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Minimizing the total completion time on-line on a single machine, using restarts

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# Minimizing the Total Completion Time On-line On a Single Machine, Using Restarts

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#### **ABSTRACT**

We give an algorithm to minimize the total completion time on-line on a single machine, using restarts, with a competitive ratio of 3/2. The optimal competitive ratio without using restarts is 2 for deterministic algorithms and  $e/(e-1) \approx 1.582$  for randomized algorithms. This is the first restarting algorithm to minimize the total completion time that is proved to be better than an algorithm that does not restart.

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# 1. Introduction

We examine the scheduling problem of minimizing the total completion time (the sum of completion times) on-line on a single machine, using restarts. Allowing restarts means that the processing of a job may be interrupted, losing all the work done on it. In this case, the job must be started again later (restarted), until it is completed without interruptions. We study the on-line problem, where algorithms must decide how to schedule the existing jobs without any knowledge about the future arrivals of jobs.

We compare the performance of an on-line algorithm  $\mathcal{A}$  to that of an optimal off-line algorithm OPT that knows the entire job sequence  $\sigma$  in advance. The total completion time of an input  $\sigma$  given to an algorithm ALG is denoted by ALG( $\sigma$ ). The competitive ratio  $\mathcal{R}(\mathcal{A})$  of an on-line algorithm  $\mathcal{A}$  is defined as

$$\mathcal{R}(\mathcal{A}) = \sup_{\sigma} \frac{\mathcal{A}(\sigma)}{\text{OPT}(\sigma)} .$$

Known results For the case where all jobs are available at time 0, the shortest processing time algorithm SPT [8] has an optimal total completion time. This algorithm runs the jobs in order of

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increasing size. Hoogeveen and Vestjens [4] showed that if jobs arrive over time and restarts are not allowed, the optimal competitive ratio is 2, and they gave an algorithm DSPT ('delayed SPT') which maintained that competitive ratio. Two other optimal algorithms were given by Phillips, Stein and Wein [5] and Stougie [9].

Using randomization, it is possible to give an algorithm of competitive ratio  $e/(e-1) \approx 1.582$  [1] which is optimal [10]. Vestjens showed a lower bound of 1.112 for deterministic algorithms that can restart jobs [12]. This was recently improved to 1.211 by Epstein and Van Stee [2].

We are aware of three previous instances where restarts were proven to help. Firstly, in [6] it was shown that restarts help to minimize the makespan (the maximum completion time) of jobs with unknown sizes on m related machines. Here each machine has its own speed, which does not depend on the job it is running. The algorithm in [6] obtains a competitive ratio of  $O(\log m)$ . Without restarts, the lower bound is  $\Omega(\sqrt{m})$ .

Secondly, [11] shows that restarts help to minimize the maximum delivery time on a single machine, obtaining an (optimal) competitive ratio of 3/2 while without restarts,  $(\sqrt{5} + 1)/2$  is the best possible. In this problem, each job needs to be delivered after completing, which takes a certain given extra time.

Thirdly, in [3] it is shown that restarts help to minimize the number of *early* jobs (jobs that complete on or before their due date) on a single machine, obtaining an (optimal) competitive ratio of 2 while without restarts, it is not possible to be competitive at all (not even with preemptions).

Our results Until now, it was not known how to use restarts in a deterministic algorithm for minimizing the total completion time on a single machine to get a competitive ratio below 2, whereas a ratio of 2 can be achieved by an algorithm that does not restart. We give an algorithm RSPT ('restarting SPT') of competitive ratio 3/2. This ratio cannot be obtained without restarts, even with the use of randomization.

Our algorithm is arguably the simplest possible algorithm for this problem that uses restarts: it bases the decision about whether or not it will interrupt a running job J for an arriving job J' solely on J and J'. It ignores, for example, all other jobs that are waiting to be run. We show in section 3 that the analysis of our algorithm is tight and that all "RSPT-like" algorithms have a competitive ratio of at least 1.467845. This suggests that a more complicated algorithm would be required to get a substantially better competitive ratio, if possible.

# 2. Algorithm RSPT

We present our on-line algorithm RSPT for the problem of minimizing the total completion time on a single machine, using restarts. See Figure 1. This algorithm has the following properties (where J, x, s, r and w are defined as in Figure 2.1). OPT is any optimal off-line algorithm (there can be more than one).

- **R1** RSPT only interrupts a job J for jobs that are smaller and that can finish earlier than J (i.e. r + w < s + x).
- **R2** If RSPT does not interrupt J for a job of size w that arrives at time r, then  $r + w > \frac{2}{3}(s + x)$ . In this case, if RSPT is still running J at time r + w, it runs J until completion.
  - **Proof.** Any job J' that arrives after time r+w satisfies  $r'+w' \ge r' > r+w > \frac{2}{3}(s+x)$  in this case, and does not cause an interruption.
- **R3** Suppose that  $s \le t \le \frac{2}{3}(s+x)$ , and RSPT has been running J continuously from time s until time t. Then at time t, all jobs smaller than J that are completed by OPT are also completed by RSPT.
  - **Proof.** The property holds for t = s by definition of RSPT. For t > s, a smaller job that OPT

3. RSPT-like algorithms

Figure 1: The algorithm RSPT

RSPT maintains a queue Q of unfinished jobs. A job is put into Q when it arrives. A job is removed from Q when it is completed. For any time t, RSPT deals first with all arrivals of jobs at time t before starting or interrupting any job.

At any time t where either RSPT completes a job, or one or more jobs arrive while RSPT is idle, RSPT starts to run the smallest (remaining) job in Q. If  $Q = \emptyset$ , RSPT is idle (until the next job arrives).

Furthermore, if at time r a job J is running that started (most recently) at time s and has size x, and if at time r a new job J' arrives with size w, then RSPT interrupts J and starts to run J' if and only if

$$r + w \le \frac{2}{3}(s+x). \tag{2.1}$$

Otherwise, RSPT continues to run J (and J' is put into Q).

completed and RSPT did not, can thus only have arrived after time s. But then it would have caused an interruption of J before time t.

**R4** Suppose that  $s < t \le \frac{2}{3}(s+x)$ , and RSPT has been running J continuously from time s until time t. Then at time t, OPT has completed at most one job that RSPT has not completed. **Proof.** By R3, the only jobs that OPT can have already completed at time t that RSPT has not, have size at least x. However, we have t < 2x, since  $t \ge 2x \Rightarrow \frac{3}{2}(s+x) \ge 2x \Rightarrow s \ge 1$ 

not, have size at least x. However, we have t < 2x, since  $t \ge 2x \Rightarrow \frac{3}{2}(s+x) \ge 2x \Rightarrow s \ge 2x \Rightarrow \frac{1}{3}s \ge \frac{2}{3}x \Rightarrow s \ge \frac{2}{3}(s+x) \Rightarrow t > \frac{2}{3}(s+x)$ , a contradiction. This proves this property.  $\Box$ 

**R5** At any time t, RSPT only interrupts jobs that it cannot finish before time  $\frac{3}{2}t$ . Hence, RSPT does not interrupt any job with a size of at most half its starting time.

**Proof.** If there is an interruption at time t, then a job arrived at time t for which  $t+w \le \frac{2}{3}(s+x)$ , hence without interruptions J would have finished at time  $s+x \ge \frac{3}{2}(t+w) \ge \frac{3}{2}t$ .

# 3. RSPT-LIKE ALGORITHMS

It can be seen that the competitive ratio of RSPT is not better than 3/2: consider a job of size 1 that arrives at time 0, and N jobs of size 0 that arrive at time  $2/3 + \varepsilon$ . RSPT will run these jobs in order of arrival time and have a total completion time of N+1. However, it is possible to obtain a total completion time of  $(2/3 + \varepsilon)(N+1) + 1$  by running the jobs of size 0 first. By letting N grow without bound, the competitive ratio tends to 3/2 for  $\varepsilon \to 0$ .

We define an algorithm  $\text{RSPT}(\alpha)$  as follows:  $\text{RSPT}(\alpha)$  behaves exactly like RSPT, but (2.1) is replaced by

$$r + w \le \alpha(s + x)$$
.

It is possible that  $RSPT(\alpha)$  outperforms RSPT for some value of  $\alpha$ . However, we show that the improvement could only be very small, if any. To keep the analysis manageable, we analyze only RSPT.

**Lemma 3.1** For all  $0 < \alpha < 1$ ,  $\mathcal{R}(RSPT(\alpha)) \ge 1.467845$ .

**Proof.** Similarly to above, we have  $\mathcal{R}(RSPT(\alpha)) > 1/\alpha$ .

4. Analysis of RSPT

Consider the following job sequence. A job  $J_1$  of size 1 arrives at time 0, a job  $J_2$  of size  $\alpha$  at time  $\varepsilon$ , a job  $J_3$  of size 0 at time  $\alpha$  (causing an interruption).

For  $\varepsilon \to 0$ , the optimal cost for this sequence tends to  $3\alpha+1$  (using the order  $J_2, J_3, J_1$ ). However, RSPT( $\alpha$ ) pays  $5\alpha + 1$ .

Now consider the same sequence where after job  $J_3$ , at time  $\alpha + \varepsilon$  one final job  $J_4$  of size  $\alpha(2\alpha) - \alpha$  arrives. For this sequence, the optimal cost tends to  $4\alpha^2 + 2\alpha + 1$  whereas RSPT( $\alpha$ ) pays  $4\alpha^2 + 5\alpha + 1$ .

This implies that  $\mathcal{R}(\text{RSPT}(\alpha)) \ge \max(1/\alpha, \frac{5\alpha+1}{3\alpha+1}, \frac{10\alpha^2+4\alpha+1}{10\alpha^2+1}) \ge \frac{41+5\sqrt{57}}{31+3\sqrt{57}} = 1.467845.$ 

#### 4. Analysis of RSPT

#### 4.1 Outline

Consider an input sequence  $\sigma$ . To analyze RSPT's competitive ratio on such a sequence, we will work with credits and an invariant.

Each job that arrives receives a certain amount of credit, based on its (estimated) completion time in the optimal schedule and in RSPT's schedule. We will show that each time that RSPT starts a job, we can distribute the credits of the jobs so that a certain invariant holds, using an induction. The calculations of the credits at such a time, and in particular of the estimates of the completion times in the two schedules, will be made under the assumption that no more jobs arrive later.

We will first give the invariant. Then we need to show that the invariant holds at the first time that RSPT starts a job. For the induction step, we need to show that the invariant holds again if RSPT starts a job later,

- given that it held after the previous start of a job;
- taking into account any jobs which arrived after that (possibly updating calculations for some jobs that had arrived before); and
- assuming no jobs arrive from now on.

Using this structure, the above-mentioned assumption that no jobs arrive after the current start of a job does not invalidate the proof. There will be one special case where the invariant does not hold again immediately. In that case, we will show the invariant is restored at some later time before the completion of  $\sigma$ . This case will be analyzed in Section 11.

Finally, we need to show that if the invariant holds at the last time that RSPT starts a job, then RSPT maintains a competitive ratio of 3/2. We begin by making some definitions and assumptions.

## 4.2 Definitions and assumptions

**Definition 1** An event is the start of a job by RSPT.

**Definition 2** An event has the property STATIC if no more jobs arrive after this event.

At the time of an event, RSPT completes a job, interrupts a job, or is idle.

In our analysis, we will use 'global assumptions' and 'event assumptions'. We show that we can restrict our analysis to certain types of input sequences and schedules and formulate these restrictions as Global assumptions. Then, when analyzing an event (from the remaining set of input sequences), we show in several cases that it is sufficient to consider events with certain properties, and make the corresponding Event assumption. The most important one was already mentioned above:

Event assumption 1 The current event has the property STATIC.

5. Definitions and notations 5

The optimal off-line algorithm There can be more than one optimal schedule for a given input  $\sigma$ . For the analysis, we fix some optimal schedule and denote the algorithm that makes that schedule by OPT. We use this schedule in the analysis of every event. Hence, OPT takes into account jobs that have not arrived yet in making its schedule, but OPT does not change its schedule between successive events: the schedule is completely determined at time 0. OPT does not interrupt jobs, because it can simply keep the machine idle instead of starting a certain job and interrupting it later, without affecting the total completion time. We can make the following assumption about RSPT and OPT, because the cost of OPT and RSPT for a sequence is unaffected by changing the order of jobs of the same size in their schedules.

Global assumption 1 If two or more jobs in  $\sigma$  have the same size, RSPT and OPT complete them in the same order.

**Definition 3** An input sequence  $\sigma$  has property SMALL if, whenever RSPT is running a job of some size x from  $\sigma$ , only jobs smaller than x arrive. (Hence, jobs larger than x only arrive at the completion of a job, or when the machine is idle.)

**Lemma 4.1** For every input sequence  $\sigma$ , it is possible to modify the arrival times of some jobs such that the resulting sequence  $\sigma'$  has the property SMALL, the schedule of RSPT for  $\sigma'$  is the same as it is for  $\sigma$ , and  $OPT(\sigma') \leq OPT(\sigma)$ .

**Proof.** At any time r that a job J arrives that is at least as large as the job that RSPT is running at that time, we modify  $\sigma$  as follows. If there has been an interval before time r in which RSPT was idle, define u as the end of the last such interval before r; otherwise set u=0. Define r' as the last time in the interval (u,r) that a job larger than J was interrupted or completed. If there is no such time, set r'=u. We change the release time of J to r'.

When RSPT is run on the resulting sequence  $\sigma'$ , it does not consider running J during the interval [r', r]: it is running smaller or equal-sized jobs in that entire interval. (For the equal-sized jobs, see Assumption 1.) Hence the schedule of RSPT for  $\sigma'$  is the same as it is for  $\sigma$ , and  $\text{OPT}(\sigma') \leq \text{OPT}(\sigma)$  since the optimal cost for a sequence does not increase if the arrival times decrease or remain the same.

This Lemma implies that if RSPT maintains a competitive ratio of 3/2 on all the sequences that have property SMALL, it maintains that competitive ratio overall. Henceforth, we make the following assumption.

Global assumption 2 The input sequence  $\sigma$  has property SMALL.

#### 5. Definitions and notations

After these preliminaries, we are ready to state our main definitions. A job J arrives at its release time r(J) and has size (weight) w(J). The size is the time that J needs to be run without interruptions in order to complete. For a job  $J_i$ , we will usually abbreviate  $r(J_i)$  as  $r_i$  and  $w(J_i)$  as  $w_i$ , and use analogous notation for jobs J',  $J^*$  etc. When RSPT is running a job J, we will be interested in J-large unfinished jobs, that are at least as large as J, and J-small unfinished jobs, that are smaller, separately. To distinguish between these sets of jobs, the unfinished large jobs will be denoted by  $J, J^2, J^3, \ldots$  with sizes  $x, x_2, x_3$  while the small jobs will be denoted by  $J_1, J_2, \ldots$  with sizes  $w_1, w_2, \ldots$ 

We let Q(t) denote the queue Q of RSPT at time t.

**Definition 4** A run-interval is a half-open interval I = (s(I), t(I)], where RSPT starts to run a job (denoted by J(I)) at time s(I) and runs it continuously until exactly time t(I). At time t(I), J(I) is either completed or interrupted. We denote the size of J(I) by x(I).

5. Definitions and notations

**Definition 5** For a run-interval I, we denote the set of jobs that arrive during I by  $ARRIVE(I) = \{J_1(I), \ldots, J_{k(I)}(I)\}$ , We write  $r_i(I) = r(J_i(I))$  and  $w_i(I) = w(J_i(I))$  for  $1 \le i \le k(I)$ . The jobs are ordered such that  $w_1(I) \le w_2(I) \le \cdots \le w_{k(I)}(I)$ . We denote the total size of jobs in ARRIVE(I) by T(I), and write  $T_i(I) = \sum_{j=1}^i w_i(I)$  for  $1 \le i \le k(I)$ .

RSPT will run the jobs in ARRIVE(I) in the order  $J_1(I), \ldots, J_{k(I)}(I)$  (using Global assumption 1 if necessary) and we have  $w_{k(I)}(I) < x(I)$  using Global assumption 2. Of course it is possible that  $ARRIVE(I) = \emptyset$ . In that case I ends with the completion of the job RSPT was running (t(I) = s(I) + x(I)).

