

# An on/off event-based formulation for RCPSP with production and consumption of resources

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## Introduction

The resource-constrained project scheduling problem (RCPSP) is one of the best-known cumulative scheduling problems due to the interest from the operational research community, and to its many industrial applications. In this article we are concerned with the extension of the RCPSP that, beyond renewable resources considered in its basic version, also allows resources that can be produced and consumed during the execution of activities. This extension is called *RCPSP with production and consumption of resources*. For more detail about the state of the art, see for instance (Laborie 2003, Neumann *et al.* 2003, Bouly *et al.* 2005, Carlier *et al.* 2009).

In our study, after a detailed description of the RCPSP and the considered extension, we present a mixed integer linear programming (MILP) model of the problem which uses variables indexed by *events*. Finally, we present some computational results.

## 1 Problem description

The resource-constrained project scheduling problem (RCPSP) is defined by a tuple  $(V, p, E, R, B, b)$ , where  $V$  is a set of *activities*,  $p$  is a vector of *durations*,  $E$  is a set of *precedence relations*,  $R$  is a set of renewable *resources*,  $B$  is a vector of *resource availabilities*, and  $b$  is a matrix of *demands*. A set of  $n$  activities, represented by the set  $\{0, \dots, n+1\}$  where activities 0 and  $n+1$  are *dummy* activities, must be scheduled on  $m$  available renewable resources belonging to the set  $R = \{1, \dots, m\}$ . Each activity  $i$  has a duration  $p_i$  (with  $p_0 = p_{n+1} = 0$ ), and demands  $b_{ik}$  for each resource  $k$  during its processing. Each resource  $k$  is available in quantity  $B_k$ . The precedence relations (precedence constraints) are given by a set  $E$  of index pairs such that  $(i, j) \in E$  means that the execution of activity  $i$  must precede that of activity  $j$ . Resource constraints dictate that at any time the sum of demands of activities being processed does not exceed the resource availability.

A *schedule* corresponding to a point  $S$  (with  $i^{\text{th}}$  component  $S_i$ , the start time of activity  $i$ , and  $S_0 = 0$  the start of the project), is said *feasible* if it is compatible with both the precedence constraints and the resource constraints. The RCPSP is the problem of finding a *non-preemptive* (with no interrupted activities) schedule  $S$  of minimal *makespan* (its end date  $S_{n+1}$ ) subject to precedence constraints and resource constraints. According to the computational complexity theory, this problem is *NP-hard in the strong sense* (Blazewicz *et al.* 1983, Uetz 2001).

The particularity of the *RCPSP with production and consumption of resources* is that, in addition to using the renewable resources described above, we also deal with specific resources. These resources are consumed (or not) at the start time of an activity in a certain amount and/or then produced in another amount at the completion time of this activity. More specifically, an activity  $i$  consumes  $c_{ip}^-$  units of resource  $p$  at the beginning of its processing and produces  $c_{ip}^+$  units at the end of its processing. Furthermore, the total amount of each resource must remain non negative during all the scheduling horizon.

## 2 Proposed model

In contrast to the formulations using variables indexed by time (like the formulations proposed by (Pritsker *et al.* 1963) and (Christofides *et. al.* 1987)), we propose here a new formulation that uses variables indexed by events. This is inspired by the work of (Pinto and Grossmann 1995) on batch process problems and on the formulation in (Dauzère-Pérès and Lasserre 1995) for flow-shop problems. Events correspond to start or end times of activities.

Remark that, in any potential optimal solution for the RCPSP (left-shifted schedule for the RCPSP, with finish-to-start precedence relations, with zero time lag), the start time of an activity is either 0 or coincides with the end time of some other activity. Consequently, the number of events to be considered is at most equal to  $n + 1$ . It can be easily shown that the set of left-shifted (or semi-active) schedules is *dominant* (it suffices to reduce our research to such schedules).

Extension of previously-proposed event-based models to the RCPSP is not straightforward. Indeed, such approaches were based on sequential variables on machines i.e. *where resource availability is equal to 1*, where all events are totally ranked on each machine, and such activities assigned to distinct events cannot overlap in time. For resource of availability greater than 1, as in the RCPSP, there is only a *partial* order between activities.

Zapata *et al.* 2008 propose such an event-based formulation for a multimode RCPSP. Their formulation considers that an event occurs when an activity starts or ends. Transposed to the RCPSP, this model involves three types of binary variables. Our proposition uses only *one* type of binary variable per event. We define a decision variable  $z_{ie}$  which remains equal to 1 for the duration of the process of activity  $i$ . That is why we call this model, the on/off event-based formulation (noted **OOE**). In this model, the number of events can be restricted to the number of activities  $n$ . A continuous variable  $t_e$  represents the date of event  $e$ . We also use one single extra continuous variable:  $C_{\max}$  (the makespan). With formulation OOE, the resource constraints are modeled in a straightforward manner.

The OOE model does *not* involve the use of dummy activities and, as the flow-based continuous-time formulation (FCT) proposed in (Artigues *et al.* 2003), has also the advantage of being able to deal with instances containing *non-integer* activity processing times. Above all, it involves *fewer variables* compared to the models indexed by time. Remark also that the event-based formulations we are introducing in this paper do *not* involve any big-M constant.

