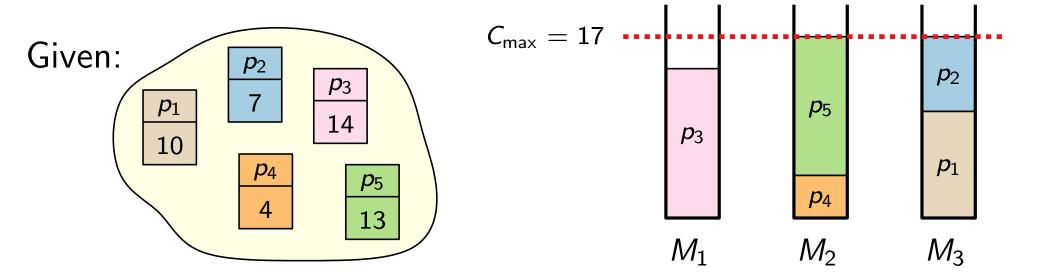
m identical machines

Obj.: find assignment jobs \rightarrow machines, min. completion time

 $P||C_{\text{max}}$ is NP-complete by reduction from BIN PACKING.

makespan minimization

Scheduling old fundamental task in combinatorial optimization



natural numbers

set of n jobs with individual processing times

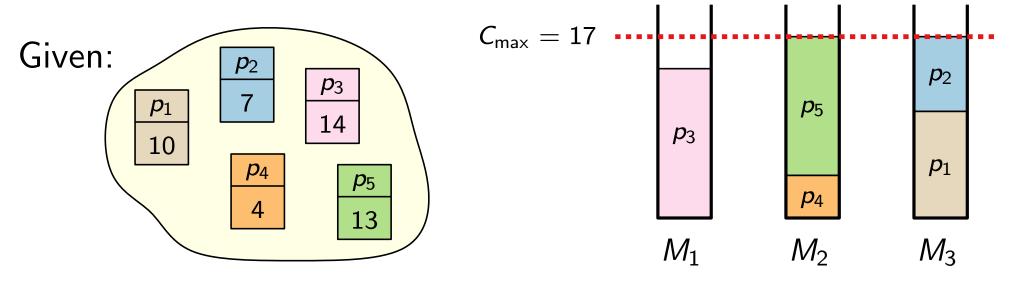
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Scheduling old fundamental task in combinatorial optimization



natural numbers set of *n* jobs with individual processing times

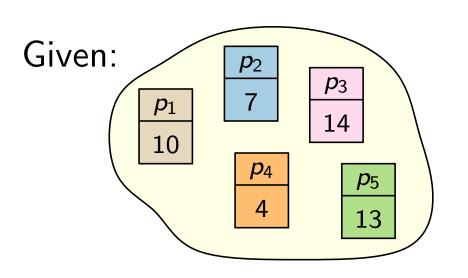
bins of size C_{max} m identical machines

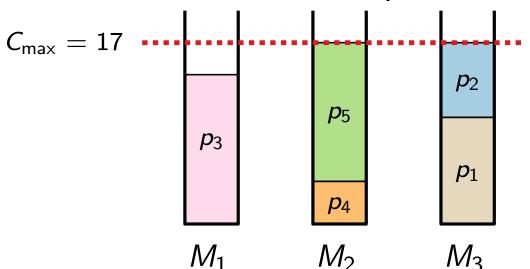
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Scheduling old fundamental task in combinatorial optimization





natural numbers set of n jobs with individual processing times

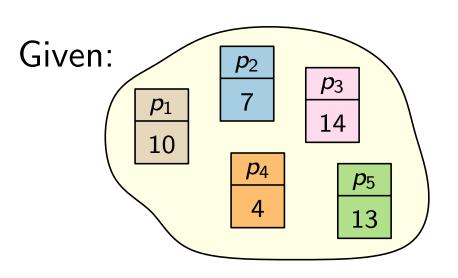
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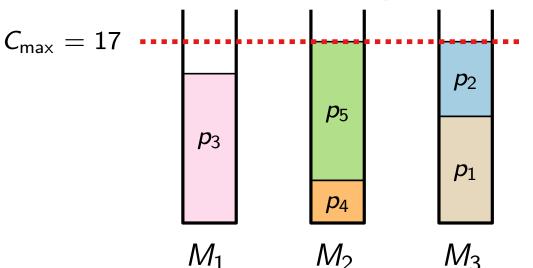
 $\frac{\text{numbers}}{\text{Obj.: find assignment }} \rightarrow \frac{\text{bins}}{\text{jobs}} \rightarrow \frac{\text{bins}}{\text{machines}}$, min. completion time

 $P||C_{\text{max}}$ is NP-complete by reduction from BIN PACKING.

makespan minimization

Scheduling old fundamental task in combinatorial optimization





natural numbers set of n jobs with individual processing times bins of size C_{max}

 $\begin{array}{ccc} & \text{numbers} \rightarrow \text{bins} & \text{no bin overfull} \\ \text{Obj.: find assignment } \xrightarrow{\text{jobs}} & \xrightarrow{\text{machines}}, & \xrightarrow{\text{min. completion}} \end{array}$

 $P||C_{\text{max}}$ is NP-complete by reduction from BIN PACKING.

makespan minimization

So how to simplify our model? What about ...

So how to simplify our model? What about ... having few machines?

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... having few machines? No, does not help!

BIN PACKING NP-hard f. const. #bins, even for 2 (PARTITION)
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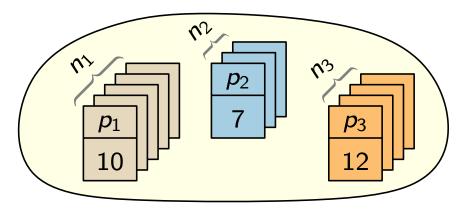
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... having many duplicates of only few job types?
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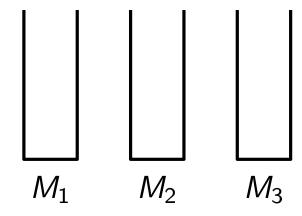
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k job types with n_1, \ldots, n_k identical jobs each

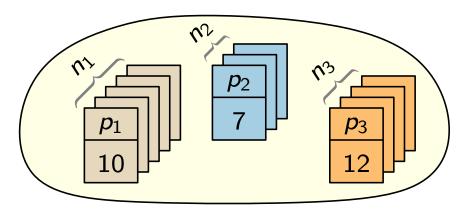


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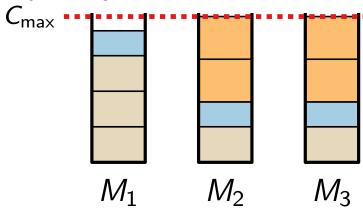
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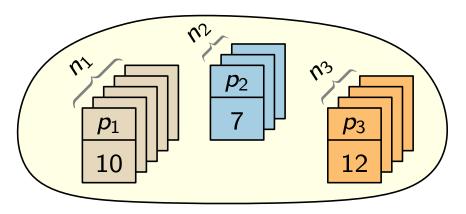
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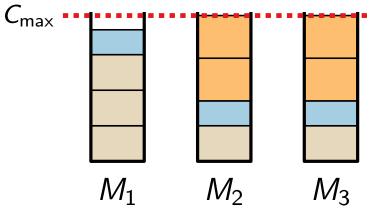
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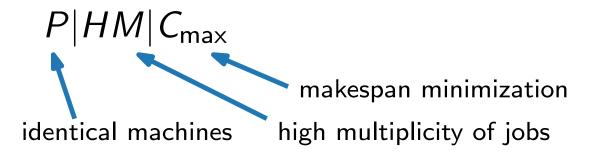
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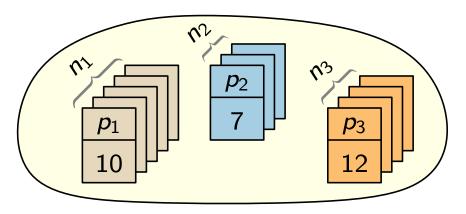




