



# On problems and methods of coordinated scheduling and location

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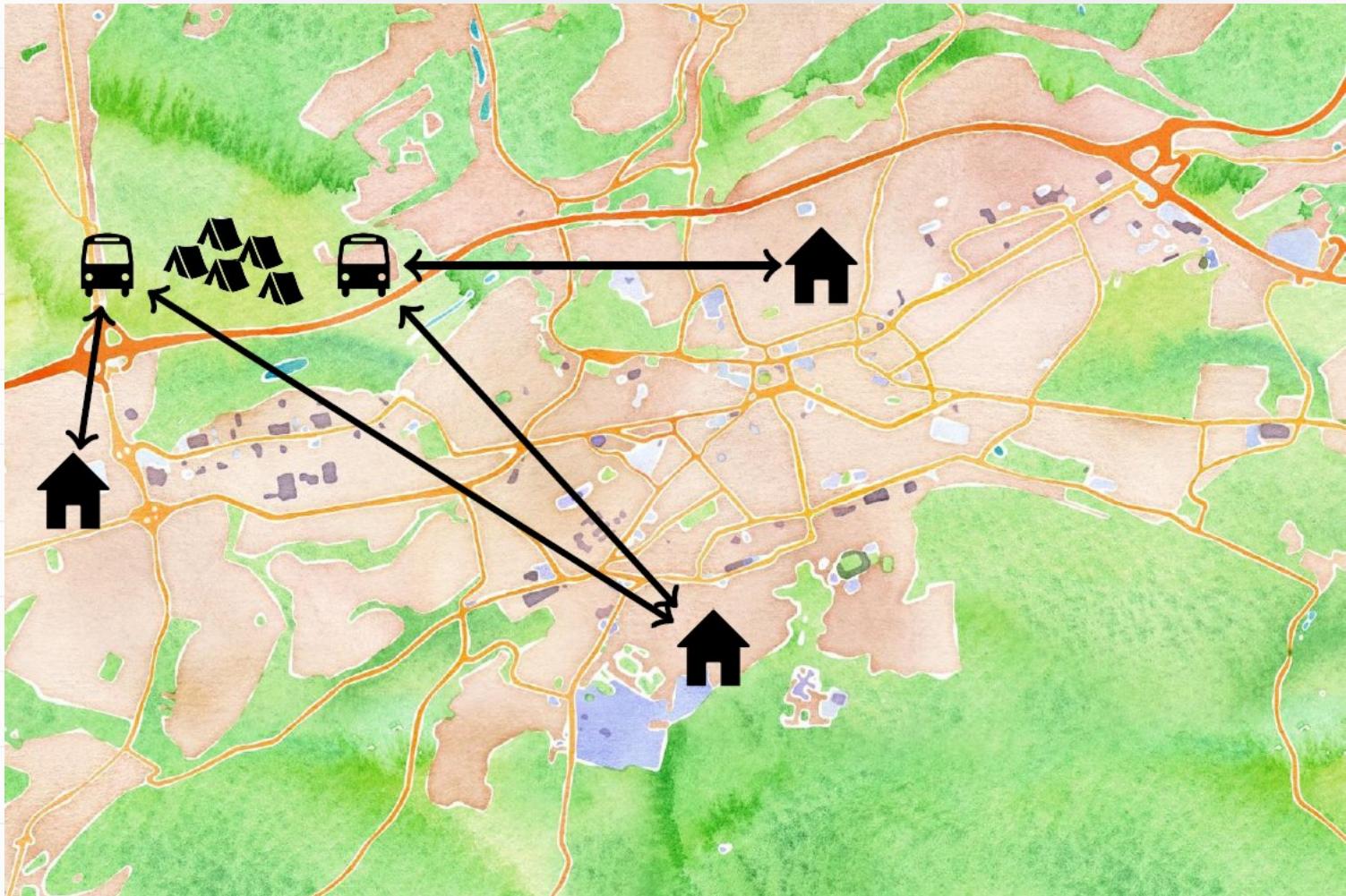
## Agenda

1. Motivation
2. Scheduling sub-problem
3. Location sub-problem
4. Coordinated scheduling and location (ScheLoc)
5. Optimization schemes for ScheLoc
6. Selected results
7. Other cases and final remarks

