# Optima Localization for Scheduling Problems: Computer-Aided Approach

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# The lower bound and instances' properties

Let

$$F(x) \rightarrow \min$$

be some minimization problem,  $LB \leqslant F^*$  is the lower bound on the optimuim.

Interesting properties of instances in terms of LB:

- Polynomially solvable subcases, for which  $F^* = LB$ ;
- Approxination algorithms with ratio based on *LB*:

$$F(x_A) \leqslant \rho LB \leqslant \rho F^*$$
;

Optima localization.

### Optima localization

#### Definition

Tight optima localization interval for a class of instances  $\mathcal I$  of some minimization problem respective to some lower bound  $\mathit{LB}$  is the tightest possible interval of form

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#### Motivation

- Quality of lower bound LB.
- Upper bound on the approximation ratio for algorithms, based on LB.
- Otential for designing approximation algorithms with "best possible" approximation ratio (with respect to LB).

# Shop scheduling problems

### "General" problem settings

- A set of jobs  $\mathcal{J} = \{J_1, \ldots, J_n\}$ ,
- a set of machines  $\mathcal{M} = \{M_1, \dots, M_m\}$ ,
- each machine  $M_i$  performs single operation  $O_{ji}$  for each job  $J_j$ , processing times are given in advance

$$P = \begin{pmatrix} p_{11} & p_{21} & p_{31} & \dots & p_{n1} \\ p_{12} & p_{22} & p_{32} & \dots & p_{n2} \\ \vdots & \vdots & \vdots & & \vdots \\ p_{1m} & p_{2m} & p_{3m} & \dots & p_{nm} \end{pmatrix},$$

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 operations of the same job/machine cannot be performed simultaneously.

Standard lower bound on the makespan  $C_{max}$ :

$$SLB = \max_{i,j} \{\ell_i, d_j\} = \max_{i,j} \left\{ \sum_{j=1}^n p_{ji}, \sum_{i=1}^m p_{ji} \right\}.$$

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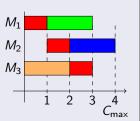
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### Critical instance for m = 3

$$\begin{pmatrix} 1 & 2 & 0 & 0 \\ 1 & 0 & 2 & 0 \\ 1 & 0 & 0 & 2 \end{pmatrix}, \textit{SLB} = 3.$$

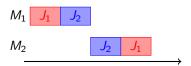


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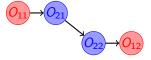
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The set of all possible early schedules contains an optimal one. An early schedule can be described with linear ordering of operations for each job and each machine.

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A schedule's template for a problem with m machines and n job is a partial order of operations, such that operations of each job and each machine are linearly ordered.

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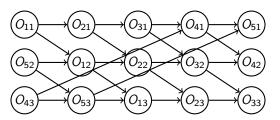
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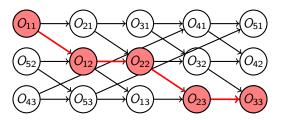
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$$SLB(I') = SLB(I) \iff \sum_{J_i \in K} d_j \leqslant SLB(I).$$

### Aggregation theorem

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Any instance I of an m-machine problem can be transformed by a series of aggregations into instance I' such that SLB(I') = SLB(I) and I' contains at most 2m-1 jobs.

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#### Proof

It is sufficient to show that we can always group the vaslues  $d_1, \ldots, d_n$  in at most 2m-1 groups such that total value of each group doesn't exceed SLB.

$$\sum_{j=1}^n d_j = \sum_{i=1}^m \ell_i \leqslant mSLB.$$

While  $n \ge 2m$ : consider m pairs of values  $d_j$ . The sum of at least one of those pairs is  $\le SLB$ .

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- Denote operations of the first (second) machine by  $a_j$  ( $b_j$ ), j = 1, 2, 3.

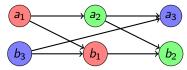
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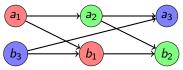
- Apply job aggregations to I to obtain an instance I' with at most three jobs, preserving SLB.
- Denote operations of the first (second) machine by  $a_j$  ( $b_j$ ), j = 1, 2, 3.
- Consider two cases:
  - either  $\forall j = 1, 2, 3 \, a_j \geqslant b_j$  (equivalently  $\forall j = 1, 2, 3 \, a_j \leqslant b_j$ )
  - or we have one false and two true inequalities (equivalently one true and two false).