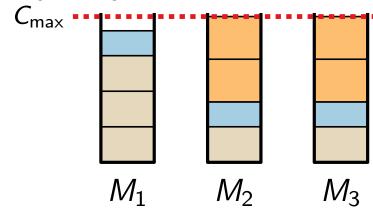
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m identical machines

 $P|HM|C_{\text{max}}$ is poly. time solvable (k const.) [Goemans, Rothvoss '14].

makespan minimization

identical machines high multiplicity of jobs

 $*|*|C_{max}$: objective function is makespan minimization

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|HM|: high multiplicity of identical jobs

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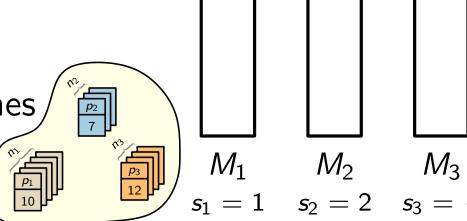
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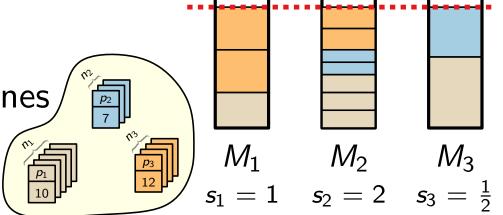
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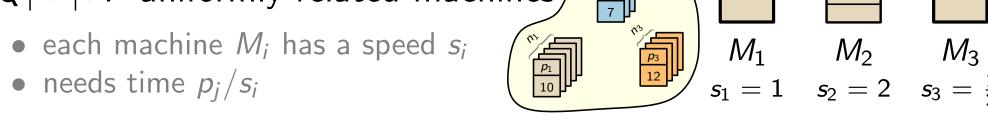


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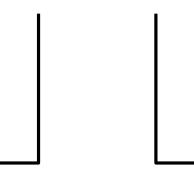
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• a processing time p_i' for each machine and each job





$$p^1 = \begin{pmatrix} 10 \\ 7 \\ 12 \end{pmatrix}$$
 $p^2 = \begin{pmatrix} 4 \\ 9 \\ 42 \end{pmatrix}$
 $p^3 = \begin{pmatrix} 4 \\ 9 \\ 42 \end{pmatrix}$



$$\overbrace{M_2}{M_2} \begin{pmatrix} 4 \\ 9 \\ 42 \end{pmatrix}$$

$$\rho^3 = \begin{pmatrix} 98 \\ 13 \\ 23 \end{pmatrix}$$

 $*|*|C_{max}$: objective function is makespan minimization

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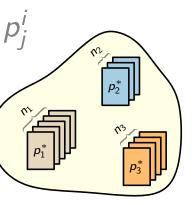
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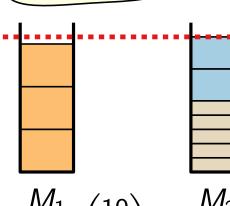
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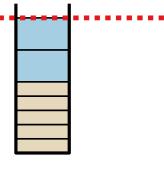


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Parametrized Complexity

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• A problem is *fixed-parameter tractable* (FPT) in k if it can be solved by an algorithm of runtime $f(k) \cdot n^{O(1)}$.

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(f: some computable function, n: input size)
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W[1]-hard problems are unlikely to be FPT.

P: identical machines

Q: related machines

R: unrelated machines

HM: high multipl. jobs

C_{max}: min. makespan

 $P||C_{\max}: NP$ -complete

 $P|HM|C_{max}$: poly. time

k: # job types

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Agenda

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1. hardness reduction

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2. obtaining FPT

BIN PACKING (tight instances) [known to be NP-complete]

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BALANCED BIN PAGE

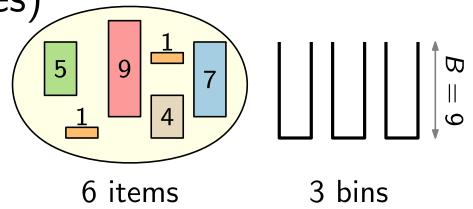
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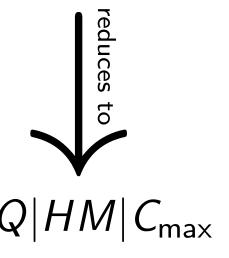




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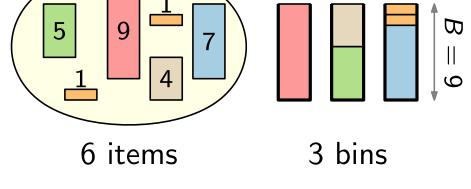


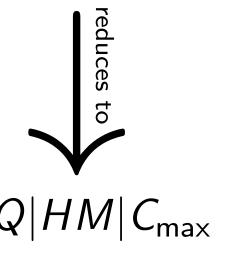




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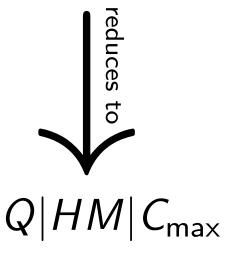


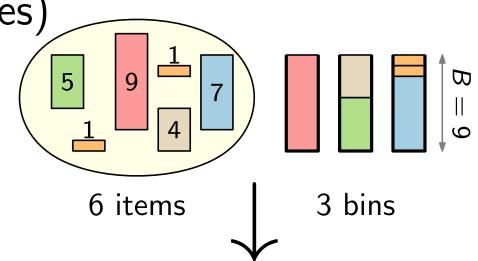




BIN PACKING (tight instances) [known to be NP-complete]

reduces to





BALANCED BIN

PACKING instance:

- multiset of numbers $\{a_1, \ldots, a_m\}$
- *k* bins of size *B*
- $A := \sum_{i=1}^{m} a_i = kB$

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Balanced Bin Packing $o Q|HM|C_{\sf max}$ 8

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Idea: • for number a_i : use machine M_i ($\Rightarrow m$ machines)

