# Deterministic Assembly Scheduling Problems: A Review and Classification of Concurrent-Type Scheduling Models and Solution Procedures\*

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## In memory of Rainer Leisten

#### Abstract

Many activities in industry and services require the scheduling of tasks that can be concurrently executed, the most clear example being perhaps the assembly of products carried out in manufacturing. Although numerous scientific contributions have been produced on this area over the last decades, the wide extension of the problems covered and the lack of a unified approach have lead to a situation where the state of the art in the field is unclear, which in turn hinders new research and makes translating the scientific knowledge into practice difficult.

In this paper we propose a unified notation for assembly scheduling models that encompass all concurrent-type scheduling problems. Using this notation, the existing contributions are reviewed and classified into a single framework, so a comprehensive, unified picture of the field is obtained. In addition, a number of conclusions regarding the state of the art in the topic are presented, as well as some opportunities for future research.

Keywords: Scheduling; Assembly; Review; Order Scheduling; Concurrent Operations; Distributed Flowshop Scheduling; Agile Manufacturing Systems

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## 1 Introduction

In industry and services it is rather a common situation where one activity can start only if a set of previous tasks (sometimes carried out by different resources) have been completed. These tasks may be jointly scheduled in the different resources of the company in order to achieve the desired goals, as individual schedules in these resources would not ensure the necessary synchronisation to efficiently complete the tasks. Arguably the most visible example of this type of problem occurs in the assembly of parts in the manufacturing industry, henceforth the problem is known as the Assembly Scheduling Problem or ASP. Recently, in most industrial sectors, the strategy has changed from the paradigm of mass production to the manufacture of complex products using postponement strategies that usually entail the assembly of customised features, mainly due to the increasing competition among companies, and the increase of customer power. As a result, most companies nowadays focus on manufacturing only the specific parts of their productive processes in which they excel, and on outsourcing/purchasing those components/operations that do not constitute their core-competences. This leads to an increasing prevalence of assembly operations and, as a consequence, the ASP is being considered a very relevant problem by academics and practitioners. Not surprisingly, a huge number of contributions in the area have been produced in the last decades –as our review, with more than 200 papers, can attest—. However, to the best of our knowledge, almost no attempt to review or classify these works has been carried out: we recall only the work by Khodke and Bhongade (2013) where contributions regarding real-time operation of assembly systems are discussed, although it covers a rather limited part of the references discussed here, and the topic has suffered from this lack of unified approach: Since a unified classification or notation for the different problems does not exist, the same models are given different names in different papers, and the case is not uncommon where some works neglect/ignore the existence of related results that could be applicable/compared. As a result, the-state-of-the-art of some problems and sub-problems remains unclear, which hinders the advance of research results and their applications in practice.

In this paper, we aim to tackle these issues by proposing a unified notation for assembly scheduling problems. Using this notation, we review and classify the existing contributions in the area. The goal is to provide a global perspective of the field so the main results can be identified. Furthermore, we also discuss some open problems and possible research avenues.

The remainder of the paper is structured as follows: In Section 2 we discuss the background and the research methodology adopted. The formal statement of the problem and the proposed notation are presented in Section 3. In Section 4 we discuss the contributions when the operations take place in dedicated machines. In Section 5 we review the research where flexible machines are employed. The contributions dealing with assembly in several (distributed) factories are reviewed in Section 6, while general layout models are discussed

## 2 Background and Research Methodology

Many products are composed of assemblies and sub-assemblies. Commonly cited examples in the ASP literature include fire engine production (Lee et al., 1993), assembly flow shop in the computer industry (Potts et al., 1995), assembly of the body and chassis in the car industry (Fattahi et al., 2013b), circuit board production (Cheng and Wang, 1999), or plastic industry (Allahverdi and Aydilek, 2015), among others. Examples can also be found in services/IT, including distributed database systems (Allahverdi and Al-Anzi, 2006b, 2012), or multi-page invoice printing systems (Zhang et al., 2010).