• Case I:  $\forall j = 1, 2, 3 \ a_j \geqslant b_j$ . Without loss of generality  $a_3 = \max\{a_j\}$ .

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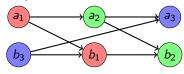


• Because of  $a_3 \geqslant a_2 \geqslant b_2$  and  $a_2 + a_3 \geqslant a_2 + a_1 \geqslant b_1 + b_2$ , the makespan doesn't exceed *SLB*.

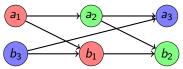
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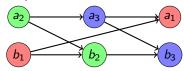
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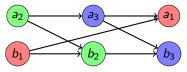
• As soon as  $a_1 \leqslant b_3$  and  $a_3 \geqslant b_3 \geqslant b_2$ , the makespan doesn't exceed *SLB*.

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• If  $\exists k | a_k + b_k = \bar{C}$ , then the following schedule is optimal:

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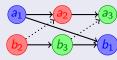
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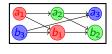




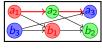
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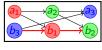


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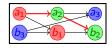
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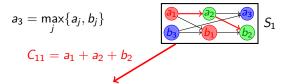
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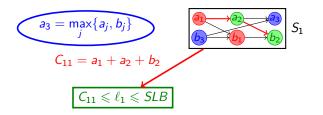


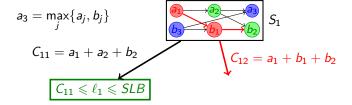
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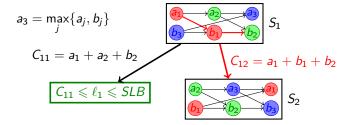
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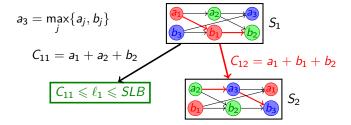


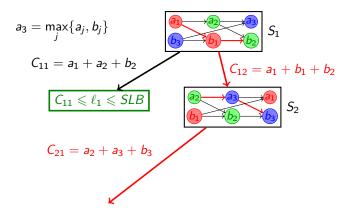


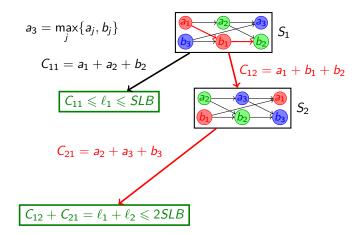


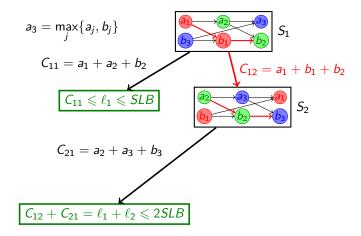


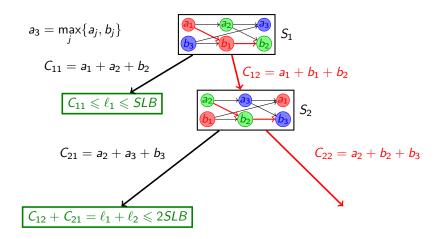


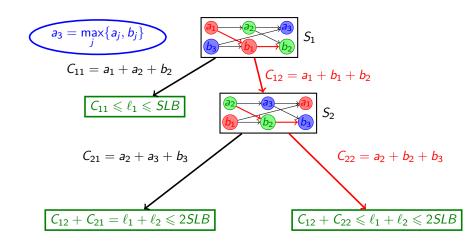






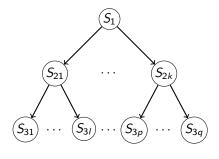






## A tree of proof

- Vertices (except sinks) are templates.
- Arcs correspond to variants of critical paths in the templates they leave.
- Sinks (terminal vertices)
   contain proofs, that at least
   one of the schedules, built
   according to the templates
   belonging to the path from
   the root to this sink is good
   enough.



