

Scheduling of a real world filter production with lot-size 1



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12th International Conference on Advances in System Simulation, SIMUL 2020, Porto, Portugal October 18 – 22, 2020



Professor Dr. Frank Herrmann – Curriculum Vitae

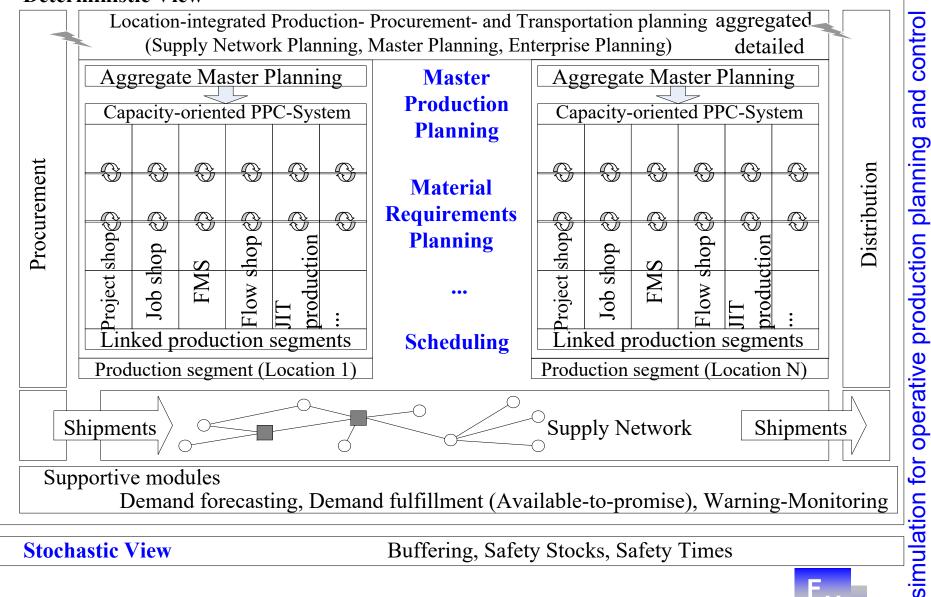
- born in Münster, Germany
- studied computer science at the RWTH Aachen University, Germany.
- at the Fraunhofer Institute IITB in Karlsruhe, Germany: worked primarily on algorithms for production control and received in this field a PhD.
- at SAP AG: several positions (Germany, Japan and USA), at the last as director.
- as a Professor for Production Logistics at the University of Applied Sciences in Regensburg, Germany: work mainly on planning algorithms, optimisation and simulation for operative production planning and control at companies.





Improvement of procedures and parameters for planning in ERP systems used in industrial practice

Deterministic View



Buffering, Safety Stocks, Safety Times



Real world application overhead travelling crane assembly welding plunge span station station station station **S**2 **S1 S**3 S4

Overhead travelling crane lifts a filter basket out of a station, transports it to the next station and **inserts it directly** in this station. This is just possible if this station is free.

- **No buffer** in the production line
- Feasible schedule of jobs is a **permutation** of these jobs.
- Other operational issues: **Move** of **crane** if all **stations** are **inactive**.
- No interruption of an operation: transport after completion of all operations also for first and last operation. ⇒ "load"-restriction
- A station may be empty.



Routings for the real world application

| Part type | Station 1 | Station 2 | Station 3 | Station 4 | Sum of times |
|-----------|------------|-----------|------------|-----------|--------------|
| P1 | 100.5 min. | 50 min. | 53.5 min. | 9 min. | 213 min. |
| P2 | 256.5 min. | 50 min. | 53.5 min. | 9 min. | 369 min. |
| P3 | 122 min. | 135 min. | 90 min. | 75 min. | 422 min. |
| P4 | 256.5 min. | 50 min. | 267 min. | 9 min. | 582.5 min. |
| P5 | 182 min. | 200 min. | 135.5 min. | 140 min. | 657.5 min. |
| P6 | 100.5 min. | 300 min. | 53.5 min. | 300 min. | 754 min. |
| P7 | 223 min. | 250 min. | 196 min. | 220 min. | 889 min. |
| P8 | 223 min. | 250 min. | 206.5 min. | 220 min. | 899.5 min. |
| P9 | 100.5 min. | 300 min. | 267 min. | 300 min. | 967.5 min. |
| P10 | 256.5 min. | 300 min. | 267 min. | 300 min. | 11235 min. |

Set-up times and all other times, especially for load and unload, are **included in operation times** or **negligible**.