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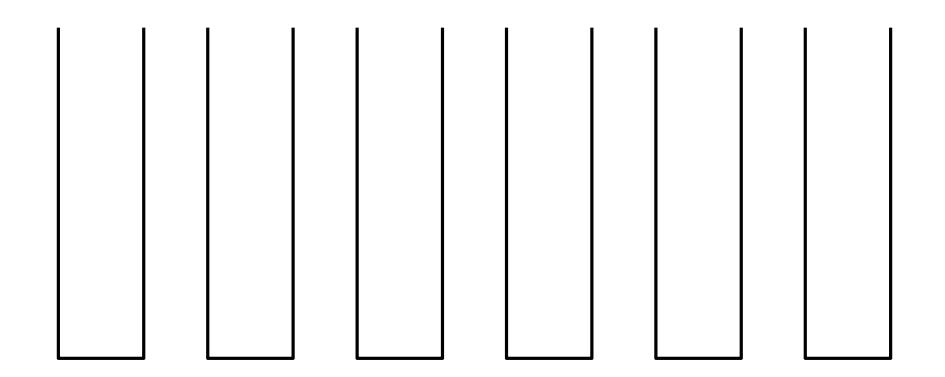
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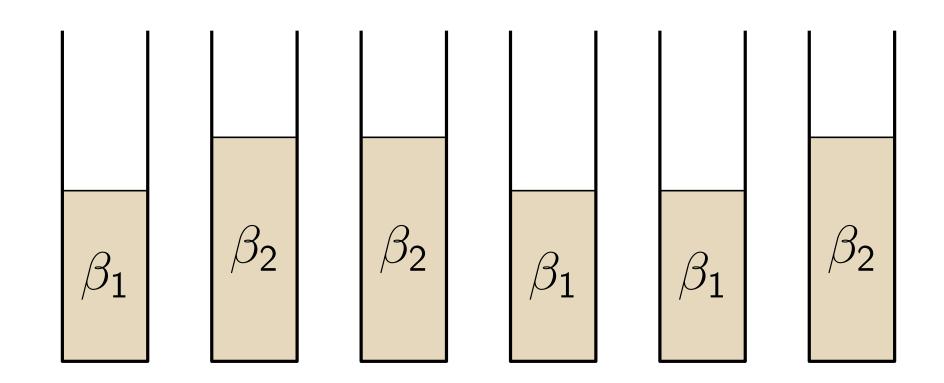
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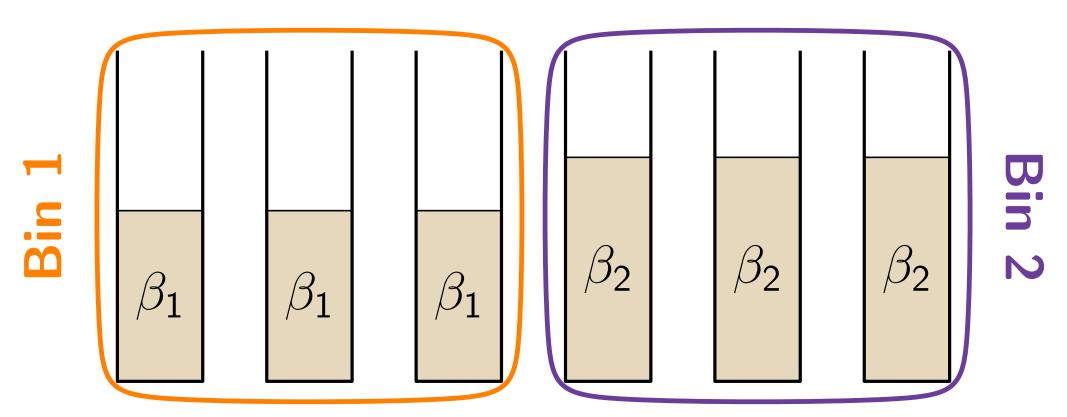
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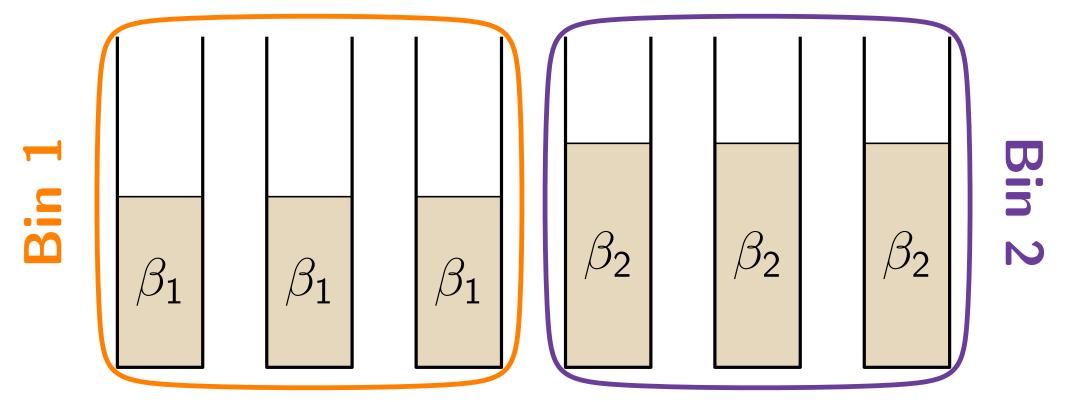
- multiset of numbers $\{a_1, \ldots, a_m\}$
- k bins of size B
- $A := \sum_{i=1}^{m} a_i = kB$

- for bin $j \in [k]$: use job types β_j , γ_j^0 , γ_j^1
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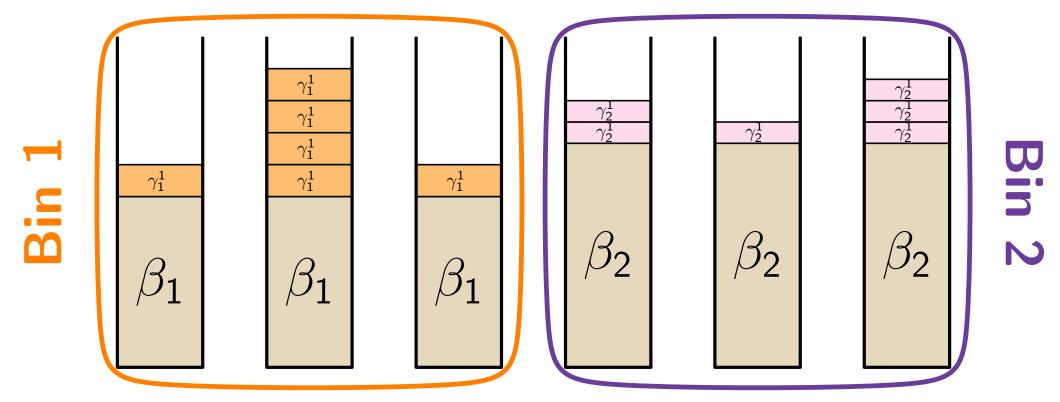
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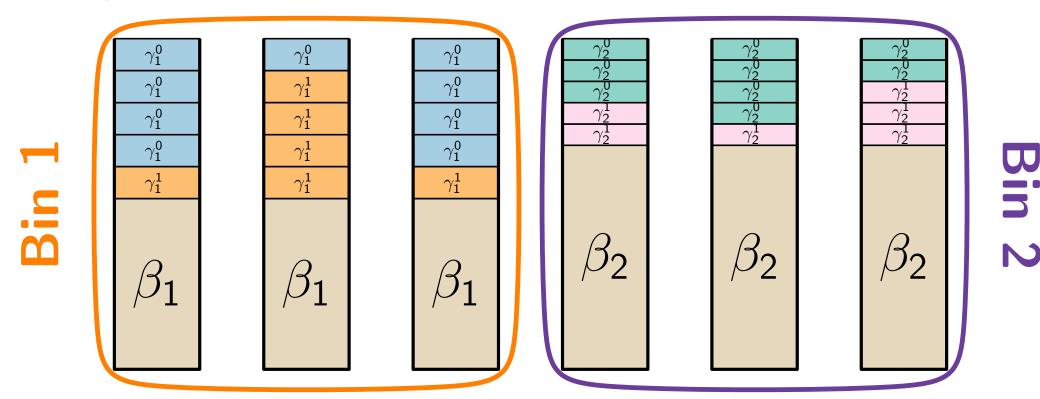
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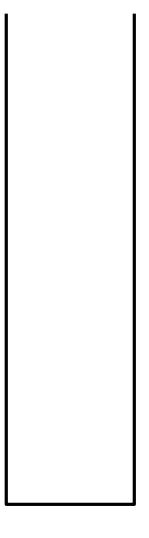
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BALANCED BIN

