

DESTRUCTIVE AND CONSTRUCTIVE BOUNDS FOR THE m -MACHINE SCHEDULING PROBLEM

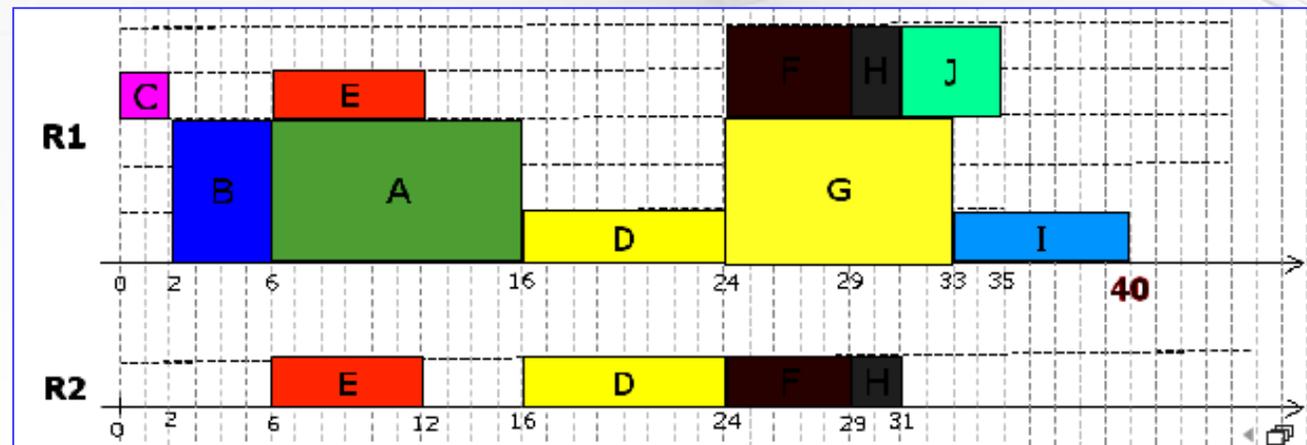
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scheduling.seminar.com

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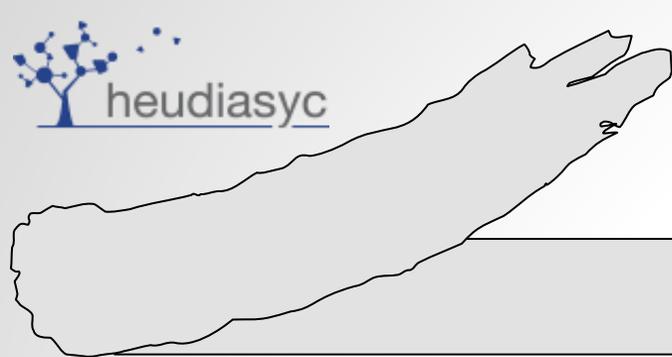
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INTRODUCTION

- ❖ RESOURCE CONSTRAINED PROJECT SCHEDULING PROBLEM (RCPSP)
- ❖ DECOMPOSITION INTO CUMULATIVE SCHEDULING PROBLEMS (CuSP) CONNECTED WITH THE PRECEDENCE GRAPH
- ❖ THE CuSP, THE m -MACHINE SCHEDULING PROBLEM (Carlier 1987, EJOR) (Haouari et al. 2007, JOS)
- ❖ CONSTRUCTIVE AND DESTRUCTIVE BOUNDS (Brucker 1990)
- ❖ ENERGETIC CONSTRUCTIVE BOUNDS



THE CUMULATIVE SCHEDULING PROBLEM (CuSP)

❖ m -MACHINE OPTIMISATION

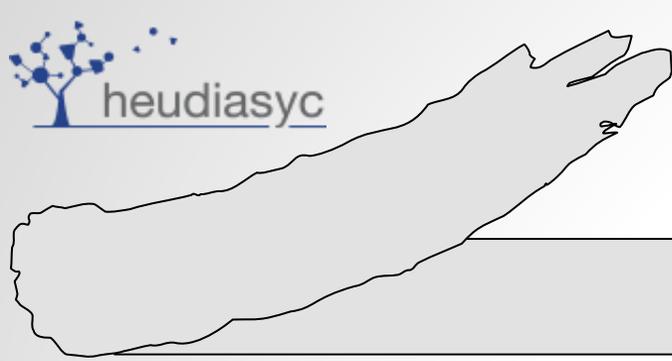
- Schedule n non preemptive tasks in a minimal makespan
- Each task i has:
 - a release date r_i ,
 - a processing time p_i
 - a tail q_i .
- It requires $c_i=1$ machine during all its processing ($m = C$)

❖ m -MACHINE DECISION (C_{max}) (**constraint programming**)

- A value C_{max} is chosen
- In the m -machine decision, we replace tails by deadlines ($d_i(C_{max}) = C_{max} - q_i$)
- Each task i has to be scheduled within the interval $[r_i, d_i]$

❖ THE CUMULATIVE SCHEDULING PROBLEM (CuSP):

- A task can need more than one machine:
 - c_i is no more necessarily equal to 1



PART 1 - DESTRUCTIVE BOUNDS

THREE CHECKERS

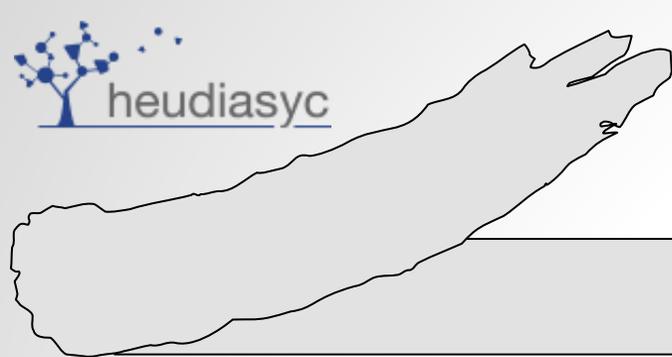
□ $EB(\alpha, \delta)$: Energetic Balance of an interval $[\alpha, \delta]$

□ Energetic Balance of all intervals

❖ $EB = \min(EB(\alpha, \delta))$

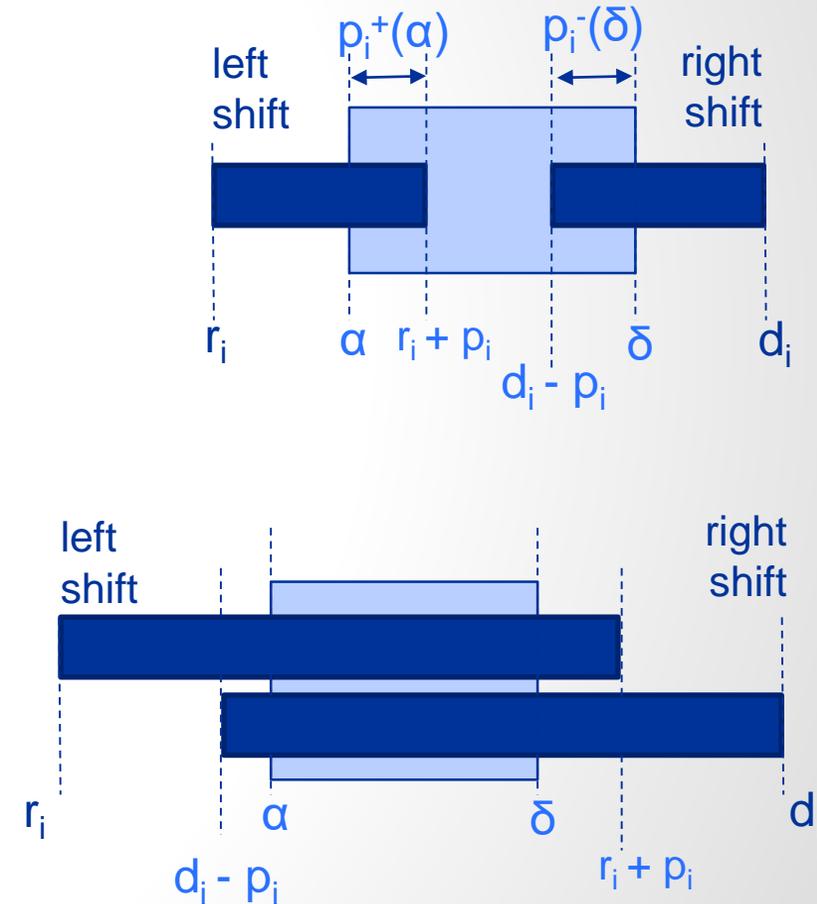
□ Energetic Reasoning (ER) (Erschler and Lopez)