## Motivation (1/2)

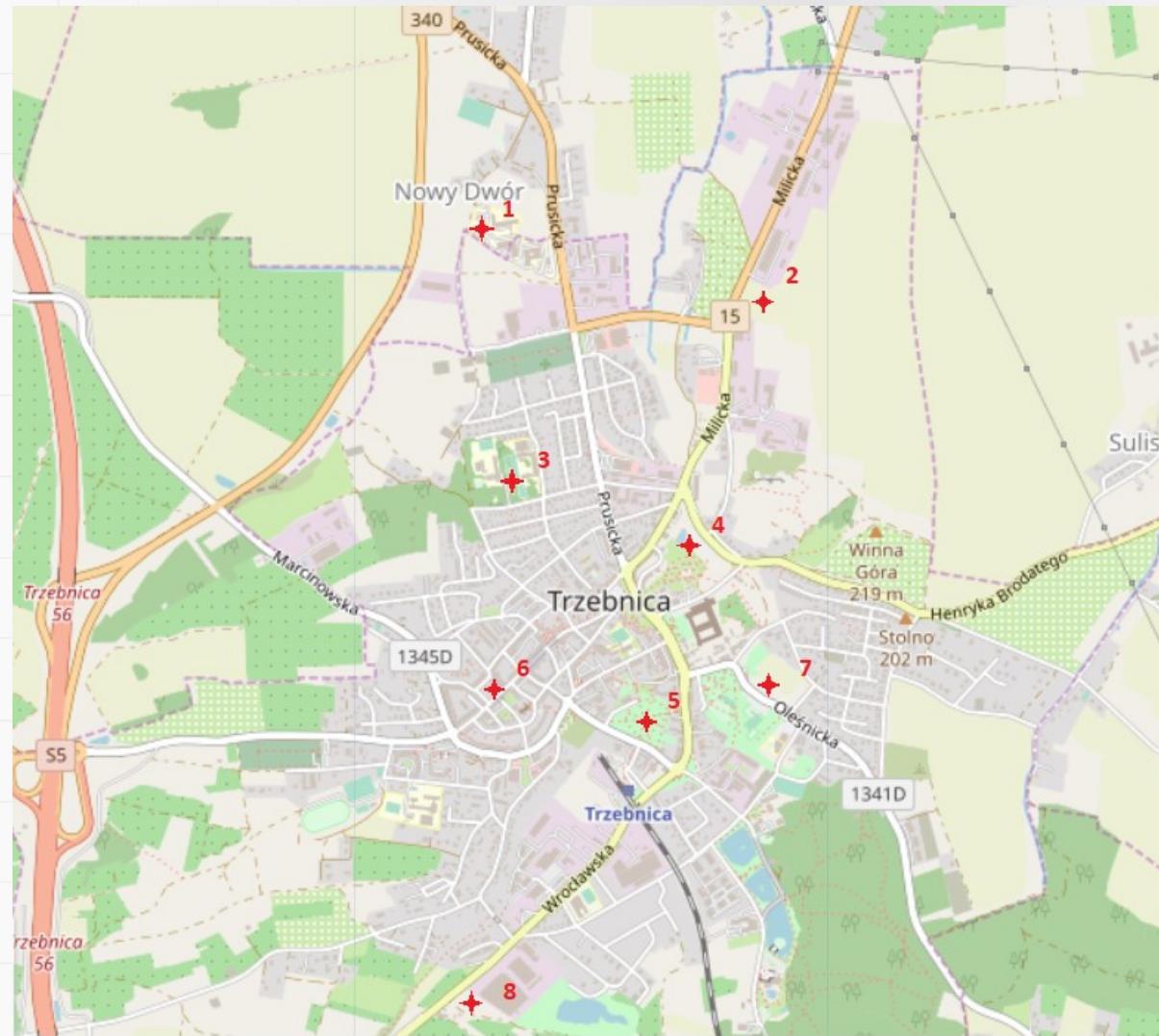
### Applications:

- Loading/unloading of ships at an embankment
- Planning of evacuation from danger zones





## Motivation (2/2)





## Scheduling sub-problem

### Scheduling of jobs on parallel machines

$J = \{J_1, J_2, \dots, J_j, \dots, J_n\}$  – set of  $n$  jobs

$M = \{M_1, M_2, \dots, M_i, \dots, M_m\}$  – set of  $m$  machines

$\sigma \in D_\sigma$  – schedule

$p = [p_{ij}]_{\substack{i=1, m \\ j=1, n}}$  – processing times

$w = [w_j]_{j=1, n}$  – weights

$r = [r_j]_{j=1, n}$  – release dates

$d = [d_j]_{j=1, n}$  – due dates

$A_S = (p, d, w, r)$  – sequence of parameters

$[C_j(\sigma; A_S)]_{j=1, n}$  – completion times of jobs

$\bar{Q}_S([C_j(\sigma; A_S)]_{j=1, n}) \sqcap Q_S(\sigma; A_S)$  – job scheduling criteria

**Sub-problem PS**

$$\min_{\sigma \in D_\sigma} Q_S(\sigma; A_S)$$



## Location sub-problem (1/2)

### Location of machines

$a = [a_j]_{j=1,\overline{n}}$  – given locations of jobs

$x = [x_i]_{i=1,\overline{m}}$  – sought locations of machines

$v = [v_j]_{j=1,\overline{n}}$  – speeds of job movements

$c = [c_{ij}]_{\substack{i=1,\overline{m} \\ j=1,n}}$  – unit movement/transportation costs

$g = [g_i]_{i=1,\overline{m}}$  – unit location/investment costs

$A_L = (a, v, c, g)$  – sequence of parameters

**Sub-problem PL**     $\min_{x \in D_x} Q_L(x; A_L)$     (*mainly, location and/or movement costs*)

where  $D_x$  represents available machines' positions taken from the discrete or continuous area



## Location sub-problem (2/2)

$r_{ij}(x_i) = \rho_j + v_j^{-1}d(a_j, x_i)$  – generalized release dates, where  $d(\cdot)$  – distance

$$D_\sigma \rightarrow D_{\sigma x} \quad Q_s(\sigma; A_s) \rightarrow Q_{SL}(\sigma, x; A_s)$$

$\alpha | \beta | \gamma | \delta$  – extended Graham's notation

$$\beta: r_j - V, \quad r_j^- \leq r_j \leq r_j^+$$

- |           |            |   |
|-----------|------------|---|
| $\delta:$ | – UFLP     | <i>(full UFLP)</i>  |
|           | – UFLP_T   | <i>(UFLP with the restriction to a transportation cost)</i> |
|           | – UFLP_I   | <i>(UFLP with the limitation to an investment cost)</i>     |
|           | – P_MEDIAN | <i>(p-median problem)</i>                                   |
|           | – CFLP     | <i>(facility location with continuous location area)</i>    |



# Coordinated scheduling and location /ScheLoc/ (1/2)

Table 1. The track record on coordinated scheduling-location

$1   r_j - V   C_{\max}   \text{UFLP\_T}$	Hennes and Hamacher (2002)
$1   r_j - V   C_{\max}   \text{CFLP}$	Elvikis et al. (2009), Kalsch and Drezner (2010)
$1   p_j = p, r_j - V   C_{\max}   \text{CFLP}$	Kalsch and Drezner (2010)
$P   r_j - V   C_{\max}$	Rajabzadeh et al. (2016)
$P   r_j - V   C_{\max}   \text{UFLP\_T}$	Hessler and Deghdak (2017)
$P   r_j - V   \sum C_j   \text{CFLP}$	Piasecki (2018), Piasecki and Józefczyk (2018)
$R   r_j - V   C_{\max}   \text{P\_MEDIAN}$	Ławrynowicz and Józefczyk (2019)
$R   r_j - V   C_{\max}$	Ławrynowicz and Józefczyk (2019)
$P   r_j - V   \sum C_j   \text{UFLP\_I}$	Filcek et al. (2020)