PACKING instance:

- multiset of numbers $\{a_1, \ldots, a_m\}$
- *k* bins of size *B*
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Machine M_i

- multiset of numbers $\{a_1, \ldots, a_m\}$
- k bins of size B
- $A := \sum_{i=1}^{m} a_i = kB$
- Speed of M_i is slightly faster than 1. Allows to process jobs of lengths $T + a_i$ in time T.

Machine M_i

BALANCED BIN PACKING instance:

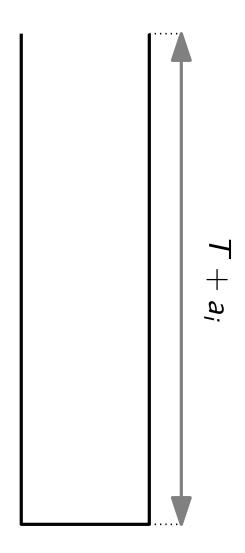
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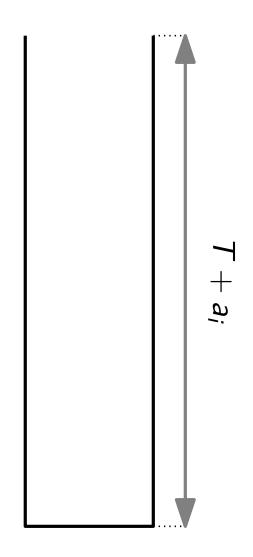
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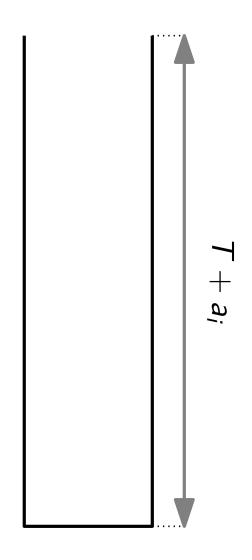
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- β -type jobs are so large that we have ≤ 1 per machine.



Machine M_i

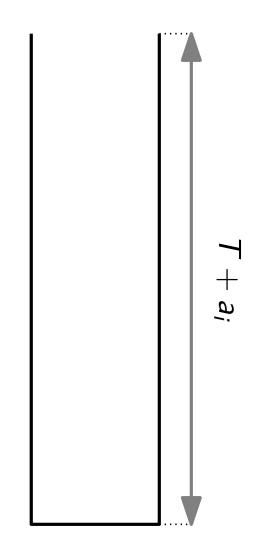
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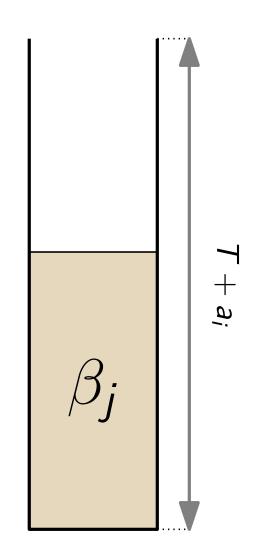
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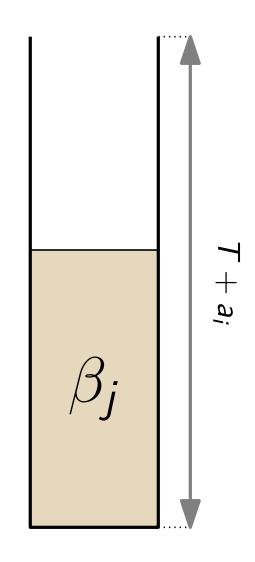
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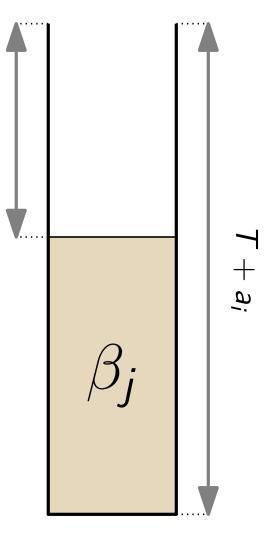
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Machine M_i