The structure of a product can be depicted using an acyclic direct graph or digraph (Kusiak, 1989) where the nodes represent operations and the arcs the precedence relations between the operations (He and Kusiak, 1998). In this manner, the digraph describes the sequence of operations required to complete a product. In this regard, the classification by Kusiak (1989) distinguishes between simple and complex products, the first one being a product that has at most one assembly operation in each level of assembly. However, note that this operation-oriented description of the manufacturing of a job is, in general, different to the resource-oriented description, since the sequence of operations required for a product may be either performed each one by dedicated resources (i.e. machines), or by flexible resources that may carry out several operations.

Since scheduling deals with the allocation of operations to resources across time (see e.g. Framinan et al., 2014), the description of the set of resources that can carry out the different operations –i.e. the machine environment– is a critical data that usually determines the difficulty of the scheduling decisions. In this regard, the classical notation for scheduling problems (Graham et al., 1979) focuses on the machine environment rather than solely on the sequence of operations, and this view will also be adopted in this paper for the proposed notation. In the case of assembly operations, such a view naturally leads to a distinction among scheduling using *flexible* machines (i.e. machines that can carry out several operations on the jobs) and *dedicated* machines (i.e. machines that can only carry out one and only one type of operation on the job). This distinction will be employed in this review to classify the contributions.

Although we retain the term *assembly*, the review focuses on scheduling problems where some operations may be performed concurrently (i.e. the existence of a set of operations that can be carried out in parallel to be completed before the starting of another operation), which does not necessarily mean a physical assembly. In this regard, papers related to the so-called *order scheduling problem* are included as a special case of concurrency of operations. In the standard order scheduling problem, a set of orders composed of jobs have to be scheduled in different (usually dedicated) machines in order to minimise some order-related objective. Clearly, these jobs can be modelled as operations that should be completed so the order (a job, in the ASP

terminology) is finished. As a consequence, this type of problems can be regarded as assembly problems where the assembly operation has zero processing times, a connection already remarked by Kyparisis and Koulamas (2002). Furthermore, by focusing on the concurrency of operations, the literature on the so-called distributed assembly flowshop scheduling problem can also be integrated, and some insights derived from this connection are discussed in the conclusions.

This focus on scheduling with concurrent operations makes the wide range of literature on assembly lines to be out of the scope, as the specific concurrency problem is not dealt with in these papers. Analogously, papers devoted to planning assembly operations (which do not explicitly consider the detailed capacity of the resources) are not included in the review. Finally, we focus the review on papers assuming a deterministic setting. Although a number of papers address the stochastic counterpart, such distinction is customary in most scheduling research, and trying to integrate stochastic assembly scheduling would produce an exceedingly large review.

## 3 Problem Statement and Proposed Notation

The problem can be formalised as follows: Each job j (j = 1, ..., n) consists of a chain of operations along s stages  $(\{O_{1,j}^1, ..., O_{r_1,j}^1\}, \{O_{1,j}^2, ..., O_{r_2,j}^2\}, ..., \{O_{1,j}^s, ..., O_{r_s,j}^s\})$ ; operation  $O_{r,j}^k$  is the rth concurrent operation that should be performed on job j at stage k  $(r_k$  indicates the number of operations to be carried out at stage k). If there is only one operation at stage k, then the operation sub-index can be dropped, i.e.  $O_j^k$  indicates the (only) operation to be performed at stage k on job j, that is  $O_j^k = O_{1,j}^k$ .

Each operation  $O_{r,j}^k$  may have technological constraints that impede the starting of the operation unless a set of operations in the previous stages –denoted by  $\mathcal{A}(O_{r,j}^k)$ – have been completed. Each operation can be classified either as concurrent or merge type (the latter type indicated by an overline) depending on the cardinality of the set  $\mathcal{A}(O_{r,j}^k)$ . If  $|\mathcal{A}(O_{r,j}^k)| \leq 1$ , then  $O_{r,j}^k$  is of concurrent type. If  $|\mathcal{A}(O_{r,j}^k)| > 1$ , then  $O_{r,j}^k$  is of merge type. The scheduling problem is then completely defined by giving, for each machine i, its processing times for each operation  $p_i(O_{r,j}^k)$ . For simplicity, if there is only one machine at stage k, the processing times are denoted by  $p(O_{r,j}^k)$ . Although not strictly required, we will assume that each machine belongs only to one stage.