## Coordinated scheduling and location /ScheLoc/ (2/2)

1. Hennes H., Hamacher H. Integrated Scheduling and Location Models: Single Machine Makespan Problems. Report in Wirtschaftsmathematik 82, Univ. of Kaiserslautern, 2002
2. Elvikis D., Hamacher H. W., Kalsch M. T. Simultaneous scheduling and location (ScheLoc): The planar ScheLoc makespan problem. *Journal of Scheduling* 12 (4), 2009, 361-374
3. Kalsch M. T., Drezner Z. Solving scheduling and location problem in the plane simultaneously. *Computers & Operations Res.* 37(2), 2010, 256-264.
4. Rajabzadeh M., Ziaeefard M., Bozorgi-Amiri A. Integrated approach in solving parallel machine scheduling and location (ScheLoc) problem. *International Journal of Industrial Engineering Computations* 7(4), 2016
5. Hessler, C.J., Deghdak, K. (2017) Discrete parallel machine makespan ScheLoc problem, *Journal of Combinatorial Optimization*, 34(4), 1159-1186.
6. Piasecki B., Józefczyk J. (2018) Evolutionary algorithm for joint task scheduling and deployment of executors, In: *Automation of Discrete Processes. Theory and Applications* (in Polish), Silesian University of Technology, 1, 169-178.
7. Liu M., Liu X., Zhang E., Chu F., Chu Ch. (2019) Scenario-based heuristic to two-stage stochastic program for the parallel machine ScheLoc problem, *International Journal of Production Research*, 57(6), 1706-1723.
8. Ławrynowicz M., Józefczyk J (2019) A memetic algorithm for the discrete scheduling-location problem with unrelated executors; Proc. of 24<sup>th</sup> Int. Conf. on Models and Methods in Automation and Robotics MMAR, Międzyzdroje, Poland, August 26-29 (in press).

# Optimization schemes for ScheLoc (1/9)

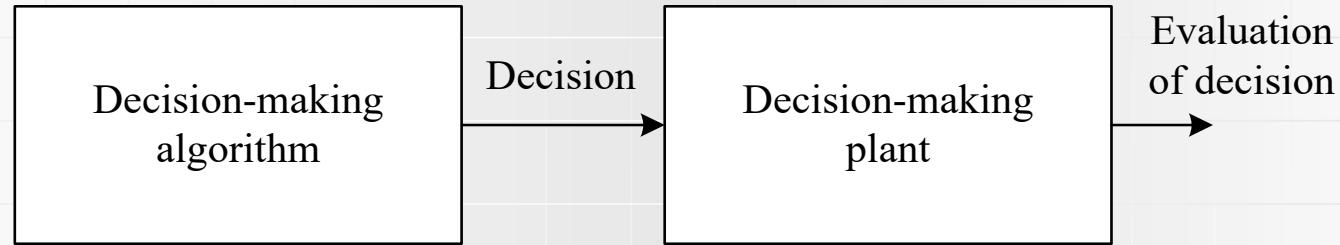


Fig.1 Decision-making system

## Decision-making problem

*Given:*

- model of a decision-making plant
- requirement for a result of a decision (evaluation of a decision)

*Determine:*

- decision fulfilling a requirement

## Optimization schemes for ScheLoc: /S\_Seq/ (2/9)

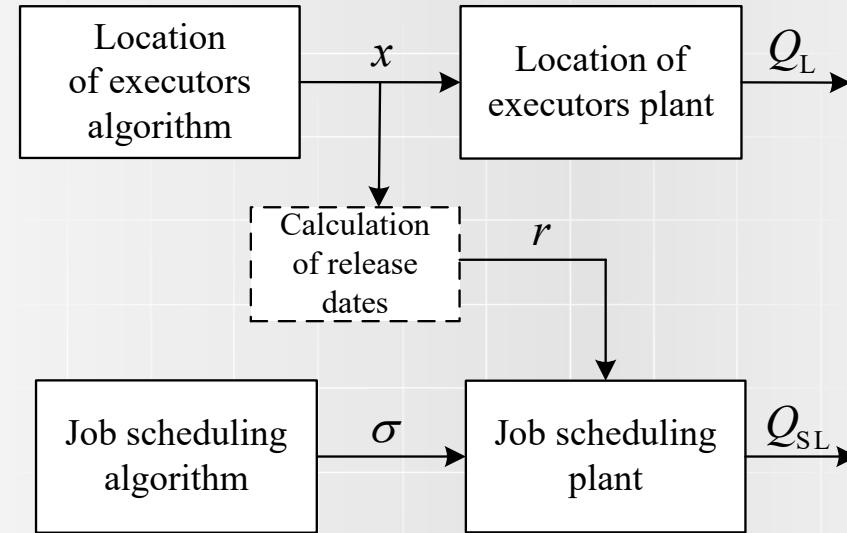


Fig. 2 Sequential approach for solving ScheLoc /S\_Seq/



## Optimization schemes for ScheLoc: /S\_Seq/ (3/9)

Sequential optimization scheme S\_Seq

**Require:**  $J, M, A_S, A_L, D_{\sigma x}, D_x$

**Ensure:**  $\tilde{x}, \tilde{\sigma}, \tilde{Q}_L \sqsubseteq Q_L(\tilde{x}; A_L), \tilde{Q}_{SL} \sqsubseteq Q_{SL}(\tilde{\sigma}, \tilde{x}; A_S),$

1. Solve the locational problem  $\min_{x \in D_x} Q_L(x; A_L)$  to obtain  $\tilde{x}$  and  $\tilde{Q}_L$ .
2. Calculate  $r_{ij} = \rho_j + v_j^{-1} d(a_j, \tilde{x}_i), i = \overline{1, m}, j = \overline{1, n}.$
3. Set the release dates of jobs using the selected operator  $\Phi$  to have  $r_j = \Phi(r_{1j}, \dots, r_{mj})$ .
4. Solve the job scheduling problem with different release dates  $r_j \min_{\sigma \in D_{\sigma x}} Q_{SL}(\sigma, \tilde{x}; A_S)$  to determine  $\tilde{\sigma}$  and  $\tilde{Q}_{SL}.$