The input sequence  $\sigma$  may contain jobs of size 0. Such jobs are completed instantly when they start and do not have a run-interval associated with them. Thus we can divide the entire execution of RSPT into run-intervals, completions of 0-sized jobs, and intervals where RSPT is idle. The following lemma follows immediately from the definition of RSPT.

**Lemma 5.1** All jobs in  $\sigma$  arrive either in a run-interval or at the end of an interval in which RSPT is idle.

**Lemma 5.2** Suppose RSPT interrupts job J(I) at time t. Then  $t = r_1(I)$ .

**Proof.** We have  $t \in \{r_1(I), \ldots, r_{k(I)}(I)\}$ . Note that  $t < r_1(I)$  is not possible since all jobs in ARRIVE(I) arrive on or before time t. Suppose  $t = r_i(I) > r_1(I)$  for some i > 1, then  $r_i(I) + w_i(I) \le \frac{2}{3}(s(I) + x(I))$ . By the ordering of the jobs in ARRIVE(I) we have  $w_i(I) \ge w_1(I)$  and thus  $r_1(I) + w_1(I) < r_i(I) + w_i(I) \le \frac{2}{3}(s(I) + x(I))$ . But then RSPT interrupts J(I) no later than at time  $r_1(I)$ , so  $t \le r_1(I)$ , a contradiction.

**Definition 6** For the jobs in ARRIVE(I), we write

$$r_i(I) + w_i(I) = \frac{2}{3}(s(I) + x(I)) + \tau_i(I) \qquad i = 1, \dots, k(I).$$
 (5.1)

We have  $\tau_i(I) > 0$  for i = 2, ..., k(I), and  $\tau_1(I) > 0$  if J(I) completes at time t(I),  $\tau_1(I) \le 0$  if it is interrupted at time t(I).

**Definition 7** We define  $f_{OPT}(I)$  as the index of the job that OPT completes first from ARRIVE(I).

**Definition 8** An interruption by RSPT at time t is slow if OPT starts to run a job from ARRIVE(I) strictly before time t; in this case  $f_{\mathrm{OPT}}(I) > 1$  and  $J_{f_{\mathrm{OPT}}(I)}(I)$  did not cause an interruption when it arrived.

We call such an interruption slow, because in this case it could have been better for the total completion time of RSPT if it had interrupted J(I) for one of the earlier jobs in ARRIVE(I) (i. e. faster); now, at time t, RSPT still has to run all the jobs in ARRIVE(I), whereas OPT has already partially completed  $J_{f\mathrm{OPT}(I)}(I)$ . Note that whether an interruption is slow or fast depends entirely on when OPT runs the jobs in ARRIVE(I). It has nothing to do with RSPT.

We now define some variables that can change over time. We will need their values at time t when we are analyzing an event at time t. They give as it were a snapshot of the current situation.

**Definition 9** If job J has arrived but is not completed at time t,  $s_t(J)$  is the (next) time at which RSPT will start J, based on the jobs that have arrived until time t. For a job J that is completed at time t,  $s_t(J)$  is the last time at which J was started (i.e. the time when it was started and not interrupted anymore). (For a job J that has not arrived yet at time t,  $s_t(J)$  is undefined.)

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**Lemma 5.3** For every event and every job J,  $s_t(J)$  is at least as high as it was during the previous event.

**Proof.** Consider an event at time t and a job J. If J completes before or at time t, then  $s_t(J)$  is unchanged since the previous event. Any other job J at time t, for which  $s_t(J)$  was already defined during the previous event, is larger than the jobs in ARRIVE(I) by definition of RSPT and by Assumption 2. Therefore J will complete after the jobs in ARRIVE(I), i.e. no earlier than previously calculated.

By this Lemma, for a job J in Q(t),  $s_t(J)$  is the earliest possible time that RSPT will start to run J.

**Definition 10** A job J is interruptable at time t, if  $s_t(J) < 2w(J)$  and  $t \leq \frac{2}{3}(s_t(J) + w(J))$ .

I. e. a job J is interruptable if it is still possible that RSPT will interrupt J after time t (cf. Property R5).

**Definition 11** BEFORE<sub>t</sub>(J) is the set of jobs that RSPT completes before  $s_t(J)$  (based on the jobs that have arrived at or before time t).  $b_t(J)$  is the total size of jobs in BEFORE<sub>t</sub>(J).  $\ell_t(J)$  is the size of the largest job in BEFORE<sub>t</sub>(J).

Clearly,  $b_t(J)$  and  $\ell_t(J)$  can only increase over time, and  $\ell_t(J) \leq b_t(J)$  for all times t and jobs J. During our analysis, we will maintain an *estimate* on the starting time of each job J in the schedule of OPT, denoted by  $s_t^{\text{OPT}}(J)$ . We describe later how we make and update these estimates. We will maintain the following as part of our invariant (which will be defined in section 7). Denote the actual optimal completion time of a job J by OPT(J). Then at the time t of an event,

$$\boxed{\sum_{J:r(J)\leq t} \text{OPT}(J) \geq \sum_{J:r(J)\leq t} (s_t^{\text{OPT}}(J) + w(J))}$$
(5.2)

This equation implies that at the end of the sequence,  $\text{OPT}(\sigma) \geq \sum_{J} (s_t^{\text{OPT}}(J) + w(J))$ . We will use the following Lemma to calculate initial values of  $s_t^{\text{OPT}}(J)$  for arriving jobs in such a way that (5.2) holds.

**Lemma 5.4** For a given time t, denote the most recent arrival time of a job by  $t' \leq t$ . Denote the job that OPT is running at time t' by  $\Phi(t')$ , and its remaining unprocessed jobs by  $\Psi(t')$ . The total completion time of OPT of the jobs in  $\Psi(t')$  is at least the total completion time of these jobs in the schedule where those jobs are run consecutively in order of increasing size after  $\Phi(t')$  is completed.

**Proof.** The schedule described in the lemma is optimal in case no more jobs arrive after time t (Local assumption 1). If other jobs do arrive after time t, it is possible that another order for the jobs in  $\Psi(t')$  is better overall. However, since this order is suboptimal for  $\Psi(t')$ , we must have that the total completion time of the jobs in  $\Psi(t')$  is then not smaller.

The fact that the optimal schedule is not known during the analysis of an event is also the reason that we check that (5.2) is satisfied instead of checking  $OPT(J) \ge s_t^{OPT}(J) + w(J)$  for each job J separately.

**Definition 12**  $D_t(J) = s_t(J) - s_t^{OPT}(J)$  is the delay of job J at time t.

6. Credits 8

#### 6. Credits

The credit of job J at time t is denoted by  $K_t(J)$ . A job will be assigned an initial credit at the first event on or after its arrival. At the end of each run-interval I = (s, t], each job  $J_i(I)$  in ARRIVE(I) receives an initial credit of

$$\frac{1}{2} \left( s^{\text{OPT}}(J_i(I)) + w_i(I) \right) - D(J_i(I)) \qquad i = 1, \dots, k(I).$$
(6.1)

If at time t a (non-zero) interval ends in which RSPT is idle, or t=0, then suppose  $Q(t)=\{J_1,\ldots,J_k\}$  where  $w_1\leq\cdots\leq w_k$ . The initial credit of job  $J_i$  in Q(t) is then

$$\frac{1}{2}t + \frac{1}{2}\sum_{i=1}^{i}w(J_i) \qquad i = 1, \dots, k(I).$$
(6.2)

This is a special case of (6.1): by Lemma 5.4 and Event assumption 1, OPT will run the jobs in Q(t) in order of increasing size, hence  $s_t^{\text{OPT}}(J_i) \geq s_t(J_i)$  for  $i = 1, \ldots, k$ . Therefore  $D(J_i) \leq 0$  for  $i = 1, \ldots, k$ . Moreover, by definition of RSPT we have  $s_t(J_i) = t + \sum_{j=1}^{i-1} w_i$  for  $i = 1, \ldots, k$ .

The idea is that the credit of a job indicates how much its execution can still be postponed by RSPT without violating the competitive ratio of 3/2: if a job has  $\delta$  credit, it can be postponed by  $\delta$  time.

For the competitive ratio, it does not matter how much credit each individual job has, and we will often transfer credits between jobs as an aid in the analysis. During the analysis of events, apart from transferring credits between jobs, we will also use the following rules.

Rule C1. If  $s_t(J)$  increased by  $\delta$  since the previous event, then K(J) decreases by  $\delta$ .

Rule C2. If the estimate  $s_t^{\text{OPT}}(J)$  increased by  $\delta$  since the previous event, then K(J) increases by  $\frac{3}{2}\delta$ .

 $s_t(J)$  cannot decrease by Lemma 5.3. We will only adjust (increase)  $s_t^{\text{OPT}}(J)$  in a few special cases, where we can show that (5.2) still holds if we increase  $s_t^{\text{OPT}}(J)$ . Both rules follow directly from (6.1): it can be seen that if  $s_t(J)$  or  $s_t^{\text{OPT}}(J)$  increases, J should have received more credit initially.

**Theorem 1** Suppose that after RSPT completes any input sequence  $\sigma$ , the total amount of credit in the jobs is nonnegative, and (5.2) holds. Then RSPT maintains a competitive ratio of 3/2.

**Proof.** We can ignore credit transfers between jobs, since they do not affect the total amount of credit. Then each job has at the end credit of

$$K(J) = \frac{1}{2}(s_t^{\text{OPT}}(J) + w(J)) - (s_t(J) - s_t^{\text{OPT}}(J)),$$

where we use the final (highest) value of  $s_t^{\text{OPT}}(J)$  for each job J, and the actual starting time  $s_t(J)$  of each job. This follows from (6.1) and the rules for increasing job credits mentioned above. Thus if the total credit is nonnegative, we have

$$\begin{split} \sum_J (s(J) - s_t^{\text{OPT}}(J)) & \leq & \sum_J \frac{1}{2} (s_t^{\text{OPT}}(J) + w(J)) \\ \Rightarrow & \sum_J s(J) & \leq & \frac{3}{2} \sum_J s_t^{\text{OPT}}(J) + \frac{1}{2} \sum_J w(J) \\ \Rightarrow & \text{RSPT}(\sigma) = \sum_J (s(J) + w(J)) & \leq & \frac{3}{2} \sum_J (s_t^{\text{OPT}}(J) + w(J)) \leq \frac{3}{2} \text{OPT}(\sigma). \end{split}$$

This proves the lemma.

Calculating the initial credit The only unknowns in (6.1) are  $s_t^{\text{OPT}}(J_i(I))$  ( $i=1,\ldots,k(I)$ ). If there is an interruption at time t, Lemma 5.4, together with the job that OPT is running at time t, gives us a schedule for OPT that we can use to calculate  $s_t^{\text{OPT}}(J_i(I))$  for all i (if OPT uses a different schedule, its overall cost is not lower, so (5.2) still holds). We also use the following Event assumption.

Event assumption 2 If the run-interval I ends in a completion, all jobs in ARRIVE(I) arrive no later than the time at which opt completes  $J_{f_{\mathrm{OPT}}(I)}(I)$ .

It is known that all jobs in ARRIVE(I) arrive no later than at time t(I). Moreover, by the time OPT completes  $J_{f\mathrm{OPT}(I)}(I)$ , RSPT will not interrupt J(I) anymore by Property R2. Hence Event assumption 2 does not influence RSPT's decisions or its total completion time. It is only used so that we can apply Lemma 5.4 to calculate lower bounds for the completion times of OPT of these jobs. Since the optimal total cost cannot increase when release times are lower, we have that (5.2) holds.

Note that if we were to modify the sequence  $\sigma$  by actually decreasing release times until Event assumption 2 holds, the optimal schedule for the resulting sequence might be quite different. This is the reason we use this assumption only locally, to get some valid lower bounds on the optimal cost.

Note also that both after a completion and after an interruption, the schedule of OPT is not completely known even with these assumptions, because we do not know which job OPT was running at time t. Therefore we still need to consider several off-line schedules in the following analysis.

#### 6.1 Credit requirements

In this section, we describe three situations in which credit is required, and try to clarify some of the intuition behind the invariant defined in Section 7.

**Interruptions** Suppose a job J of size x is interrupted at time  $r_1$ , because job  $J_1$  arrives, after starting at time s. Then s < 2x.  $J_1$  will give away credit to  $J, J^2, J^3$  and  $J^4$  as described in Table 1 in the Appendix, and nothing to any other jobs. We briefly describe the intuition behind this. We have the following properties.

- INT1 The amount of lost processing time due to this interruption is  $r_1 s$ . This is at most  $\frac{2}{3}(s+x) s = \frac{2}{3}x \frac{s}{3}$ , which is monotonically decreasing in s.
- INT2 The size of  $J_1$  is  $w_1$ . This is at most  $\frac{2}{3}(s+x) r_1 < \frac{2}{3}(s+x) s = \frac{2}{3}x \frac{s}{3}$ , which is monotonically decreasing in s.

So, in Table 1,  $J_1$  appears to give away more credit if s is larger, but a) it has more (this follows from (6.1); b) it needs less (we will explain this later); and c)  $r_1 - s$  is smaller.

From Table 1 we can also see how much credit is still missing. For instance if s < x and  $x < r_1$ , then  $J^2$  receives  $r_1 - x$  from  $J_1$ , but it lost  $r_1 - s$  because it now starts  $r_1 - s$  time later. We will therefore require that in such a case,  $J^2$  has at least x - s of credit itself, so that it still has nonnegative credit after this interruption. In general, any job that does not get all of its lost credit back according to the table above, must have the remaining credit itself. We will formalize this definition in Section 7.

**Completions** Suppose a job J completes at time s + x. We give the following property without proof.

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s	[0,x]	[0, x]	$(x, \frac{3}{2}x]$	$(x, \frac{3}{2}x]$	$(\frac{3}{2}x,2x)$
$r_1$	[0, x]	$(x, \frac{4}{3}x]$	$(x, rac{3}{2}x]$	$(\frac{3}{2}x, \frac{5}{3}x]$	$(rac{3}{2}x,2x)$
To $J$	$r_1 - s$	$r_1 + w_1 - s$	$r_1 + w_1 - s$	$r_1 + w_1 - s$	$r_1 + w_1 - s$
To $J^2$	0	$r_1 - x$	$r_1 - s$	$r_1 - s$	$r_1 - s$
To $J^3$	0	0	0	$r_1 - \frac{3}{2}x$	$r_1 - s$
To $J^4$	0	0	0	$r_1 - \frac{3}{2}x$	$r_1 - s$
Total	$r_1 - s$	$2r_1 + w_1$	$2(r_1-s)+w_1$	$4r_1 + w_1$	$4(r_1-s)+w_1$
		-(s+x)		-2s-3x	

Table 1: Credit given by  $J_1$  to other jobs

COM1 The jobs in ARRIVE(I) (where I=(s,s+x]) need to get at most  $\frac{1}{2}(x-b_s(J))$  of credit from J.

By this ("needing" credit) we mean that the amount of credit those jobs receive initially, together with at most  $\frac{1}{2}(x - b_s(J))$ , is sufficient for these jobs to satisfy the conditions that we will specify in the next section.

**Small jobs** As long as a job J has not been completed yet, it is possible that smaller jobs than J arrive that are completed before J by RSPT. If OPT completes them after J, then  $D_t(J)$  increases.

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From the previous section we see that for a job, sometimes credit is required to pay for interruptions of jobs that are run before it, (e.g. on page 9 below,  $J^2$  pays x - s for an interruption of J), and sometimes to make sure that jobs that arrive during its final run have sufficient credit (COM1). We will make sure that each job has enough credit to pay both for interruptions of jobs before it and for its own completion (i.e. for jobs that arrive during its final run).

For a job J, we define the *interrupt-delay* associated with an interruption as the amount of increase of  $D_t(J)$  compared to the previous event. This amount is at most t-s at the end of a run-interval (s,t]. (It is less for a job J if  $s_{\text{OPT}}(J)$  also increases).

Credit can also be required because the situation marked "Small jobs" in Section 6.1 occurs. The small job-delay of J associated with an event at time t is the total size of jobs smaller than J in ARRIVE(I) that are completed before J by RSPT and after J by OPT.