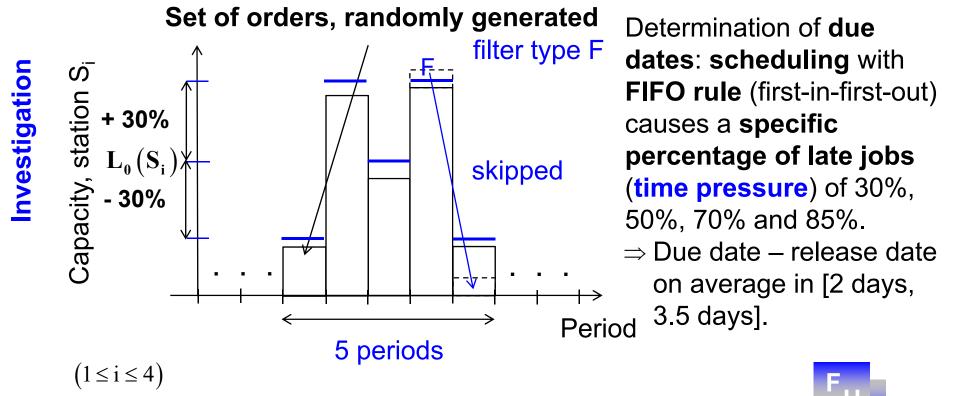
minutes (min.)



Orders / jobs

Reality

- Jobs comes from an SAP system for a period about seven days with three 8 hour shifts, released at the beginning of a period.
- Large numbers of periods with (very) high number of late jobs and numbers of periods with a low number of late jobs.



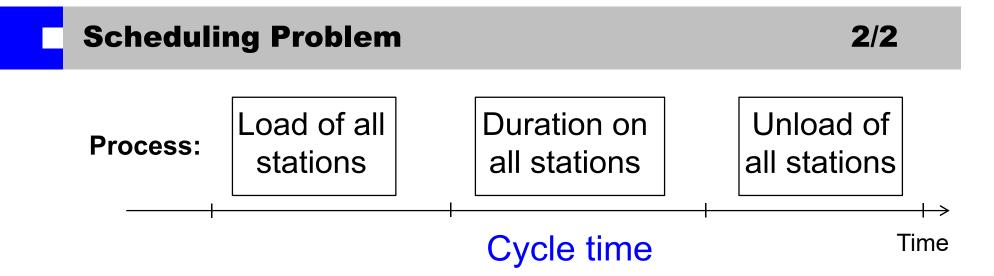
Parameters

- M stations, ۲
- N jobs, which may change at any time, ۲
- Release dates a_i ($1 \le i \le N$), ٠
- Due dates f_i $(1 \le i \le N)$ and •
- Duration $t_{i,i}$ of operation j $(1 \le i \le M)$ of job i $(1 \le i \le N)$ on station j. ٠

Performance criteria

- Tardiness $T_i = \max\{F_i f_i, 0\}$ with F_i is the realized completion time.
- Average tardiness $\left(T_{Mean} = \frac{T_i}{N}\right)$ and Root mean square of tardiness $\left(T_{RMS} = \sqrt{\frac{1}{N} \cdot \sum_{i=1}^{N} T_i^2}\right)$ (similar to standard deviation)

p. 7

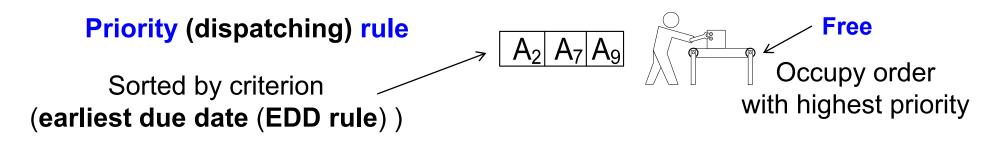


Main restrictions:

- This "load"-restriction.
- The no-buffer condition.
- The capacity of the stations.
- Relaxation of the "load"-restriction ⇒ no-buffer problem which is NP-hard in the strong sense for more than two stations.