## Optimization schemes for ScheLoc: /S\_Jnt/ (4/9)

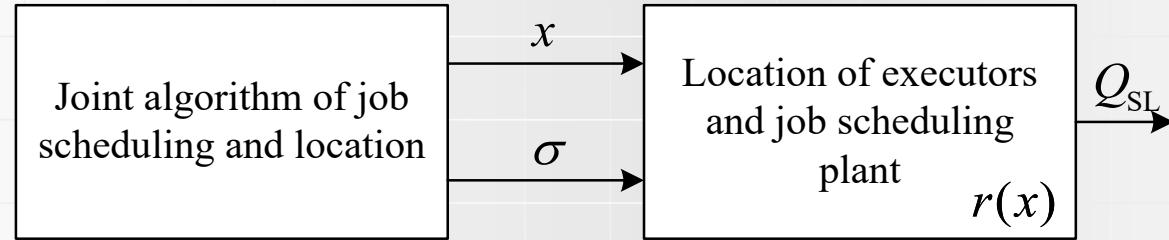


Fig. 3 Joint approach for solving Schec with an only criterion  $Q_{SL}$  /S\_Jnt/



## Optimization schemes for ScheLoc: /S\_Jnt/ (5/9)

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### Joint optimization scheme S\_Jnt

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**Require:**  $J, M, A_s, A_L, D$

**Ensure:**  $\hat{\sigma}, \hat{x}, \hat{Q}_{SL} \sqsupseteq Q_{SL}(\hat{\sigma}, \hat{x}; A_s)$

1. Solve the joint scheduling-location problem  $\min_{(\sigma,x) \in D} Q_{SL}(\sigma, x; A_s)$  to obtain  $\hat{\sigma}, \hat{x}$ , and  $\hat{Q}_{SL}$ .
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## Optimization schemes for ScheLoc: /S\_Jnt\_B/ (6/9)

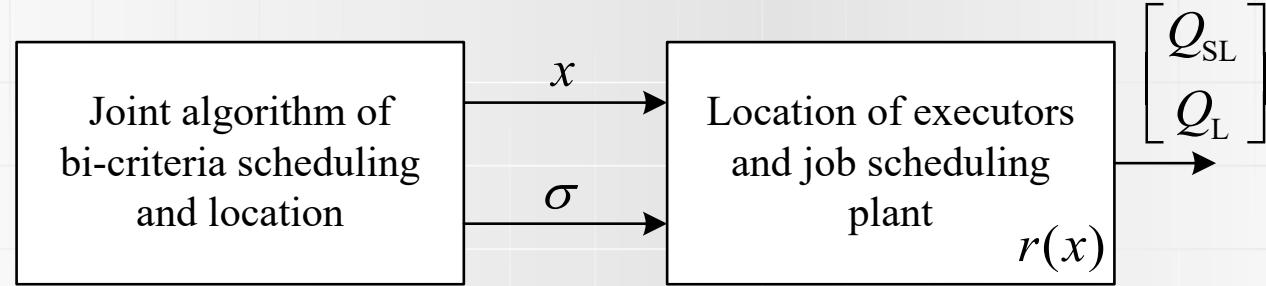


Fig. 4 Bi-criteria joint approach for solving ScheLoc /S\_Jnt\_B/



## Optimization schemes for ScheLoc: /S\_Jnt\_B/ (7/9)

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Joint bi-criteria optimization scheme S\_Jnt\_B

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**Require:** J, M, A<sub>S</sub>, A<sub>L</sub>, D

**Ensure:** Set of  $\lambda$  pairs of decisions  $\text{Arg}_{\text{PF}} = \{(\sigma_l^*, x_l^*): l = \overline{1, \lambda}\}$  and corresponding Pareto front

$$\text{PF} = (Q_l^* \sqcup [Q_{\text{SL},l}^*, Q_{\text{L},l}^*]^T : Q_{\text{SL},l-1}^* < Q_{\text{SL},l}^*, l = \overline{2, \lambda}).$$

1. Solve the joint scheduling-location problem  $\min_{(\sigma,x) \in D} \begin{bmatrix} Q_{\text{SL}}(\sigma, x; A_S) \\ Q_L(x; A_L) \end{bmatrix}$  to have  $\text{Arg}_{\text{PF}}$  and PF.
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# Optimization schemes for ScheLoc: /S\_Unc/ (8/9)

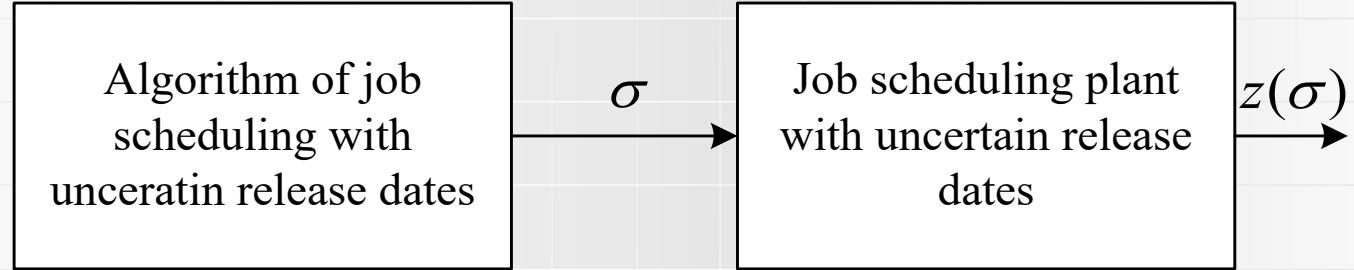


Fig. 5 Uncertain approach for solving ScheLoc – addressing as an uncertain version of PS /S\_Unc/



## Uncertain optimization scheme S\_Unc

**Require:** J, M, A<sub>S</sub>, D<sub>σ</sub>, R

**Ensure:** σ'', r<sup>σ</sup>, z(σ''), Q<sub>S</sub>(σ'', r<sup>σ</sup>) ⊓ Q<sub>S</sub>''

1. Solve  $\min_{\pi \in D_\pi} \hat{Q}_S(\pi, r)$  to have  $Q'_S(r)$ .
2. Obtain the worst-case scenario as  $r^\sigma = \arg \max_{r \in R} [\hat{Q}_S(\sigma, r) - Q'_S(r)]$  and calculate  $z(\sigma) = \hat{Q}_S(\sigma, r^\sigma) - Q'_S(r^\sigma)$ .
3. Solve  $\min_{\sigma \in D_\sigma} z(\sigma)$  to obtain σ'', z(σ''), and Q<sub>S</sub>''.