#### Automation

- It is sufficient to consider instances with at most 2m-1 jobs.
- ② It is sufficient to consider instances with SLB = 1.
- Questions:
  - How to choose the next template when branching?
  - How to prove that no further branching is necessary?

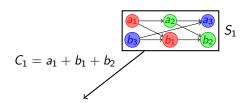
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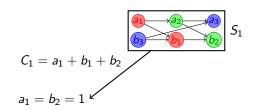
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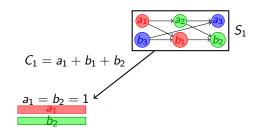
#### General ideas

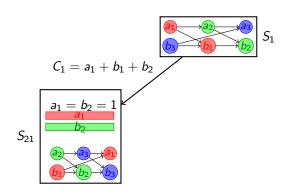
- Treat the branching as splitting of the set of instances. Now each node corresponds to a subset of instances.
- Find a critical instance in each subset (with maximal makespan for the subset).
- If the makespan if critical instance is good enough, we have the proof (for this vertex).
- Otherwise, choose the template that suits the critical instance the most.

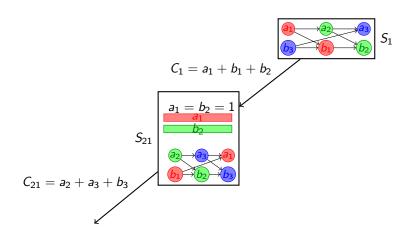


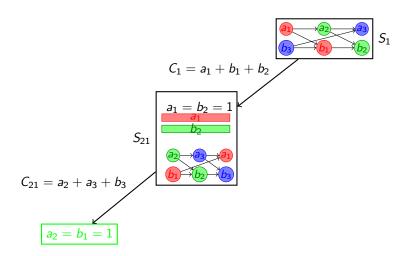


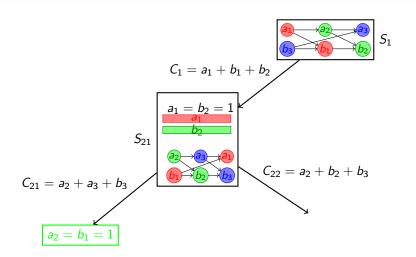


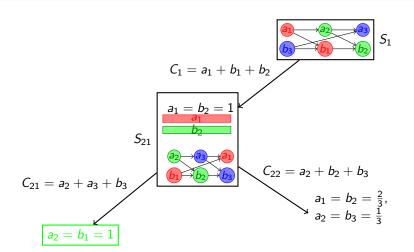


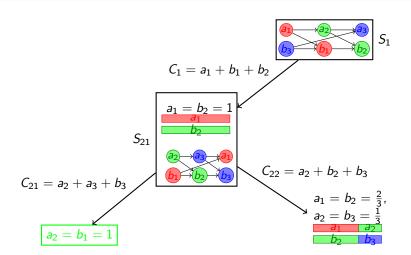




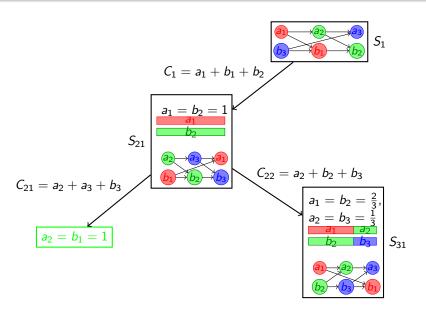








### Example (SLB = 1)



#### How to find a critical instance

#### Linear programming

- Nonnegative variables: processing times  $(a_j, b_j)$  and auxiliary variable  $\rho$ .
- Objective:  $\rho \to \max$ .
- Subject to:

$$\begin{cases} \ell_1 = a_1 + a_2 + a_3 \leqslant 1, \\ \ell_2 = b_1 + b_2 + b_3 \leqslant 1, \\ d_1 = a_1 + b_1 \leqslant 1, \\ d_2 = a_2 + b_2 \leqslant 1, \\ d_3 = a_3 + b_3 \leqslant 1, \\ C_1 = \sum_{O \in P_1} p(O) \geqslant \rho, \\ \dots \\ C_k = \sum_{O \in P_k} p(O) \geqslant \rho, \\ a_j, b_j, \rho \geqslant 0. \end{cases}$$

#### Further automation

#### How to choose the next templete

#### Possible variants:

- $\textbf{ Oritical instance} \to \text{optimal schedule} \to \text{partial order of the operations} \to \text{template}.$
- Create some pool of instances. Choose the best fitting the critical instance from the pool.

