## Single Machine Inserted Idle Time Scheduling with Release Times and Due Dates

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Abstract. The single machine scheduling problem is considered in which each task has a release dates, a processing time and a due date. The objective is to mimimize the maximum lateness. Preemption is not allowed. Scheduling problem  $1|r_j|L_{max}$  is a NP-hard problem. We define an IIT (inserted idle time) schedule as a feasible schedule in which a processor is kept idle at a time when it could begin processing an operation. We propose an approximate IIT algorithm named ELS/IIT (earliest latest start/ inserted idle time) and branch and bound algorithm, which produces a feasible IIT schedule for a fixed the maximum lateness L. In order to optimize over L we must iterate the scheduling process over possible values of L. New dominance criteria are introduced to curtail the enumeration tree. By this approach it is generally possible to eliminate most of the useless nodes generated at the lowest levels of decision tree.

#### 1 Introduction

The problem of minimizing the maximum lateness while scheduling tasks to single processor is a classical combinatorial optimization problem. Following the 3-field classification scheme proposed by Graham *et al.* [1], this problem is denoted by  $1|r_j|L_{max}$ . This problem relates to the scheduling problem [2], it has many applications, and it is *NP*-hard [3]. The approximation algorithms for single processor scheduling problem were given by Potts[4], Hall and Shmoys [5]. This algorithms used extended Jackson's rule with some modifications. The problem is solved by the extended Jackson's rule: whenever the machine is free and one or more tasks available for processing, schedule an available task with earliest due data.

This algorithms construct an nondelay schedule. A nondelay schedule has been defined by Baker[6] as a feasible schedule in which no processor is kept idle at a time when it could begin processing a task. An inserted idle time schedule (IIT) has been defined by J.Kanet and V.Sridharam [7] as a feasible schedule in which a processor is kept idle at a time when it could begin processing a task. J.Kanet and V.Sridharam [7] reviewed the literature with problem setting where IIT scheduling may be required.

In [8] we considered scheduling with inserted idle time for m parallel identical processors and proposed branch and bound algorithm for multiprocessor scheduling problem with precedence-constrained tasks. In [9] we proposed the approximation IIT

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algorithm for  $P|r_j|L_{max}$  problem. The goal of this paper is to propose IIT schedule for  $1|r_j|L_{max}$  problem. We propose an approximate IIT algorithm named ELS/IIT (earliest latest start/ inserted idle time) and branch and bound algorithm, which produces a feasible IIT(inserted idle time) schedule for a fixed maximum lateness L. The algorithm may be used in a binary search mode to find the smallest maximum lateness. A new method for evaluating partial solutions, selecting the next task and new ways of reducing the exhaustive search was designed.

We consider a system of tasks  $U = \{u_1u_2, \ldots, u_n\}$ . Each task is characterized by its execution time  $t(u_i)$ , its release time  $r(u_i)$  and its due dates  $D(u_i)$ . Release time  $r(u_i)$  is the time at which the task is ready for processing. Due date  $D(u_i)$  specifies the time limit by which the task should be completed. Set of tasks is performed on one processor. Task preemption is not allowed.

A schedule for a task set U is the mapping of each task  $u_i \in U$  to a start time  $\tau(u_i)$ . Maximum lateness of schedule S is the quantity

$$L_{\max} = \max\{\tau(u_i) + t(u_i) - D(u_i) | u_i \in U\}.$$

First, we propose an approximate IIT algorithm named ELS/IIT (earliest latest start/ inserted idle time). Then by combining the ELS/IIT algorithm and B&B method this paper presents BB/IIT algorithm which can find optimal solutions for single processor scheduling problem.

#### 2 Approximate algorithm ELS/IIT

For each task  $u_i$ , we know the earliest starting time  $r(u_i)$  and the latest start time  $v_{max}(u_i) = D(u_i) - t(u_i)$ , which is a priority of task. Let k tasks have been put in the schedule and partial schedule  $S_k$  have been constructed.

Let be  $t_{min}(k)$  the time of the termination of the processor after completion all tasks from the partial schedule  $S_k$ . The approximate schedule is constructed by ELS/IIT algorithm as follows:

- 1. Select the task  $u_0$ , such as  $v_{max}(u_0) = \min\{v_{max}(u_i) | u_i \notin S_k\}$ .
- 2. If  $idle(u_0) = r(u_0) t_{min}(k) > 0$  then choose a task  $u^* \notin S_k$ , which can be executed during the idle time of the processor without increasing the start time of the task  $u_0$ .