## Selected results: Case P | $r_j$ - V | $\sum C_j$ | UFLP\_I (1/4)

Filcek G., Józefczyk J., Ławrynowicz M. (2020) An evolutionary algorithm for joint bi-criteria location-scheduling problem. *International Journal of Industrial Engineering Computations* (accepted)

discrete locations, the Euclidean distances

$\mu$  locations ready for deploying  $m$  machines

$$\text{A}_L = (a, v, g)$$

$$Q_{SL}(\sigma, x; A_S) \rightarrow Q_{SL}(s, x; A_S) = \sum_{i=1}^{\mu} \sum_{k=1}^n x_i C_{ik}(s, x)$$

s.t.

$$1 \leq \sum_{i=1}^{\mu} x_i \leq \mu,$$

$$\sum_{i=1}^{\mu} \sum_{k=1}^n s_{jik} = 1, \quad j = 1, 2, \dots, n,$$

$$\sum_{j=1}^n s_{jik} \leq x_i, \quad i = 1, 2, \dots, \mu, \quad k = 1, 2, \dots, n,$$

$$C_{ik}(s, x) \geq \sum_{j=1}^n (r_j + p_j) s_{jik}, \quad i = 1, 2, \dots, \mu, \quad k = 1, 2, \dots, n,$$

$$C_{ik}(s, x) \geq C_{i,k-1}(s, x) + \sum_{j=1}^n p_j s_{jik}, \quad i = 1, 2, \dots, \mu, \quad k = 2, 3, \dots, n$$



# Selected results: Case $P \mid r_j - V \mid \sum C_j \mid \text{UFLP\_I}$ (2/4)

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## Algorithm ALG\_BC

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**Require:** Data of BC\_ScheLoc:  $J, B, A, \mu, p_j, \rho_j, v_j, c_i$ , and parameters of the algorithm:  $\varphi_m, \varphi_c, \alpha_i, \bar{\alpha}, \tilde{\alpha}, \Gamma, \Gamma_{\max}$ .

**Ensure:** Set of non-dominated solutions  $S_{PF}$  and the Pareto front PF.

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1:  $i := 1, z := 1, \tilde{z} := 1, S_M(iz) := \emptyset$ 
2: while  $i \leq \mu$  do
3:   Generate the initial population  $S_i$  of  $\alpha_i$  solutions for exactly  $i$  executors and set  $\bar{S}_i(0) := \emptyset$ 
4:   while  $iz < \Gamma_{\max}$  or  $\tilde{z} < \Gamma$  do
5:     Perform a non-dominated sorting and crowding-distance assignment.
6:     Use a crowded comparison operator for a selection.
7:     Generate the set  $\bar{S}_i(z)$  of offsprings using the crossover (CPC-2/OX2) and mutation
       (SIM/SM) operators.
8:     for each  $l$  th element in  $\bar{S}_i(z)$  that is non-dominated by any element in  $S_M(iz)$  do
9:        $S_M(iz) := S_M(iz) \cup \bar{E}_{il}(z)$ 
10:      end for
11:      if  $|\bar{S}_i(z)| = |\bar{S}_i(z-1)|$  then  $\tilde{z} := \tilde{z} + 1$  else  $\tilde{z} := 1$  end if
13:      if  $\Gamma_{\max} \bmod z = 0$  or  $\tilde{z} := \Gamma$  then set  $i := i + 1, z := 1$  and go to 2, end if
16:    end while
17:  Set  $z := z := z + 1$ .
18: end while
19: return  $S_{PF} = \left\{ \left( x_{PF,l} = f_x(E_{L,l}), y_{PF,l} = f_y(E_{Lu}) \right), l = 1, 2, \dots, L(iz) \right\}$ 
           and  $PF = \left( \left( q^{(1)}(x_{PF,l}, y_{PF,l}), q^{(2)}(y_{PF,l}) \right) \sqsubseteq (q_l^{(1)}, q_l^{(2)}) : q_{l-1}^{(1)} < q_l^{(1)}, l = 1, 2, \dots, L(iz) \right)$ 

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## Selected results: Case $P \mid r_j - V \mid \sum C_j \mid \text{UFLP\_I}$ (3/4)

