## <span id="page-0-0"></span>Optima Localization for Scheduling Problems: Computer-Aided Approach

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Let

$$
F(x)\to \text{min}
$$

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:

 $F(x_A) \le \rho L B \le \rho F^*$ ;

• Optima localization.

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### Optima localization

### Definition

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

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OL_{LB}(\mathcal{I})=[LB,\rho ^{*}LB],
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guaranteed to contain optima of all instances from  $\mathcal{I}$ .

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#### **Motivation**

- **Q** Quality of lower bound LB.
- <sup>2</sup> Upper bound on the approximation ratio for algorithms, based on  $\overline{AB}$
- <sup>3</sup> Potential 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, \ldots, M_m\},\$
- each machine  $M_i$  performs single operation  $O_{ji}$  for each job  $J_j,$ processing times are given in advance

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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  $C_{\text{max}}$ :

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

## <span id="page-7-0"></span>Open shop problem

#### **Notation**

Open shop with m machines is denoted as  $Om||C_{\text{max}}$ . We denote the set of instances as  $\mathcal{I}_m$ .

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- $\bullet$  OL<sub>SLB</sub> $(\mathcal{I}_2) = [\mathcal{S} \mathcal{L} \mathcal{B}, \mathcal{S} \mathcal{L} \mathcal{B}]$  [Gonzalez, Sahni 1976],
- **3** OL $_{SLB}(\mathcal{I}_3) = [SLB, \frac{4}{3}SLB]$  [Sevastyanov, Ch 1998].

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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.

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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Job aggregation of a subset of jobs  $K$  of instance  $I$  is the following transformation  $I \rightarrow I'$ :

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\mathcal{J}(I')=\mathcal{J}(I)\setminus K\cup\{J_K\},\
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\forall i=1,\ldots,m \quad p_{K}i=\sum_{J_{j}\in K}p_{ji}.
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$$
SLB(I') = SLB(I) \iff \sum_{J_j \in K} d_j \leqslant SLB(I).
$$

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#### Theorem

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

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#### Gonzalez-Sahni theorem (1976)

For the problem  $O2||C_{\text{max}}$  the optimal makespan always coincides with SLB. Such (optimal) schedule can be built in  $O(n)$  time.

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

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- Denote operations of the first (second) machine by  $a_i$   $(b_i)$ ,  $j = 1, 2, 3.$
- **Consider two cases:** 
	- either  $\forall j = 1, 2, 3$   $a_j \geq b_j$  (equivalently  $\forall j = 1, 2, 3$   $a_j \leq b_j$ )
	- or we have one false and two true inequalities (equivalently one true and two false).

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

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

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• Case II:  $a_1 \leq b_1$ ,  $a_2 \geq b_2$ ,  $a_3 \geq b_3$ . Without loss of generality  $b_3 \geq b_2$ .

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- Case II:  $a_1 \leq b_1$ ,  $a_2 \geq b_2$ ,  $a_3 \geq b_3$ . Without loss of generality  $b_3 \geq b_2$ .
- Case IIa:  $b_3 \ge a_1$ .

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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.

- Case II:  $a_1 \leq b_1$ ,  $a_2 \geq b_2$ ,  $a_3 \geq b_3$ . Without loss of generality  $b_3 \geq b_2$ .
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### de Werra's algorithm (1989)

#### Algorithm

Ilya Chernykh [Computer-aided optima localization](#page-0-0) 14/30

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### de Werra's algorithm (1989)



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a_3=\max_j\{a_j,b_j\}
$$



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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

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

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#### General ideas

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

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# Example  $(SLB = 1)$



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#### Linear programming

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

 $\int \ell_1 = a_1 + a_2 + a_3 \leqslant 1,$  $\left| \begin{array}{c} \hline \ \hline \ \hline \ \hline \end{array} \right|$  $\begin{array}{c} \hline \end{array}$  $\ell_2 = b_1 + b_2 + b_3 \leqslant 1,$  $d_1 = a_1 + b_1 \leq 1,$  $d_2 = a_2 + b_2 \leq 1$ ,  $d_3 = a_3 + b_3 \leq 1$ ,  $C_1 = \sum$  $O \in P_1$  $p(O) \geqslant \rho$ . . .  $C_k = \sum$  $O \in P_k$  $p(O) \geqslant \rho$  $a_j, b_j, \rho \geqslant 0.$ 

#### How to choose the next templete

Possible variants:

- **O** Critical instance  $\rightarrow$  optimal schedule  $\rightarrow$  partial order of the  $operations \rightarrow template.$
- **2** 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.
- $\bullet$  Introduce properties of an instance without loss of generality (e.g.,  $a_3 = \max\{a_j, b_j\}.$
- Split  $\mathcal I$  into subcases (by number of jobs, by total workload, ...)