Heuristic solution with priority rules



Priority rules **reacts on real time events** like **station failure**, **tool breakage**, **arrival of new jobs with high priority**, **changes of due dates** etc. immediately. **Used in real application**; priority rules in this investigation assigns an order in 1 milli-second.

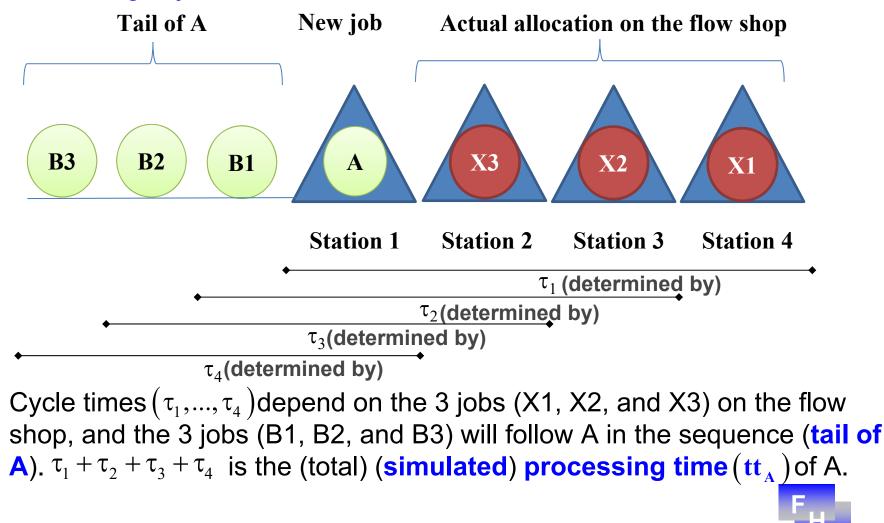
Scheduling with priority rules still investigated: see e.g. Rajendran and Holthaus (1999), Swaminathan et al. (2007), Rajendran and Alicke (2007), Mouelhi-Chibani and Pierreval (2010), Chiang and Fu (2009), El-Bouri (2012) or Chiang and Fu (2012).

Run time (hours) for solving the optimisation model is too large for industrial application in real time.



Simulation of processing times in priority rules

"Load"-restriction \Rightarrow processing time of job A significantly larger than sum of processing times of its single operations (net processing time (t_A)). Processing of job A:



(Deviation of) Tardiness is improved by assigning jobs with a small slack $sl_i = f_i - t - tt_i$, with current time t.

Investigations by the author (see also Engell et al. (1994)) show: rules $\begin{aligned} \textbf{CR+SPT} &= \begin{cases} \frac{f_i - t}{tt_i}, & f_i - t - tt_i > 0\\ tt_i, & f_i - t - tt_i \leq 0 \end{cases} \quad (tt_i \text{ is the shortest processing time (SPT)} \\ \textbf{rule}, \textbf{ODD} \text{ (here identical with the EDD-rule) and } \\ \textbf{SL/OPN} &= \frac{f_i - t - tt_i}{M} \end{aligned}$

(a low value is always preferred) are **pareto optimal** to the **average**, the **variance** and the **maximum tardiness for many job shop problems**.

SL/OPN and **CR+SPT often** used as **benchmark**; Raghu and Rajendran (1993): other combinations deliver worse results for flow shop problems.