Namely define the start time of task  $u_i$  as  $\tau(u_i) = \max\{t_{min}(k), r(u_i)\}$  then set  $d(u_i) = \tau(u_i) + t(u_i)$  and find task  $u^*$  such as

$$v_{max}(u^*) = \min\{v_{max}(u_i) | d(u_i) \le r(u_0), u_i \notin S_k\}.$$

3. If the task  $u^*$  is found, then we assign to the processor the task  $u^*$ , otherwise the task  $u_0$ .

Suppose that  $L_{opt}$  denotes the maximum lateness of optimal schedule, while  $L_{ELS}$  denotes the the maximum lateness when the tasks are sequenced using ELS/IIT heuristic. We are interested in seeing how much worse  $L_{ELS}$  can be compared to  $L_{opt}$ . In what follows we will prove the following worse-case bound. Let  $T = \sum_{k=1}^{n} t(k)$  and  $t_{min} = \min\{t(u_i)|u_i \in U\}$ .

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#### Lemma 1.

$$\frac{L_{ELS} - L_{opt}}{L_{opt} + D_{max}} \le 1 - \frac{t_{min}}{T}.$$

Proof. Suppose that the sequence  $\pi = (l_1, l_2, ..., l_n)$  is generated using ELS/IIT algorithm. In schedule  $\pi$  let task  $l_j$  be the task with maximum lateness, then  $L_{ELS} = \tau(l_j) + t(l_j) - D(l_j)$ . Then we can find the task  $l_i$  such as  $L_{ELS} = r(l_i) + \sum_{k=i}^{j} t(l_k) - D(l_j)$ , where  $1 \leq l_i \leq l_j \leq l_n$ . If there is a choice, it is assumed that  $l_j$  is as small as possible and that  $l_i$  is as large as possible. Then either task  $l_i$  is the first task in the schedule or the processor will be idle before the beginning of task  $l_i$ . Consider tasks from  $l_i$  to  $l_j$  in the sequence  $\pi$ . If for all  $i \leq k \leq j - 1$  it is true that

$$D(l_k) - t(l_k) \le D(l_{k+1}) - t(l_{k+1})$$

then

$$D(l_i) - t(l_i) \le D(l_j) - t(l_j)$$

Otherwise we can find k such as  $i \leq k \leq j - 1$  and task  $l_k$  such as

$$D(l_k) - t(l_k) > D(l_{k+1}) - t(l_{k+1}).$$

But for  $k+1 \leq u \leq j-1$  we have that

$$D(l_u) - t(l_u) \le D(l_{u+1}) - t(l_{u+1}).$$

Then  $\tau(l_k) < r(l_{k+1})$  and  $\tau(l_k) + t(l_k) \leq r(l_{k+1})$ . Hence during the application of ELS/IIT algorithm task  $l_{k+1}$  begins at its release date  $\tau(l_{k+1}) = r(l_{k+1})$ , which contradicts the choice of task  $l_i$ . If k = j - 1 and task  $l_j$  begins at its release date  $\tau(l_j) = r(l_j)$  then schedule  $\pi$  is optimal schedule.

In either case we have from the construction of schedule that

$$D(l_i) - t(l_i) \le D(l_j) - t(l_j).$$

On the other hand

$$L_{opt} \ge r(l_i) + t(l_i) - D(l_i) \ge r(l_i) + t(l_j) - D(l_j)$$

and

$$L_{opt} \ge T - D_{max}$$

Then

$$L_{ELS} - L_{opt} \le r(l_i) + \sum_{k=i}^{j} t(l_k) - D(l_j) - r(l_i) - t(l_j) + D(l_j) = \sum_{k=i}^{j-1} t(l_k).$$

Then

$$\frac{L_{ELS} - L_{opt}}{L_{opt}} \le \frac{\sum_{k=i}^{j-1} t(l_k)}{T} \le 1 - \frac{t_{min}}{T}$$

To illustrate ELS heuristic we consider the following example. There are two task:  $r_1 = 0; t_1 = T - 1; D_1 = T - 1; r_2 = 0; t_2 = 1; D_2 = 1 + \delta$ . Then ELS/IIT algorithm will schedule the large task first and maximum lateness  $L_{ELS} = T - 1 - \delta$ . But maximum lateness of optimal schedule  $L_{opt} = 1$ .