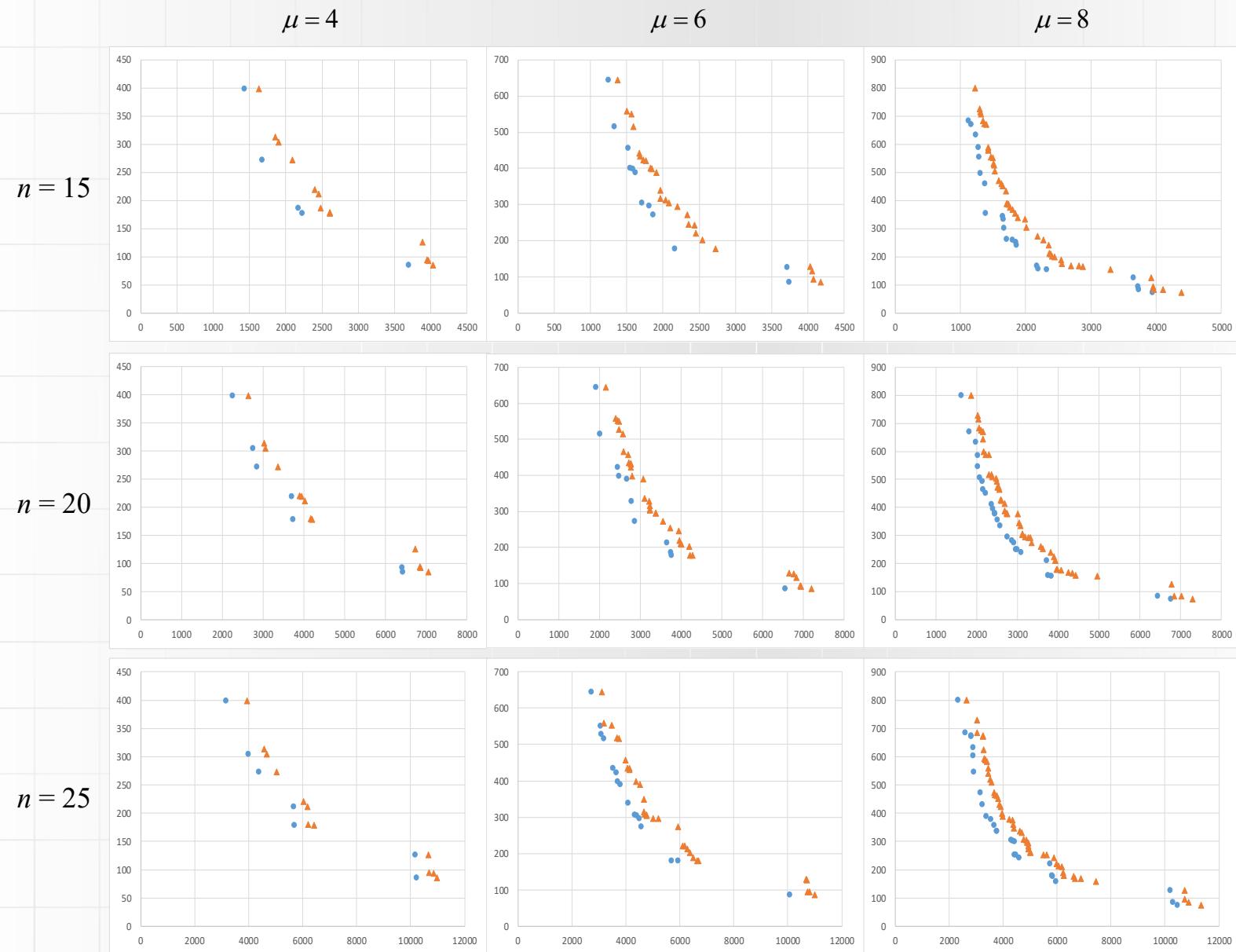
Table 2 Dependence of  $Q_{\text{SL,d}}^*$ ,  $Q_{\text{L,d}}^*$  and  $Dist$  on  $n$  and  $\mu$  for both algorithms

$(n, \mu)$	$Q_{\text{SL},l}^*$	$Q_{\text{L},l}^*$	$Q_{\text{SL},l}^{\text{NS}}$	$Q_{\text{L},l}^{\text{NS}}$	$Dist^*$	$Dist^{\text{NS}}$	$Dist^{\text{NS}} / Dist^*$
(10, 4)	266.776	182	<b>266.776</b>	<b>182</b>	322.945	<b>322.945</b>	1.000
(15, 4)	432.052	285	<b>432.052</b>	<b>285</b>	517.584	<b>517.584</b>	1.000
(20, 4)	596.663	385	624.574	<b>385</b>	710.093	733.701	1.033
(25, 4)	866.800	385	956.164	<b>385</b>	948.455	1030.765	1.087
(10, 6)	265.559	177	<b>265.559</b>	<b>177</b>	319.140	<b>319.140</b>	1.000
(15, 6)	406.760	257	448.850	<b>257</b>	481.147	517.218	1.075
(20, 6)	458.741	406	477.497	452	612.600	725.684	1.185
(25, 6)	611.681	452	716.951	536	760.564	911.585	1.199

$Dist$  – distance between  $(0,0)$  and Pareto front  $/(Q_{\text{SL},l}, Q_{\text{L},l})/$

NS – NSGS II-based algorithm

# Selected results: Case P | $r_j - V$ | $\sum C_j$ | UFLP\_I (4/4)



## Selected results: Cases $R | r_j - V | C_{\max} | P\_MEDIAN$ and $R | r_j - V | C_{\max}$ (1/5)

Ławrynowicz M. and Józefczyk J (2019) A memetic algorithm for the discrete scheduling-location problem with unrelated executors; *Proc. of 24<sup>th</sup> Int. Conf. on Models and Methods in Automation and Robotics MMAR*. Międzyzdroje. Poland, August, 26-29.

$R | r_j - V | C_{\max} | P\_MEDIAN \rightarrow \text{Scheme S\_Seq}$

discrete locations, the Euclidean distances

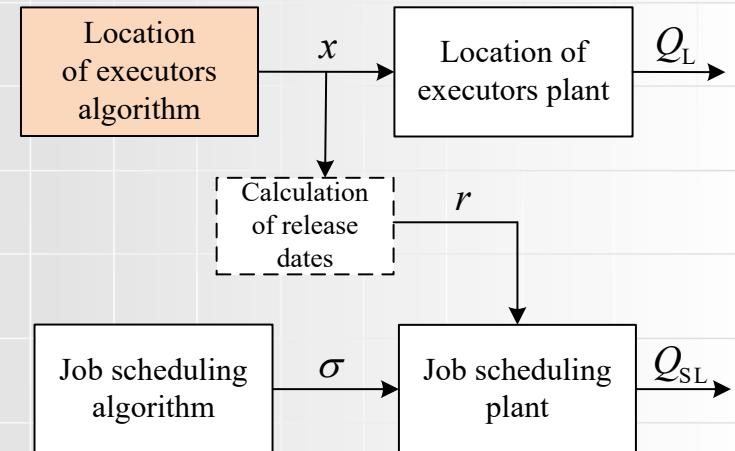
$\mu$  locations ready for deploying  $m$  machines

$$A_L = (a, v)$$

**Sub-problem PL** (*p-median problem*)

$$Q_L(x; A_L) = \sum_{i=1}^{\mu} \min_{x \in D_x} r_{ij} \quad r_{ij}(x_i) = \rho_j + v_j^{-1} d(a_j, x_i)$$

Rosing, K. E., Revelle, C. S., & Schilling, D. A. (1999) A gamma heuristic for the p-median problem. *European Journal of Operational Research*, **117**, 3, 522-532.