\Rightarrow Restriction to these pareto optimal rules; justified by some sample simulations.

p. 1'

In addition: more recent rules are adapted to the class of problems regarded here. One is the rule **RR** of <u>R</u>aghu and <u>R</u>ajendran (1993) – **minimises** both **mean flow time** and **mean tardiness** of jobs; originally defined for job shop problems.

Adaption to flow shop problems:

- remaining work content is tt_i .
- probable waiting time of the successor of an operation (in job i) at the (next) station is integrated in cycle times; due to Rajendran and Holthaus (1999) this seems to be less effective in flow shops for minimising mean flow time.
- **utilisation level** of the entire flow shop $\eta = \frac{b}{b+j}$ with busy time b and idle time j of the entire flow shop.

Priority index is $(\mathbf{f}_i - \mathbf{t} - \mathbf{t}\mathbf{t}_i) \cdot \mathbf{e}^{-\eta} + \mathbf{e}^{\eta} \cdot \mathbf{t}\mathbf{t}_i$ (note: a low value is preferred).

Optimal solution for the single-station weighted tardiness scheduling problem \Rightarrow Rachamadugu and Morton (1982): weighted slack-based scheduling rule RM. Analysis (Rachamadugu and Morton 1982): near optimal results to the one station problem can be assumed and modifications: very good for flow shop and job shop problems with weighted tardiness criteria (see (Vepsatainen and Morton 1987)). Rule successfully adapted to resource constrained project scheduling problems (RCPSP) in (Voß and Witt 2007) – following based on this.

Priority index is:
$$\frac{1}{\pi} \cdot e^{-\frac{k}{\overline{t}} \cdot \max\{f_i - t - tt_i, 0\}}$$

with slack $f_i - t - tt_i$ as usual, k is an empirically determ8i7unined "look-ahead" parameter π_i are processing time costing, namely

local: $\pi_i^l = tt_i$ (RM local) and

global:
$$\pi_i^g = \sum_{i \in U_t} tt_i$$
, U_t set of unfinished jobs, excluding job i (RM global).

Computational results – Basic settings

Real world application is realised in the simulation tool "Plant Simulation" together with an implementation of the above mentioned hierarchical planning as realised in commercial ERP systems.

• products' distribution among routing

| | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
|---|---------|----|-----|-----|-----|-----|-------|---------|--------|------|
| | 5% | 5% | 15% | 15% | 5% | 10% | 10% | 15% | 5% | 15% |
| • | Station | | | 2 | 3 | 4 | with | larges | t work | load |
| | | 2 | 2% | 31% | 23% | 24% | (i.e. | bottler | neck) | |

 Time-dependent course of work load on stations and urgency of jobs are identical (~stationary stochastically process).

⇒ performance criteria reach a steady state by a simulation horizon of 3000 periods – without first / last 10 periods.

Preliminary studies: parameter k has a significant impact on the performance of the local and the global RM rule and the best results are achieved with k = 1.



Impact of the simulated processing time

- Dependency from the (3) jobs on the flow shop and the (3) jobs following.
 - \Rightarrow Independent from the priority rules and the time pressure.
- The rules prefer permutations of jobs in a cycle. Mean, the standard deviation, the minimum and the maximum of the simulated processing times for all part types and all rules are between those for the SPT rule and the SL; see following table.



1/2

Net processing time (NET) and simulated processing time in minutes for the rules SPT and SL 1/2

| Part | SPT | | | | | |
|------|--------|--------|--------------------|---------|---------|--|
| type | Mean | Net | Standard deviation | Minimum | Maximum | |
| | | | | | | |
| P1 | 1116.5 | 213 | 151.8 | 885 | 1349.5 | |
| P2 | 1159.8 | 369 | 100.45 | 1061 | 1349.5 | |
| P3 | 1088.6 | 422 | 138.1 | 929 | 1349.5 | |
| P4 | 1151.7 | 582.5 | 96.4 | 1061 | 1349.5 | |
| P5 | 1162.9 | 657.5 | 88.5 | 1063.5 | 1349.5 | |
| P6 | 1233.3 | 754 | 95.3 | 1098.5 | 1376 | |
| P7 | 1228.1 | 889 | 60.1 | 1164.5 | 1349.5 | |
| P8 | 1225.5 | 889.5 | 57.8 | 1164.5 | 1349.5 | |
| P9 | 1237.2 | 967.5 | 93.9 | 1098.5 | 1376 | |
| P10 | 1322.8 | 1123.5 | 27.9 | 1098.5 | 1376 | |