Interrupt-credit and completion-credit When considering the credit of a job J, we will make a distinction between interrupt-credit  $K_{INT}(J)$ , which is used to pay for interrupt-delays whenever they occur, and completion-credit  $K_{COM}(J)$ , which is used to "pay for the completion" of J (see above). (We do not reserve credit for small job-delays since they will be paid for by the small jobs that cause it.) Accordingly, we now make two important definitions.

**Definition 13**  $N_{INT}(J,t)$  is the maximum amount of credit that J may need to pay for (all the) interruptions of jobs that RSPT completes before it, as it is known (for the on-line algorithm RSPT) at time t.

I.e. this is the amount of credit needed if all the jobs before J that have arrived before time t are interrupted as often as possible. If other jobs arrive later,  $N_{INT}(J,t)$  can change. For any job J that is already completed at time t by RSPT,  $N_{INT}(J,t)=0$ .

**Definition 14**  $N_{COM}(J, t)$  is the maximum amount of credit that J may need to pay for its own completion, as known (for the on-line algorithm RSPT) at time t.

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This amount can also change over time, namely if s(J) increases. Again, if J is completed before time t, then  $N_{COM}(J, t) = 0$ .

Consider an event at time t. Suppose  $Q(t) = \{J_1, \ldots, J_k\}$ , where  $w_1 \leq w_2 \leq \cdots \leq w_k$ . We write  $s_i = s_t(J_i) = t + \sum_{j=1}^{i-1} w_j$ . From Table 1 it can be seen that

$$N_{INT}(J_i, t) = \max(0, w_{i-1} - s_{i-1}) + \max(0, \frac{3}{2}w_{i-2} - s_{i-2}) + \max(0, 2w_{i-4} - t), \tag{7.1}$$

where each maximum only appears if the corresponding job exists. For the third maximum in this equation, note that the total interrupt-delay of  $J_i$  caused by interruptions of the jobs  $J_1, \ldots, J_{i-4}$  is at most  $2w_{i-4} - t$  after time t, since RSPT starts to run  $J_1$  at time t and does not interrupt any of the jobs  $J_1, \ldots, J_{i-4}$  after time  $2w_{i-4}$  by Property 4.

The following table gives upper bounds for  $N_{INT}(J_i, t)$  in all possible cases.

$t \le 2w_{i-4}$	$s_{i-2} \le \frac{3}{2}w_{i-2}$	$s_{i-1} \le w_{i-1}$		$N_{INT}(J,t)$
•	•	•	$\max(0,$	$w_{i-1} + \frac{1}{2}w_{i-2} - 2s_{i-4} - t$
•	•		$\max(0,$	$\frac{3}{2}w_{i-2} - s_{i-4} - t)$ $w_{i-1} - s_{i-3} - t)$
•		•	$\max(0,$	$w_{i-1} - s_{i-3} - t$
•			$\max(0,$	$2w_{i-4} - t$ )
	•	•	$\max(0,$	$w_{i-1} + \frac{1}{2}w_{i-2} - 2s_{i-2})$
	•		$\max(0,$	$\frac{3}{2}w_{i-2} - s_{i-2}) \ w_{i-1} - s_{i-1})$
		•	$\max(0,$	$w_{i-1}-s_{i-1})$
				0

Note that in all cases

$$N_{INT}(J_i, t) \le \max(0, w_{i-1} + \frac{1}{2}w_{i-2} + \frac{1}{2}w_{i-4} - t).$$

$$(7.2)$$

Using property COM1, we have

$$N_{COM}(J_i, t) = \max\left(0, \frac{1}{2}(w_i - b_t(J_i))\right).$$
(7.3)

 $N_{COM}(J_i, t)$  can only decrease over time (since  $s_i$  and  $b_t(J_i)$  only increase). For all jobs J that have arrived at time t, we wish to maintain

$$K_t(J) \ge N_{COM}(J, t) + N_{INT}(J, t).$$

$$(7.4)$$

This means that each job will be able to pay for the specified parts of its interrupt-delay and for its completion. I. e. the total credit of each job will be sufficient to pay for both these things.

Invariant We now define our invariant, that will hold at specific times t in the execution, and in particular when a sequence is completed:

**Invariant:** At time t, for all jobs that have arrived, (7.4) holds; furthermore, (5.2) holds.

Theorem 2  $\mathcal{R}(RSPT) \leq 3/2$ .

**Proof outline.** The proof consists of a case analysis, which makes up the rest of this paper. In the rest of this section we show that (5.2) can be maintained and that (7.4) holds for large jobs. In

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section 9 and beyond, we consider all possible interruptions and completions. "All possible" refers to both the times at which these events occur, and the possible schedules of the off-line algorithm.

For every possible event, we will give a time at which the above invariant holds again, assuming that it held after the previous event. This will be no later than at the completion of the last job in  $\sigma$ . At that time, the invariant implies that all completed jobs have nonnegative credit, since for completed jobs we have  $N_{COM}(J,t) = N_{INT}(J,t) = 0$ . Also, (5.2) holds. We can then apply Theorem 1.

For almost all events, it will be the case that the invariant holds again immediately after the current event. However, there is one event for which it takes slightly longer: this is a slow interruption of a job J, where  $s(J) \leq \frac{2}{3}w(J)$ . If such an event occurs at some time t, we will show that the invariant is restored no later than when RSPT has completed the second-smallest job in ARRIVE(I).

In order to ensure that the invariant holds again after an event, we will often transfer credits between jobs. Also, we will use the credit that some jobs must have because the invariant was true previously, to pay for their interrupt-delay or for their completion. We need to take into account that  $N_{INT}(J,t)$ ,  $s_t^{\text{OPT}}(J)$  etc. of some jobs that arrived before or at the previous event can change as a result of the arrival of new jobs, compared to the calculations in that event (that were made under the assumption that STATIC held).

By the discussion following Theorem 1, (5.2) holds at each event if it held at the previous event and if  $s_t^{\text{OPT}}(J)$  is not changed for any job J that arrived at or before the previous event. We also have the following lemma.

**Lemma 7.1** Suppose  $Q(t) = \{J_1, \ldots, J_k\}$ , where  $w_1 \leq w_2 \leq \cdots \leq w_k$ , and RSPT starts  $J_1$  at time t. A job  $J_i$  satisfies (7.4) in any of the following situations.

- 1.  $K_t(J_i) \ge \max(0, \frac{1}{2} \sum_{j=1}^i w_j t)$ . 2.  $K_t(J_i) \ge \frac{1}{2}(w_i w_{i-1}) + \frac{1}{2} \sum_{j=1}^{i-2} w_j \text{ and } t \ge w_{i-1}$
- 3.  $K_t(J_i) \geq \frac{1}{2}(w_i w_{i-1}) + \frac{1}{2}\sum_{j=1}^{i-2} w_j + (w_{i-1} t)$  and  $t < w_{i-1}$
- 4.  $K_{t'}(J_i) \geq \frac{1}{2}(w_i w_{i-1})$  and  $J_i$  starts to run at time t'

- **Proof.** Note first of all that  $w_{i-1} \leq \ell_t(J_i)$  because RSPT runs the jobs in order of increasing size. 1. We have  $\frac{1}{2} \sum_{j=1}^{i} w_j t = \frac{1}{2} (w_i w_{i-1}) + w_{i-1} + \frac{1}{2} \sum_{j=1}^{i-2} w_j t \geq \frac{1}{2} (w_i \ell_t(J)) + N_{INT}(J_i, t) \geq N_{INT}(J_i, t)$  $N_{COM}(J_i,t) + N_{INT}(J_i,t).$
- 2. Here we have  $N_{INT}(J_i,t) \leq \frac{1}{2}(w_{i-2}+w_{i-4})$ , since  $t \geq w_{i-1} \geq w_{i-2} \geq w_{i-4}$ . Hence  $K_t(J_i) \geq \frac{1}{2}(w_i-w_{i-1}) + \frac{1}{2}\sum_{j=1}^{i-2}w_j \geq N_{COM}(J_i,t) + N_{INT}(J_i,t)$ .
  - 3. Now  $N_{INT}(J_i, t) \leq \frac{1}{2}(w_{i-2} + w_{i-4}) + (w_{i-1} t)$  and we are done similarly.
- This can only happen if  $J_1, \ldots, J_{i-1}$  are completed, because RSPT runs jobs in order of size. We have  $N_{INT}(J_i, t') = 0$  by (7.1): note that  $J_i$  is job  $J_1$  in (7.1) at time t', since it is the smallest job available at time t' by definition of RSPT. Furthermore, since  $w_{i-1} \leq \ell_{t'}(J_i)$ ,  $K_{t'}(J_i) \geq \frac{1}{2}(w_i - \ell_{t'}(J_i)) \geq N_{COM}(J_i, t).$

Corollary 7.1 Suppose RSPT starts to run jobs at time t, where t=0 or t is the end of a (nonzero) interval in which RSPT was idle. Then (7.4) and (5.2) hold for the jobs that arrive at time t.

**Proof.** This follows directly from (6.2) and Lemma 7.1, Case 1. 

We can apply this corollary at the arrival time of the first job in  $\sigma$ , and anytime after RSPT has been idle.

Notation	Definition	Long notation
t	time of the current event	
s	start of the most recent run-interval $I = (s, t]$	
J	job that RSPT was running in $I = (s, t]$	J(I)
ARRIVE	jobs that arrive in $I$	ARRIVE(I)
$J_1$	smallest job that arrives in $I$	$J_t(I)$
$r_1$	its arrival time	$r_1(I)$
$w_1$	its size	$w_1(I)$
f	index of job in $ARRIVE$ that opt runs first	$f_{\mathrm{OPT}}(I)$

Table 2: Notations

Proof overview We will show that for all events, it is possible to restore the invariant before the sequence completes. This proves that RSPT maintains a competitive ratio of 3/2. We divide the analysis into the following cases.

- 1. An interruption of a job J (Lemmas 9.1, 9.2, 9.3) in all but one case, Case 3 below
- 2. Completion of a job J (Lemmas 10.1, 10.2, 10.3, 10.4)
- 3. A slow interruption of a job J of size x in the case that RSPT started it before time 2x/3 (Section 11), and OPT does not run any J-large jobs before ARRIVE(I).

#### 8. Analysis of an event

As described in the previous section, for the analysis of RSPT we need to analyze every possible event that can occur during its execution, i. e. show that the invariant holds after the event, if it holds after the previous event.

For each event, we will only be interested in the credits of jobs at the time of the current event, denoted by t. Hence, we will drop the subscript t and write  $K(J_i)$  for each job  $J_i$ . Furthermore, the job that was interrupted or completed at the time of the event will be denoted by J, and the set of smaller jobs that arrived during the most recent run of J will be denoted by  $ARRIVE = \{J_1, \ldots, J_k\}$ . The most recent starting time of J will be denoted by s. We will call J-large jobs large, and others small. Remember that  $f_{OPT}$  is the index of the job in ARRIVE that OPT completes first. Our notation is summarized in Table 2.

**Lemma 8.1** After OPT completes  $J_f$ , then if STATIC holds, OPT does not run any J-large job until all jobs in ARRIVE are completed.

**Proof.** This is a direct consequence of Lemma 5.4 and Event assumptions 1 and 2: after  $J_f$ , opt will complete first the remaining jobs in ARRIVE in order of increasing size, and then the remaining large jobs - as long as no new jobs arrive.

Using this lemma, we only need to consider when OPT is running large jobs in relation to the set ARRIVE (as a whole), as long as we assume STATIC holds. We have the following lemma.

**Lemma 8.2** Suppose that there is a job L that RSPT completes on or before time t, whereas OPT completes it after a job  $J_i$  in ARRIVE. Then there is  $\frac{3}{2}w_i$  of credit available that can be freely assigned to uncompleted jobs.

**Proof.** In the analyses of previous events, ARRIVE was not taken into account when considering the credit of job L. Compared to that analysis, we have that  $s^{\mathrm{OPT}}(L)$  increases by at least  $w_i$ . Rule C2 implies that L now has  $\frac{3}{2}w_i$  more credit than calculated at the previous events. But

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 $N_{COM}(L,t) = N_{INT}(L,t) = 0$  since L is completed. Hence we can give  $\frac{3}{2}w_i$  to other jobs, while L still satisfies (7.4).

Suppose that OPT runs at least one large job J' before ARRIVE. In this case we will not use any lower bound on the optimal starting time of J' (except that it is at least 0). This enables us to make the following assumption.

Event assumption 3 If opt runs at least one large job before ARRIVE, opt runs J before ARRIVE.

Suppose OPT runs  $J' \neq J$  before ARRIVE, but not J. By Assumption 1, J' is then larger than J. This can only increase the optimal starting time of jobs in ARRIVE compared to the situation where OPT does run J before ARRIVE (J' could not start earlier than J because we will only use that J starts on or after time 0.)

If opt runs exactly one large job  $J' \neq J$  before ARRIVE, then  $s^{\mathrm{OPT}}(J)$  increases by T by the arrival of the jobs in ARRIVE, and therefore K(J) increases by  $\frac{3}{2}T$  by Rule C2, that we do not take into account if we assume opt runs J before ARRIVE. On the other hand, RSPT starts to run J' an additional T later by the arrival of ARRIVE (aside from the interrupt-delay, in the case that  $J_1$  from ARRIVE causes a restart), hence the credit of J' decreases by T, in contrast to the case where opt runs J' after ARRIVE as well. In addition, consider  $N_{INT}(J', r_1)$ . Since x' > x, RSPT runs (after ARRIVE) first J and later J'. Hence  $N_{INT}(J', r_1) \leq N_{INT}(J', s) + \frac{1}{2}T$ . J' would receive the additional  $\frac{1}{2}T$  automatically if opt completed J' after ARRIVE, because then  $s_t^{\mathrm{OPT}}(J')$  would increase by T as well.

Putting these facts together, it is sufficient to analyze the case where OPT runs J before ARRIVE (not using any lower bounds on J's starting time), switch J and J', and transfer an additional  $\frac{3}{2}T$  worth of credit (that we do not take into account in this analysis) from J to J'.

The case where OPT runs two jobs before ARRIVE, none of which is J, can be treated similarly. We will therefore always make Event assumption 3.

**Lemma 8.3** The condition (5.2) can be maintained throughout the execution of  $\sigma$ .

**Proof.** Using Lemma 5.4 we can calculate valid initial values  $s_t^{\text{OPT}}(J)$  for any arriving job J. The only modification we will make in later events, is that for any J(I)-large job J' that OPT completes after ARRIVE(I), we increase  $s_t^{\text{OPT}}(J')$  by  $T_k(I)$ . (Here we will use Event assumption 3.) Since the set ARRIVE(I) was not taken into consideration when  $s_t^{\text{OPT}}(J')$  was originally determined, the resulting bound is still valid, so (5.2) holds.

**Lemma 8.4** The large jobs that OPT and RSPT complete after ARRIVE besides J satisfy (7.4).

**Proof.** Consider such a job  $J^i$ . It receives extra credit of  $\frac{1}{2}T$  by Rules C1 and C2, since both  $s(J^i)$  and  $s^{\text{OPT}}(J^i)$  increase by T. It possibly loses some credit if there was an interruption.

To see that  $J^i \neq J$  (still) satisfies (7.4), note that  $N_{COM}(J^i, t) \leq N_{COM}(J^i, s)$  for all  $s \geq t$ . Regarding  $N_{INT}(J^i, t)$ , we use the bound (7.1). This bound refers to three different jobs. For  $J^i$ , some of these jobs may be in ARRIVE and some of them can be the (previously arrived) jobs  $J, J^2, \ldots, J^{i-1}$ .

The jobs in ARRIVE can only occur as jobs " $J_{i-2}$ " and " $J_{i-4}$ ", since after ARRIVE at least J is also completed before  $J^i$ . Hence the gained credit of  $\frac{1}{2}T$  is sufficient to cover this.

For the remaining jobs, if there is no interruption, the maximums in (7.1) can only decrease since  $s(J^i)$  increases by  $T_k$ . In this case we are done. If there is an interruption, we either have that

this part of  $N_{INT}(J^i, t)$  decreases by at least the amount of credit that is lost, or  $J^i$  receives the remaining lost credit back from  $J_1$ . This follows from Table 1 and (7.1).