## Selected results: Cases R | $r_j - V | C_{\max}$ | P\_MEDIAN and R | $r_j - V | C_{\max}$ (2/5)

### Sub-problem PS

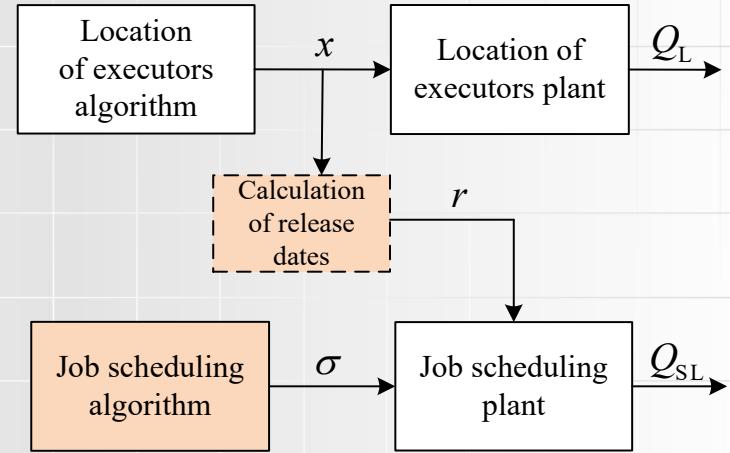
$$A_S = (p, r)$$

$$Q_{SL}(\sigma, x; A_S) = \max_{1 \leq i \leq m} C_{\sigma_i^{n_i}}(x_i)$$

$$\sigma = \{\sigma_1, \sigma_2, \dots, \sigma_i, \dots, \sigma_m\}$$

$$\sigma_i = (\sigma_i^1, \sigma_i^2, \dots, \sigma_i^l, \dots, \sigma_i^{n_i})$$

$$D_{\sigma_x} = \{\sigma : \sigma_{i_1}^{l_1} \neq \sigma_{i_2}^{l_2}, \sum_{i=1}^m n_i = n\}$$

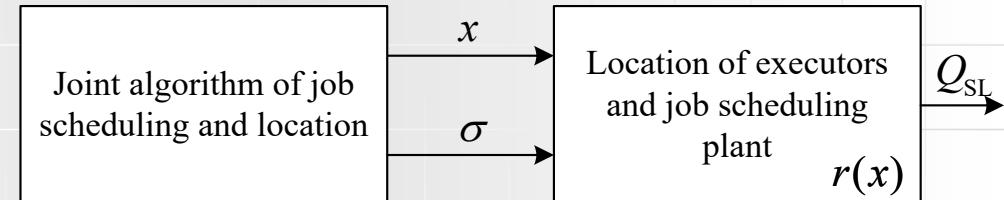


### PSO-based solution algorithm

Lin, Y. K. (2013). Particle swarm optimization algorithm for unrelated parallel machine scheduling with release dates. *Mathematical Problems in Engineering*, Article ID 409486.

## Selected results: Cases $R | r_j - V | C_{\max}$ and $R | r_j - V | C_{\max}$ (3/5)

$R | r_j - V | C_{\max} \rightarrow \text{Scheme S\_Jnt}$



### Algorithm TSMA. Tabu Search based Memetic algorithm

**Require:** Data:  $D = \{M, Y, \tilde{Y}, J, S, V, p\}$  and parameters of the algorithm:  $\alpha_{\text{init}}, \alpha_{\text{par}}, \varphi_m, \varphi_r, \Gamma, \Gamma_{\max}, \rho, \tilde{\rho}, \kappa^{\text{bin}}, \kappa^{\text{integer}}$

**Ensure:** Heuristic solution  $X$  and  $\Pi$  as well as  $C_{\max}^{\text{TSMA}}$ .

1. Generate the initial population  $\tilde{E}(z)$  for  $z := 1$  and set  $E^* := E^{\text{best}}(z)$ .
2. **while** stop condition defined by  $(\Gamma, \Gamma_{\max}, E^*)$  is not satisfied
3. Evaluate  $\tilde{\omega}(z)$  by population  $\tilde{E}(z)$ .
4. Select parents  $\tilde{E}^{\text{sus}}(z)$  with the use of Stochastic Universal Sampling.
5. Generate the set  $\tilde{E}^{\text{off}}(z)$  of offsprings using the recombination (CPC-2/OX1) and mutation operators.
6. Run the Local Search Heuristic with arguments:  $\tilde{\omega}^{\text{off}}(z), D$  and return  $\tilde{E}^{\text{TS}}$ .
7. **if**  $C_{\max}(E^*) > C_{\max}(E^{\text{TS}_{\text{best}}})$  **then**  $E^* := E^{\text{TS}_{\text{best}}}$  **end if**
8. Set  $z := z + 1$  and  $\tilde{E}(z) := \tilde{E}^{\text{TS}} \cup \tilde{E}^{\text{off}_{\text{best}}}(z)$ .
9. **end while** (2)
10.  $X := f_X(E^*; Y), \Pi := f_{\Pi}(E^*), C_{\max}^{\text{TSMA}} := C_{\max}(\Pi, X)$

Selected results: Cases R |  $r_j - V | C_{\max}$  | P\_MEDIAN and R |  $r_j - V | C_{\max}$  (4/5)

 Table 3 Dependence of  $\hat{Q}_{\text{SL}}$  and  $t$  on  $n$  for joint and sequential approaches

$n$	$\hat{Q}_{\text{SL}}$	$\tilde{Q}_{\text{SL}}$	$\delta_Q$	$\hat{t}_{\text{SL}} [s]$	$\tilde{t}_{\text{SL}} [s]$	$\delta_t$
100	39.764	52.780	32.733	9.221	7.035	-23.707
200	71.551	100.954	41.094	16.934	14.697	-13.210
300	146.625	188.781	28.751	25.755	26.968	4.710
400	235.912	297.873	26.264	34.777	36.089	3.773
500	300.651	369.762	22.987	41.048	47.114	14.778
600	348.684	462.543	32.654	49.912	58.281	16.768
700	405.646	527.986	30.159	58.995	72.092	22.200
800	489.871	659.451	34.617	67.665	83.668	23.650
900	579.543	778.992	34.415	80.019	99.769	24.682
1000	645.671	868.621	34.530	88.894	117.249	31.898