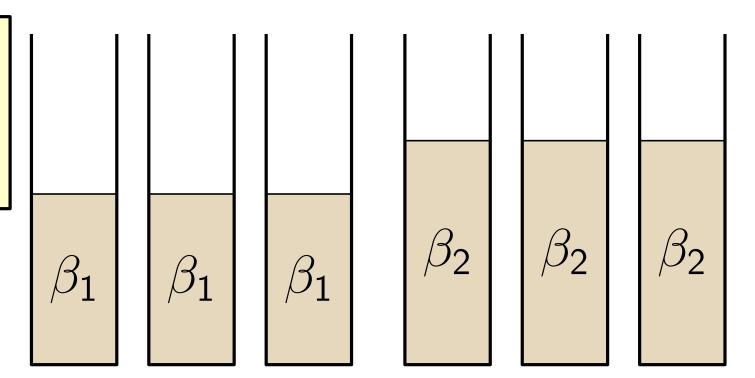
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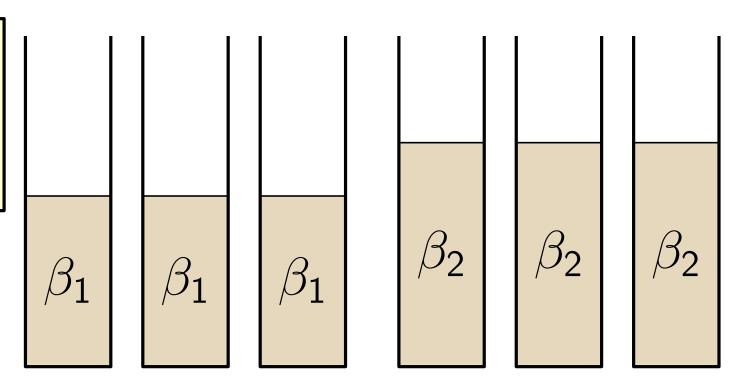
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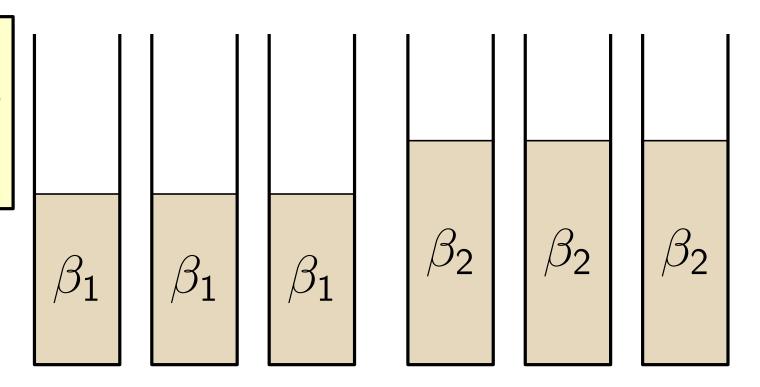
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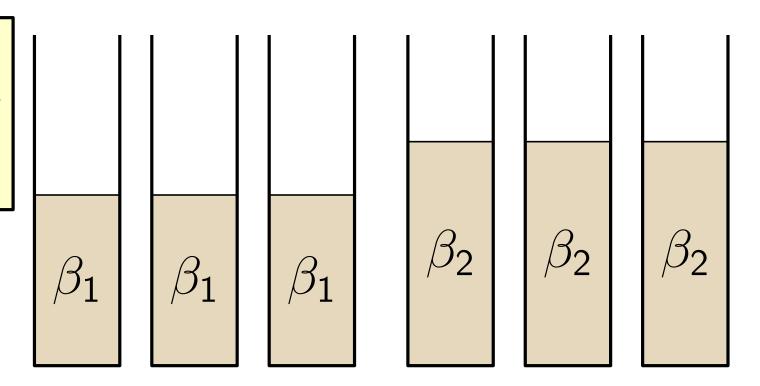
• We have mA γ -type jobs



• Any machine can execute $\leq A \gamma$ -type jobs

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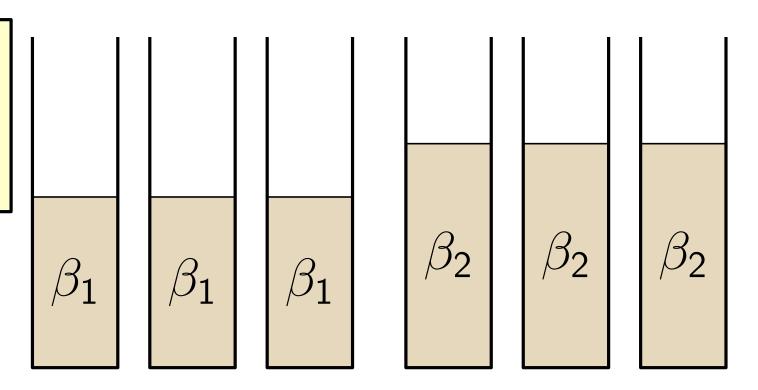
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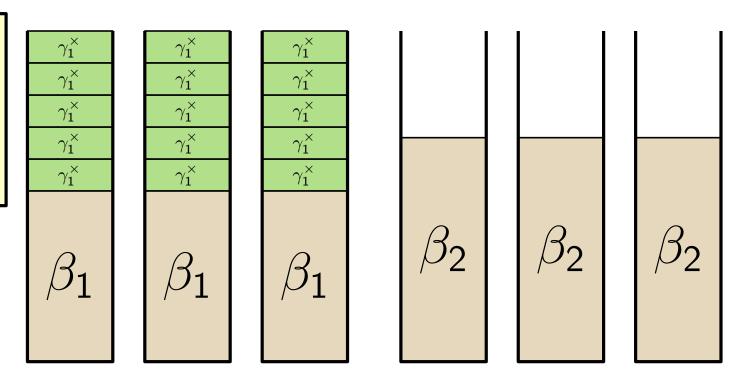
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- As $\gamma_1^{\times} > \gamma_2^{\times}$, only machines with β_1 can host $A \gamma_1^{\times}$ jobs

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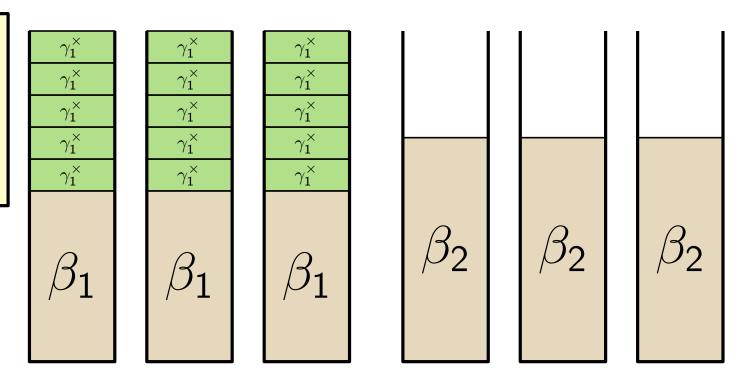
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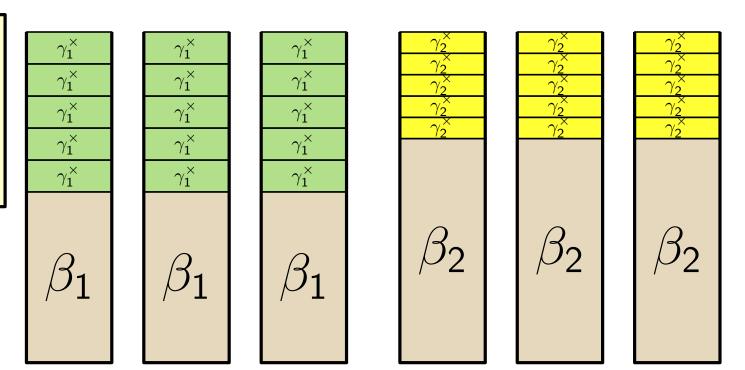
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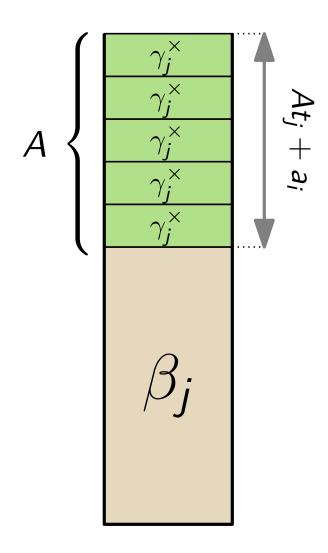
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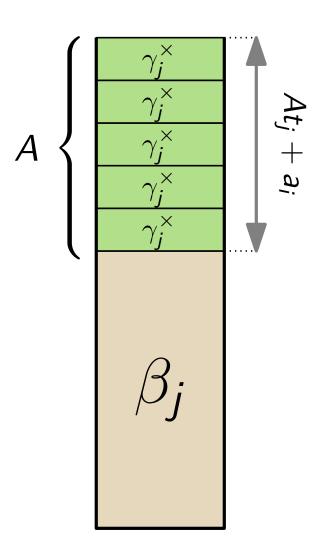
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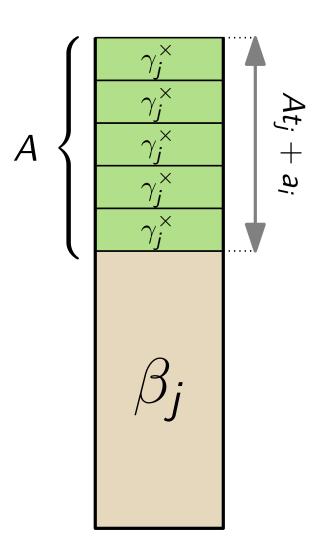
Machine M_i