As an example, J is interrupted at time 2x/3 after starting at time 0, for a job  $J_1$  of size 0. Job  $J^2$  loses 2x/3 of credit because of this (2x/3) processing time is wasted). But  $N_{INT}(J^2, 2x/3) = x/3$  and  $N_{INT}(J^2, 0) = x$ , so  $J^2$  still satisfies (7.4).

As a second example, J is interrupted at time 10x/9 after starting at time 2x/3, for a job  $J_1$  of size 0. Job  $J^2$  loses 4x/9 of credit because of this (4x/9) processing time is wasted). It receives x/9 of credit from  $J_1$  due to Table 1. Also,  $N_{INT}(J^2, 2x/3) = x/3$  and  $N_{INT}(J^2, 10x/9) = 0$ , a decrease of x/3. Since 4x/9 = x/9 + x/3,  $J^2$  still satisfies (7.4).

It can be seen that Table 1 and (7.1) complement each other in all cases: the credit from  $J_1$  together with the decrease in (7.4) is sufficient for any large job  $J^i$  to keep satisfying (7.4).

By the results in this section, in the remainder of the paper it is sufficient to check (or ensure) that J and the jobs in ARRIVE satisfy (7.4). We already have that (5.2) holds and that (7.4) holds for the J-large jobs besides J. All other jobs have either already been completed by RSPT, or have not arrived yet.

#### 9. Interruptions

Consider an interruption at time  $r_1$  of a job J that started at time s. The interrupt-delay associated with this interruption is  $r_1 - s$  for all jobs that were already in Q at time s. The small job-delay of this event of the jobs that OPT completes before ARRIVE, and RSPT does not, is  $T = \sum_{i=1}^{k} w_i$ .

The last event before this one was the start of J, at time s. No jobs were completed since then by RSPT.

We divide the interruptions into three types, based on when OPT runs large jobs relative to the set ARRIVE:

Large jobs before 
$$ARRIVE$$
 by OPT012Lemma9.19.29.3

We need to distinguish between the cases f = 1 and f > 1. First suppose f = 1, i. e. opt runs the jobs from ARRIVE in the same order as RSPT. The credit reassignments in this case take place in four steps.

- 1. On arrival of  $J_1$ , the jobs  $J, J_2, \ldots, J_k$  are shifted. However, for the moment we keep the order of those jobs the same (as in the situation where  $J_1$  does not arrive). We reassign credit from  $J_1$  to J so that its credit remains constant. (Some jobs can have negative credit in this step.)
- 2. We reorder the jobs so that the order is now  $J_1, \ldots, J_k, J$ . However, the credits of the jobs stay "in the same place", so that e. g.  $J_2$  now has the credit that J had in Step 1.
- 3. We calculate the extra credit that this reordering generates. If a completion is now  $\delta$  time earlier, there is  $\delta$  more credit available by Rule 1.
- 4. We reassign credits to make sure all waiting jobs satisfy (7.4). (This step is not always required.)

A graphical representation of the first three steps of this procedure can be seen in Figure 2.

In case f > 1, we proceed similarly. However, in the first step we consider different orders for the jobs (which will be described at the time), instead of the order described above. We then put the jobs in the order they will be executed by RSPT in Step 2 and continue as above.

**Lemma 9.1** If RSPT interrupts a job J at time  $r_1$ , and OPT runs no large jobs before ARRIVE, and  $s \geq 2x/3$ , and STATIC holds, and the invariant held at time s, then it holds at time  $r_1$ .

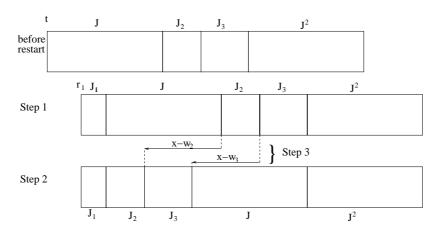


Figure 2: Credit transfers

**Proof.** Case 1. f = 1. Only in this very first case will we not use the procedure outlined above, and instead calculate the credits for the proper order directly. We begin by showing that  $J_1$  still satisfies (7.4) after giving credit to J and J-large jobs as described in Table 1. We have initially  $K(J_1) = \frac{1}{2}(r_1 + w_1)$ . Also,  $N_{INT}(J_1, r_1) = 0$  and  $N_{COM}(J_1, r_1) \leq \frac{1}{2}w_1$  by definition.

Suppose  $s < r_1 \le x$ . Since  $s \ge 2x/3$ , we have  $r_1 \le \frac{2}{3}(s+x) \le \frac{5}{3}s < 2s$ . Then  $\frac{1}{2}(r_1+w_1)-(r_1-s) = \frac{1}{2}w_1 + s - \frac{1}{2}r_1 \ge \frac{1}{2}w_1$ .

Suppose  $s \le x < r_1$ . Since  $r_1 + w_1 \le \frac{2}{3}(s+x)$ , then using Table 1, we have that  $J_1$  is left with credit of  $\frac{1}{2}(r_1+w_1)-(2r_1+w_1-s-x)=s+x-\frac{3}{2}r_1-\frac{1}{2}w_1\ge s+x-\frac{3}{2}(\frac{2}{3}(s+x)-w_1)-\frac{1}{2}w_1=w_1$ . Suppose  $x < s < r_1 \le \frac{3}{2}x$ .  $J_1$  is left with  $\frac{1}{2}(r_1+w_1)-2(r_1-s)-w_1=2s-\frac{3}{2}r_1-\frac{1}{2}w_1\ge w_1$ , since  $r_1+w_1\le \frac{4}{3}s$ .

Suppose  $x < s \le \frac{3}{2}x < r_1$ . We take  $2(r_1 - s) + w_1 + 2(r_1 - \frac{3}{2}x)$  out of  $J_1$ .  $J_1$  still has  $\frac{1}{2}(r_1 + w_1) - 4r_1 + 2s + 3x - w_1 \ge -\frac{7}{2} \cdot \frac{2}{3}(s + x) + 3w_1 + 2s + 3x = -\frac{1}{3}s + \frac{2}{3}x + 3w_1 > 3w_1$  of credit. Suppose  $\frac{3}{2}x < s$ . We take  $4(r_1 - s) + w_1$  out of  $J_1$ , leaving it with  $\frac{1}{2}(r_1 + w_1) - 4r_1 + 4s - w_1 \ge 4s - \frac{7}{3}(s + x) + 3w_1 = \frac{5}{3}s - \frac{7}{3}x + 3w_1 > 3w_1$ .

In all cases,  $K(J_1)$  satisfies (7.4). For  $2 \le i \le k$ , we have  $K(J_i) = \frac{1}{2}(r_1 + T_i)$  so that we are done by Lemma 7.1, Case 1. For J, we have that  $s^{\mathrm{OPT}}(J)$  increases by  $\frac{1}{2}T$  (see proof of Lemma 8.3). Note that  $\frac{1}{2}T \ge w_k + \frac{1}{2}w_{k-1} + \frac{1}{2}w_{k-3} - r_1 \ge N_{INT}(J, r_1)$ , since  $r_1 > s \ge \frac{2}{3}x > \frac{2}{3}w_k$ . We also have  $N_{COM}(J, r_1) \le N_{COM}(J, s)$ , so J still satisfies (7.4).

Case 2. f > 1. We define  $D_1 = r_1 - r_f > 0$  (if  $r_1 = r_f$ , then by Lemma 5.4 opt runs the jobs in order of increasing size after time  $r_1$  and hence f = 1) and  $D_2 = (r_f + w_f) - (r_1 + w_1) > 0$  (if  $D_2 = 0$ , either  $J_f$  would have already caused a restart before time  $r_1$ , or  $J_1$  would not have caused a restart).

As in Case 1, we begin by checking the credit of  $J_1$ . In this case, initially,  $K(J_1) = \frac{3}{2}(r_f + w_f) + \frac{1}{2}w_1 - r_1$  since  $s^{\text{OPT}}(J_1) = r_f + w_f$  and  $s(J_1) = r_1$ . We take an extra  $w_1$  out of  $K(J_1)$  for  $J_2$ .

Suppose  $r_1 \leq x$ . Then  $\frac{3}{2}(r_f + w_f) - \frac{1}{2}w_1 - 2r_1 + s = \frac{3}{2}D_2 + w_1 - \frac{1}{2}r_1 + s > w_1$ . We have used  $r_1 \leq \frac{2}{3}(s+x) < 2s$  which holds since  $s \geq \frac{2}{3}x$ .

Suppose  $s \leq x < r_1$ . In this case we take  $2r_1 + 2w_1 - s - x$  of credit out of  $J_1$ . Since  $r_1 + w_1 \leq \frac{2}{3}(s + x)$ , we have that  $J_1$  is left with credit of  $\frac{3}{2}(r_f + w_f - w_1) - 3r_1 + s + x = \frac{3}{2}D_2 - \frac{3}{2}r_1 + s + x \geq \frac{3}{2}D_2 + \frac{3}{2}w_1$ . Suppose  $x < s < r_1 \leq \frac{3}{2}x$ . We take  $2(r_1 - s) + 2w_1$  of credit out of  $J_1$ . Since  $r_1 + w_1 \leq \frac{4}{3}s$  in this case, again  $J_1$  is left with at least  $\frac{3}{2}w_1 + \frac{3}{2}D_2$ .

Suppose  $x < s \le \frac{3}{2}x < r_1$ . We take  $2(\tilde{r_1} - s) + 2w_1 + 2(r_1 - \frac{3}{2}x)$  out of  $J_1$ .  $J_1$  still has

	1	2	3	final
$J_1 \ J_f$	$\frac{\frac{1}{2}w_1}{\frac{3}{2}r_f + \frac{1}{2}w_f - r_1}$	$egin{array}{c} J_1 \ J_2 \end{array}$	0	$\frac{1}{2}w_1$ $\frac{1}{2}w_f$
i =	$2,\ldots,f-1$ :		9	<u> </u>
	$\frac{1}{2}(r_f + w_f + T_i) - D_1$ $f + 1, \dots, k$ :	$J_{i+1}$	$w_f - w_i$	$\frac{r_f + w_f + T_{i-1} - w_i}{2} + w_f - D_1$
$J_i$	$\frac{1}{2}(r_f + T_i) - D_1$	$J_i$	0	$rac{1}{2}(r_f+T_i)-D_1$
J	$N_{COM}(J,s) + \frac{1}{2}T$	J	0	$N_{COM}(J, r_1) + N_{INT}(J, r_1)$

Table 3: Credits in Lemma 9.1

 $\frac{3}{2}(r_f+w_f-w_1)-5r_1+2s+3x\geq 3x+2s-\frac{7}{2}r_1+\frac{3}{2}D_2\geq x-\frac{1}{2}r_1+\frac{3}{2}D_2+3w_1\geq 3\frac{1}{2}w_1+\frac{3}{2}D_2 \text{ of credit, using } 3(r_1+w_1)\leq 2(s+x).$ 

Suppose  $\frac{3}{2}x < s$ . We take  $4(r_1 - s) + 2w_1$  out of  $J_1$ , leaving it with  $\frac{3}{2}(r_f + w_f - w_1) - 5r_1 + 4s \ge 4s - 3\frac{1}{2}r_1 + \frac{3}{2}D_2 \ge 4s - \frac{7}{2}(\frac{2}{3}(s+x) - w_1) + \frac{3}{2}D_2 \ge \frac{5}{3}s - \frac{7}{3}x + \frac{3}{2}D_2 + \frac{7}{2}w_1 > \frac{7}{2}w_1 + \frac{3}{2}D_2$  since  $\frac{5}{3}s \ge \frac{5}{2}x > \frac{7}{3}x$ .

In all cases, (7.4) holds for  $J_1$ . For the other jobs, we use Table 3.

In this table, the column marked 1 contains the credits of the jobs assuming the order  $J_1, J_f, J_2, \ldots, J_{f-1}, J_{f+1}, \ldots, J_k, J$ , and after  $J_1$  has given away credit to J-large jobs as described in Table 1. Column 2 shows the new order of the jobs. The credits stay in the same place, hence e. g.  $J_2$  now has a credit of  $\frac{3}{2}r_f + \frac{1}{2}w_f - r_1$ . Column 3 shows how much credit is gained by the reordering of the jobs. Column 4 shows credit transfers; in this case,  $\frac{1}{2}r_f$  is transferred from J to  $J_2$ . The last column contains the final credit of each job. The numbers above the columns refer to the steps in the procedure described at the start of this section.

We now show that the credit in the last column is sufficient so that all jobs satisfy (7.4). We have  $w_1=(r_1+w_1)-r_1\leq \frac{3}{2}(s+x)-s=\frac{3}{2}x-\frac{1}{3}s\leq \frac{4}{9}x\leq \frac{4}{9}x$  and  $r_1>\frac{2}{3}x$ , so  $J_1$  cannot start before time  $w_1$ . Hence  $N_{INT}(J_2,r_1)=0$ . Also  $N_{COM}(J_2,r_1)\leq \frac{1}{2}(w_2-w_1)$ . As in Case 1, we use that  $s^{\mathrm{OPT}}(J)$  has increased by  $\frac{1}{2}T$ .

Suppose  $r_1 + w_1 \ge w_k$ . Then  $N_{INT}(J, r_1) \le \frac{1}{2}(w_{k-1} + w_{k-3})$ . Therefore J can give  $\frac{1}{2}w_k$  of credit to  $J_2$ , and still satisfy (7.4). Then we find  $K(J_2) \ge D_2 + \frac{1}{2}r_f$ . We are done if  $r_f \ge w_f$ ; otherwise, since  $r_f \ge \frac{2}{3}x$ ,  $D_2 = (r_f + w_f) - (r_1 + w_1) \ge r_f + \frac{2}{3}x - \frac{2}{3}(s+x) \ge \frac{1}{3}r_f$ . Thus  $K(J_2) = D_2 + \frac{1}{2}r_f \ge \frac{5}{6}r_f \ge \frac{5}{9}x > \frac{1}{2}w_2$ .

Suppose  $r_1 + w_1 < w_k < x$ . Then  $\frac{3}{2}r_f - r_1 \ge 0$ , so  $K(J_2) \ge \frac{1}{2}w_f \ge \frac{1}{2}w_2$ .

For jobs  $J_3, \ldots, J_f$ , we have  $D_1 = w_f - w_1 - D_2 < w_f$  so we are done by Lemma 7.1, Case 2 if  $r_1 \ge w_{i-1}$ . If  $r_1 < w_{i-1}$ , then  $\frac{r_f - w_{i-1}}{2} + w_f - D_1 \ge \frac{3}{2}r_f + \frac{1}{2}w_f - r_1 \ge w_{i-1} - r_1$  since  $r_f > \frac{2}{3}x$ . We are done (Lemma 7.1, Case 3).

For jobs  $J_{f+1}, \ldots, J_k$ , we are done if  $r_1 \geq w_{i-1}$  since then  $K(J_i) \geq \frac{1}{2}(r_f + T_i) - D_1 \geq \frac{1}{2}(w_i - w_{i-1} + T_{i-2})$  (using  $D_1 < w_f$ ). And if  $r_1 < w_{i-1}$ , then  $\frac{1}{2}T_i - D_1 \geq \frac{1}{2}(w_i - w_{i-1} + T_{i-2}) + (w_{i-1} - r_1)$ .

**Lemma 9.2** If RSPT interrupts a job J at time  $r_1$ , and OPT runs one large job before ARRIVE, and STATIC holds, and the invariant held at time s, then it holds at time  $r_1$ .

**Proof.** We distinguish between three cases depending on s and f. We ignore that OPT has to run the jobs in  $BEFORE_s(J)$  too at some point; this can only decrease the optimal cost on the other jobs.