Some attempts have been made by several researchers to introduce a notation for these types of scheduling problems (most times just covering a subset of assembly scheduling problems), all of them based on the standard 3-field notation by Graham et al. (1979). Although all these proposals have some merits, they are oriented towards specific problem types and do not cover all the extension of ASP. We therefore propose the following notation: If we consider a single-assembly case –i.e. only one operation of merge type–, these layouts can be noted as

$$\alpha_1 \to \alpha_2 |\beta| \gamma$$

where  $\alpha_1$  is the machine environment prior to the concurrent operation. In this environment, all operations preceding the concurrent operation are performed.  $\alpha_2$  is the machine environment of the concurrent and subsequent operations. In this environment, assembly and subsequent operations take place. Note that, although in most models the first stage of the  $\alpha_2$  layout is the assembly stage, it does not always have to be the case, being an example the papers where the components of a product are grouped together to be firstly transported (first stage of  $\alpha_2$ ) and secondly assembled in further stages (successive stages of  $\alpha_2$ ). However, since the collective transportation of the components of the products requires that all of them have been completed, the entity to be processed in  $\alpha_2$  is the job (with all its operations).

The following values for  $\alpha_1$  can be identified in the literature:

- 1: Single machine: In this case, the single machine is a flexible machine capable of carrying out all operations of the job to be later assembled. In some papers, such assembly layout with a flexible machine is denoted as agile manufacturing system.
- Pm/Qm/Rm: m parallel machines can carry out each one of the operations of the job. Pm assumes identical machines, whereas Qm assumes related machines. Finally, the unrelated parallel machine case is denoted by Rm. Since the machines are flexible, the number of different operations is not limited to the number of machines.
- *DPm*: m dedicated parallel machines carry out a specific operation of the job. *Dedicated* in this context means that each machine can carry out one and only one specific type of operation. Therefore, a job consists of, at maximum, m operations before being assembled.
- Fm: A flowshop consisting of m (flexible) machines can carry out each one of the operations of the job before its assembly. More specifically, all operations prior to the assembly take place in a m-machine flowshop.
- DFm: f dedicated m-machine flowshops carry out each one of the operations of the job. In other words, each set of operations prior to the assembly takes place in one specific flowshop layout. Since each flowshop is dedicated to one specific type of operation, the product is composed of, at maximum, f components to be assembled.
- *PFm*: f flexible m-machine flowshops in parallel are able to carry out each one of the operations prior to the assembly of the job. More specifically, the machine environment is composed of f (possibly different) m-machine flowshops, each one capable to carry out all operations of the jobs to be assembled. Therefore, in this case the number of components of the product is not limited to f.

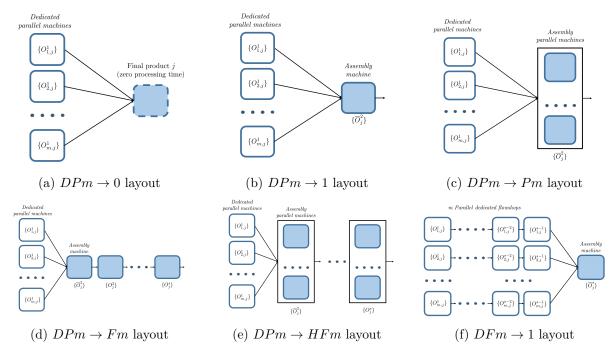


Figure 1: Several layouts for the case with dedicated machines prior to the assembly operations.

• *HFm*: The operations prior to the assembly of the jobs take place in a flexible *m*-stage hybrid flowshop before the assembly. More specifically, all components of the products can be manufactured in the hybrid flowshop.