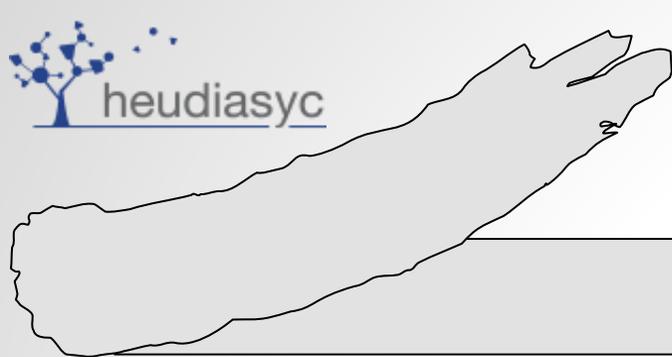
❖ If $EB < 0$, the instance is infeasible and $C_{max} + 1$ is a valid lower bound.



ENERGETIC REASONING: A DESTRUCTIVE BOUND

- ❑ **TAILS ARE REPLACED BY DEADLINES**
 - ❑ Energetic Reasoning (ER) (Erschler and Lopez, Baptiste, Le Pape and Nuijten)
 - ❑ Given a time interval $[\alpha, \delta]$
 - Let $p_i^+(\alpha)$ the length of time during which task i after α if it is left-shifted
 - Let $p_i^-(\delta)$ the length of time during which task i before δ if it is right-shifted
 - $W_i(\alpha, \delta) = c_i \times \min(p_i^+(\alpha), p_i^-(\delta), \delta - \alpha)$
 - ❑ The total energy over the time interval $[\alpha, \delta]$ is defined by $W(\alpha, \delta) = \sum_{i=1}^n W_i(\alpha, \delta)$.
 - ❑ $EB(\alpha, \delta) = C(\delta - \alpha) - W(\alpha, \delta)$ and $EB = \min(EB(\alpha, \delta))$
- Clearly, if $EB < 0$, the instance is infeasible. Otherwise it could be feasible.





THE FAMILY OF INTERVALS

THE FAMILY OF INTERVALS $[\alpha, \delta]$: (the pinning points)

□ Family of intervals Ω_1

- ❖ $\alpha \in \{r_i, r_i + p_i, d_i - p_i(\text{crossing task}) \mid i \in \{1, \dots, n\}\}$
- ❖ $\delta \in \{d_i, r_i + p_i(\text{crossing task}) \mid i \in \{1, \dots, n\}\}$

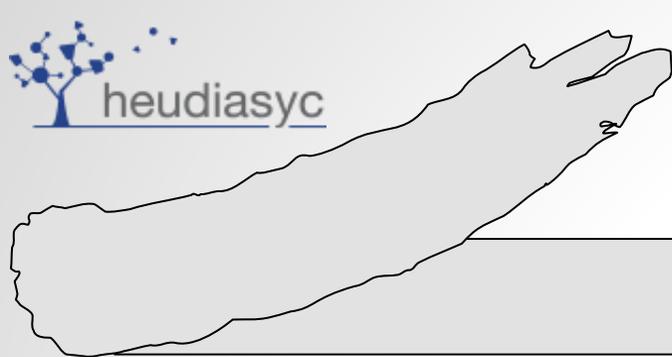
□ Family of intervals Ω_2

- ❖ $\alpha \in \{r_i, d_i - p_i(\text{crossing task}) \mid i \in \{1, \dots, n\}\}$
- ❖ $\delta \in \{r_k + d_k - \alpha \mid k \text{ balancing } \textbf{equilibrium} \text{ task}\}$
 - where k is a function of α

□ Family of intervals Ω_3

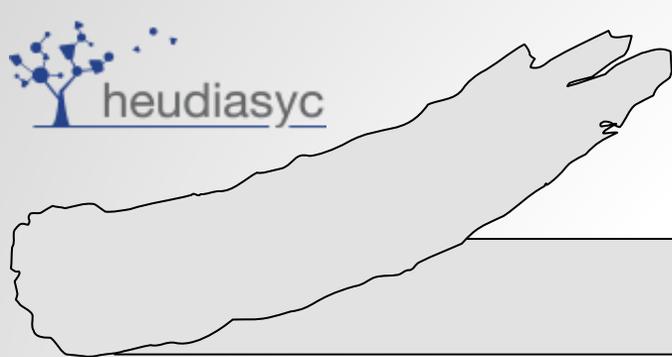
- ❖ $\delta \in \{d_i, r_i + p_i(\text{crossing task}) \mid i \in \{1, \dots, n\}\}$
- ❖ $\alpha \in \{r_k + d_k - \delta \mid k \text{ balancing } \textbf{equilibrium} \text{ task}\}$
 - where k is a function of δ

Total number of intervals : $n^2 + 4nm + m^2$



ENERGETIC REASONING: LITERATURE REVIEW

- ❑ **Baptiste, Le Pape and Nuijten (1999) proposed a quadratic checker. They also derived a cubic algorithm for computing heads and tails adjustments.**
- ❑ **Challenges of ulterior researches:**
 - ❖ **Can we do better than quadratic complexity for checker?**
 - ❖ **Can we do better than cubic algorithms for adjustments?**
- ❑ **Brief history of adjustment improvements:**
 - ❖ $O(n^2 \log n)$ (Bonifas 2018, Tesch 2018, Ouellet Quimper 2018)
 - ❖ **$O(n^2)$: OUR ADJUSTMENTS ALGORITHM (Incremental evaluation and Cooling box: hare, tortoises etc.)**
 - Carlier, J., Pinson, E., Sahli, A. and, Jouglet, A. (2020). An $O(n^2)$ algorithm for time-bound adjustments for the cumulative scheduling problem. European Journal of Operational Research, vol 286(2), 468-476.
 - Carlier, J., Jouglet, A Pinson, E., Sahli, A. (2020). A new data structure for some scheduling problems: **the cooling box**. JOCO.
- ❑ **We have evaluated the incremental addition of the constraint $r_i = \alpha$ to the evaluation of energy in the double loop of Baptiste et al. The method is made efficient by using adapted data structure including a new one: the cooling box.**