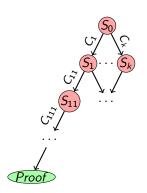
#### Optimization

- "Base" templates can be modified with application of permutations of jobs/machines.
- Introduce properties of an instance without loss of generality (e.g.,  $a_3 = \max\{a_i, b_i\}$ ).
- Split  $\mathcal{I}$  into subcases (by number of jobs, by total workload, ...)

### Verifying the proof constructed

- The proof is constructive.
- We need a verification for each terminal vertex.
- We could verify by solving the corresponding LP (for terminal vertices only).
- Faster approach: for each terminal vertex store an optimal solution of dual LP!

### The structure of the proof



- Vertices correspond to subsets of instances
- red vertices contain templates
- arcs, outcoming from red vertices, correspond to variants of critical paths in that templates. Each path is stored as a linear expression
- terminal (green) vertices contain proofs

### Algorithm: building the tree of proof

**Conjecture:** For any instance (with certain restrictions) there exists schedule S with makespan  $C_{\text{max}}(S) \leq \rho^* SLB$ .

- Given a set of templates  $S = \{S_0, \dots, S_N\}$ .
- For each template  $S_k$  the set  $\mathcal{P}(S_k)$  of possible critical paths is described.
- Root vertex:  $S := S_0$ . Current set of paths:  $Q = \emptyset$ .
- **3** For each  $P \in \mathcal{P}(S)$ :
  - **1**  $Q := Q \cup \{P\}.$
  - **②** Find a critical instance  $\tilde{I} = \arg \max_{I} \min_{P \in Q} P(I)$ .
  - If  $\min_{P \in Q} P(\tilde{I}) \leqslant \rho^*$ ,  $Q := Q \setminus \{P\}$ , continue to the next P, if any. Otherwise climb up to the previous vertex, continue to the next P.
  - Else
    - Find an improving template  $S \in \mathcal{S}$  for the instance  $\tilde{I}$ , Go to Step 2.
    - If improving template is not found, STOP, output the critical instance.
- Done!



### Algorithm: building the tree of proof

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- **Step 2 is this one!** For each  $P \in \mathcal{P}(S)$ :
  - $Q := Q \cup \{P\}.$
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  - $\textbf{9} \quad \text{If} \min_{P \in Q} P(\tilde{I}) \leqslant \rho^*, \ Q := Q \setminus \{P\}, \ \text{continue to the next $P$, if any.}$  Otherwise climb up to the previous vertex, continue to the next \$P\$.
  - Else
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    - If improving template is not found, STOP, output the critical instance.
- Done!



### Input files: model description

```
"M": 2.
"J": 3.
"params": 0,
"missed_vertexes": "",
"bounds": [
    [ "Lmax", "<", "1", "Lmax" ],
    [ "Dmax", "<", "1", "Dmax" ]
"expressions": [],
"hypothesis": "1",
"objective_augmentation": "",
"improvement_flag": true,
"Machines": [
    [ 1, 2 ]
"Jobs": [
    [ 1, 2, 3 ]
1}
```

```
"base": [
    "a1 a2 a3",
    "b2 b3 b1",
    "a1 b1",
    "b2 a2",
    "b3 a3"
```

```
"base": [
    "a1 a2 a3",
    "b2 b3 b1",
    "a1 b1",
    "b2 a2",
    "b3 a3"
```

```
a_1 \rightarrow a_2 \rightarrow a_3,

b_2 \rightarrow b_3 \rightarrow b_1,

a_1 \rightarrow b_1,

b_2 \rightarrow a_2,

b_3 \rightarrow a_3.
```

```
"base": [
    "a1 a2 a3",
    "b2 b3 b1",
    "a1 b1",
    "b2 a2",
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```