Net processing time (NET) and simulated processingtime in minutes for the rules SPT and SL2/2

| Part | SL | | | | | |
|------|--------|--------|--------------------|---------|---------|--|
| type | Mean | Net | Standard deviation | Minimum | Maximum | |
| P1 | 1179 | 213 | 126.5 | 885 | 1349.5 | |
| P2 | 1192.6 | 369 | 112.3 | 885 | 1349.5 | |
| P3 | 1179.3 | 422 | 118.1 | 885 | 1349.5 | |
| P4 | 1181.7 | 582.5 | 111.5 | 885 | 1349.5 | |
| P5 | 1184.6 | 657.5 | 106.5 | 885 | 1349.5 | |
| P6 | 1198.3 | 754 | 106.1 | 885 | 1376 | |
| P7 | 1203.8 | 889 | 101.7 | 885 | 1376 | |
| P8 | 1207.9 | 889.5 | 98.2 | 885 | 1376 | |
| P9 | 1215.9 | 967.5 | 98.1 | 885 | 1376 | |
| P10 | 1225.9 | 1123.5 | 97.5 | 885 | 1376 | |



Impact of the simulated processing time

• Dependency from the (3) jobs on the flow shop and the (3) jobs following.

 \Rightarrow Independent from the priority rules and the time pressure.

- The rules prefer permutations of jobs in a cycle.
- No best tail for each priority rule: Study: tails of part types with similar net processing times and those with significantly different net processing times ⇒ both significant and minor deviations – not exceptions, deviation is almost one-third (or even more).
- **Best tail**: jobs of part type P4 only (i.e. P4, P4, P4); used in the following. Accidently tail is a very good alternative.



1/2

Impact of the simulated processing time

- Significant impact by the tail, listed values are representative for many tails. Exceptions: tail only consists of jobs with a small net processing time, e.g. P1, or a high one, e.g. P10.
 - First case: small simulated processing times, e.g. 901.1 minutes for P1 and 1067.6 minutes for P10.

Second case: large mean values are large, e.g. 1248.5 minutes for P1 and 1269.2 minutes for P10.

Standard deviations: huge in first case, e.g. for P1 173.1 minutes and for P10 187.6 minutes, and low in second case, e.g., P1 77.4 minutes and P10 61.3 minutes.

- Performance of a priority rule: influenced by concrete tail. Study: tails of part types with similar net processing times and those with significantly different net processing times ⇒ both significant and minor deviations – not exceptions, reduction is almost one-third (or even more).
- Best tail: jobs of part type P4 only (i.e. P4, P4, P4); used in the following. Accidently tail is a very good alternative.



2/2

Change by using simulated processing time (a) instead of net processing time (b), compared to the result with net processing time; i.e. (b-a)/b*100%.

| | | T ! | | | |
|-------------------|---------------|------------|---------|----------|--|
| Rule | Time pressure | | | | |
| T _{Mean} | 30 % | 50 % | 70 % | 85 % | |
| SPT | 57.6 % | 10.3 % | 12.3 % | 25.8 % | |
| SL | -41.2 % | -2.3 % | 0.23 % | -17 % | |
| CR+SPT | -4 % | -10.3 % | -7.4 % | 8.9 % | |
| RR | 75.3 % | 4.2 % | 3.9 % | 11.9 % | |
| RM local | 48.9 % | 10.4 % | 11.7 % | 21.5 % | |
| RM global | 3.3 % | -10.9 % | -4 % | -5.8 % | |
| Τ _σ | 30% | 50% | 70% | 85% | |
| SPT | 68.65 % | 31.3 % | 27.2 % | 48.11 % | |
| SL | -20.1 % | 1.2 % | 3.4 % | -19 % | |
| CR+SPT | 51.4 % | 34.1 % | 37.1 % | 48.6 % | |
| RR | 69.8 % | 14.3 % | 14.4 % | 23.6 % | |
| RM local | 68.3 % | -21.2 % | -25.5 % | -242.8 % | |
| RM global | 50 % | -10.1 % | 10.4 % | 67.9 % | |

p. 20

SIMUL – Scheduling of a real world filter production with lot-size 1

- SPT rule benefits most from a more realistic processing time.
- SL rule just small improvements but often significant deteriorations.