ENERGETIC REASONING: A DESTRUCTIVE BOUND

THE QUADRATIC CHECKER OF BAPTISTE, LE PAPE AND NUIJTEN

□ Let us define the sets:

$$O_1(i) = \{r_i, r_i + p_i, d_i - p_i\}, \forall i \in \{1, \dots, n\}$$

$$O_2(i) = \{r_i + p_i, d_i - p_i, d_i\}, \forall i \in \{1, \dots, n\}$$

$$O_t(i) = \{r_i + d_i - t\}, \forall i \in \{1, \dots, n\}$$

$$O_1 = \bigcup_{i \in \{1, \dots, n\}} O_1(i)$$

$$O_2 = \bigcup_{i \in \{1, \dots, n\}} O_2(i)$$

$$O_t = \bigcup_{i \in \{1, \dots, n\}} O_t(i)$$

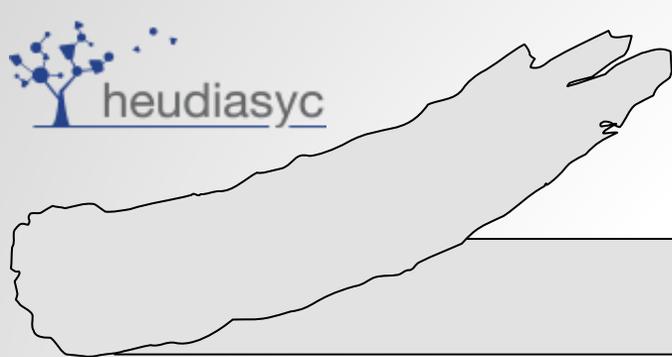
Proposition 1 [Baptiste et al. 2001]: It is sufficient to check intervals $[\alpha, \delta]$ in $\Omega = \Omega_A \cup \Omega_B \cup \Omega_C$ with three families:

$$\Omega_A = \{[\alpha, \delta] \mid \alpha \in O_1, \delta \in O_2, \alpha < \delta\}$$

$$\Omega_B = \{[\alpha, \delta] \mid \alpha \in O_1, \delta \in O_\alpha, \alpha < \delta\}$$

$$\Omega_C = \{[\alpha, \delta] \mid \delta \in O_2, \alpha \in O_\delta, \alpha < \delta\}$$

- The number of such intervals is equal to $15n^2$
- Improved by Derrien and Petit to $3n^2$ (us: nearly n square)
- Thanks to two double loops on α and δ and incremental evaluations. They also derived a cubic algorithm for computing heads and tails adjustments.



ENERGETIC REASONING: A DESTRUCTIVE BOUND

□ FORMULA (Checker)

$$p_i^+(\alpha) = \max(0, \min(p_i, r_i + p_i - \alpha))$$

$$p_i^-(\delta) = \max(0, \min(p_i, \delta - d_i + p_i))$$

$$W_i(\alpha, \delta) = \min(p_i^+(\alpha), p_i^-(\delta), \delta - \alpha)$$

□ INTERVALS FAMILIES (Baptiste et al. Checker)

$$\Omega_A = \left\{ (\alpha, \delta) \left| \begin{array}{l} \alpha \text{ of the form: } r_i \text{ or } d_i - p_i \text{ or } r_i + p_i \\ \delta \text{ of the form: } d_j \text{ or } d_j - p_j \text{ or } r_j + p_j \end{array} \right. \right\}$$

$$\Omega_B = \left\{ (\alpha, \delta) \left| \begin{array}{l} \alpha \text{ of the form: } r_i \text{ or } d_i - p_i \\ \delta \text{ of the form: } r_j + d_j - \alpha \end{array} \right. \right\}$$

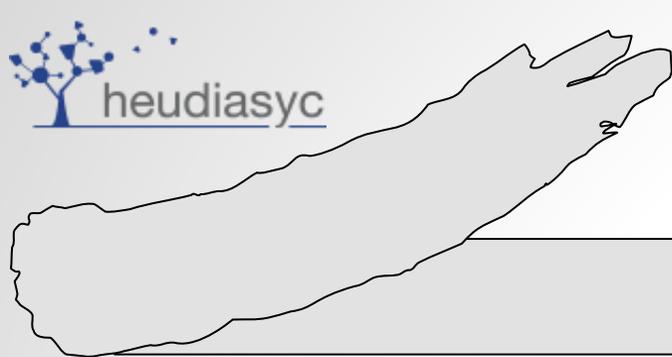
$$\Omega_C = \{\text{symmetrical case of } \Omega_B\}$$

□ FORMULA AND INTERVALS FAMILIES (BOUNDS)

$$p_i^+(\alpha) = \max(0, \min(p_i, r_i + p_i - \alpha))$$

$$p_i^-(\delta) = \max(0, \min(p_i, \delta - d_i + p_i)), \quad \delta = C_{max} - \gamma$$

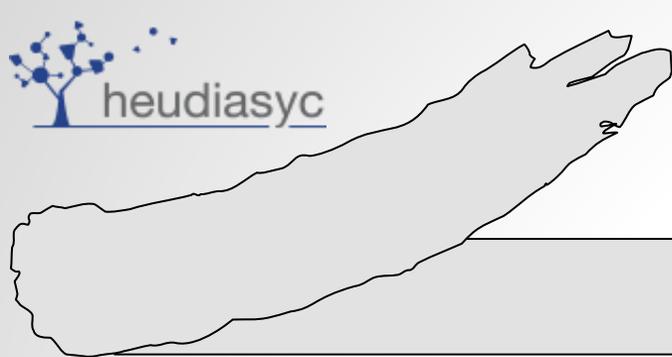
$$W_i(\alpha, \delta) = \min(p_i^+(\alpha), p_i^-(\delta), C_{max} - \gamma - \alpha)$$



ENERGETIC REASONING: A DESTRUCTIVE BOUND

THE CHECKER OF OUELLET AND QUIMPER

- ❑ Ouellet and Quimper have proposed recently a $O(n \log^2 n)$ checker and an $O(n^2 \log n)$ algorithm for adjustments (2018).
- ❑ It answered to the challenge of Baptiste et al.
- ❑ They build a very clever algorithm based on range trees for computing the energy of an interval in $O(\log n)$ (tools issued from algorithmic geometry) **PRETREATMENT WITH RANGE TREES**
- ❑ They prove the following fundamental property: **PARADIGM CHANGEMENT**
 - ❖ The matrix of energy interval is a Monge Matrix.
- ❑ The lines of the matrix are associated with the values of α and the column with the values of δ .
- ❑ Two difficulties :
 - ❖ The Monge Matrix is a Partial Monge Matrix
 - ❖ There are a quadratic number of lines and of columns.
- ❑ They overcome these difficulties by a clever algorithm.

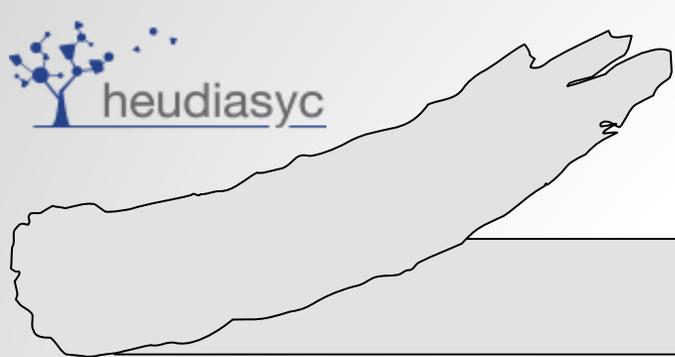


ENERGETIC REASONING: A DESTRUCTIVE BOUND

THE CHECKER OF CARLIER, SAHLI, JOUGLET AND PINSON (IJPR 2021)

- ❑ At first we treat the second and third families of intervals by stating an **equilibrium property** associating with each value of alpha or delta a single interval.
- ❑ It permits to divide by n the number of these intervals in family 2 and family 3.
- ❑ We propose Algorithm 1 to compute all these specific intervals in $O(n \log n)$.
- ❑ Of course for the first family, the submatrix remains an inverse Monge matrix (So we cannot use directly the so-called SMAWK-algorithm which is linear).
- ❑ Note that each entry of the matrix is computed in $O(\log n)$ time using the method of (Ouellet and Quimper 2018).
- ❑ If for some row, the minimal value is strictly negative, then the considered instance is infeasible. The overall complexity of this Algorithm 2 is $O(\alpha(n)n \log n)$ ($\alpha(n)$ Ackermann coefficient).