This problem can be solved using extended Jackon's rule (EDD): whenever the machine is free and one or more tasks are available for processing, schedule an available task with earliest due date. We consider examples, in which EDD algorithm builds a bad schedule, while ELS algorithm builds the optimal schedule and vice versa. For this example extended Jackson's rule (EDD heuristic) makes the optimal schedule. But if we change example:  $r_1 = 0$ ;  $t_1 = T - 1$ ;  $D_1 = T$ ;  $r_2 = r$ ;  $t_2 = 1$ ;  $D_2 = 1$ , EDD heuristic will schedule the large task first and maximum lateness  $L_{EDD} = T - 1$ . ELS/IIT algorithm generates optimal schedule  $L_{ELS} = r$  and  $L_{opt} = r$ ;

The example 2 from [5] in table 1 demonstrates the worse-case instance for approximation algorithm *B*, which was proposed in [5]. There are five tasks,  $r_i, t_i, D_i$  represent the release date, processing time and due date, respectively, of task *i*.  $L_i = \tau_i + t_i - D_i$  and  $v_{max}(i) = D_i - t_i$ . ELS/IIT algorithm generates the optimal schedule

Table	1.	Examp	le	<b>2</b>

Task	$r_i$	$t_i$	$D_i$	$v_{max}(i)$	$ au_i$	$L_i(ELS)$
1	0	Q	2Q + 2	Q+2	Q+2	0
2	1	Q	1	1-Q	1	Q
3	Q+1	1	0	-1	1 + Q	Q + 2
4	2Q + 1	Q	2Q + 1	Q+1	Q+3	Q + 2
5	2Q + 2	1	Q+1	Q	2Q + 2	Q + 2

(2,3,1,5,4) with the maximum lateness  $L_{ELS} = Q + 2$ . Algorithm B [5] generates schedule (1,2,3,4,5) with the maximum lateness  $L_B = 2Q + 2$ .

#### 3 Algorithm for constructing an optimal schedule

The branch and bound algorithm produces a feasible IIT schedule for a fixed maximum lateness L. In order to optimize over L we must iterate the scheduling process over possible values of L. Let  $L_{opt}$  be maximum lateness of optimal schedule. We defile interval (a, b] such as  $a < L_{opt} \leq b$ .

First we define the low bound of maximum lateness. We calculate two low bounds

$$LB1 = \max\{r(u_i) + t(u_i) - D(u_i) | u_i \in U\}$$

and

$$LB2 = \max\{\sum_{i=1}^{n} t(u_i) - D_{max}\}.$$

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Then the low bound of maximum lateness LB is

$$LB = \max\{LB1, LB2\}.$$

The upper bound  $b = \sum_{i=1}^{n} t(u_i) + r_{max} - D_{min}$  [10]. Then  $L_{opt} \in (a, b]$ .

Select  $z = \lceil (a+b)/2 \rceil$  and use branch and bound method for constructing a feasible schedule BB(U, D + z; S). If we find a feasible schedule then we take interval (a, z], else we take interval (z, b] and repeat.

Algorithm  $SCHEDULE(U; S_{opt}, L_{opt})$ 

- 1. Calculate  $a \ b$ .
- 2. While b a > eps do
- 3. Set  $z := \lceil (a+b)/2 \rceil$ .
- 4. We recalculate due dates  $D(u_i)$  as  $D^*(u_i) = D(u_i) + z$ , recalculate makespan

 $D_{max} = \max\{D^*(u_i)|u_i \in U\}$ 

and the latest start times  $v_{max}(u_i) = D^*(u_i) - t(u_i)$ .

- 5. Use procedure  $BB(U, D^*; S, L_S)$  for constructing a feasible schedule. 6. If we find feasible schedule S, then  $S_{rec} := S$ ;  $L_{rec} := L_S$  and set  $b := L_S$ , else set
- 0. If we find reactive schedule S, then  $S_{rec} := S$ ,  $L_{rec} := L_S$  and set  $b := L_S$ , else set a := z.
- 7. endwhile
- 8.  $S_{opt} := S_{rec}$ , and  $L_{opt} := L_{rec}$ .

# 4 Branch and bound method for constructing a feasible schedule $BB(U, D^*; S)$

The branch and bound algorithm produces a feasible IIT( inserted idle time) schedule for a fixed maximum lateness L. In order to optimize over L we must iterate the scheduling process over possible values of L.