Case 1.  $s \le x/2$ . We have  $r_1 + w_1 \le \frac{2}{3}(s+x) \le x$ , so f = 1 by Lemma 5.4. Also  $b_s(J) \le s < x$ . We have  $s^{\text{OPT}}(J_1) \ge x$  and  $D(J_1) \le r_1 - x$ , so  $K(J_1) \ge \frac{3}{2}x + \frac{1}{2}w_1 - r_1$ . On arrival of  $J_1$ , job J is in Step 1 shifted by RSPT by  $r_1 + w_1 - s$  time. We take  $r_1 + 2w_1 - s$  of credit out of  $J_1$  for J, so that  $J_1$  is left with  $\frac{3}{2}x + \frac{1}{2}w_1 - 2(r_1 + w_1) + s \ge \frac{1}{2}w_1 + \frac{1}{6}x - \frac{1}{3}s \ge \frac{1}{2}w_1$ , so  $J_1$  satisfies (7.4).

Credit transfers For the Step 1-column, we use (6.1).

	1	2	3	$_{ m final}$
$J_1$	$\frac{1}{2}w_1$	$J_1$	0	$\frac{1}{2}w_1$
J	$N_{COM}(J,s) + w_1$	$J_2$	0	$N_{COM}(J,s) + w_1$
$J_2$	$\frac{1}{2}(x+T_2)-r_1$	$J_3$	$x-w_2$	$\frac{1}{2}(x+T_1-w_2)+(x-r_1)$
	:	:		
$J_k$	$\frac{1}{2}(x+T_k)-r_1$	J	$x-w_k$	$\frac{1}{2}(x+T_{k-1}-w_k)+(x-r_1)$

 $J_1$  satisfies (7.4) by Lemma 7.1, Case 1;  $J_2$  as well, using that  $x > w_2$  and  $b_s(J) \leq b_{r_1}(J_2)$ ; the other jobs too by Lemma 7.1, Case 3.

Case 2. s > x/2 and f = 1. Since f = 1, we have in Step 1 of our calculations that  $D(J_i) \le \min(x, r_1)$  for  $2 \le i \le k$ : after time  $r_1 + w_1$ , RSPT first runs J (of size x) whereas OPT runs  $J_2, \ldots, J_k$  immediately after J and  $J_1$ , at most  $\min(x, r_1)$  time earlier. We also have  $w_1 \le \frac{2}{3}(s+x) - r_1 \le \frac{2}{3}x - \frac{1}{3}s \le \frac{1}{2}x < s$ , so  $N_{INT}(J_2, r_1) = 0$ .

If  $r_1 \leq x$ , we are done exactly as in Case 1.

Now suppose  $r_1 > x$ . Since in this case  $K(J_1) = \frac{1}{2}(r_1 + w_1)$  initially, we have already checked in the proof of Lemma 9.1, Case 1, that  $J_1$  satisfies (7.4) after giving away credit as in Table 1.

Credit transfers  $(r_1 > x)$  See the following table.

	1	2	3	final
$J_1$	$\frac{1}{2}w_1$	$J_1$	0	$\frac{1}{2}w_1$
J	$N_{COM}(J,s)$	$J_2$	0	$N_{COM}(J,s)$
$J_2$	$\int \frac{1}{2}(x+T_2)-x$	$J_3$	$x-w_2$	$\frac{1}{2}(x+T_1-w_2)$
	:	:		
$J_k$	$\frac{1}{2}(x+T_k)-x$	J	$x-w_k$	$\frac{1}{2}(x+T_{k-1}-w_k)$

Since  $r_1 > x > w_i$  for  $1 \le i \le k$ , it follows immediately from Lemma 7.1, Case 2, that all jobs satisfy (7.4).

Case 3. s > x/2 and f > 1. Write  $\tilde{r} = \max(x, r_f)$ . Suppose  $r_1 \le x$ . Then at time  $\tilde{r} \ge r_1$ , OPT will run the remaining jobs in order of increasing size by Lemma 5.4. But then f = 1, a contradiction. Therefore  $r_1 > x$  and  $D(J_1) \le r_1 - (\tilde{r} + w_f) < 0$  using Property R3.

There can be only two jobs in ARRIVE that are interruptable, because the first one must have size at least  $p = (r_1 + w_1)/2 > x/2$  by Property R5, the second one size at least  $p' = (r_1 + w_1 + p)/2 > \frac{3}{4}x$ , so the third should have size  $(r_1 + w_1 + p + p')/2 > x$ , which is not possible for a job in ARRIVE. It follows similarly that if  $J_i$  is interruptable, then from ARRIVE only  $J_{i-1}$  or  $J_{i+1}$  can be interruptable as well. Moreover, since all jobs in ARRIVE start after time  $r_1 > x$ , for every job  $J_i$  in ARRIVE we have  $w_{i-1} - s_{i-1} < 0$ . Therefore if a job  $J_i$  is interruptable, then  $N_{INT}(J_i, r_1) = 0$ . Moreover, in this case  $T_{i-1} < w_i$ , because all jobs in ARRIVE start after time

		$J_1$	J	$J_f$	
	1	$\frac{3}{2}w_1 + \frac{3}{2}D_2$	$N_{COM}(J,s)$	$\frac{\tilde{r}+w_f}{2}-1$	$\overline{D_1 - x - w_1}$
	2a	$J_1$	J	$J_2$	
	3a	0	0		0
	2b	$J_1$	$J_2$	$J_3$	
	<b>3</b> b	0	0	x	$-w_2$
	4	$-\frac{1}{2}D_2$	0		$\frac{1}{2}D_2$
	final	$\frac{3}{2}w_1 + D_2$	$N_{COM}(J,s)$	$\frac{1}{2}(w)$	$(w_3 - w_2)$
	$J_i \ (2 \le i$	$\leq f - 1)$	$J_i(f+1 \le i \le$	$\leq k-1)$	$J_k$
1	$\frac{\tilde{r}+w_f+T_f}{2}$	$\frac{1}{2} - D_1 - x$	$\frac{\tilde{r}+T_i}{2}-D_1$	1-x	$\frac{\frac{1}{2}(\tilde{r}+T_k)-D_1-x}{}$
<b>2</b> a	$J_{i+1}$		$J_i$		$J_k^z$
3a	$w_f - w_i$		0		0
<b>2</b> b	$\parallel J_{i+2}$		$  J_{i+1}  $		J
3b	$x-w_{i+1}$		$x-w_i$		$x-w_k$
4	0		0		0
final	$\frac{\tilde{r}+w_f+T_{i-}}{2}$	$\frac{3-w_{i-2}}{2}-D_1$	$\frac{\tilde{r}+T_{i-3}-w_i}{2}+D_2+w_1$		$\frac{\tilde{r} + T_{k-2} - w_k}{2} + D_2 + w_1$

Table 4: Credit transfers in Lemma 9.2, Case 3

 $r_1 > x$ . Thus in such a case we have

$$N_{COM}(J_i, r_1) = \frac{1}{2}(w_i - T_{i-1})$$
 and  $N_{INT}(J_i, r_1) = 0$  (9.1)

If  $J_i$  is not interruptable, and  $J_{i-2}$  is, then  $w_{i-2} + w_{i-1} > x > w_i$  so

$$N_{COM}(J_i, r_1) = 0$$
 and  $N_{INT}(J_i, r_1) = \max(\frac{3}{2}w_{i-2} - s_{i-2}, 0).$ 

Since  $s^{\text{OPT}}(J_1) \geq \tilde{r} + w_f$ , we have  $K(J_1) \geq \frac{3}{2}(\tilde{r} + w_f) + \frac{1}{2}w_1 - r_1$ . Define  $D_2 = (\tilde{r} + w_f) - (r_1 + w_1) > 0$ , and  $D_1 = r_1 - \tilde{r} > 0$ . We will make much use of the following property:

$$w_f - D_2 = (r_1 + w_1) - \tilde{r} \le \frac{2}{3}(s+x) - \tilde{r} \le \frac{2}{3}x - \frac{1}{3}\tilde{r} \le \frac{1}{3}x.$$

$$(9.2)$$

This property implies  $D_1 = w_f - w_1 - D_2 \le w_f - D_2 \le \frac{1}{3}x$  and  $D_1 \le w_f$ .

We consider the various possibilities for s and  $r_1$  and take credit out of  $J_1$  as described in Table 1. The calculations are identical to the ones in Lemma 9.1, Case 2, except that  $r_f$  is replaced by  $\tilde{r}$  and  $D_2$  is defined as above. It follows that  $J_1$  ends up with credit of at least  $\frac{3}{2}(D_2 + w_1)$  and satisfies (7.4).

Credit transfers Since  $r_1 > x$ , we can again use Case 2 of Lemma 7.1 to check if jobs satisfy (7.4). We transfer credits as in Table 4. We now have columns for jobs in stead of rows as before, due to space constraints. Note that in this case, there are two reorderings of the jobs (a and b). Also, there is an additional row 4, indicating credit transfers between jobs. Note that the entries in this row add up to 0. The entries in the last row will be explained below.

 $J_1$  is not interruptable because  $w_1 \leq \frac{2}{3}(s+x) - s = \frac{2}{3}x - \frac{1}{3}s < \frac{1}{2}x < \frac{1}{2}r_1$ . Moreover,  $r_1 > x > w_2$ , so  $N_{INT}(J_2, r_1) = N_{INT}(J_3, r_1) = 0$ . For  $J_2$ , we have  $N_{COM}(J, s) = \frac{1}{2}(x - b_s(J))$ ,  $x > w_2$  and  $b_s(J) \leq b_{r_1}(J_2)$ . Therefore  $J_2$  satisfies (7.4).

For  $J_3$ , we have  $K(J_3) = \frac{1}{2}(\tilde{r} + w_f) - D_1 - x - w_1 + x - w_2 + \frac{1}{2}D_2 = \frac{1}{2}(\tilde{r} + w_f) + \frac{3}{2}D_2 - w_2 - w_f \ge \frac{1}{2}(\tilde{r} - 2w_2 - w_f) + \frac{3}{2}D_2 = \frac{1}{2}(w_3 - w_2) + \frac{1}{2}(\tilde{r} - w_2 - w_3 - w_f + 3D_2) \ge \frac{1}{2}(w_3 - w_2)$  using (9.2). For  $i = 4, \ldots, f$  we find

$$K(J_{i}) = \frac{1}{2}(\tilde{r} + w_{f} + T_{i-2}) - D_{1} - x + x - w_{i-1} + w_{f} - w_{i-2}$$

$$\geq \frac{1}{2}(\tilde{r} + w_{f} + T_{i-3} - w_{i-2}) - D_{1}$$

$$= \frac{1}{2}(\tilde{r} + T_{i-3} - w_{f} - w_{i-2}) + D_{2} + w_{1}$$

$$= \frac{(w_{i} + T_{i-3} - w_{i-2}) + (\tilde{r} - w_{f} - w_{i} + 2D_{2})}{2} \geq \frac{w_{i} + T_{i-3} - w_{i-1}}{2}.$$

$$(9.4)$$

If  $J_i$  is interruptable,  $J_{i-2}$  and earlier jobs are not and we are done. Suppose  $J_i$  is not interruptable and  $s_{i-2} < \frac{3}{2}w_{i-2}$ . (If  $s_{i-2} \ge \frac{3}{2}w_{i-2}$ , we are done.) Then we use that  $s_{i-2} > r_1$  and we have from (9.3)

$$K(J_i) + s_{i-2} > \frac{1}{2}(\tilde{r} + w_f + T_{i-3} - w_{i-2}) + \tilde{r} \ge \frac{1}{2}(\tilde{r} - w_{i-2} + T_{i-3}) + \frac{3}{2}w_{i-2}.$$

For  $J_{f+1}$ , the calculations are similar, but from (9.4) we now derive  $K(J_{f+1}) \geq \frac{1}{2}T_{f-1} + \frac{1}{2}(w_{f+1} - T_f)$ and  $K(J_i) \geq \frac{1}{2}T_{f-1} + 0$  (using (9.2)). Thus there is sufficient completion-credit, and the case  $s_{f-1} < \frac{3}{2}w_{f-1}$  is handled as above.

For i = f + 2, ..., k we have  $K(J_i) \geq \frac{1}{2}(\tilde{r} + T_{i-1}) - D_1 - x + x - w_{i-1} \geq \frac{1}{2}(\tilde{r} + T_{i-3} - w_f - x)$  $(w_{i-1}) + D_2 + w_1$ .

Suppose  $r_1 < \frac{3}{2}w_{i-2}$ . Then  $K(J_i) + r_1 \ge \frac{1}{2}(\tilde{r} + T_{i-2} - w_{i-1}) + \tilde{r} \ge \frac{1}{2}(\tilde{r} + T_{i-3} - w_{i-1}) + \frac{3}{2}w_{i-2}$ , and we are done.

Otherwise,  $s_{i-2} \geq r_1 \geq \frac{3}{2}w_{i-2}$  so  $N_{INT}(J_i, r_1) \leq 2w_{i-4} - r_1 \leq \frac{1}{2}w_{i-4}$ . Suppose  $w_f \geq \frac{2}{3}x$ . Then  $D_2 \geq \frac{1}{3}\tilde{r}$  and thus  $K(J_i) \geq \frac{1}{2}(w_i + T_{i-3} - w_{i-1}) + \frac{1}{2}(\tilde{r} - (w_f - D_2)) - \frac{1}{2}(\tilde{r} - w_f - D_2)$  $\frac{1}{2}(w_i - D_2) \ge \frac{1}{2}(w_i + T_{i-3} - w_{i-1}).$ 

If  $w_f < \frac{2}{3}x$ , then also  $w_2 < \frac{2}{3}x$ . For this particular case only, we consider when OPT runs the jobs in  $BEFORE_s(J)$ . If any job in  $BEFORE_s(J)$  is completed after  $J_f$ , then by Lemma 8.2 there is extra credit available of  $\frac{3}{2}w_f$ . We give this to  $J_i$  which then has credit of at least  $\frac{1}{2}(w_i + T_{i-3} - w_{i-1}) + \frac{1}{2}(\tilde{r} - w_i) \ge \frac{1}{2}(w_i + T_{i-3} - w_{i-1})$ . If all jobs in  $BEFORE_s(J)$  are completed before  $J_f$ , then the credit of  $J_f$  is  $\frac{3}{2}b_s(J)$  larger than previously calculated. We give this to  $J_2$ . Then  $K(J_2) \geq \frac{1}{2}x$ . However,  $w_2 < \frac{2}{3}x$ , so we take  $\frac{1}{6}x$  out of the credit of  $J_2$  again and give it to  $J_i$ . Then  $K(J_i) \geq \frac{1}{2}(\tilde{r} + T_{i-3} - w_{i-1}) + \frac{1}{6}x + \frac{1}{2}w_{i-2} - D_1 \geq \frac{1}{2}(\tilde{r} + T_{i-3} - w_{i-1})$  since  $D_1 \leq \frac{1}{3}x$  and  $D_1 \leq \frac{1}{2} w_f \leq \frac{1}{2} w_{i-2}$ .

For J, we calculate as for  $J_{f+1}$  in case k=f and as for  $J_{f+2}$  and higher in case k>f+1. (The calculations for  $J_{f+1}, \ldots, J_k$  hold for any job size at most x, so they also hold when applied to J.)

**Lemma 9.3** If RSPT interrupts a job J at time  $r_1$ , and OPT runs at least two large jobs before ARRIVE, and STATIC holds, and the invariant held at time s, then it holds at time  $r_1$ .

**Proof.** Since RSPT only interrupts J before time 2x, we have f=1: OPT starts to run the jobs in ARRIVE after RSPT does, and will use the optimal order for them by Lemma 5.4. That Lemma also implies that OPT runs not more than two large jobs before ARRIVE. If  $s \leq x/2$ , we have  $r_i \leq x$  for all jobs  $J_i \in ARRIVE$ . Then, again by Lemma 5.4, we may assume OPT runs only one large job before ARRIVE: a contradiction. Hence x/2 < s < 2x and  $r_1 > x$ .