Klawe, Maria, and Daniel Kleitman. 1990. An Almost Linear Time Algorithm for Generalized Matrix Searching. SIAM J. Discrete Math. 3: 81–97.



STRICLY NEGATIVE ENERGETIC BALANCE

□ BEFORE TASKS:

▪ $p_i^+(\alpha) \leq p_i^-(\delta)$

□ AFTER TASKS:

▪ $p_i^+(\alpha) \geq p_i^-(\delta)$

□ BALANCING TASKS:

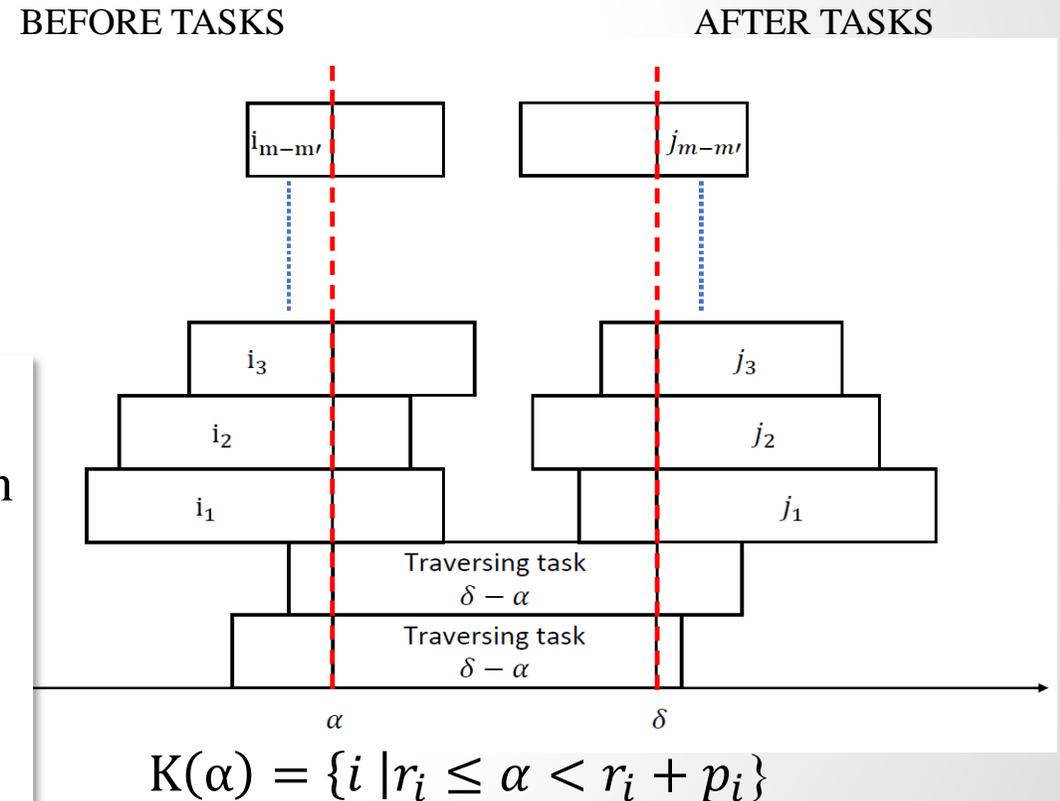
▪ $p_i^+(\alpha) = p_i^-(\delta)$ and $\alpha + \delta = r_i + d_i$

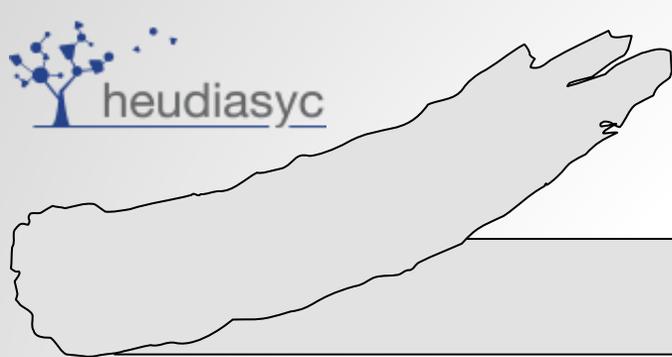
EQUILIBRIUM PROPERTY

Let us suppose that the minimal ENERGETIC BILAN of an interval $[\alpha, \delta]$ is strictly negative (« sursaturated interval »),

$$\begin{cases} \alpha \in \{r_i, d_i - p_i\} & \text{and} \\ \delta \in \{d_j, r_j + p_j, r_j + d_j - \alpha\} \end{cases} \quad \text{or} \quad \begin{cases} \delta \in \{d_j, r_j + p_j\} & \text{and} \\ \alpha \in \{r_i, d_i - p_i, r_j + d_j - \delta\} \end{cases}$$

we have m BEFORE TASKS and m AFTER TASKS.





STRICLY NEGATIVE ENERGETIC BALANCE

□ Let $K(\alpha)$ be the set of tasks which meet α when they are left shifted. $K(\alpha) = \{i \mid r_i \leq \alpha < r_i + p_i\}$

□ Let $<_\alpha$ be a total strict total order between tasks:

$$i <_\alpha j \Leftrightarrow \begin{cases} \text{rank}(\alpha, i) < \text{rank}(\alpha, j) & \text{or} \\ \text{rank}(\alpha, i) = \text{rank}(\alpha, j) \text{ and } i < j \end{cases} \quad \text{with:} \quad \text{rank}(\alpha, i) = \begin{cases} 0 & \text{if } \alpha \geq d_i - p_i \\ r_i + d_i & \text{if } \alpha < d_i - p_i \end{cases}$$

□ The set $K(\alpha)$ is ordered according to $<_\alpha$.

❖ Let k and k' be the m^{th} and $(m + 1)^{\text{th}}$ tasks of $K(\alpha)$ respectively (k' is supposed to exist):

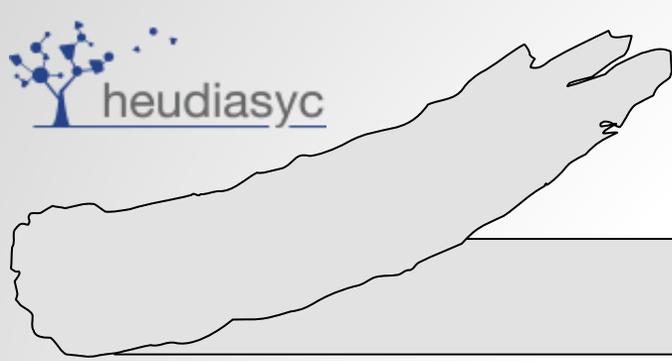
❖ Let $\delta_1 = r_k + d_k - \alpha$ and $\delta_2 = r_{k'} + d_{k'} - \alpha$

Critical interval proposition

There exists a critical interval such that δ is strictly larger than δ_1 and smaller or equal to δ_2 .

❖ **This proposition permits to divide by n the number of intervals of families 2 and 3 of Baptiste et al.**

❖ δ_1 and δ_2 depends on α and δ , all of them can be computed by Algorithm 1 we elaborate.