```
a_1 \rightarrow a_2 \rightarrow a_3,

b_2 \rightarrow b_3 \rightarrow b_1,

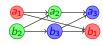
a_1 \rightarrow b_1,

b_2 \rightarrow a_2,

b_3 \rightarrow a_3.
```

```
"base": [
    "a1 a2 a3",
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    "a1 b1",
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    "b3 a3"
```

$$a_1 \rightarrow a_2 \rightarrow a_3, \ b_2 \rightarrow b_3 \rightarrow b_1, \ a_1 \rightarrow b_1, \ b_2 \rightarrow a_2, \ b_3 \rightarrow a_3.$$



$$\begin{cases} P_0: b_2 + a_2 + a_3, \\ P_1: b_2 + b_3 + b_1 \end{cases}$$

```
1 0 (0 1 2 )
2 0 0 [L1=1/2 L2=1/2 P_1=1/2 P_2=
     1/2 ]
3 0 1 (0 0 4 )
4 0 1 0 [L1=2/3 L2=1/3 P_1=1/3 P_
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5 0 1 1 [L1=1/2 L2=1/2 D3=0 P_2=1
     /2 P 3=1/2 ]
6 1 (0 1 2 )
7 1 0 (0 0 4 )
8 1 0 0 [L1=1/2 L2=1/2 D3=0 P 1=1
     /2 P_3=1/2
9 1 0 1 [L1=1/3 L2=2/3 P_1=1/3 P_
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10 1 1 (0 0 4 )
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12 1 1 1 [L1=1/2 L2=1/2 P_2=1/2 P_
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```

$$S_0 = S_{(0,0,0)}$$
  
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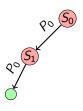
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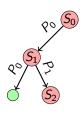
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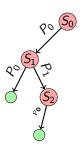
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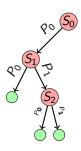
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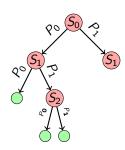
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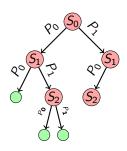


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12

$$S_0 = S_{(0,0,0)}$$
  
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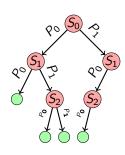


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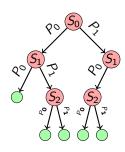


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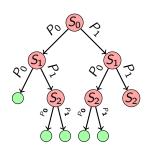


```
1 0 (0 1 2 )
2 0 0 [L1=1/2 L2=1/2 P_1=1/2 P_2=
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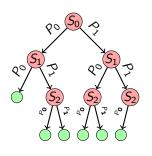


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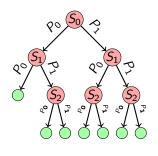


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     /2 P 3=1/2 ]
6 1 (0 1 2 )
7 1 0 (0 0 4 )
 1 0 0 [L1=1/2 L2=1/2 D3=0 P_1=1
     /2 P_3=1/2
9 1 0 1 [L1=1/3 L2=2/3 P_1=1/3 P_
     2=1/3 P_3=1/3 ]
10 1 1 (0 0 4 )
  1 1 0 [L1=1/2 L2=1/2 D3=0 P_1=1
11
     /2 P_3=1/2
```

1 1 1 [L1=1/2 L2=1/2 P\_2=1/2 P\_

12

$$S_0 = S_{(0,0,0)}$$
  
 $S_1 = S_{(0,1,2)}$   
 $S_2 = S_{(0,0,4)}$ 



#### Selected results

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$O3 \nu=2 C_{\sf max}$	[ <i>SLB</i> , 5/4 <i>SLB</i> ]
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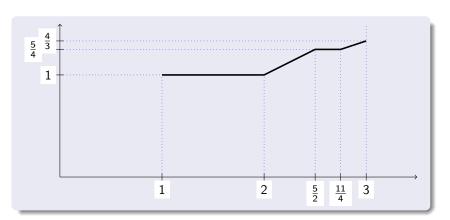
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#### Results

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- Optima localization for  $F4||C_{\text{max}}|$  (it is known, that upper bound of the interval is at least  $\frac{67}{32}$ )
- Sviridenko's conjecture: for any instance I of the  $O||C_{\max}$  problem  $C^*_{\max}(I) \leqslant SLB + p_{\max}$ .

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Questions?