Machine M_i

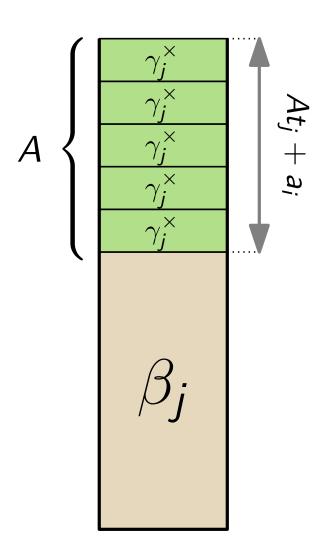
Distinguishing between γ_j^0 and γ_j^1 :

 $\bullet \ p_{\gamma_j^0}=t_j$



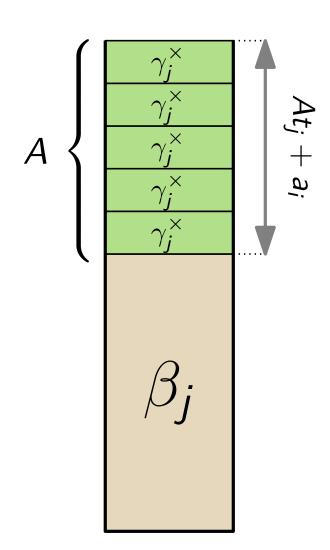
Machine M_i

- $egin{array}{ll} ullet &
 ho_{\gamma_j^0} = t_j \ & ullet &
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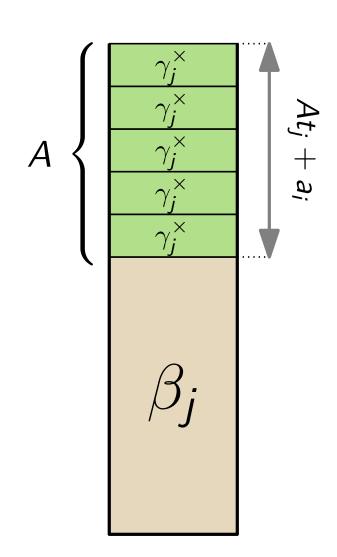
Machine M_i

- $\bullet \ p_{\gamma_j^0} = t_j$
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- $\Rightarrow \leq a_i$ jobs of type γ_i^1 per M_i



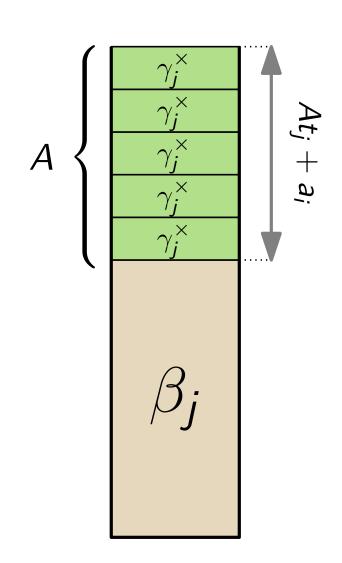
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Machine M_i

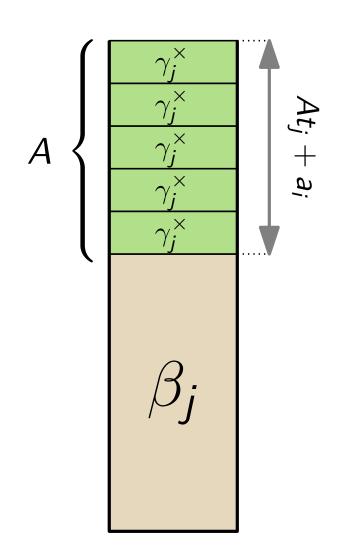
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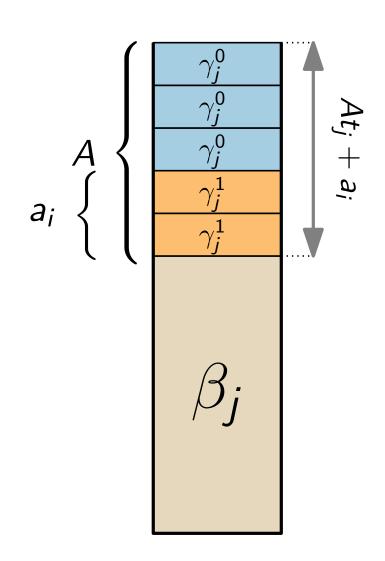
Machine M_i