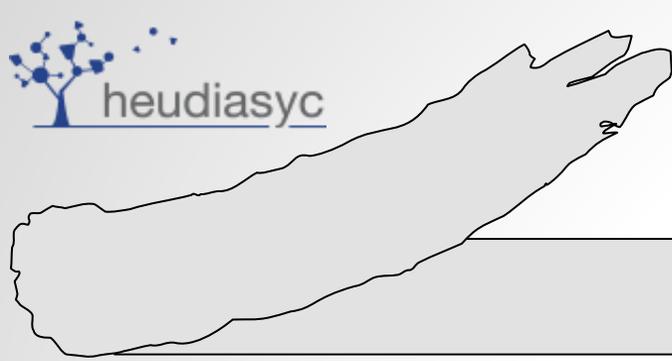
PART 2 - CONSTRUCTIVE BOUNDS

DESTRUCTIVE BOUNDS

- ❑ Baptiste, Le Pape and Nuijten: $O(n^2)$
- ❑ Ouellet and Quimper: $O(n \log^2 n)$
- ❑ Carlier, Sahli, Jouglet and Pinson: $O(\alpha(n)n \log n)$
- ❑ Practical complexity (function depends of n) are confirmed by computational results for any n
- ❑ The checker of Baptiste, Le Pape and Nuijten remains valuable because:
 - ❖ It brings more information (adjustments)

CONSTRUCTIVE BOUNDS

- ❑ **First alternative:**
 - ❖ Use a **checker** and apply a **dichotomic search**
 - ❖ It is not always good because the complexity is multiplied by $\log(C_{max})$ so at least multiplied by $\log n$
- ❑ **Second alternative:**
 - ❖ Characterize **mathematically the bound** and imagine other **nice algorithms**



PART 2 - CONSTRUCTIVE BOUNDS

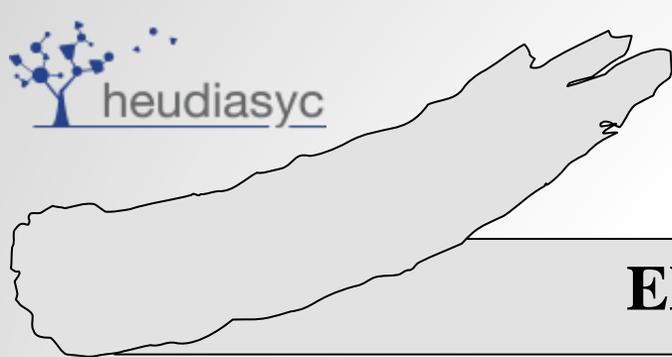
- $LB_1 = \max(r_i + p_i + q_i)$
 - Critical Path Bound

- $LB_2 =$ a constructive time table bound
 - Algorithm 3: $O(n \log n)$
 - Degenerate case : the minimal intervals are of length 0

- $LB_3 =$ a constructive critical interval bound
 - Algorithm 4: $O(n^2)$

- $LB_4 =$ Jackson Pseudo Preemptive Schedule

- $LB_5 =$ the preemptive Schedule
 - imposed idle periods



ENERGETIC REASONING: THREE CONSTRUCTIVE BOUNDS

On this figure you can see 8 types of tasks for an interval and especially Type 4 which is the CROSSING TASK Type

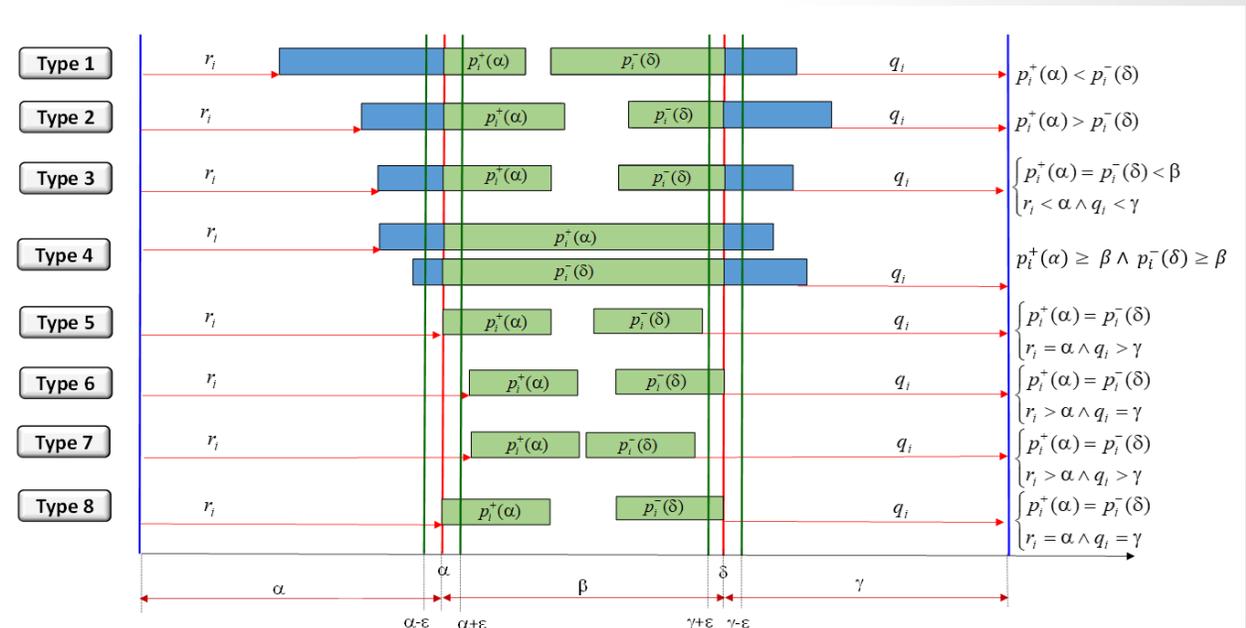
See also the “parties obligatoires” of Lahrichi, RAIRO 1982

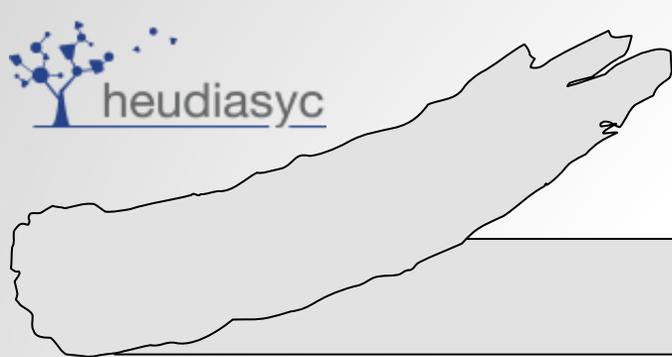
We look for the smallest value $C_{max} = ER$ accepted by the checker

Equilibrium property

It appears a discontinuity due to crossing tasks so:
 $ER = \max(LB_2, LB_3)$

See: Carlier, Jouglet, Pinson and Sahli, a quadratic algorithm for computing the energetic bound, PMS 2021



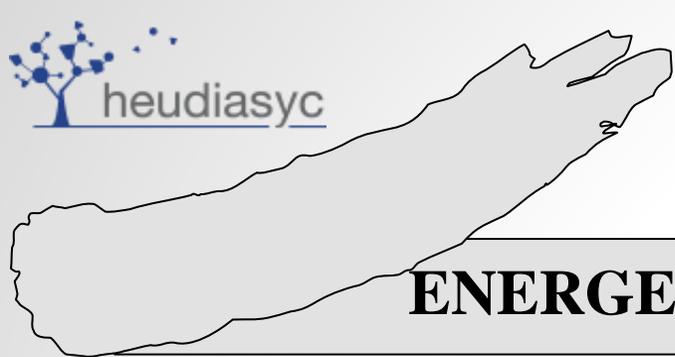


ENERGETIC REASONING: LB_2 - THE TIME TABLE BOUND

- ❖ Adjusting the trial makespan to keep at most m crossing operations (called cumulative constraint) leads to the time table lower bound LB_2 .
 - ❑ Given a makespan C_{max} and a time instant t , a crossing operation satisfies $d_i - p_i \leq t < r_i + p_i$. Clearly, such an operation is always running in the interval $[t - 1, t]$ for any non-preemptive schedule.
 - ❑ An immediate consequence is that if there are strictly more than m crossing operations at time t , then no non-preemptive schedule with a makespan less than or equal to C_{max} can exist.
 - ❑ This bound results from an adjustment of the trial makespan C_{max} ensuring that at any time instant t , there are at most m crossing operations, which can easily be tested by checking that there is no interval $[r_i + p_i - 1, r_i + p_i]$ in which $m + 1$ operations are processed.
- ❖ This technique is well known, it is called time tabling.