 $\hat{Q}_{\text{SL}}, \hat{t}_{\text{SL}} - S_{\text{-Jnt}}$ 

$$\delta_Q = \frac{\tilde{Q}_{\text{SL}} - \hat{Q}_{\text{SL}}}{\hat{Q}_{\text{SL}}} 100\%$$

 $\tilde{Q}_{\text{SL}}, \tilde{t}_{\text{SL}} - S_{\text{-Seq}}$ 

$$\delta_t = \frac{\tilde{t}_{\text{SL}} - \hat{t}_{\text{SL}}}{\hat{t}_{\text{SL}}} 100\%$$



Selected results: Cases R |  $r_j - V | C_{\max}$  | P\_MEDIAN and R |  $r_j - V | C_{\max}$  (5/5)

Property. The optimization scheme S\_Seq does not outperform the optimization scheme S\_Jnt, i.e.,  $Q_{SL}(\tilde{\sigma}, \tilde{x}; A_S) \geq Q_{SL}(\hat{\sigma}, \hat{x}; A_S)$

Justification:

$$Q_{SL}(\hat{\sigma}, \hat{x}; A_S) = \min_{(\sigma, x) \in D} Q_{SL}(\sigma, x; A_S) \leq \min_{(\sigma, x) \in D'} Q_{SL}(\sigma, x; A_S) = \min_{\sigma \in D_{\sigma \tilde{x}}} Q_{SL}(\sigma, \tilde{x}; A_S) = Q_{SL}(\tilde{\sigma}, \tilde{x}; A_S),$$

where  $\tilde{x} = \arg \min_{x \in D_x} Q_L(x; A_L)$ ,  $D' = \{(\sigma, x) : \sigma \in D_{\sigma \tilde{x}} \wedge \tilde{x} = \arg \min_{x \in D_x} Q_L(x; A_L)\}$ , and  $D' \subseteq D$ .



## Selected results: Uncertain case $1 \mid r_j^- \leq r_j \leq r_j^+ \mid C_{\max}$ (1/2)

Release dates belong to given intervals, i.e.,  $r_j \in [r_j^-, r_j^+]$ .

How to determine intervals?

$$\hat{Q}_s(\sigma, r) \sqsubseteq C_n(\sigma, r)$$

where  $C_k(\sigma, r) = p_{\sigma(k)} + \max \left\{ C_{k-1}(\sigma, r), r_{\sigma(k)} \right\}, \quad k = 2, 3, \dots, n, \quad C_0(\sigma, r) = 0$

$$\hat{Q}_s(\sigma, r) - Q'_s(\sigma'_r) - \text{regret}$$

where  $\sigma' = \arg \min_{\pi \in D_\pi} Q(\pi, r)$  – optimal solution for fixed scenario  $r$

$D_\pi$  – set of permutations without repetitions

$$Q'_s \sqsubseteq \min_{\pi \in D_\pi} Q(\pi, r)$$

$z(\sigma) = \max_{r \in R} [\hat{Q}_s(\sigma, r) - Q'_s(\sigma'_r)]$  – maximum regret for given  $\sigma$

$r^\sigma = \arg \max_{r \in R} [\hat{Q}_s(\sigma, r) - Q'_s(r)]$  – worst-case scenario

$$\min_{\sigma \in D_\sigma} z(\sigma)$$

$$\sigma'' = \arg \min_{\sigma \in D_\sigma} z(\sigma) \text{ – solution}$$

Selected results: Uncertain case  $1 \mid r_j^- \leq r_j \leq r_j^+ \mid C_{\max}$  (2/2)

 Table 4 Dependence of makespan and computational time on  $n$  for S\_Jnt and S\_Unc,  $\mu = 50$ 

$n$	any intervals				disjoint intervals			
	$\hat{Q}_{SL}$	$Q_s(\sigma'')$	$\hat{t}_{SL}$ [ms]	$t_s$ [ms]	$\hat{Q}_{SL}$	$Q_s(\sigma'')$	$\hat{t}_{SL}$ [ms]	$t_s$ [ms]
40	2741.530	2776.632	8	39	<b>556.55</b>	<b>556.55</b>	11	9
80	5719.114	5747.075	10	296	<b>709.33</b>	<b>709.33</b>	16	12
120	8737.921	8785.887	26	1241	<b>811.91</b>	<b>811.91</b>	29	22
160	11505.807	11533.889	29	4410	<b>987.38</b>	<b>987.38</b>	39	27
200	14482.500	14503.128	31	6712	<b>1108.99</b>	<b>1108.99</b>	55	40
240	17534.556	17557.584	47	12744	<b>1293.77</b>	<b>1293.77</b>	74	50
280	20638.523	20680.748	63	22208	<b>1671.41</b>	<b>1671.41</b>	92	67
320	23102.561	23138.121	78	35916	<b>1822.76</b>	<b>1822.76</b>	111	80
360	<b>26457.697</b>	<b>26457.697</b>	92	49812	<b>2098.41</b>	<b>2098.41</b>	133	97
400	<b>29299.100</b>	<b>29299.100</b>	110	71251	<b>2223.91</b>	<b>2223.91</b>	161	117



Connection of the **deployment of machines with the assignment of jobs to machines**.

Next,  **$m$  separate job scheduling sub-problems on single machines**.

Advantage – substantial simplification of PS.

The detailed analysis is an open issue, in particular, on the connection between location and assignment.

The first attempt can be found in

Hessler C.J. and Deghdak K. (2017) Discrete parallel machine makespan ScheLoc problem.

*Journal of Combinatorial Optimization, 34, 4, 1159-1186.*

clusters of jobs are determined around launched sites for machines.



## Other cases and final remarks (2/3)

Machine-dependent release dates  $r_{ij}$  are figured in S\_Seq.

PS needs a single release date  $r_j$ .

The substantiation other than max, min or mean value needs research.

We would have a new issue with machine-dependent release dates; the comparison to similar known problems required.



## Other cases and final remarks (3/3)

How to calculate  $r_{ij}$  ?

Applied proposition:  $r_{ij}(x_i) = \rho_j + v_j^{-1}d(a_j, x_i)$

Other methods for S\_Unc, e.g., the probabilistic one  
and  
release date values acquisition



**Thank you for your attention.**