2/3

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p. 22

SIMUL – Scheduling of a real world filter production with lot-size 1

- SPT rule benefits most from a more realistic processing time.
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- CR+SPT rule:
 - deteriorations for T_{Mean} due to CR (some kind of slack).
 - net processing time is much smaller than simulated processing time: CR+SPT rule with simulated processing time decides earlier according to SPT – explains improvement.

Change by using simulated processing time (a) instead of net processing time (b), compared to the result with net processing time; i.e. (b-a)/b*100%.

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p. 24

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- RR and RM: combination of slack and SPT.
- RR rule benefits from a more precise processing time. Smaller than SPT rule due to already better values if net processing is used and the impact of slack; see time pressure of 85%.
- RR rule prefers critical jobs with positive slack much better than the SPT rule.



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2/3

- RR rule prefers critical jobs with positive slack much better than the **SPT** rule: see T_{Mean} in case of a small time pressure.
- RM rule prefers small jobs if there is no slack and otherwise jobs with small slack.
 - \Rightarrow Changes: between those of the rules SL and CR+SPT depending on the degree of influence of the slack on the priority confirmed for RM global.
- RM local: percental improvements for both criteria with small time ۲ pressure are comparable to the ones of the SPT rule.
 - T_{τ} better processing time causes an increase of the (absolute) values on the level of the values of the SPT rule, except for a low time pressure.



3/3

Absolute performance measures for priority rules with simulated processing time 1/5

| Rule | Time pressure | | | | |
|-------------------|---------------|-------|-------|--------|--|
| T _{Mean} | 30 % | 50 % | 70 % | 85 % | |
| SPT | 99.1 | 323.3 | 326.2 | 646.9 | |
| SL | 161.6 | 321.5 | 344.7 | 1149.8 | |
| CR+SPT | 581.97 | 575.7 | 574.6 | 1032.7 | |
| RR | 40.7 | 279.5 | 313.5 | 823.1 | |
| RM local | 55.3 | 267.1 | 278.6 | 626.2 | |
| RM global | 134.9 | 346.7 | 359.2 | 1008.5 | |
| Τ _σ | 30% | 50% | 70% | 85% | |
| SPT | 314.5 | 449.2 | 473.4 | 99.1 | |
| SL | 353.4 | 315.3 | 326.6 | 161.6 | |
| CR+SPT | 2023.9 | 916.4 | 901.2 | 1464.1 | |
| RR | 125.1 | 282.8 | 305.7 | 564.6 | |
| RM local | 235.9 | 425.8 | 454.1 | 1187.4 | |
| RM global | 395.5 | 456.2 | 464.6 | 890.04 | |

Values in minutes

Absolute performance measures for priority rules with simulated processing time 2/5

| Rule | | Time pr | essure | |
|-------------------|--------|---------|--------|--------|
| T _{Mean} | 30 % | 50 % | 70 % | 85 % |
| SPT | 99.1 | 323.3 | 326.2 | 646.9 |
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Values in minutes.

- Differ partially from the results published in other papers – note: very special problem structure.
- Expectation: small T_{Mean} but large T_{σ} by SPT rule and opposite by SL rule is fulfilled.
- CR+SPT rule outperforms SPT and the SL rule often – here much worse (1 exception).
 Reason: too late switch from preferring small slack to small SPT.
 Compared to other rules:
 Misguided decision ⇒ long cycles.
 ⇒ more reduction remaining slack; cause long idle times.