	1	2	3	4	final
$J_1$	$\frac{1}{2}w_1 + K_1$	$J_1$	0	$-K_1$	$\frac{1}{2}w_1$
J	$ar{N}_{COM}(J,s)$	$J_2$	0	0	$N_{COM}(J,s)$
$J_2$	$\frac{1}{2}T_2 + D_1$	$J_3$	$x-w_2$	$-\frac{x+w_1}{2} - D_1$	$\frac{1}{2}(x-w_2)$
i =	$\overline{3,\ldots,k-1}$ :				
$J_{i}$	$\frac{1}{2}T_i + D_1$	$J_{i+1}$	$x-w_i$	$-\frac{1}{2}(x+w_{i-1})$	$\frac{x+T_{i-2}-w_i}{2}+D_1$
$J_k$	$\frac{1}{2}T_k + D_1$	J	$x-w_k$	$-\frac{1}{2}(x+w_{k-1})$	$\frac{x+T_{k-2}-w_k}{2}+D_1$
$J^2$	$N_{COM}(J^2,s) - T_k + w_1$	$J^2$	0	$+T_k+D_1$	$N_{COM}(J^2,s) + D_1$

Table 5: Credit transfers in Lemma 9.3  $(r_1 \leq \frac{3}{2}x, k \geq 3)$ 

Suppose  $\ell_s(J) < x$ . In this case, we ignore that OPT has to run the job of this size too at some time. This can only help OPT. The interrupt-delay caused by the current interruption is  $r_1 - s$  for each large job that RSPT has not completed yet.

Credit of  $J_1$  and large jobs We define  $D_1 = -D(J_1) = x + x_2 - r_1 \ge \frac{4}{3}x - \frac{2}{3}s + w_1$ . We have  $K(J_1) = \frac{3}{2}(x + x_2) + \frac{1}{2}w_1 - r_1$ . We consider the various possibilities for s and  $r_1$  and take credit out of  $J_1$  as described in Table 1, and an extra  $w_1$  for the small-job delay of  $J^2$ . By these reassignments, and because J and  $J^2$  satisfied (7.4), we have in Step 1 that  $K(J) \geq \frac{1}{2}(x - b_s(J))$ and  $K(J^2) \ge \frac{1}{2}(x_2 - x) - T_k + w_1$ .

Suppose  $s \leq x$ . Then  $r_1 \leq \frac{2}{3}(s+x) \leq \frac{4}{3}x$ . We take  $2(r_1+w_1)-s-x$  of credit out of  $J_1$  to give to J and  $J^2$ , and we let it keep  $\frac{1}{2}w_1$  for itself. We denote the remainder, which will be given to  $J^2$ , by  $K_1$ . We have  $r_1 \leq \frac{2}{3}(x+s) - w_1$ , so in this case  $K_1 = \frac{3}{2}(x+x_2) - 3r_1 - 2w_1 + s + x \geq 1$  $\frac{1}{2}x + \frac{3}{2}x_2 - s + w_1 \ge x_2 + w_1.$ 

Now suppose  $x < s < r_1 \le \frac{3}{2}x$ . In this case we need  $2(r_1 + w_1) - 2s$  for J and  $J^2$ . Hence  $K_1 = \frac{3}{2}(x + x_2) - 3r_1 - 2w_1 + 2s \ge \frac{3}{2}(x + x_2) - 2x + w_1 \ge x_2 + w_1$ .

Thirdly, suppose  $x < s \le \frac{3}{2}x < r_1$ . Now the required credit is in total  $2(r_1 - s + w_1) + 2(r_1 - \frac{3}{2}x)$ . Hence  $K_1 \ge \frac{3}{2}(x + x_2) - \frac{4}{3}s - \frac{1}{3}x + 3w_1 \ge \frac{2}{3}x + 3w_1$ . Finally, if  $\frac{3}{2}x < s < r_1$  the jobs require  $4(r_1 - s) + w_1$ , and again  $K_1 \ge \frac{2}{3}x + 3w_1$ .

Credit transfers We transfer credits as in Table 5.

For  $2 \le i \le k$ , we have  $D(J_i) \le (r_1 + x + T_{i-1}) - (x + x_2 + T_{i-1}) = r_1 - x_2$  in Step 1. Using (6.1) we have  $K(J_i) \ge \frac{1}{2}(x + x_2 + T_i) - (r_1 - x_2) \ge \frac{1}{2}T_i + D_1$  for  $2 \le i \le k$ .

 $J_1$  is not interruptable by Property R5 since  $r_1 \geq \max(x,s)$  and  $r_1 + w_1 \leq \frac{2}{3}(s+x) \leq \frac{4}{3}\max(s,x)$ , hence  $N_{INT}(J_i, r_1) = 0$  for  $1 \le i \le 3$ . Furthermore,  $D_1 = x + x_2 - r_1$  is an upper bound for the total amount of future interrupt-delays caused by interruptions of jobs before  $J^2$  that have arrived so far.

Suppose  $k \leq 2$ . In this case we do not use the table. If k = 1, we are done immediately. If k=2, then  $N_{INT}(J,r_1)=0$  and  $K(J)=\frac{1}{2}T_2+D_1+x-w_2=\frac{1}{2}(x-w_2+w_1)+\frac{1}{2}x+D_1$ . Thus J can give  $\frac{1}{2}x+D_1$  to  $J^2$ , and  $J_1$  can give an additional  $K_1\geq \frac{1}{2}x$  to  $J^2$ . Then  $J^2$  receives in total  $x+D_1\geq w_2+D_1$ , and it received  $w_1$  already from  $J_1$  at the start. Thus  $J^2$  satisfies (7.4). For job  $J_2$ , we have  $K(J_2) = N_{COM}(J,s) = \frac{1}{2}(x - b_s(J)), x \ge w_2$  and  $b_{r_1}(J_2) \ge b_s(J)$ , so  $K(J_2) \ge N_{COM}(J_2, r_1).$ 

Suppose  $k \geq 3$ . In this case we use Table 5.  $J_3$  can give  $D_1$  away because  $N_{INT}(J_3, r_1) = 0$ . We distinguish between two cases:  $r_1 \leq \frac{3}{2}x$  and  $r_1 > \frac{3}{2}x$ .

Case 1.  $r_1 \leq \frac{3}{2}x$ : The jobs  $J_4, \ldots, J_k, J, J^2$  have sufficient interrupt-credit because they have  $D_1$ . Since  $x > w_i$  for  $i = 4, \ldots, k$ , all these jobs also have sufficient completion-credit.  $J_2$  satisfies (7.4) as above

Hence we only need to show that the total transferred credit in Column 4 is at most 0, i. e. we do not in total give more credit to jobs than we remove from jobs. In other words, all the credit given to  $J^2$  is actually available. To see this, note that  $\frac{1}{2}(x+w_{i-1}) \geq w_{i-1}$  for  $2 \leq i \leq k$ . Furthermore, if  $r_1 \leq \frac{3}{2}x$  (shown in the table), we have  $K_1 \geq x_2 \geq w_k$ , and the additional  $D_1$  from  $J_3$  completes the credit given to  $J^2$ .

Case 2.  $r_1 > \frac{3}{2}x$ : Denote the jobs that RSPT starts to run at time  $r_1$  alternatively by  $J'_1, \ldots, J'_{k'}$ , then by (7.1) we have  $N_{INT}(J'_i, r_1) \leq \frac{1}{2}w'_{i-4}$ . We take  $D_1$  from  $J_3$  as before and also  $D_1$  from the very next job  $J'_4$  ( $J'_4 \in \{J_4, J\}$ ). We can do that because  $N_{INT}(J'_4, r_1) = 0$ . This makes in total again at least  $T_k + D_1$  to give to  $J_2$ , since in this case  $K_1 + D_1 \geq x_2 \geq w_k$ . Giving it to  $J^2$  again ensures that  $J^2$  satisfies (7.4).

Now suppose  $\ell_s(J) \geq x$ . In this case OPT runs only one more large job than RSPT before ARRIVE. Hence in this case,  $J^2$  does not have small-job delay and we are done after Step 3 in the table: all jobs already satisfy (7.4).

## 10. Job completions

We divide the job completions into cases based on how many large jobs opt runs before ARRIVE. The case where no jobs arrived at all while RSPT was running J is treated separately in Lemma 10.1. An overview can be found in the following table.

Large jobs before $ARRIVE$ by OPT	0	1	2	More than 2
Lemma	10.2	10.3	10.4	10.5, 10.10

Remember that to calculate the initial credit of jobs, we will use Event assumption 2. Since all jobs in ARRIVE are smaller than x, and complete after J, we have immediately  $N_{COM}(J_i, t) = 0$  for  $J_1, \ldots, J_k$ .

We use again Event assumption 3.

**Lemma 10.1** If RSPT completes a job J and no jobs arrived while it was running J, and STATIC holds, and the invariant held at time s, then it holds at time t.

**Proof.** RSPT now starts the run the smallest available job at the time that was calculated in the analysis of the most recent event. Hence, for the remaining jobs the situation (and the credit) does not change. The completed job has nonnegative credit.

**Lemma 10.2** If RSPT completes a job J without interruptions and OPT does not run any large jobs before ARRIVE, and STATIC holds, and the invariant held at time s, then it holds at time t.

**Proof.** We use similar tables as in Section 9, starting with a job order for which it is easy to calculate the credits and then reordering the jobs. Here we ignore that RSPT starts to run the jobs already at time s and not only at time  $r_f$ . This gives us a lower bound for the amount of credit that is actually available.

Applying Lemma 8.2 repeatedly, we have that there is  $\frac{3}{2}T$  of credit available. We give this to J. We consider first the credit of the jobs if RSPT would run the jobs in the same order as OPT, and starting at time  $r_f$ . Then J starts T time later than calculated at the previous event, and thus only has  $\frac{1}{2}T$  left of the  $\frac{3}{2}T$  that it just received. In Step 1, we have that RSPT starts each job at the same time as OPT starts it. See Table 6. We use (6.1).

	1	2	3	final
$J_f$	$\frac{1}{2}(r_f+w_f)$	J	$-(x-w_f)$	0
$J_i \ (i=1,\ldots,f-1)$	$\frac{1}{2}(r_f + w_f + T_i)$	$J_i$	$-(x-w_f)$	$\frac{1}{2}T_i$
$J_i \ (i=f+1,\ldots,k)$	$\frac{1}{2}(r_f + T_i)$	$J_{i-1}$	$-(x-w_i)$	$\frac{1}{2}(T_i-w_f)$
J	$N_{COM}(J,s) + \frac{1}{2}T$	$J_k$	0	$N_{COM}(J,s) + \frac{1}{2}T$

Table 6: Credits in Lemma 10.2

We use in this table that  $\frac{1}{2}(r_f + w_f) - (x - w_f) = \frac{3}{2}w_f - x + \frac{1}{2}r_f \ge s - r_f \ge 0$ , which holds since  $\frac{3}{2}w_f \geq s + x - \frac{3}{2}r_f$ . For  $J_f, \ldots, J_{k-1}$  we also use that  $x - w_i \leq x - w_f$ . Note that  $T_i - w_f \geq T_{i-1}$ for i > f. Hence all the jobs in Table 6 satisfy (7.4) by Lemma 7.1, Case 1. Note that this proof also holds for f = 1.

**Lemma 10.3** If RSPT completes J without interruptions and OPT runs one large job before ARRIVE, and STATIC holds, and the invariant held at time s, then it holds at time t.

**Proof.** If  $s \leq x/2$ , the jobs in ARRIVE start within a factor of  $\frac{3}{2}$  of their optimal starting time (and run in the best possible order), so that the credit of  $J_i$  is at least  $\frac{1}{2}\sum_{j=1}^i w_i$  by (6.1): all jobs in ARRIVE satisfy (7.4) by Lemma 7.1. The same thing holds if  $s \geq 2x$ .

Suppose x/2 < s < 2x. This implies  $N_{INT}(J_i, t) \leq 2w_{i-4} - t \leq \frac{1}{2}w_{i-4}$  for  $4 \leq i \leq k$  and

 $N_{INT}(J_i,t)=0$  for  $1\leq i\leq 3$ . Recall that  $N_{COM}(J_i,t)=0$  for all  $J_i\in ARRIVE$ . Suppose  $1\leq f< k$ . We define  $v_f=s^{\mathrm{OPT}}(J_1)-\frac{2}{3}(s+x)>0$  and  $\tilde{s}=\max(s,x+b_s(J))$ . Suppose first that OPT runs the jobs in  $BEFORE_s(J)$  before ARRIVE, then  $s^{\mathrm{OPT}}(J_1)\geq \tilde{s}+w_f$ . We have

$$K(J_f) \ge \frac{1}{2}(\tilde{s} + w_f) - (s + x - \tilde{s}) = \frac{3}{2}\tilde{s} + \frac{1}{2}w_f - (s + x) = \frac{3}{2}v_f - w_f.$$

If  $s \le x + b_s(J)$ , then  $w_f - v_f \le \frac{2}{3}(s+x) - \tilde{s} \le \frac{2}{3}(x+b_s(J)+x) - (x+b_s(J) = \frac{1}{3}(x-b_s(J))$ . If  $s \ge x + b_s(J)$ , then  $w_f - v_f \le \frac{2}{3}x - \frac{1}{3}s \le \frac{1}{3}(x-b_s(J))$  as well. Using this bound, we transfer credits as in Table 7. It can be seen that the entries in Column 4 add up to at most 0, and that all jobs satisfy (7.4).

	1	2	3	4	final
$\overline{J}$	$\frac{1}{2}(x-b_s(J))$	J	0	$-\frac{1}{2}(x-b_s(J))$	0
$J_f$	$-\frac{3}{2}v_f-w_f$	$J_1$	0	$\frac{1}{3}(x - b_s(J))$	$\frac{1}{2}v_f$
$J_1$	$\frac{3}{2}v_f - w_f + \frac{1}{2}w_1$	$J_2$	$w_f - w_1$	$\frac{1}{2}w_1$	$\frac{3}{2}v_f$
i=2	$\dots, f$ :				
$J_{i}$	$\frac{3}{2}v_f - w_f + \frac{1}{2}T_i$	$J_{i+1}$	$w_f - w_i$	$\frac{1}{2}(w_i - w_{i-1})$	$\frac{3}{2}v_f + \frac{1}{2}T_{i-2}$
$J_{f+1}$	$\frac{3}{2}v_f - w_f + \frac{T_{f+1} - w_f}{2}$	$J_{f+1}$	0	$\frac{x-b_s(J)}{6} - \frac{1}{2}w_{f-1}$	$v_f + \frac{1}{2}T_{f-2}$
i = f	$+2,\ldots,k$ :				
$J_i$	$\frac{3}{2}v_f - w_f + \frac{T_i - w_f}{2}$	$J_i$	0	0	$\frac{3}{2}v_f + \frac{1}{2}T_{i-3}$

Table 7: Credit transfers in Lemma 10.3  $(1 \le f < k)$ 

If f = k, then we cannot take  $\frac{1}{2}w_{f-1}$  of credit out of  $J_{f+1}$  because there is no such job. However, we can now give  $\frac{x-b_s(J)}{6}$  from J to  $J_f$  instead of to  $J_{f+1}$ , and  $\frac{x-b_s(J)}{6} \ge \frac{1}{2}(w_f - v_f) \ge \frac{1}{2}(w_{f-1} - v_f)$ . Finally, consider the case where OPT does not run all jobs in  $BEFORE_s(J)$  before all the jobs in ARRIVE. Then OPT runs one job in  $BEFORE_s(J)$  in particular after job  $J_f$ , which implies that

there is an additional  $\frac{3}{2}w_f$  of credit available by Lemma 8.2. We can give  $w_f$  to  $J_1$  and  $\frac{1}{2}w_f$  to  $J_{f+1}$  (instead of giving those jobs credit from J). For the other jobs, we can still transfer credits as in Table 7. If f = k, we give  $\frac{3}{2}w_f = \frac{3}{2}w_k$  to  $J_1$ .

Corollary 10.1 If RSPT completes J without interruptions and OPT runs one large job before ARRIVE, and STATIC holds, the jobs in ARRIVE need to receive at most an additional  $\frac{3}{2}(w_f - v_f) \leq \frac{1}{2}(x - b_s(J))$  of credit in total in order to satisfy (7.4), where  $v_f = s^{\text{OPT}}(J_1) - \frac{2}{3}(s + x)$ .

**Lemma 10.4** If RSPT completes J without interruptions and OPT runs two large jobs before ARRIVE, and STATIC holds, and the invariant held at time s, then it holds at time t.