Clearly, the previous values of the  $\alpha_1$  parameter can also be identified for  $\alpha_2$ . In addition,  $\alpha_2 = 0$  means that the processing times of the assembly operation are zero. This may serve to model the order scheduling problem (see Section 4.1). In this problem, a number of orders —each one composed of up to m different products—have to be scheduled in m machines, where each machine can manufacture only an specific product. Clearly, the order is only completed when all products forming the order have been completed, henceforth it can be seen as an assembly operation with zero-assembly times. Figures 1 and 2 show some samples of the typical layouts, while instance problems for the main layouts and Gantt charts of a sample schedule are provided in the additional on-line material.

Regarding the different constraints that may appear in the  $\beta$  field, we adopt the standard notation trying to make it as clear as possible. Henceforth, the constraints should be interpreted as they apply to some jobs/stages/machines of the process, but not necessarily in all stages/machines. For instance, recrc in the  $1 \to 1|recrc|C_{max}$  problem indicates that some jobs—but not all—visit at least one machine—but not all—more than once. Finally, regarding the  $\gamma$  field, the standard notation is adopted, using the extension by T'Kindt and Billaut (2006) for the multicriteria case. A full description of the three fields is given as additional on-line material.

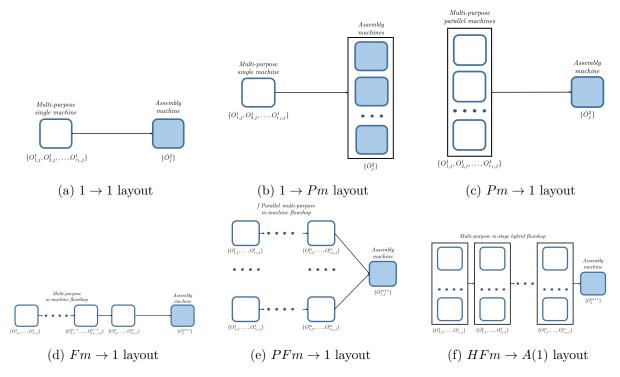


Figure 2: Several layouts for the flexible machine case

Note that the proposed notation can also model multi-assembly layouts by nesting concurrency arrows in parenthesis: In this manner, the complex layout in Figure 3 can be noted as  $(((DPm \to 1, Fm) \to Pm), 1) \to Fm|\beta|\gamma$ . Although we seldom make use of this extended notation in this paper, we believe that this ability to be extended to complex layouts is another interesting feature of the proposed notation. Finally, note that some of the simple layouts described before, such as DPm or DFm, could be denoted also as  $(1, \ldots, 1) \to \alpha_2$ , or as  $(Fm, \ldots, Fm) \to \alpha_2$ , respectively. However, we believe that DPm and DFm provide a more compact notation and will be used henceforth.

Equipped with this notation, we will review the existing contributions in the following sections. Since most of them focus on single-assembly layouts, and given the fact that assembly problems are quite different conceptually depending on whether the operations prior to assembly take place in dedicated machines, or not, Section 4 is devoted to single-assembly scheduling problems with dedicated machines in the  $\alpha_1$  field. Section 5 is devoted to scheduling problems with flexible machines in the  $\alpha_1$  field. Section 6 is devoted to distributed assembly problems, and Section 7 discusses general assembly models.

To facilitate the study of the different contributions, Tables 1 to 6 are provided as summaries of the different layouts, noting the main focus of the references. The abbreviations used in these tables are:

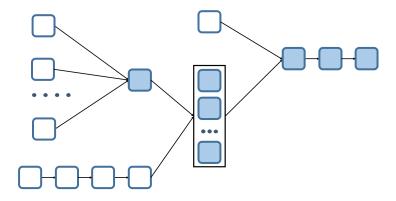


Figure 3: A complex assembly shop layout

CA	Analysis of the Complexity of the Problem
DR	Dominance Rules
LB	Development of Lower Bounds for the problem
PP	Problem Properties (other than dominance rules/lower bounds) $$
DP	Dynamic Programming
BB	Development of a Branch & Bound procedure
PA	Proposal of Polynomial-Time Algorithms
IP	Development of an Integer Programming (Not Linear) model
MILP	Development of a MILP model
QM	Development of a quadratic model
СН	Proposal of Constructive Heuristics
MH	Proposal of Meta-Heuristics