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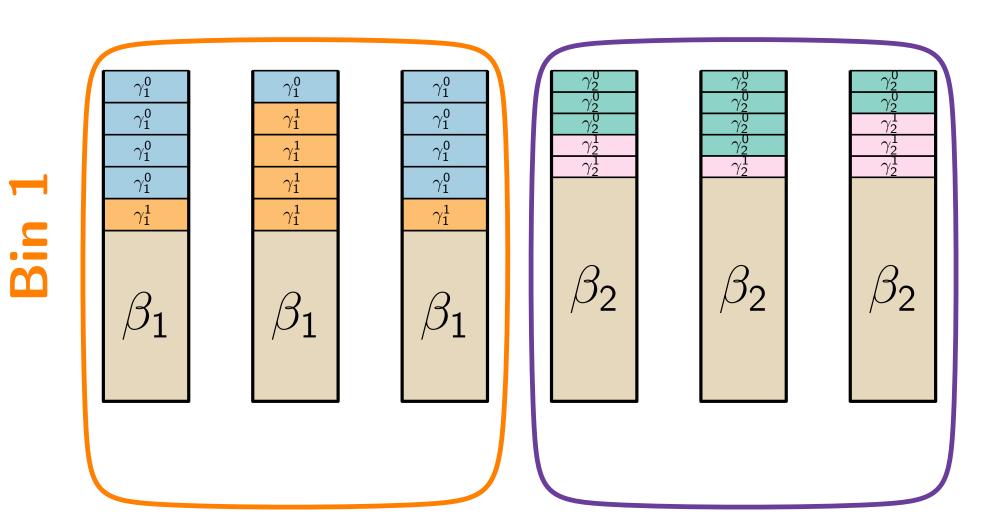
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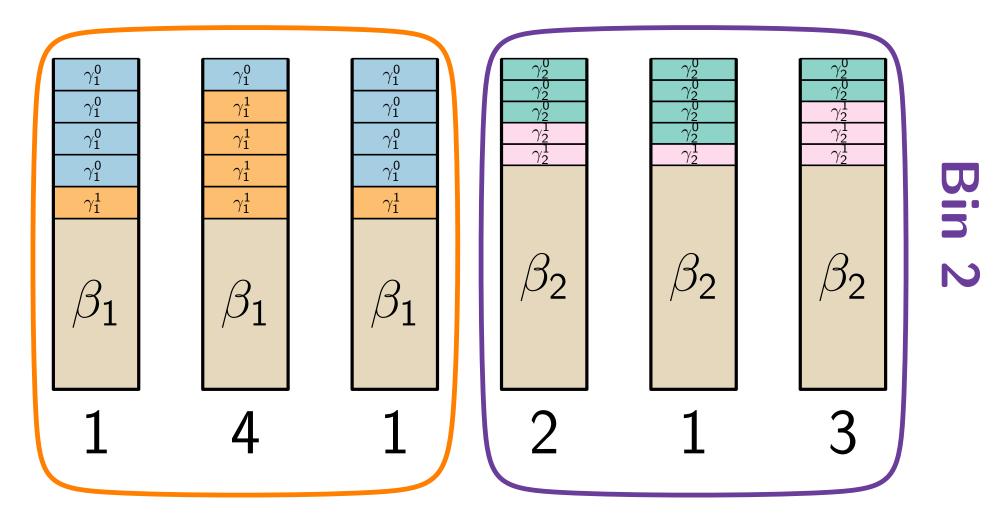
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Machine M_i



Bin 2



For k = 2 bins, BALANCED BIN PACKING is already NP-hard (\rightarrow PARTITION), there we use $2 \cdot 3 = 6$ job types.

 $Q|HM|C_{max}$ is NP-hard already for 6 job types.

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And with some small modifications of this reduction:

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CUTTING STOCK is NP-hard already with 8 item types.

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 $\{R,Q\}||C_{\max}$ is W[1]-hard parameterized by the number of job types even for unary input.

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 $\{R,Q\}||C_{\max}$ is W[1]-hard parameterized by the number of job types even for unary input.

Beside C_{max} , most of our hardness results also hold true for the objectives ℓ_2 and $\sum w_j C_j$.

Fixed-Parameter Tractability

 $P||C_{\max}$ is FPT parameterized by the number of job types k.

 $P||C_{\text{max}}|$ is FPT parameterized by the number of job types k.

Proof Idea:

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Proof Idea:

• Use algorithm by Goemans and Rothvoss, which has runtime $(\log p_{\max})^{f(k)} \cdot \operatorname{poly} \log(n)$

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But our vector p of processing times for jobs may contain large numbers!

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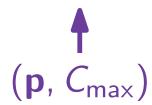
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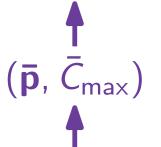
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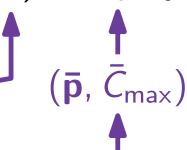
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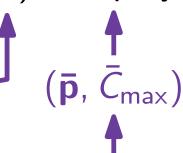
$$m$$
 (p, C_{max})

 $P||C_{\text{max}}$ is FPT parameterized by the number of job types k.

Proof Idea:

assignment of jobs to machines

• Use algorithm by Goemans and Rothvoss, which has runtime $(\log p_{\max})^{f(k)} \cdot \operatorname{poly} \log(n) \leq g(k) \cdot p_{\max}^{o(1)} \cdot \operatorname{poly} \log(n).$



FPT if the largest job size p_{max} is small

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$$m$$
 (**p**, C_{max})

<i>P</i>	$P HM \dots$	$Q HM \dots$	$R HM \dots$
C_{max}			

P: identical machines

Q: related machines

R: unrelated machines

HM: high multipl. jobs

C_{max}: min. makespan

 ℓ_2 : min. time under ℓ_2 -Norm

 $\sum w_j C_j$: min. sum of weighted completion times

	$P HM \dots$	$Q HM \dots$	$R HM \dots$
C_{max}			
max.			

P: identical machines

Q: related machines

R: unrelated machines

HM: high multipl. jobs

C_{max}: min. makespan

 ℓ_2 : min. time under ℓ_2 -Norm

 $\sum w_j C_j$: min. sum of weighted completion times

	$P HM \dots$	$Q HM \dots$	$R HM \dots$
C_{max}	poly. time for const. <i>k</i>		

P: identical machines

Q: related machines

R: unrelated machines

HM: high multipl. jobs

C_{max}: min. makespan

 ℓ_2 : min. time under ℓ_2 -Norm

 $\sum w_j C_j$: min. sum of weighted completion times

	$P HM \dots$	$Q HM \dots$	$R HM \dots$
C_{max}	poly. time for const. <i>k</i>		

P: identical machines

Q: related machines

R: unrelated machines

HM: high multipl. jobs

C_{max}: min. makespan

 ℓ_2 : min. time under ℓ_2 -Norm

 $\sum w_j C_j$: min. sum of weighted completion times



	$P HM \dots$	$Q HM \dots$	$R HM \dots$
C_{max}	poly. time for const. <i>k</i>		NP-hard for $k \ge 4$

P: identical machines

Q: related machines

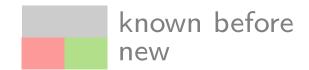
R: unrelated machines

HM: high multipl. jobs

C_{max}: min. makespan

 ℓ_2 : min. time under ℓ_2 -Norm

 $\sum w_j C_j$: min. sum of weighted completion times



	$P HM \dots$	$Q HM \dots$	$R HM \dots$	$P \dots $	$Q \dots$	$R \dots $
C_{max}	poly. time for const. <i>k</i>	NP-hard for $k \ge 6$	NP-hard for $k \ge 4$			

P: identical machines

Q: related machines

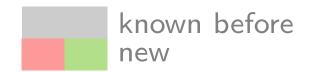
R: unrelated machines

HM: high multipl. jobs

C_{max}: min. makespan

 ℓ_2 : min. time under ℓ_2 -Norm

 $\sum w_j C_j$: min. sum of weighted completion times



	$P HM \dots$	$Q HM \dots$	$R HM \dots$	$P \dots $	$Q \dots $	$R \dots $
	poly. time	NP-hard for	NP-hard for	FPT		
C _{max}	for const. k	$k \geq 6$	$k \geq 4$	in <i>k</i>		

P: identical machines

Q: related machines

R: unrelated machines

HM: high multipl. jobs

C_{max}: min. makespan

 ℓ_2 : min. time under ℓ_2 -Norm

 $\sum w_j C_j$: min. sum of weighted completion times



	$P HM \dots$	$Q HM \dots$	$R HM \dots$	$P \dots$	$Q \dots$	$R \dots $
	poly. time	NP-hard for	NP-hard for	FPT	XP	XP
Cmax	for const. k	$k \geq 6$	$k \geq 4$	in <i>k</i>	in <i>k</i>	in <i>k</i>