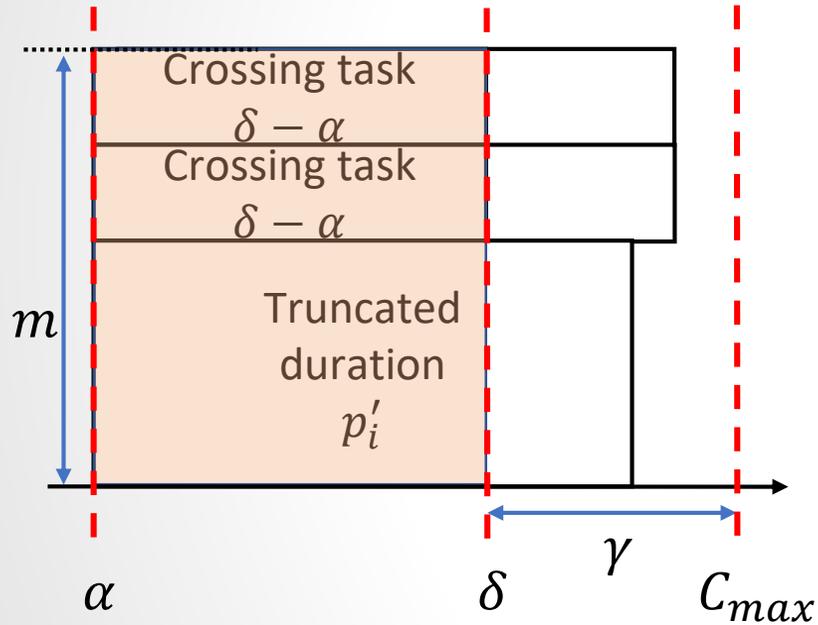
Example: Consider the instance where $m=2$ machines and involving $n=3$ operations, each operation having a processing time equal to 1, a release date equal to 0, and a tail equal to 0. We have: $LB_2 = 2$

We have proposed an $O(n \log n)$ algorithm for computing LB_2

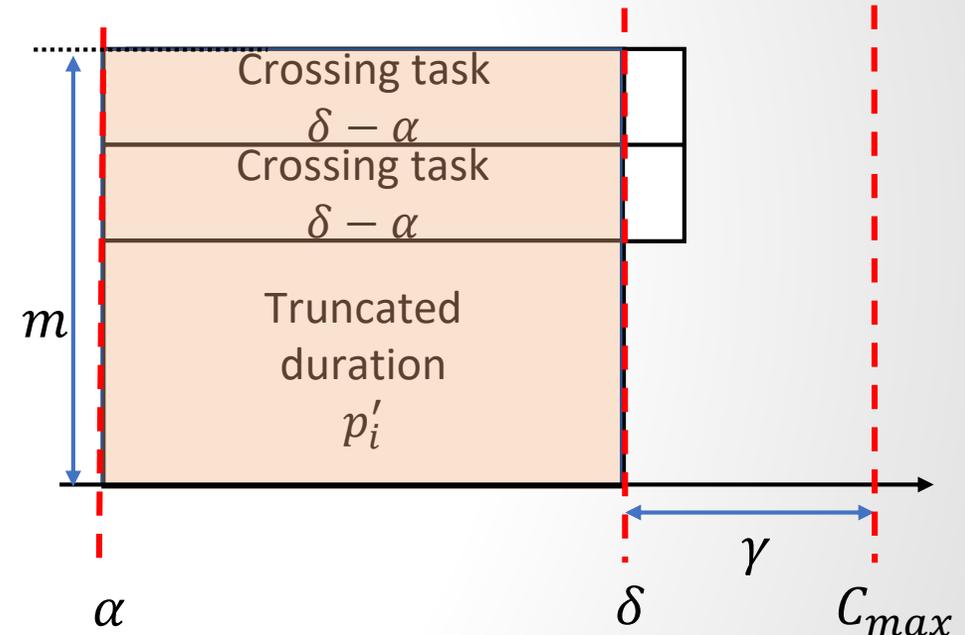


ENERGETIC REASONING: LB_3^{ER} - THE CRITICAL INTERVAL BOUND

An $O(n^2)$ algorithm



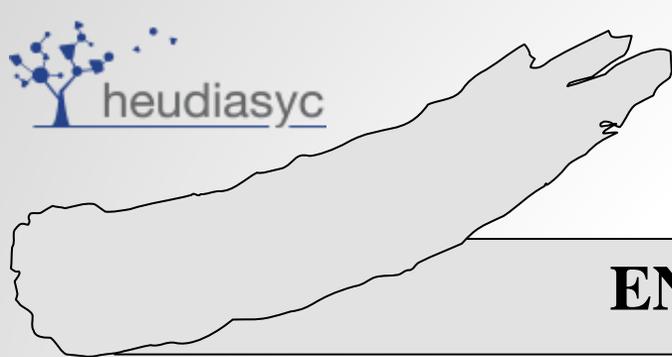
Increasing C_{max}



❖ The truncated duration: $\min(r_i + p_i - \alpha, q_i + p_i - \gamma, p_i, 0, \delta - \alpha)$

❖ **Double loop on α and γ**

❖ The constructive bound: LB_3 is obtained when there exists a saturated interval (critical interval)



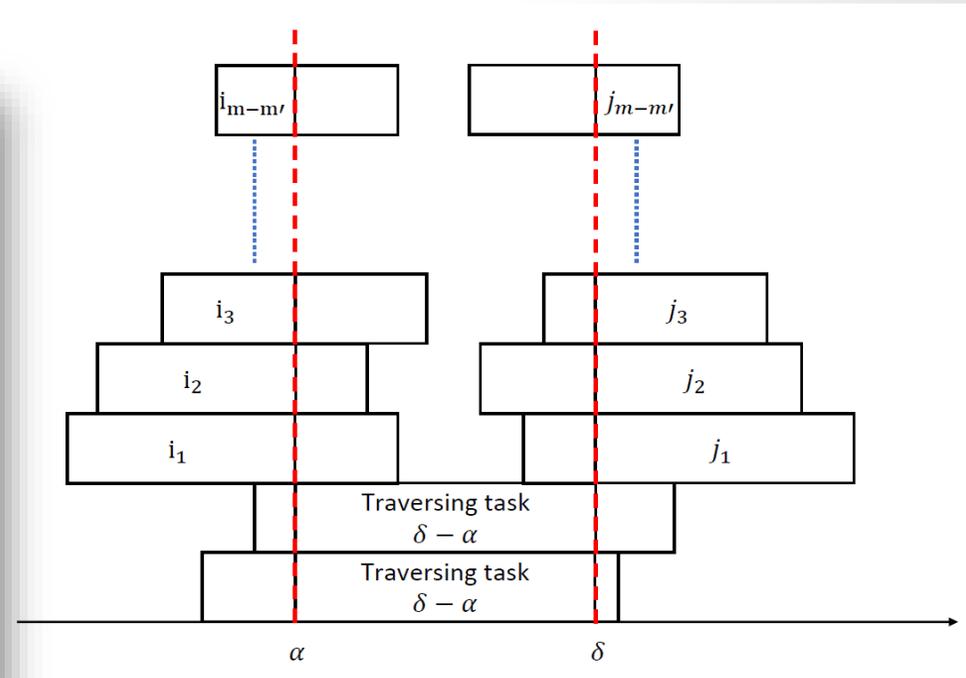
ENERGETIC REASONING: THE CRITICAL INTERVAL BOUND