# 4 Assembly scheduling with dedicated machine

Although different dedicated layouts can be employed to carry out the operations prior to the assembly of the jobs, we are only aware of contributions dealing with dedicated machines in parallel, i.e. the  $DPm \to \alpha_2$  layout. In this setting,  $r_1$  the number of concurrent operations in the first stage is assumed to be m. The following subsections discuss the related contributions.

## 4.1 Order scheduling: $DPm \rightarrow 0$ layout

The main contributions regarding this layout –depicted in Figure 1a– are summarised in Table 1. Depending on the objective, the problems have different complexity (see Leung et al., 2005a for a review of the complexity

Problem*	Reference	Analysis	Exact	Approximate
$DPm \rightarrow 0    C_{max}$	Wagneur and Sriskandarajah (1993)	CA		
	Leung et al. (2006b)	CA		$_{\mathrm{CH}}$
$DPm \to 0    \sum C_i$	Wagneur and Sriskandarajah (1993)	CA		
	Roemer and Ahmadi (1997)	CA		
	Roemer (2006)	CA		
	Leung et al. (2005b)	PP		$_{\mathrm{CH}}$
	Framinan and Perez-Gonzalez (2017b)			CH, MH
$DP2  o 0    \sum w_j C_j$	Sung and Yoon (1998)	CA		$_{\mathrm{CH}}$
$DPm \rightarrow 0    \sum w_j C_j$	Wang and Cheng (2003)			$_{\mathrm{CH}}$
	Ahmadi et al. (2005)	CA, LB		CH
	Garg et al. (2007)	CA		$_{\mathrm{CH}}$
	Wang and Cheng (2007)			CH
	Leung et al. (2007a)			$_{\mathrm{CH}}$
	Leung et al. (2008b)	PP		$_{\mathrm{CH}}$
	Wang et al. (2013)		QM	
	Shi et al. (2017)		QM	
$DPm  o 0  r_j  \sum w_j C_j$	Garg et al. (2007)	CA		$_{\mathrm{CH}}$
$DPm  o 0    L_{max}$	Wagneur and Sriskandarajah (1993)	CA		
$DPm \to 0    \sum T_i$	Wagneur and Sriskandarajah (1993)	CA		
2.	Lee (2013)	PP	$_{ m BB}$	$_{\mathrm{CH}}$
	Framinan and Perez-Gonzalez (2018)			CH, MH
$DPm \rightarrow 0   learning - eff.   \sum T_j$	Xu et al. (2016)	$_{ m DR}$	$_{\mathrm{BB}}$	MH
$DPm \to 0    \sum U_j$	Wagneur and Sriskandarajah (1993)	CA		
	Leung et al. (2006b)	PP	$^{\mathrm{BB}}$	$_{\mathrm{CH}}$
	Lin and Kononov (2007)	CA		CH
$DPm \to 0    \sum w_i U_i$	Lin and Kononov (2007)	CA		CH
$DPm \to 0    \sum_{j} w_j U_j$ $DPm \to 0    \epsilon(\sum_{j} C_j^A, \sum_{j} C_j^B)$	Lin et al. (2017)	$_{ m DR}$	BB	MH
$DP2 \rightarrow 0    \text{Cost function}  $	Li and Ou (2007)			CH
$DP2 \rightarrow 0$   Cost function	Li and Vairaktarakis (2007)			СН
$DPm \rightarrow 0    F(f_1(C_1), \dots, F(f_n(C_n)) $	Cai and Zhou (2004)	PP	DP	