P: identical machines

Q: related machines

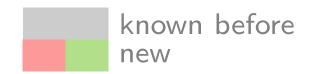
R: unrelated machines

HM: high multipl. jobs

C_{max}: min. makespan

 ℓ_2 : min. time under ℓ_2 -Norm

 $\sum w_j C_j$: min. sum of weighted completion times



	$P HM \dots$	$Q HM \dots$	$R HM \dots$	$P \dots$	$Q \dots$	$R \dots $
C_{max}	poly. time for const. <i>k</i>	NP-hard for				
	for const. K	$K \geq 0$	$k \geq 4$	in <i>K</i>	in K hard	in <i>k</i> hard

P: identical machines

Q: related machines

R: unrelated machines

HM: high multipl. jobs

C_{max}: min. makespan

 ℓ_2 : min. time under ℓ_2 -Norm

 $\sum w_j C_j$: min. sum of weighted completion times



	$P HM \dots$	$Q HM \dots$	$R HM \dots$	$P \dots$	$Q \dots$	$R \dots $
C_{max}		NP-hard for $k \ge 6$			XP W[1]in k hard	XP W[1]in k hard
ℓ_2	?	NP-hard for $k \ge 6$	NP-hard for $k \geq 7$?	XP W[1]- hard	XP W[1]- hard

P: identical machines

Q: related machines

R: unrelated machines

HM: high multipl. jobs

C_{max}: min. makespan

 ℓ_2 : min. time under ℓ_2 -Norm

 $\sum w_j C_j$: min. sum of weighted completion times



	$P HM \dots$	$Q HM \dots$	$R HM \dots$	$P \dots$	Q		R	
C_{max}	poly. time for const. <i>k</i>	NP-hard for $k \ge 6$	NP-hard for $k \ge 4$	FPT in <i>k</i>	XP in <i>k</i>	W[1]- hard	XP in <i>k</i>	W[1]- hard
ℓ_2	?	NP-hard for $k \ge 6$	NP-hard for $k \geq 7$?	ХP	W[1]- hard	XP	W[1]- hard
$\sum w_j C_j$?	?	NP-hard for $k \geq 7$?	ΧP	?	XP	W[1]- hard

P: identical machines

Q: related machines

R: unrelated machines

HM: high multipl. jobs

C_{max}: min. makespan

 ℓ_2 : min. time under ℓ_2 -Norm

 $\sum w_j C_j$: min. sum of weighted completion times



	$P HM \dots$	$Q HM \dots$	$R HM \dots$	$P \dots$	Q		R	
C_{max}	poly. time for const. <i>k</i>	NP-hard for $k \ge 6$	NP-hard for $k \ge 4$	FPT in <i>k</i>				
ℓ_2	?	NP-hard for $k \ge 6$	NP-hard for $k \ge 7$?	XP	W[1]- hard	XP	W[1]- hard
$\sum w_j C_j$?	?	NP-hard for $k \geq 7$?	XP	?	XP	W[1]- hard

Open Problems

P: identical machines

Q: related machines

R: unrelated machines

HM: high multipl. jobs

C_{max}: min. makespan

 ℓ_2 : min. time under ℓ_2 -Norm

 $\sum w_j C_j$: min. sum of weighted completion times



	$P HM \dots$	$Q HM \dots$	$R HM \dots$	$ P \dots$	Q		R	
C_{max}	poly. time for const. <i>k</i>		NP-hard for $k \ge 4$					W[1]- hard
ℓ_2	?		NP-hard for $k \geq 7$?	XP	W[1]- hard	XP	W[1]- hard
$\sum w_j C_j$?	?	NP-hard for $k \geq 7$?	ХP	?	XP	W[1]- hard

Open Problems

? above in the table

P: identical machinesQ: related machines

R: unrelated machines

HM: high multipl. jobs

C_{max}: min. makespan

 ℓ_2 : min. time under ℓ_2 -Norm

 $\sum w_j C_j$: min. sum of weighted completion times



	$P HM \dots$	$Q HM \dots$	$R HM \dots$	$ P \dots$	Q		R	
C_{max}		NP-hard for $k \ge 6$	NP-hard for $k \ge 4$			W[1]- hard		
ℓ_2	?	NP-hard for $k \ge 6$	NP-hard for $k \geq 7$?	ΧP	W[1]- hard	XP	W[1]- hard
$\sum w_j C_j$?	?	NP-hard for $k \geq 7$?	ХP	?	ХP	W[1]- hard

- ? above in the table
- Is it also NP-hard for fewer job types, e.g. k = 2 or 3?



	$P HM \dots$	$Q HM \dots$	$R HM \dots$	$ P \dots$	Q		R	
C_{max}	poly. time for const. <i>k</i>	NP-hard for $k \ge 6$	NP-hard for $k \ge 4$		XP in <i>k</i>	W[1]- hard	XP in <i>k</i>	W[1]- hard
ℓ_2	?		NP-hard for $k \geq 7$?	ХP	W[1]- hard	XP	W[1]- hard
$\sum w_j C_j$?	?	NP-hard for $k \geq 7$?	ХP	?	XP	W[1]- hard

- ? above in the table
- Is it also NP-hard for fewer job types, e.g. k = 2 or 3?
- Is $P|HM|C_{max}$ FPT in k or not?



	$P HM \dots$	$Q HM \dots$	$R HM \dots$	$ P \dots$	Q		R	
C_{max}	poly. time for const. <i>k</i>	NP-hard for $k \ge 6$	NP-hard for $k \ge 4$		XP in <i>k</i>	W[1]- hard	XP in <i>k</i>	W[1]- hard
ℓ_2	?		NP-hard for $k \geq 7$?	ХP	W[1]- hard	XP	W[1]- hard
$\sum w_j C_j$?	?	NP-hard for $k \geq 7$?	ХP	?	XP	W[1]- hard

- ? above in the table
- Is it also NP-hard for fewer job types, e.g. k = 2 or 3?
- Is $P|HM|C_{max}$ FPT in k or not?
- Consider more constraints & obj. (release/due times, tardiness, ...)



	$P HM \dots$	$Q HM \dots$	$R HM \dots$	$ P \dots$	Q		R	
C_{max}	poly. time for const. <i>k</i>	NP-hard for $k \ge 6$	NP-hard for $k \ge 4$					W[1]- hard
ℓ_2	?		NP-hard for $k \geq 7$?	ХP	W[1]- hard	XP	W[1]- hard
$\sum w_j C_j$?	?	NP-hard for $k \geq 7$?	ΧP	?	XP	W[1]- hard

- ? above in the table
- Is it also NP-hard for fewer job types, e.g. k = 2 or 3?
- Is $P|HM|C_{max}$ FPT in k or not?
- Consider more constraints & obj. (release/due times, tardiness, ...)
- Is CUTTING STOCK W[1]-hard when input is given in unary?