We also define **OOE\_Prec**, a preprocessed variant of OOE. Roughly speaking, it is obtained from OOE by removing, from the set of possible events for an activity, all the first events during which the activity cannot or does not need to be in processed because of its predecessors. Symmetrically, we remove the last events during which the activity cannot, or does not need to, be in process because of its successors.

### 3 Computational results

We perform a series of tests and we compare the results obtained by OOE et OOE\_Prec with those obtained by time-indexed formulations proposed in (Pritsker *et al.* 1963) (DT), Christofides (DDT) (Christofides *et al.* 1987), and flow-based continuous-time formulation (FCT) (Artigues *et al.* 2003). We use different types of modified RCPSp instances where we randomly generate resource productions and consumptions: KSD30 (Kolisch and Sprecher 1997), BL (Baptiste and Le Pape 2000), PACK (Carlier and Néron 2001). We use instances PACK\_d and KSD15\_d obtained from the PACK and KSD30 instances by increasing the range of processing times as this feature is common in the process industry (Pinto and Grossmann 1995). We obtained the following results with ILOG-CPLEX (version 11) on Xeon 5110 biprocessor Dell PC clocked at 1.6GHz with 4GB RAM, running Linux Fedora as operating system. In Table 1, *%integer* gives the percentage of instances for which

**Table 1.** RCPSp with resource consumption and production

| Inst.   | Model    | %integer | %Optimal | BestSol gap | $\Delta$ CPM gap | Time   |
|---------|----------|----------|----------|-------------|------------------|--------|
| KSD30   | DT       | 84       | 63       | 10.21       | 25.20            | 52.60  |
|         | DDT      | 82       | 71       | 0.13        | 7.65             | 83.87  |
|         | OOE_Prec | 78       | 1        | 52.63       | 76.13            | 415.70 |
|         | FCT      | 69       | 20       | 46.65       | 70.35            | 289.39 |
|         | OOE      | 1        | 0        | 65.96       | 65.96            |        |
| PACK    | OOE      | 94.55    | 1.82     | 20.44       | 277.83           | 110.85 |
|         | OOE_Prec | 92.73    | 3.64     | 13.13       | 258.18           | 449.26 |
|         | DT       | 90.91    | 18.18    | 48.04       | 365.49           | 126.63 |
|         | DDT      | 47.27    | 32.73    | 1.33        | 245.66           | 168.04 |
|         | FCT      | 9.09     | 0        | 5.90        | 96.41            |        |
| BL      | OOE_Prec | 100      | 0        | 17.61       | 72.57            |        |
|         | DDT      | 94.87    | 48.72    | 1.32        | 47.62            | 125.55 |
|         | DT       | 87.18    | 38.46    | 49.82       | 119.82           | 108.60 |
|         | OOE      | 74.36    | 0        | 27.64       | 87.56            |        |
|         | FCT      | 20.51    | 0        | 26.79       | 72.51            |        |
| KSD15_d | FCT      | 100      | 93.94    | 0.12        | 10.15            | 18.26  |
|         | OOE_Prec | 100      | 80.81    | 0.05        | 10.08            | 30.69  |
|         | OOE      | 100      | 79.80    | 0.10        | 10.14            | 62.33  |
|         | DT       | 0        | 0        |             |                  |        |
|         | DDT      | 0        | 0        |             |                  |        |
| PACK_d  | OOE_Prec | 96.36    | 5.45     | 1.62        | 249.77           | 252.09 |
|         | OOE      | 96.36    | 5.45     | 5.80        | 264.41           | 320.62 |
|         | FCT      | 5.45     | 1.82     | 0           | 44.02            | 100.01 |
|         | DT       | 0        | 0        |             |                  |        |
|         | DDT      | 0 %      | 0 %      |             |                  |        |

a (non-necessarily optimal) integer solution was found within 500 seconds of CPU time, *%Optimal* is the percentage for which an optimal solution was found, *BestSol gap* represents the average deviation percentage for solved instances from the value of the best solution known,  *$\Delta$ CPM gap* provides the average deviation percentage for solved instances from the critical-path method lower bound, and *Time* is the average time (in seconds) to find an optimal solution.

We note that, in terms of number of (not necessarily optimal) solutions found, the model OOE and its variant OOE\_Prec have almost the best performance on three types of instances (PACK, BL and PACK\_d), the second best performance on KSD15\_d, and the third best performance on the last one type (KSD30). Overall, these results allow us

to conclude that OOE and its variant OOE\_Prec are the best overall at finding integer solutions. Moreover, thanks to the preprocessing, OOE\_Prec obtains better results than OOE. In terms of optimal solutions found, OOE models are outperformed by DT and DDT for the instances with small duration ranges, which is due to their weaker relaxations. However, OOE models are uncomparably better than DT and DDT for the instances with high duration ranges.

## Conclusion

In this paper, we proposed a new MILP formulation for the RCPSP with consumption and production of resources using variables indexed by events. Compared to other classical formulations issued from the literature, our formulation provides encouraging results. Future work should consider designing MILP approaches that combines the advantages of time-indexed and event-based formulations.

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