Absolute performance measures for priority rules with simulated processing time 3/5

| Rule | Time pressure | | | |
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Values in minutes.

RR rules compared to (Rajendran and Holthaus 1999): In (Rajendran and Holthaus 1999): RR rule delivers **better results** than other rules except for 1 case – improvements: less significant (partially much less) and sequences of rules according are different.

Reason: Different work load.

- Rajendran and Holthaus (1999): utilisation level of 80% and 95%.
- Here: significant fluctuation of the load in periods – much higher / lower than 95% / 80%.

⇒ tighter due date has more significant effect.



Absolute performance measures for priority rules with simulated processing time 3/5

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Absolute performance measures for priority rules with simulated processing time 4/5

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| T _{Mean} | 30 % | 50 % | 70 % | 85 % |
| SPT | 99.1 | 323.3 | 326.2 | 646.9 |
| SL | 161.6 | 321.5 | 344.7 | 1149.8 |
| CR+SPT | 581.97 | 575.7 | 574.6 | 1032.7 |
| RR | 40.7 | 279.5 | 313.5 | 823.1 |
| RM local | 55.3 | 267.1 | 278.6 | 626.2 |
| RM global | 134.9 | 346.7 | 359.2 | 1008.5 |
| Τ _σ | 30% | 50% | 70% | 85% |
| SPT | 314.5 | 449.2 | 473.4 | 99.1 |
| SL | 353.4 | 315.3 | 326.6 | 161.6 |
| CR+SPT | 2023.9 | 916.4 | 901.2 | 1464.1 |
| RR | 125.1 | 282.8 | 305.7 | 564.6 |
| RM local | 235.9 | 425.8 | 454.1 | 1187.4 |
| RM global | 395.5 | 456.2 | 464.6 | 890.04 |

Values in minutes.

Poor results of RM global compared with RM local (1 exception) contradicts results in (Lawrence et al. 1993) - same to investigation (Voß and Witt 2007).

- Local processing time costing prefers more often jobs with short processing times than the global processing time costing. Cause much better absolute results with time pressures: SPT rule delivers a much better $T_{\rm Mean}$ than to the SL.
- Other cases: RM local is beneficial if many tardy jobs are waiting in front of the production line.



Absolute performance measures for priority rules with simulated processing time 5/5

| Rule | Time pressure | | | | |
|-------------------|---------------|-------|-------|--------|--|
| T _{Mean} | 30 % | 50 % | 70 % | 85 % | |
| SPT | 99.1 | 323.3 | 326.2 | 646.9 | |
| SL | 161.6 | 321.5 | 344.7 | 1149.8 | |
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Values in minutes.

Sequence in the performance criteria of the priority rules are in accordance to the results shown in many publications (Lawrence and Morton (1993), Engell et al. (1994), Raghu and Rajendran (1993) as well as in Rajendran and Holthaus (1999)).

Differences of **results** of the rules:

- Flow shop problem in (Voß and Witt 2007) with parallel resources and setup states: differences are smaller than in this investigation.
- General problem structure in (Rajendran and Holthaus (1999) and Raghu and Rajendran (1993): Differences are larger



Absolute performance measures for priority rules with simulated processing time 5/5

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Overall:

- Simulated processing times should be used in rules.
- Then, **RR** and **RM local** deliver the **best mean tardiness**.
- RR is beneficial with low and RM local with (very) high time pressure.
- RR rule delivers the best standard deviation of the tardiness (for all time pressures).

Values in minutes.



Summary

- Real world flow shop scheduling problem with specific restrictions, which are not covered by restrictions in standard classification.
- Simulated processing times should be used in rules. Then, RR and RM local deliver the best mean tardiness.
 - **RR** is **beneficial** with **low** and **RM local** with (very) high time pressure.
 - **RR** rule delivers the **best standard deviation** of the **tardiness** (for **all time pressures**).

Future investigations

- Scheduling of workers.
- Limited resources number of coils or assembly ground plates.
- Efficient improvement procedure based on behaviour of priority rules.