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- 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  $\mathcal{C}_{\mathsf{max}}(S) \leqslant \rho^* S L B$ .

- Given a set of templates  $S = \{S_0, \ldots, S_N\}$ .
- For each template  $S_k$  the set  $\mathcal{P}(S_k)$  of possible critical paths is described.
- **1** Root vertex:  $S := S_0$ . Current set of paths:  $Q = \emptyset$ .
- **2** For each  $P \in \mathcal{P}(S)$ :
	- $Q := Q \cup \{P\}.$
	- **2** Find a critical instance  $\tilde{l} = \arg \max \min P(l)$ . I P∈Q
	- **9** 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.
	- **a** Else
		- **O** Find an improving template  $S \in \mathcal{S}$  for the instance  $\tilde{I}$ , Go to Step 2.
		- **2** If improving template is not found, STOP, output the critical instance.
- **3** Done!

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# 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 ]
]}
```

```
{
  " base ": [
     \lfloor" a1 a2 a3",
       "b2 b3 b1",
       " a1 b1",
       " b2 a2",
        " b3 a3"
     ]
  ]
}
```
E.

医间周的



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

E.

医间周的



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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.
$$



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



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

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```
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_
     2=1/3 P_3=1/3 ]
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```
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```
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$$
\begin{array}{c} S_0=S_{(0,0,0)}\\ S_1=S_{(0,1,2)}\\ S_2=S_{(0,0,4)}\end{array}
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```
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K 로 시 (로 ) - 로 - 1

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


K 로 시 (로 ) - 로 - 1

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```

$$
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```
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5 0 1 1 [L1=1/2 L2=1/2 D3=0 P_2=1
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9 1 0 1 [L1=1/3 L2=2/3 P_1=1/3 P_
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      /2 P 3=1/2 ]
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$$
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```
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$$
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```
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경기 지경기



It is proved, that for any instance I of the  $O||C_{\text{max}}$  problem  $C_{\text{max}}^*(I) \le \Delta(I)/2$ , where  $\Delta(I) \doteq \sum \ell_i$  — total instance load.

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 $\mathbf{A} \times \mathbf{B}$ 



- It is proved, that for any instance I of the  $O||C_{\text{max}}$  problem  $C_{\text{max}}^*(I) \le \Delta(I)/2$ , where  $\Delta(I) \doteq \sum \ell_i$  — total instance load.
- Exact form of the functional dependancy of the upper bound of optima localization interval on the total instance load for  $O3||C_{\text{max}}$ .

#### **Results**

Exact form of the functional dependancy of the upper bound of optima localization interval on the total instance load for  $O3||C_{\text{max}}$ 



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 $\bullet$  Optima localization for  $O4||C_{\text{max}}$  (it is unknown, if an instance I with  $C_{\text{max}}^*(I) > \frac{4}{3} SLB$  exists)

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- $\bullet$  Optima localization for O4||C<sub>max</sub> (it is unknown, if an instance I with  $C_{\text{max}}^*(I) > \frac{4}{3} SLB$  exists)
- Optima localization for  $F4|prmu|C_{\text{max}}$  (conjecture:  $[SLB, \frac{13}{6} SLB])$

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- $\bullet$  Optima localization for O4||C<sub>max</sub> (it is unknown, if an instance I with  $C_{\text{max}}^*(I) > \frac{4}{3} SLB$  exists)
- Optima localization for  $F4|prmu|C_{\text{max}}$  (conjecture:  $[SLB, \frac{13}{6} SLB])$
- Optima localization for  $F4||C_{\text{max}}$  (it is known, that upper bound of the interval is at least  $\frac{67}{32}$ )
- Optima localization for  $O4||C_{\text{max}}$  (it is unknown, if an instance I with  $C_{\text{max}}^*(I) > \frac{4}{3} SLB$  exists)
- Optima localization for  $F4|prmu|C_{\text{max}}$  (conjecture:  $[SLB, \frac{13}{6} SLB])$
- $\bullet$  Optima localization for F4||C<sub>max</sub> (it is known, that upper bound of the interval is at least  $\frac{67}{32}$ )
- Sviridenko's conjecture: for any instance I of the  $O||C_{\text{max}}$ problem  $C^*_{\text{max}}(I) \leqslant SLB + p_{\text{max}}$ .

**Barbara** 

# Thank you for attention!

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# Thank you for attention!

Questions?

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**Barbara**