**Proof.** If  $\ell_s(J) \geq x$ , there is nothing to prove since the same number of jobs is delayed by RSPT and by OPT, and RSPT starts the jobs in ARRIVE at most a factor of 3/2 after OPT starts them since  $s \geq x$ . Hence, the jobs in ARRIVE satisfy (7.4) and the remaining large jobs gain credit by Rule C2 and still satisfy (7.4). (We can assume OPT runs the same two large jobs before ARRIVE as RSPT, similarly to Event assumption 3.)

Suppose  $\ell_s(J) < x$ . Denote the largest of the two jobs that OPT completes before ARRIVE by  $J^2$ . We distinguish between the cases  $s < x_2$  and  $s > x_2$ .

Case 1.  $s \leq x_2$ . Then  $K(J_i) \geq \frac{1}{2}(x+x_2+T_i)$ . Note that  $N_{COM}(J_i,t)=0$ , and  $N_{INT}(J_i,t) \leq \frac{1}{2}T_{i-2}$ . We let each job  $J_i$  keep  $\frac{1}{2}T_{i-1}$  and give  $\frac{1}{2}(x+x_2+w_i)>\frac{3}{2}w_i$  to  $J^2$ . This is sufficient to both pay for the small job-delay of  $J^2$ , which is T, and to add  $\frac{1}{2}T$  for  $K_{INT}(J^2)$ , which ensures  $K(J^2) \geq N_{COM}(J^2,t) + N_{INT}(J^2,t)$ .

Case 2.  $s > x_2$ . Then the jobs in ARRIVE are not interruptable, hence  $N_{INT}(J_i, t) = N_{COM}(J_i, t) = 0$  for all jobs  $J_i \in ARRIVE$ . Therefore,  $N_{INT}(J_2, t) = 0$ . Consider the set  $BEFORE_s(J)$  of jobs that RSPT already completed, and suppose OPT completes all these jobs before  $J_k$ .

Then we have  $K(J_i) \geq \frac{3}{2}(\max(s, x + x_2)) + \frac{1}{2}T_i - (s + x) \geq \frac{1}{2}T_i$  for  $i = 1, \ldots, k - 1$  and  $K(J_k) \geq \frac{3}{2}(\max(s, x + x_2) + b_s(J)) + \frac{1}{2}T_k - (s + x) \geq \frac{3}{2}b_s(J) + \frac{1}{2}T_k$ . All the credit of these jobs can go to  $J^2$ . The sum is at least  $\frac{3}{2}b_s(J) + T_{k-1} + \frac{1}{2}w_k$ . Furthermore,  $J^2$  receives  $\frac{1}{2}(x - b_s(J))$  from J, and it loses at most  $T_k$  because it is delayed by RSPT. Hence in total  $J^2$  does not lose credit and still satisfies (7.4).

Finally, suppose there is a job in  $BEFORE_s(J)$  that OPT does not complete before the final job  $J_k$  in ARRIVE. By Lemma 8.2 there is  $\frac{3}{2}w_k$  of credit available that we can give to  $J^2$ , in addition to the  $T_{k-1} + \frac{1}{2}w_k$  that it gets from the jobs in ARRIVE. This is sufficient for  $J^2$  to satisfy (7.4) again.

## 10.1 OPT runs at least three jobs before ARRIVE

Define  $\delta(t)$  as the number of jobs OPT has completed minus the number of jobs RSPT has completed at time t. Property R4 implies that if RSPT is running a job of size x at time t < 2x, then  $\delta(t) \le 1$ . In other words,  $\delta(t) \ge 2 \Rightarrow t \ge 2x$ . Thus as long as  $\delta(t) \ge 2$ , no jobs are ever interrupted by RSPT by Property R5.

**Lemma 10.5** If  $\delta(s) \leq 1$ , and a job J is completed by RSPT, and STATIC holds, and the invariant held at time s, then it holds at time t.

**Proof.** Because of Lemma 10.1, 10.2, 10.3 and 10.4 we only need to consider the case where OPT runs  $a \ge 3$  large jobs before ARRIVE. Since  $\delta(s) \le 1$ , after time s OPT still starts  $a-2 \ge 1$  J-large

job before it runs the jobs in ARRIVE. Therefore, RSPT completes the jobs in ARRIVE no later than opt does. Moreover, a=3 since the jobs in ARRIVE arrive before opt completes the third J-large job. We have  $K(J_i) \geq \frac{1}{2}(3x+T_i) \geq 2w_i$ . We give  $w_i$  to any jobs that RSPT completes after ARRIVE and opt before ARRIVE, since the jobs in ARRIVE are not interruptable and do not need any credit themselves: we have s > x, else  $a \leq 2$ . There are at most two such jobs, and their credit decreased by T because of the jobs in ARRIVE, using Rule C1. Therefore they get all the lost credit back from the jobs in ARRIVE, and again satisfy (7.4).

Suppose  $\delta(s) \geq 2$ . It can only happen during the final run of a job that  $\delta(s)$  increases from at most 1 to above 1, because we can apply Property R4 whenever a job is interrupted. For any maximal interval [a, b) in which  $\delta(s) \geq 2$  and where RSPT completes a job at time a, denote the job that it completes at time a by J(a).

**Lemma 10.6** Suppose OPT starts its next J(a)-large job after time a at time  $s_2$ . Then there is a time  $t \in (a, s_2 + w(J(a))]$  such that  $\delta(t) \leq 1$ .

**Proof.** At time a, RSPT starts to run the J(a)-small jobs that arrived while it was running J(a). Suppose  $\delta(t) \geq 2$  in the entire interval  $(a, s_2 + w(J(a))]$ , then RSPT does not interrupt any job in this interval. Then in this interval, it certainly completes at least as many jobs as OPT starts and completes in the interval  $(a - w(J(a)), s_2]$  (it is possible that OPT decides not to run some small jobs that have arrived yet, but then it can only complete less jobs in  $(a - w(J(a)), s_2]$  than RSPT does in  $(a, s_2 + w(J(a))]$ ). Thus  $\delta(s_2 + w(J(a))) \leq \delta(a) \leq 1$ .

**Lemma 10.7** Suppose  $\delta(s) \geq 2$  for a job J. Then J(a) is J-large.

**Proof.** At time a - w(J(a)), opt has completed at most one job that RSPT has not completed, and such a job can only be J(a)-large. At time a, RSPT completes a J(a)-large job, namely J(a) itself. OPT completes at most one J(a)-large job in the interval (a - w(J(a)), a]. Thus at time a, opt has (still) completed at most one J(a)-large job more than RSPT.

By Lemma 10.6, OPT does not complete any other J(a)-large job within the current interval where  $\delta(t) \geq 2$ . On the other hand, at time s RSPT has completed all J-small jobs that have arrived, so OPT must have completed at least two J-large jobs that RSPT has not completed. Then J must be J(a)-small.

**Lemma 10.8** Suppose  $\delta(s) \geq 2$  for a job J. Then  $s \geq 3x$ .

**Proof.** J(a) is J-large by Lemma 10.7. At time s, RSPT has completed all J-small jobs that have arrived. Also it has completed J(a). There are two cases.

If OPT completes J(a) before time s, and at least two other J-large jobs, then  $s \geq w(J(a)) + 2x \geq 3x$ . If OPT does not complete J(a) before time s, there must be at least three other J-large jobs that OPT has completed at time s since  $\delta(s) \geq 2$ , and thus  $s \geq 3x$ .

**Lemma 10.9** If  $\delta(s) \geq 2$ , then at time s the total size of the smallest  $\delta(s) - 1$  jobs in RSPT's queue is at most  $\min(w(J(a)), a/3)$ .

**Proof.** We begin by showing it holds at time a. At that time, we have that  $\delta(a) - 1$  jobs that OPT has completed and RSPT has not, were started and completed by OPT in (a - w(J(a)), a]. Thus their total size is at most w(J(a)). Then the total size of the  $\delta(a) - 1$  smallest such jobs is certainly at most w(J(a)).

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If  $a \geq 3w(J(a))$ , the other bound also follows immediately. Otherwise, if OPT completes two J(a)-large jobs before time a, we use  $a-2w(J(a))\leq a/3$ . Finally, if it completes only one, then the first J(a)-small job that OPT completes in (a-w(J(a)),a] must complete after time  $\frac{2}{3}a$ , since it does not cause an interruption. Thus the  $\delta(a)-1$  smallest jobs can start and complete in an interval of size a/3. (Note that if OPT completes a J(a)-large job in (a-w(J(a)),a] in this case, then  $\delta(a-w(J(a)))\leq 0$ .)

Now we show that it holds later, by induction. Consider a time s for which (still)  $\delta(s) \geq 2$ . Denote the number of jobs that RSPT and OPT complete in (a, s] by  $c_1$  and  $c_2$ , respectively. From these  $c_2$  jobs and the last  $\delta(a) - 1$  jobs that OPT starts and completes in (a - w(J(a)), a], there are then exactly  $\delta(a) - 1 + c_2 - c_1 = \delta(s) - 1$  jobs that RSPT must still run. The total size of the  $c_1$  jobs that RSPT completes in (a, s] is exactly s - a, so the total size of these  $\delta(s) - 1$  jobs is again bounded by  $\min(w(J(a)), a/3)$ . Then this certainly holds for the smallest  $\delta(s) - 1$  jobs that RSPT must still complete.

**Lemma 10.10** If  $\delta(s) \geq 2$ , and a job J is completed, and STATIC holds, and the invariant held at time s, then it holds at time t.

**Proof.** Since  $\delta(s) \geq 2 \Rightarrow s \geq 3x$  by Lemma 10.8, the jobs in ARRIVE(I) require 0 credit because they cannot be interrupted and a larger job completes before them. Because of Lemma 10.9, the  $\delta(s) - 1$  smallest waiting jobs also require just 0 credit for the same reason (using  $s \geq a$ ).

We first consider an alternative schedule, where RSPT runs the jobs in ARRIVE(I) not just after J, but after the  $\delta(s)-1\geq 1$  smallest waiting jobs in RSPT's queue. (If  $\delta(s)=2$ , this is only J.) The jobs in ARRIVE(I) then cause only small-job delay for at most one job J', and they are executed within  $\frac{1}{3}s$  of their optimal starting time. Therefore each such job  $J_i$  has credit of at least  $\frac{1}{2}(s+T_i)-\frac{s}{3}\geq \frac{1}{2}T_i+\frac{1}{6}s\geq \frac{1}{2}T_i+\frac{1}{2}x(I)\geq w_i$ , which it can give to J' to make up for its small-job delay. By finally putting the jobs in the correct order (but keeping the credits in the same locations as usual), the total amount of credit does not decrease. This proves the lemma.

**Lemma 10.11** If RSPT completes a job J, and STATIC holds, and the invariant held at time s, then it holds at time t.

**Proof.** This follows from Lemmas 10.1, 10.2, 10.3, 10.4, 10.5 and 10.10.  $\Box$ 

# 11. Interruptions, s < 2x/3

In Section 9, it was shown for several situations that the invariant keeps holding if an interruption occurs. There is only one case left of the situation where OPT does not complete any large jobs before ARRIVE, and this is the complement of Lemma 9.1: s < 2x/3.

We will use the following Lemma. We do **not** use Assumption 2 at time s or  $r_1$ .

**Lemma 11.1** For any input sequence  $\sigma$ , where some run-interval  $I = (s(J), r_1]$  ends with an interruption, and where  $s(J) \leq \frac{2}{3}w(J)$ , and where opt does not run any J-large job before ARRIVE(I), it is possible to modify the release times of some jobs so that  $\sigma$  can be divided into two sequences  $\sigma_1, \sigma_2$  so that the schedule of RSPT for  $\sigma_1$  is unchanged and the schedule for  $\sigma_2$  is unchanged starting from time s(J); no job in  $\sigma_2$  arrives before time s(J);  $J \in \sigma_2$  arrives at time s(J); all other J-large jobs arrive at time s(J) or later; and  $s(J) \in \sigma_1$  opt  $s(J) \in \sigma_2$  arrives at time  $s(J) \in \sigma_3$ .

**Proof.** We divide  $\sigma$  into two parts: we let  $\sigma_1$  contain the jobs from  $\sigma$  that RSPT completes before time s(J), and  $\sigma'_2$  all the other jobs.

All jobs in  $\sigma_1$  are finished by RSPT before time  $s(J) \leq \frac{2}{3}w(J)$ . The jobs in  $\sigma_2'$  either have size at least w(J) or arrive after time s(J) by definition of RSPT. Therefore, when processing  $\sigma$ , the total completion time of RSPT of the jobs in  $\sigma_1$  is the same as it would have been if the jobs in  $\sigma_2'$  all arrived after time s(J): any job in  $\sigma_2'$  that is running before time s(J), is interrupted immediately whenever a job in  $\sigma_1$  arrives, since such a job from  $\sigma_2'$  has size at least w(J).

Moreover, OPT does not start any J-large job in  $\sigma'_2$  before time  $r_1$ , since OPT runs ARRIVE(I) before any J-large job and OPT does not complete any job in ARRIVE(I) before time  $r_1$  by Property R3. Therefore, the optimal total completion time of the jobs in  $\sigma'_2$  is unaffected if we constuct  $\sigma_2$  by changing the release time of J to s(J) and the release time of all other J-large jobs in  $\sigma'_2$  that arrive before time  $r_1$ , to  $r_1$ . Clearly, this cannot affect the optimal total completion time of the jobs in  $\sigma_1$ . (Note that it is possible that OPT still runs some jobs in  $\sigma_1$  after time s.)

Thus  $RSPT(\sigma_1) + RSPT(\sigma_2) = RSPT(\sigma)$ ,  $OPT(\sigma_1)$  is the cost of  $\sigma_1$  in  $\sigma$ ,  $OPT(\sigma_2)$  is at most the cost of  $\sigma_2'$  in  $\sigma$  and we are done.

Thus if there is an interruption at time  $r_1$ , and  $s \leq \frac{2}{3}x$ , we can consider all the jobs completed earlier as a separate job sequence and make the following assumption:

Global assumption 3 The interrupted job was the first job in the input sequence.

Consider such an interruption and make assumption 3. If f = 1, we can in fact assume **all** jobs in  $\sigma$  arrive at time  $r_1$ , since both OPT and RSPT start and complete all jobs in  $\sigma$  after time  $r_1$ . Then we are in the case where  $r_1$  is the end of an interval in which RSPT was idle, and we apply Lemma 7.1.

In the remainder of this section, we only need to consider the case f > 1. The important thing about Assumption 3 is that it implies that the first event of this sequence occurred at time s, and the job that started then still has all of its original credit. This is much more credit than could be deduced from the invariant.

**Lemma 11.2** If RSPT interrupts a job J at time  $r_1$ , and OPT runs no large jobs before ARRIVE, and  $x/3 \le s < 2x/3$ , and f > 1, and STATIC holds, then the invariant holds at time  $r_1$ .

**Proof.** We use Assumption 3 and consider the credits of the jobs, assuming J arrived at time s. Again we can assume all J-large jobs besides J arrived at time  $r_1$  (thus not using Assumption 2 in this case). Define  $D_1 = r_1 - r_f > 0$  and  $D_2 = (r_f + w_f) - (r_1 + w_1)$ , as before. See Table 8.

	1	2	3	4	final
$J_f$	$\frac{r_f + w_f}{2} - D_1$	$J_1$	0	$\frac{w_f - r_f - w_1}{2}$	$\frac{1}{2}w_1 + D_2$
$J_1$	$\frac{r_f + w_f^2 + w_1}{2} - D_1$	$J_2$	$w_f-w_1$	$\frac{w_1+2\tilde{r}_f-w_f}{2}$	$\frac{3}{2}r_f + w_1 + D_2$
	$2,\ldots,f-1$ :				
$J_i$	$\frac{r_f + w_f + T_i}{2} - D_1$	$J_{i+1}$	$w_f - w_i$	0	$\frac{r_f + w_f + T_{i-1} - w_i}{2} + D_2 + w_1$
i =	$f+1,\ldots,k$ :				
$J_i$	$\frac{r_f+T_i}{2}-D_1$	$J_i$	0	0	$rac{r_f + T_i}{2} - D_1$
J	$\frac{r_f + \tilde{T}_k + x}{2} - D_1$	J	0	$-rac{1}{2}r_f$	$\frac{T_k+x}{2}-D_1$

Table 8: Credit transfers in Lemma 11.2

 $J_1$  satisfies (7.4) by Lemma 7.1, Case 1.