For the formal description of the branch and bound method we must give a definition of partial solutions. It is convenient to represent the schedule as a permutation of tasks. For each permutation of tasks  $\pi = (u_{i_1}, u_{i_2}, \ldots, u_{i_n})$ , one can construct a schedule  $S_{\pi}$ as follows: the task is assigned to the processor at the earliest possible time. Partial solution  $\sigma_k$ , where k the number of jobs will be regarded as a partial permutation  $\sigma_k = (u_{i_1}, u_{i_2}, \ldots, u_{i_k})$ , which is determined partial schedule.

**Definition 1.** The solution  $\gamma_n = (l_1, l_2, \dots, l_n)$  is called the extension of partial solutions  $\sigma_k = (q_1, q_2, \dots, q_k)$ , if  $l_1 = q_1, l_2 = q_2, \dots, l_k = q_k$ .

**Definition 2.** A partial solution  $\sigma_k$  is called a feasible if there exists an extension of  $\sigma_k$ , which is a feasible schedule.

For each task  $u_i$ , we know the earliest starting time  $r(u_i)$  and the latest start time  $v_{max}(u_i) = D(u_i) - t(u_i)$ , In order to make the feasible schedule, it is necessary that each task  $u_i \in U$ , the start time of its execution  $\tau(u_i)$  satisfies the inequality

$$r(u_i) \le \tau(u_i) \le v_{max}(u_i).$$

In order to describe the branch and bound method it is necessary to determine the set of tasks that we need to add to a partial solution, the order in which task will be chosen from this set and the rules that will be used for eliminating partial solutions.

Let I be the total idle time of processor in the feasible schedule S of length  $D_{max}$ , then  $I = D_{max} - \sum_{i=1}^{n} t(u_i)$ .

For a partial solution  $\sigma_k$  we know for task  $idle(u_i)$ — idle time of processor before start the task  $u_i$ .

At each level k will be allocated a set of tasks  $U_k$ , which we call the the ready tasks. These are tasks that need to add to a partial solution  $\sigma_{k-1}$ , so check all the possible continuation of the partial solutions.

**Definition 3.** Task  $u \notin \sigma_k$  is called the ready task at the level k, if r(u) satisfies the inequality  $r(u) - t_{\min}(k) \leq I - \sum_{u \in \sigma_k} idle(u_i)$ .

The main way of reducing of the exhaustive search will be the earliest possible identification unfeasible solutions.

**Definition 4.** Let the task  $u_{cr} \notin \sigma_k$  is such as  $v_{max}(u_{cr}) = \min\{v_{max}(u) | u \notin \sigma_k\}$ . The task  $u_{cr} \notin \sigma_k$  is called the delayed task for  $\sigma_k$ , if  $v_{max}(u_{cr}) < t_{min}(k)$ .

Below we formulate and proof the rules of deleting unfeasible partial solutions.

**Lemma 2.** Let delayed task  $u_{cr}$  for a partial solution  $\sigma_k$  exists, then

- 1. The partial solution  $\sigma_k$  is unfeasible.
- 2. For any task u, such as  $\max\{t_{min}k 1, r(u)\} + t(u) > v_{max}(u_{cr})$  a partial solution  $\sigma_{k-1} \cup u$  is unfeasible.
- 3. If  $\max\{t_{min}(k-1), r(u_{cr})\} + t(u_{cr}) > v_{max}(u_k)$  then the partial solution  $\sigma_{k-1}$  is unfeasible.

*Proof.* 1. This follows from definition the delayed task.

2. Let  $t_{min}(k)$  is the time of ending all tasks which are included in a partial solution  $\sigma_k$ 

If the task  $u_{cr}$  is delayed task, then  $v_{\max}(u_{cr}) < t_{\min}(k)$ .

After cancelation of the last scheduled task  $u_k$ , algorithm returns to the partial solution  $\sigma_{k-1}$ . Processor ends all task at time  $t_{min}(k-1)$ . If we add a task u to the partial solution  $\sigma_{k-1}$  on step k, we must assign the task  $u_{cr}$  on the processor on step k+1. Therefore should be performed

$$\max\{t_{\min}(k), r(u)\} + t(u) \le v_{\max}(u_{cr}).$$

3. Consider two cases.

 $3.1 v_{\max}(u_k) \leq v_{\max}(u_{cr})$ . If the task  $u_{cr}$  is delayed task, then  $v_{\max}(u_{cr}) < t_{\min}(k)$ . After deleting the task  $u_k$ , the task  $u_{cr}$  is assigned to processor. Processor ends all it's task at time  $t_{\min}(k) = \max\{t_{\min}(k-1), r(u_{cr})\} + t(u_{cr})$ .