Energy Theorem

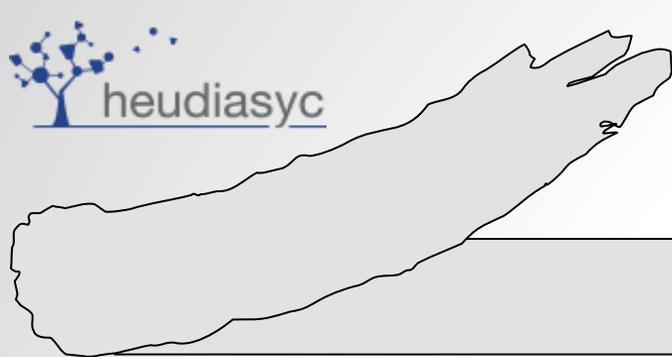
Theorem 1 (Energy Theorem). For a critical triplet $(\alpha^*, \beta^*, \gamma^*)$, we have:

$$\alpha^* + \beta^* + \gamma^* = \frac{1}{\tilde{m}} \left[(r_{i_1} + r_{i_2} + \dots + r_{i_{\tilde{m}}}) + \sum_{i \in \hat{J}(\alpha^*, \gamma^*)} p_i + (q_{j_1} + q_{j_2} + \dots + q_{j_{\tilde{m}}}) \right]$$

m' denoting the number of crossing operations, $\hat{J}(\alpha^*, \gamma^*) = J(\alpha^*, \gamma^*) - J_A(\alpha^*, \gamma^*)$ the subset of $\tilde{m} = m - m'$ non-crossing operations with a strictly positive energy on the time interval $[\alpha^*, \delta^*]$ with $\delta^* = C_{\max} - \gamma^*$, and where $\{i_1, i_2, \dots, i_{\tilde{m}}\} = J_B$, $\{j_1, j_2, \dots, j_{\tilde{m}}\} = J_A$, with $J_B \cap J_A = \emptyset$.



A critical interval



DESTRUCTIVE AND CONSTRUCTIVE BOUNDS FOR THE m -MACHINE SCHEDULING PROBLEM

Jacques CARLIER, Abderrahim SAHLI, Antoine JOUGLET, Eric PINSON

THE JPPS CONSTRUCTIVE BOUND

$P(t)=\emptyset$; $np(t)=m$

While $np(t)>0$ do

 Compute PA and TA, the sets of non in-process partially (resp. totally) available operations with maximal priority

If $PA \neq \emptyset$ or $TA \neq \emptyset$ then

If $|PA| + |TA| \leq np(t)$ then

$\forall i \in PA, s_i(t) = 1; np(t) = np(t) - |PA|$

If $|TA| > 0$ then

$\forall i \in TA, s_i(t) = \lceil np(t) - |PA| \rceil / |TA|; np(t) = 0$

Endif

Else

$\forall i \in PA \cup TA, s_i(t) = np(t) / (|PA| + |TA|); np(t) = 0$

Endif

$P(t) = P(t) \cup PA \cup TA$

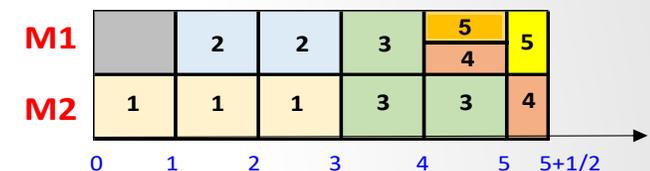
Else

$C(JPPS) = t$

Endif

Enddo

i	1	2	3	4	5
r_i	0	1	2	3	3
p_i	3	2	2	1	1
q_i	4	4	1	0	0



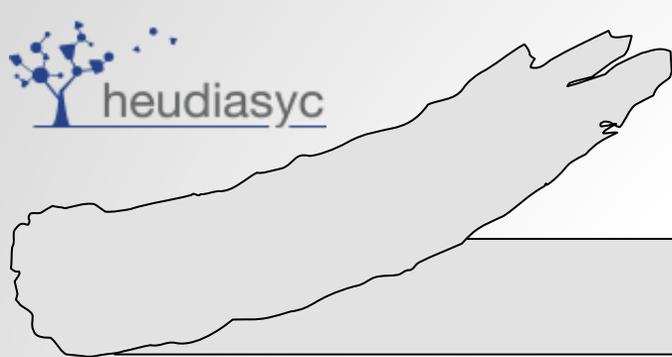
Theorem 2

$$LB^{JPPS} = C_{max}^{JPPS} = \max \left\{ \max_{i \in I} (r_i + p_i + q_i), \max_{J \subseteq I, |J| \geq m} LB_2^{SB}(J) \right\}$$

J denoting a subset of operations of I with $|J| \geq m$, and $LB_2^{SB}(J)$ the quantity defined by:

$$LB_2^{SB}(J) = \frac{1}{m} (r_{i_1} + r_{i_2} + \dots + r_{i_m}) + \frac{1}{m} \sum_{j \in J} p_j + \frac{1}{m} (q_{j_1} + q_{j_2} + \dots + q_{j_m})$$

where i_1, i_2, \dots, i_m (resp. j_1, j_2, \dots, j_m) denote the m first jobs in J rearranged in an ascending order of heads (resp. tails).



THE PREEMPTIVE BOUND

- ❖ Intervals with idleness periods in some intermediary intervals which are necessary

Theorem 3

$$LB^{PB} = \frac{1}{m} \sum_{j \in J_a} r_j + \frac{1}{m} \left\{ \sum_{j \in \bar{J}} p_j + \sum_{k \in \bar{K}} MH_k \right\} + \frac{1}{m} \sum_{j \in J_b} q_j$$

- ❖ Empirical results: the three bounds have most often the same value
- Carlier, Pinson, Sahli et Jouglet 2020, Comparison of three lower bounds for the CusP (submitted)

ER

$$LB^{ER} = \frac{1}{\bar{m}} \left[(r_{i_1} + r_{i_2} + \dots + r_{i_{\bar{m}}}) + \sum_{i \in \hat{J}(\alpha^*, \gamma^*)} p_i + (q_{j_1} + q_{j_2} + \dots + q_{j_{\bar{m}}}) \right]$$

\bar{m} : number of non-crossing operations
 $\hat{J}(\alpha^*, \gamma^*) = J(\alpha^*, \gamma^*) - J_A(\alpha^*, \gamma^*)$
 $\{i_1, i_2, \dots, i_{\bar{m}}\} = J_B, \{j_1, j_2, \dots, j_{\bar{m}}\} = J_A$ with $J_B \cap J_A = \emptyset$.