For  $J_2$ , note that  $\frac{3}{2}r_f \geq \frac{3}{2}s \geq \frac{1}{2}x \geq \frac{1}{2}w_2$ , and use the same lemma.

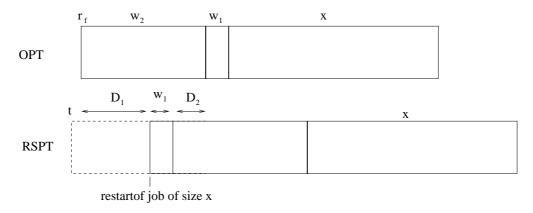


Figure 3: An example of a late interruption

For i = 3, ..., f, we use  $w_f \ge w_i$ ,  $D_2 + w_1 = (r_f + w_f) - r_1 \ge w_f - r_1 \ge w_{i-1} - r_1$  and  $D_2 + w_1 \ge 0$ . This shows these jobs satisfy (7.4) by Lemma 7.1, Cases 2 and 3.

For  $i = f + 1, \ldots, k$  we use  $K(J_i) \geq \frac{1}{2}T_i - D_1 = \frac{1}{2}(w_i - w_{i-1} + T_{i-2}) + (w_{i-1} - D_1)$  and note that  $w_{i-1} - D_1 \geq w_{i-1} - r_1$  and  $w_{i-1} - D_1 = w_{i-1} + D_2 - w_f + w_1 \geq D_2 + w_1 \geq 0$ , and we use the same Lemma. We can reason analogously for J (implying that we can indeed take  $\frac{1}{2}r_f$  out of the credit of J) and for J-large jobs.

Note that the proof of Lemma 11.2 works as long as  $r_f \geq x/3$ . From now on, we assume  $r_f < x/3$ . For this case, we use the same credit transfers as described in Table 8. However, in this case, this may not be enough for job  $J_2$  to satisfy (7.4). We make one additional transfer apart from the ones mentioned in Table 8: we give  $D_2$  from  $J_1$  to  $J_2$ . By (5.1), we have  $D_2 = \tau_f - \tau_1$  where  $\tau_f > 0$  and  $\tau_1 \leq 0$ . See Figure 3.

**Lemma 11.3** Consider the jobs involved in a slow interruption as above. If  $J_2$  does not satisfy (7.4), then

- 1.  $s(J_1) \geq w_1$
- 2.  $w_f > \frac{1}{2}x$
- 3.  $r_1 + w_1 > \frac{1}{2}x$
- 4.  $f \in \{k-1, k\}$

**Proof.** After the above transfers, we have  $K(J_2) = \frac{3}{2}r_f + w_1 + 2D_2$ .

- 1. Suppose  $r_1 < w_1$ . Then  $w_1 + D_2 = w_1 + r_f + w_f r_1 w_1 \ge w_f r_1 \ge \frac{1}{2}(w_1 + w_2) r_1$ , and  $w_1 + D_2 \ge 0$ , so  $J_2$  satisfies (7.4).
- 2. Suppose  $w_f \leq \frac{1}{2}x$ . Then also  $w_2 \leq \frac{1}{2}x$ . Moreover, since  $r_f + w_f > \frac{2}{3}(s+x) \geq \frac{2}{3}x$  we have  $r_f > \frac{1}{6}x$ . If  $J_2$  does not satisfy (7.4), then (using item 1)  $\frac{3}{2}r_f + w_1 + 2D_2 \leq \frac{1}{2}(w_2 w_1)$  and thus  $\frac{3}{2}w_1 + 2D_2 < \frac{x}{4} \frac{x}{4} = 0$ , a contradiction.
- 3. Suppose  $r_1 + w_1 \leq \frac{1}{2}x$ . We have  $D_2 \geq r_f + w_2 (r_1 + w_1) \geq r_f + w_2 \frac{1}{2}x$ . If  $w_2 \geq \frac{2}{3}x$ , then  $2D_2 \geq 2w_2 x \geq \frac{1}{2}w_2$ . If  $w_2 < \frac{2}{3}x$ , then  $D_2 \geq r_f + w_f \frac{1}{2}x \geq \frac{1}{6}x$  and  $2D_2 \geq \frac{1}{2}w_2$ . In both cases, we find that  $J_2$  satisfies (7.4).
- 4. If f = k 2 or  $f \le k 4$ , we can take  $\frac{1}{2}w_f$  out of the credit of J and still satisfy (7.4). If f = k 3, we can take  $\frac{1}{2}w_{f+1}$  out of K(J).

 $J_2$  may not have enough credit to pay for its completion (it does not need to pay for interruptions of  $J_1$ , or of smaller jobs that arrive before  $J_2$  starts). The credit to pay for the completion of  $J_2$ 

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will have to come from another job. We will show that we can use some of the credit of J to pay for this. To begin with, we transfer  $2D_2$  of credit from  $J_2$  to J. Then, we divide the credit of J as follows. First suppose f = k.

$$K_{COM}(J) = \frac{x - w_f + 4D_2}{2} \ge \frac{x + r_f - (r_1 + w_1) + 3D_2}{2} \ge \frac{1}{6}(x + r_f) + \frac{3}{2}D_2;$$
 (11.1)

$$K_{INT}(J) = \frac{1}{2}T_{f-1} + w_f - D_1 \ge \frac{1}{2}T_{f-1} + (w_f - r_1).$$
 (11.2)

If f=k-1, note that  $J_k$  cannot start before time  $x>w_k$  since  $r_1+w_1+w_f>\frac{x}{2}+\frac{x}{2}=x$  by Lemma 11.3. Hence  $N_{INT}(J,r_1)\leq \frac{1}{2}T_{k-2}+\frac{3}{2}w_f-r_1$ . We have

$$K_{COM}(J) = \frac{1}{2}(x - w_k) + 2D_2$$

$$K_{INT}(J) = \frac{1}{2}T_{k-1} + (w_k - D_1) \ge \frac{1}{2}T_{k-2} + (\frac{3}{2}w_k - D_1)$$

so J can certainly give  $\frac{1}{2}(w_k - w_f)$  to its own completion-credit, so that we again have (11.1).

We now consider the events after time  $r_1$ , using the analysis from the previous sections. Note that in those analyses, in some cases a job J' transfers its completion-credit  $N_{COM}(J', s)$  to another job: this happens if J' is interrupted. However, the target job can only be a smaller job than J'. We need to keep track of the job that does not have enough completion-credit. This job will be called red and be denoted by  $J_R$ . Job J above, that was slowly interrupted, will be called green and be denoted by  $J_G$ . It satisfies (11.1) at time  $r_1$ .

**Lemma 11.4** Suppose there exists a red job  $J_R$  and a green job  $J_G$ . Until  $J_R$  completes, all jobs besides  $J_R$  and  $J_G$  satisfy (7.4), and (5.2) holds. Moreover, there will appear no further red jobs until  $J_R$  completes.  $J_G$  is the job that was slowly interrupted at time  $r_1$ , and satisfies (11.1).  $K_{INT}(J_G) \geq N_{INT}(J_G, t)$  holds for all times t where an event occurs, up to and including the completion of  $J_R$ .

**Proof.** We consider the events in the sequence from the first event after time  $r_1$  until the last event before  $J_R$  completes, and use induction. At time  $r_1$  (the base case), all the statements of the lemma hold.

Since OPT starts  $J_f$  before time  $r_1$ , it completes  $J_f$  before any job that arrives later. Since  $w_R \leq w_f$  by induction, we are always in the case where OPT completes at least one J(I)-large job before ARRIVE(I). This implies in particular that as long as  $J_R$  is not completed, there can occur no further slow interruptions where OPT does not run any large jobs before ARRIVE, so no further red jobs can appear.

Consider a later event. If it is an interruption (either of  $J_R$ , or of smaller jobs), consider the credit of the jobs in Q. As can be seen from the credit reassignments in lemmas 9.2 and 9.3, if  $J_R$  is interrupted, it is possible that another job in stead of  $J_R$  becomes red as a result. However, this can only be a job smaller than  $J_R$ . Furthermore, job  $J_G$  keeps satisfying (11.1) throughout such interruptions, since of  $J_R$ -large jobs only the amount of interrupt-credit can be affected. Also, the credit of  $J_G$  is not transferred to another job, so it is the same job that remains green. If there is an interruption of a job smaller than  $J_R$ , then  $J_R$  remains red for the same reason. In both cases, all other jobs satisfy (7.4) by the analyses in those lemmas, including the job that was  $J_R$  if another job is red now.

Now consider a completion of a job J' before  $J_R$  completes. Then J' and any smaller jobs that arrived while J' was running are all small relative to  $J_R$  and  $J_G$ . In Lemma 10.3,  $J_R$  and  $J_G$  are

then among the large jobs whose credit increases by  $\frac{1}{2}T(I')$ , and remain red and green respectively. Their completion credit is unaffected. In Lemma 10.4 and Lemma 10.5, the same holds. In Lemma 10.10, the credit of  $J_R$  can be moved to another job (that thus becomes red), but then that is again a smaller job.

At some point, the red job  $J_R$  will complete. By (7.3), as long as we maintain  $K_{COM}(J) \ge \frac{1}{2}(x - b_s(J))$ , we can take credit out of J to pay for the completion of  $J_R$ .

**Lemma 11.5** Suppose there is a red job. When it completes, credits can be transferred so that all jobs satisfy (7.4).

**Proof.** Denote the set of jobs that arrive during  $J_R$ 's final execution by ARRIVE', and their total size by T'. Note that OPT completes  $J_f \geq J_R$  before ARRIVE'. There are thus three cases.

Case 1. OPT completes exactly one  $J_R$ -large job before ARRIVE' (i.e. job  $J_f$ ).

By Corollary 10.1, the jobs in ARRIVE' need at most  $\frac{3}{2}(w'_{f'}-v'_{f'}) \leq \frac{1}{2}w_R \leq \frac{1}{2}w_f$  of credit to satisfy (7.4). We have that the credit of J increases by  $\frac{1}{2}T'$ .

Claim:  $K(J) \ge \frac{1}{6}(x + r_f) + \frac{3}{2}D_2 + N_{INT}(J, t') + \frac{1}{2}T'$ .

Proof: At the previous event, J satisfied (11.1) and  $K_{INT}(J) \geq N_{INT}(J,t)$ . If  $J_R$  started after time  $w_R$ , none of the jobs in ARRIVE' are interruptable and the claim follows. Otherwise, note that J had enough credit to pay for interruptions of  $J_R$  until time  $w_R$ , because it was green. (By Table 1, any job following a job  $J^*$  that is interrupted after it started before time  $w(J^*)$ , needs to pay for this itself until time  $w(J^*)$ .) This credit can now instead be used for any interruptions of jobs in ARRIVE' until time  $2w_R$ .

Thus  $\frac{1}{2}T'$  can go to the jobs in ARRIVE' that need it. Moreover, since  $w'_{f'} - v'_{f'} \leq \frac{1}{3}w_f \leq \frac{1}{3}x$  using Corollary 10.1, we can also take  $\frac{1}{2}(w'_{f'} - v'_{f'}) \leq \frac{1}{6}x$  out of the credit of J and still have  $K_{COM}(J) \geq N_{COM}(J,t)$ , because we take at most half the size of a job that completes before J out of J's credit, and J actually has at least this amount of credit by (11.1).

If f' < k', we have  $\frac{1}{2}T' \ge w'_{f'}$  and hence  $\frac{3}{2}(w'_{f'} - v'_{f'}) \le \frac{1}{2}T' + \frac{1}{2}(w'_{f'} - v'_{f'})$ , which is the amount we could take from J.

If f'=k'>1, we have  $\frac{1}{2}T'\geq\frac{1}{2}(w'_{f'}+w'_{f'-1})$ . We can give  $\frac{1}{2}w'_{f'-1}$  to  $J'_{f'}$  and  $\frac{1}{2}w'_{f'}$  to  $J'_{1}$ . Also, we give  $\frac{1}{2}(w'_{f'}-v'_{f'})\leq\frac{1}{2}w'_{f'}$  from J to  $J'_{1}$ . It can be seen from the proof of Lemma 10.3 that this is sufficient.

If f' = k' = 1, then  $\frac{1}{2}T' = \frac{1}{2}w'_1$ . Giving this and an additional  $\frac{1}{2}(w'_1 - v'_1) \leq \min(\frac{1}{6}x, \frac{1}{2}w'_1)$  from J to  $J'_1$  is sufficient as in the proof of Lemma 10.3.

Case 2. OPT completes two  $J_R$ -large jobs before ARRIVE'.

If OPT runs two large jobs other than J before ARRIVE', we again have that the credit of J increases by  $\frac{1}{2}T'$  and we can reason as above.

Suppose OPT completes J and  $J_R$  before ARRIVE'. Following the proof of Lemma 10.4, we are done immediately if  $s \leq x$ , so suppose s > x. This implies the jobs in ARRIVE' are not interruptable, so  $N_{INT}(J,t) \leq N_{INT}(J,s)$ . Then  $K(J_i') = \frac{3}{2}(w_R + x) + \frac{1}{2}T_i' - (s + w_R) = \frac{1}{2}(T_i' + w_R) + \frac{3}{2}x - s$ . This implies that as long as  $s \leq \frac{3}{2}x$ , we can give  $\frac{1}{2}(w_i' + w_f) \geq w_i'$  to J from each job  $J_i'$ , which is sufficient: J receives in total at least T', which it lost because  $s_t(J)$  increased.

Otherwise, note that we only need to find an extra  $\frac{1}{2}w'_{k'}$  of credit to give to J, since J gets at least  $T_{k'-1} + \frac{1}{2}w'_{k'}$  from the jobs in ARRIVE'.

Suppose  $w_R \leq \frac{2}{3}x$ . If  $s \leq x + w_R$  then  $K(J'_{k'}) \geq \frac{1}{2}(w_R + x) + \frac{1}{2}T' - w_R \geq \frac{1}{2}(x - w_R) + \frac{1}{2}w'_{k'} \geq \frac{1}{6}x + \frac{1}{2}w'_{k'} \geq \frac{3}{4}w'_{k'}$ , and if  $s > x + w_R$  then  $K(J'_{k'}) \geq \frac{1}{2}s + \frac{1}{2}T' - w_R \geq \frac{1}{2}(x - w_R) + \frac{1}{2}w'_{k'} \geq \frac{3}{4}w'_{k'}$ .

11. Interruptions, s < 2x/3

We can take the last  $\frac{1}{4}w'_{k'} < \frac{1}{4}w_R \le \frac{1}{6}x$  out of the credit of J, and then all the small job-delay is paid for; J still satisfies  $K_{COM}(J) \ge N_{COM}(J, t)$ .

Finally, if  $w_R = \frac{2}{3}x + a$  for some a > 0, then  $D_2 = (r_f + w_f) - (r_1 + w_1) \ge s + \frac{2}{3}x + a - \frac{2}{3}(s + x) \ge a$  and we can take  $\frac{1}{4}w'_{k'} + \frac{3}{4}D_2$  out of  $K_{COM}(J)$  itself, since we then still have  $K_{COM}(J) \ge \frac{1}{2}(x - w_f) + 2D_2 - \frac{1}{4}w_f - \frac{3}{4}D_2 \ge \frac{1}{2}(x - \frac{3}{2}(w_f - D_2)) + \frac{1}{2}D_2 \ge 0$ . Here we use

$$w_f - D_2 = r_1 + w_1 - r_f \le \frac{2}{3}(s+x) - r_f \le \frac{2}{3}x.$$

Since we take only less than half of the size of a job that completes before J out of the credit of J, we also still have  $K_{COM}(J) \geq N_{COM}(J,s)$  as before. To complete the missing credit, we can take  $\frac{3}{4}(w'_{k'}-a)$  out of  $K(J'_{k'})$ ; the calculations are similar to above.

Case 3. OPT completes three or more  $J_R$ -large jobs before ARRIVE'. Note from the proofs of Lemmas 10.5 and 10.10 that in this case, no completion credit from  $J_R$  is required to pay for any small job-delay. Hence we are done immediately.

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