On lemma  $\max\{t_{min}(k-1), r(u_{cr})\} + t(u_{cr}) > v_{max}(u_k)$ , then the task  $u_k$  will be the delayed task for partial solution  $\sigma_k = \sigma_{k-1} \cup u_{cr}$ .

3.2. If  $v_{\max}(u_k) > v_{\max}(u_{cr})$  then the partial solution  $\sigma_{k-1} \cup u_{cr}$  was tested early and it was unfeasible. For any solution  $\sigma_{k-1} \cup u$  task  $u_k$  or task  $u_{cr}$  will be delayed task. The partial solution  $\sigma_k = \sigma_{k-1} \cup u$  is unfeasible for all u, then the partial solution  $\sigma_{k-1}$  is unfeasible. Algorithm 1 BB/IIT algorithm

1: Set  $k := 1; t_{min}(0) := 0; \sigma_0 = \emptyset;$ 2: while (k > 0) and (k < n + 1) do 3: Determine the task  $u_{cr}$  such as  $v_{\max}(u_{cr}) = \min\{v_{\max}(u) | u \notin \sigma_{k-1}\};$ 4: if  $v_{\max}(u_{cr}) \leq t_{\min}(k)$  then 5:Compute  $EST = est(\sigma_{k-1});$ if  $EST \leq 0$  then 6: 7: Select the task  $u_0$ , use ELS/IIT procedure 8: Set the task  $u_0$  on processor and create partial solution  $\sigma_k = \sigma_{k-1} \cup u_0$ 9: else 10: Perform step back and create the partial schedule  $\sigma_{k-1}$ 11: else 12:Delete all unfeasible partial solution by using Lemma 2 13:end if 14:end if 15: end while 16: if k = 0, then Maximum lateness of optimal schedule is greater than  $L_S$ . 17:18: end if 19: if k = n, then We find feasible schedule  $S = \sigma_n$  and its maximum lateness is equal  $L_S$ 20:21: end if

Another method for determining unfeasible partial solutions based on a comparison of resource requirements of tasks and processor power. In this case we propose to modify the algorithm for determining the interval of concentration [11] for the complete schedule. We apply this algorithm to a partial schedule  $\sigma_k$  and determine its admissibility.

We consider time intervals  $[t_1, t_2] \subseteq [t_{\min}(k), D_{max}].$ 

For all tasks  $u_i \notin \sigma_k$  we find minimal time of its begin:  $v(u_i) = \max\{r(u_i), time_k\}$ . Let  $L([t_1, t_2])$  be a length of time interval  $[t_1, t_2]$ .

Let  $M_k(t_1, t_2)$  be the total minimal time of tasks in time interval  $[t_1, t_2]$ , then

$$M_k(t_1, t_2) = \sum_{u_i \notin \sigma_k} \min\{L(x_k(u_i)), L(y(u_i))\}$$

where

$$x_k(u_i) = [v(u_i), v(u_i) + t(u_i)] \cap [t_1, t_2],$$
  
$$y(u_i) = [v_{\max}(u_i), v_{\max}(u_i) + t(u_i)] \cap [t_1, t_2].$$

Let

$$est(\sigma_k) = \max_{[t_1, t_2] \in [t_{min}(k), D_{max}]} \{ M_k(t_1, t_2) - (t_2 - t_1) \}$$

**Lemma 3.** If  $est(\sigma_k) > 0$  then a partial solution  $\sigma_k$  is unfeasible.

The pseudo-code of Branch and bound method for constructing a feasible schedule BB(U, D; S) is shown in Algorithm 1.

#### 5 Conclusions

In this paper we propose IIT schedule for  $1|r_j|L_{max}$  problem. We propose an approximate IIT algorithm named ELS/IIT (earliest latest start/ inserted idle time) and branch and bound algorithm, which produces a feasible IIT(inserted idle time) schedule for a fixed maximum lateness L. The algorithm may be used in a binary search mode to find the smallest maximum lateness. We compare IIT algorithm and algorithms which use extended Jackson's rule. We can see, that algorithms build good schedule for various examples, so combining the two approaches, we can get the best solutions for all examples.

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