JPPS

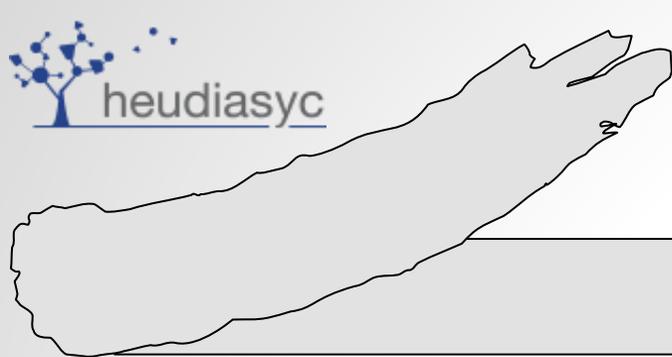
$$LB^{JPPS} = \max \left\{ \max_{i \in I} (r_i + p_i + q_i), \frac{1}{m} \sum_{i \in J_B} r_i + \frac{1}{m} \sum_{i \in J} r_i + \frac{1}{m} \sum_{i \in J_A} q_i \right\}$$

$\bar{J} = \text{Arg max}_{J \subseteq I, |J| \geq m} LB_2^{SB}(J),$
 $J_B = \{i_1, i_2, \dots, i_m\}, i_k = \text{Arg min}_{j \in \bar{J}} r_j$
 $J_A = \{i_1, i_2, \dots, i_m\}, i_k = \text{Arg min}_{j \in \bar{J}} q_j$

PB

$$LB^{PB} = \frac{1}{m} \sum_{j \in \bar{J}_a} r_j + \frac{1}{m} \left\{ \sum_{j \in \bar{J}} p_j + \sum_{k \in \bar{K}} MH_k \right\} + \frac{1}{m} \sum_{j \in \bar{J}_b} q_j$$

$\bar{J} = \{\text{not marked operation nodes in the optimal max flow problem associated with } G(L^{PB})\}$
 $\bar{K} = \{\text{interval node on which at least one unit of an operation in } \bar{J} \text{ is processed}\}$
 $J_B = \{i_1, i_2, \dots, i_m\} \subseteq \bar{J} \text{ st } r_{i_1} = r_{i_2} = \dots = r_{i_m} = \alpha$
 $J_A = \{j_1, j_2, \dots, j_m\} \subseteq \bar{J} \text{ st } q_{j_1} = q_{j_2} = \dots = q_{j_m} = \gamma$

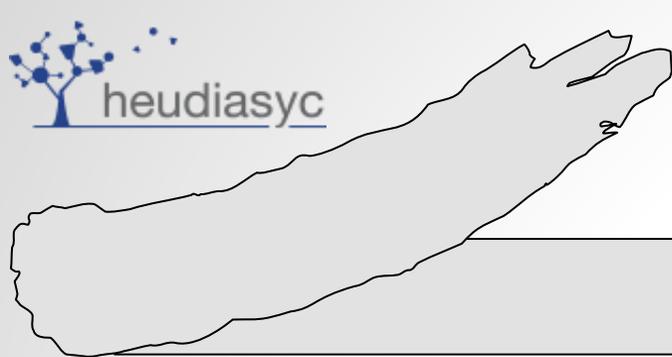


CONCLUSION

- ❑ We have three lower bounds for the m -machines scheduling problem:
 - ❖ THE PREEMPTIVE BOUND
 - ❖ JACKSON PSEUDO PREEMPTIVE BOUND
 - ❖ THE ENERGETIC CONSTRUCTIVE BOUND
- ❑ The energetic constructive bound can be expressed similarly as JPPS and preemption
$$\alpha + \sum (\text{Truncated durations}) + \gamma$$
- ❑ We have proposed a fully quadratic algorithm for computing this bound. It can be applied directly to the CUSP
- ❑ We improve the complexities of Checker and adjustment algorithms proposed by Baptiste et al.
- ❑ We characterize mathematically the three bounds. They are very similar.
- ❑ In practice the three bounds are generally equal.

OPEN QUESTIONS:

- ❑ Can we get rid of Ackermann coefficient (generally equal to 3) in practice? In theory?
- ❑ Can we improve the data structure based on Range trees?



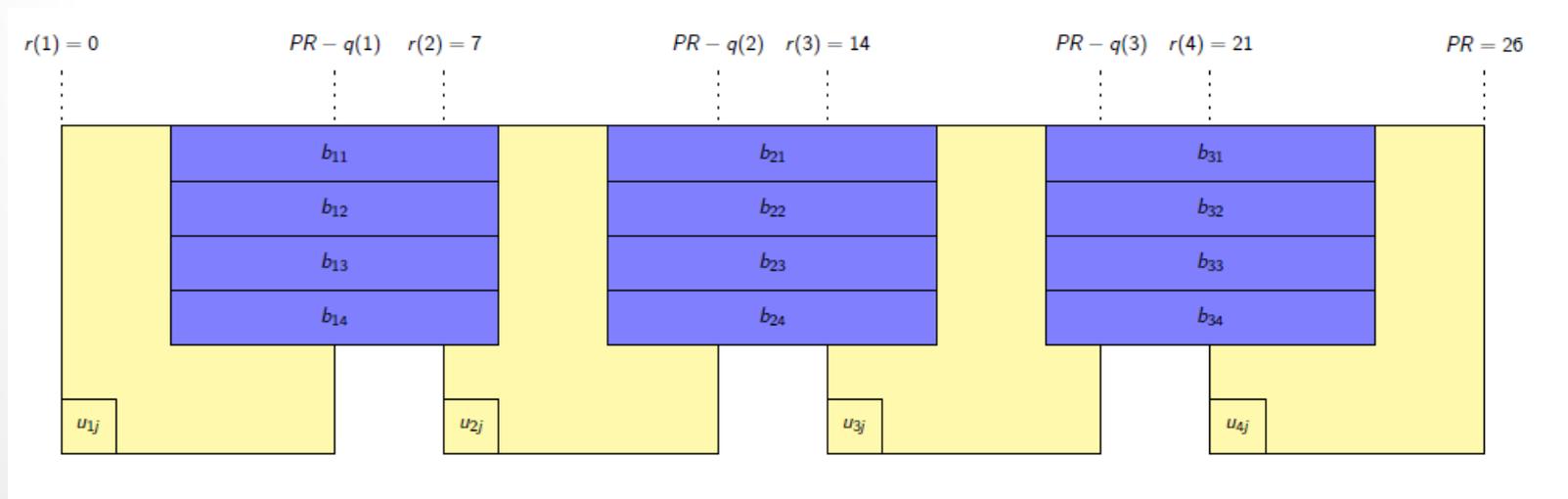
DESTRUCTIVE AND CONSTRUCTIVE BOUNDS FOR THE m -MACHINE SCHEDULING PROBLEM

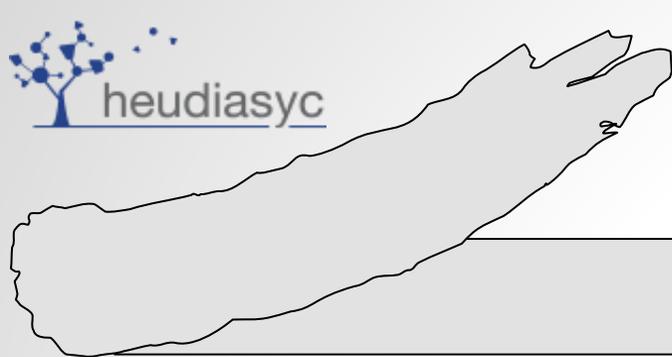
Jacques CARLIER, Abderrahim SAHLI, Antoine JOUGLET, Eric PINSON

WORKS IN PROGRESS

- ❖ EXTENSION OF ENERGY NOTION (See our talk ROADEF 2022) TO THE CUSP, THEN TO RCPSP BY USING JPS, JPPS AND LLB.
- ❖ THEORETICAL GAP BETWEEN THE THREE BOUNDS (collaboration with Claire Hanen, gap : pmax) Carlier, Hanen, PMS 2022.

❖ Illustration: A bandaneon data





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Thank you for your
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