Table 1: Summary of contributions in Section 4.1 (\*Notation is described in the additional on-line material)

of some of the problems). For makespan minimisation without additional constraints, the problem has been shown to be polynomial by Wagneur and Sriskandarajah (1993), being the makespan value independent of the schedule. The total completion time objective has received a lot of attention: The problem has been first addressed by Wagneur and Sriskandarajah (1993), who showed it to be NP-hard, although their proof contained a flaw and its complexity was not confirmed until Roemer and Ahmadi (1997). Other contributions regarding the complexity of the problem for the weighted case are Ahmadi et al. (2005) and Roemer (2006). Also for the weighted case, the NP-hardness of the specific case of m = 2 was independently established by Sung and Yoon (1998).

Regarding exact procedures, Wang et al. (2013) and Shi et al. (2017) propose a quadratic formulation of the weighted case. With respect to approximate procedures, different constructive heuristics have been proposed by Leung et al. (2005b) and by Framinan and Perez-Gonzalez (2017b), the latter being the best procedure with regard to approximate methods. Approximate solutions for the weighted version of the problem are given by Wang and Cheng (2003); Ahmadi et al. (2005); Garg et al. (2007); Leung et al. (2007a); Wang and Cheng (2007) and Leung et al. (2008b), although only the paper by Ahmadi et al. (2005) addresses a computational experience to test the performance of the proposed heuristics, which are not compared with other available heuristics. The rest of the papers are devoted to establishing the worst-case performance of

the heuristics. The works by Leung et al. (2007a, 2008b) present a computational experience of the heuristics proposed, but in the testbed it is assumed that all weights are the same and the heuristics are not compared with existing ones. For the specific two machines/components case and weighted jobs, Sung and Yoon (1998) propose some constructive heuristics. Finally, Lin et al. (2017) address the version with interfering jobs, where one set of jobs has to minimise the completion time, and the completion time of the other set of jobs cannot exceed a given value (see e.g. Perez-Gonzalez and Framinan, 2014 for a review on scheduling problems with interfering jobs). One B & B with several dominance rules is presented, and some metaheuristics are proposed.

Regarding due-date related objectives, Wagneur and Sriskandarajah (1993) and Leung et al. (2006b) show that the EDD rule is optimal for the maximum lateness. The problem with total tardiness is shown to be unary NP-hard by Wagneur and Sriskandarajah (1993), and Lee (2013) presents a B & B procedure and several constructive heuristics for the problem. For this problem, Framinan and Perez-Gonzalez (2018) propose both a fast constructive heuristic and a high-performing matheuristic. Xu et al. (2016) address the problem with position-based learning effect, proposing dominance rules, a B & B procedure, and two metaheuristics. The objective of minimisation of the number of late jobs is shown to be binary NP-hard by Wagneur and Sriskandarajah (1993). In fact, Lin and Kononov (2007) show that even the special case with common due dates is also NP-hard. These authors propose an LP-based approximate algorithm for the weighted and unweighted cases, and a constructive heuristic for the common due date case for the  $\sum U_j$  and  $\sum w_j U_j$  problems. An exact algorithm for the problem is also proposed by Leung et al. (2006b) together with a heuristic and a greedy algorithm for the  $\sum U_j$  problem with common due dates, although their contributions are not compared with those by Lin and Kononov (2007).

Regarding general cost functions, Li and Ou (2007) and Li and Vairaktarakis (2007) address the  $DP2 \rightarrow 0$  layout with a cost function, for which the authors develop some polynomial time heuristics. Cai and Zhou (2004) study the problem for max-type and sum-type non-decreasing functions of the completion times of the jobs in the context of teamworks. They present some problem properties and a dynamic programming procedure, although this reference is disconnected from the main stream of order scheduling and it partially overlaps with existing works.

## 4.2 Single machine in the assembly stage: $DPm \rightarrow 1$ layout

This problem –depicted in Figure 1b– has been studied for the case where there are two dedicated parallel machines in the  $\alpha_1$  field, as well as for the general m dedicated machines case. A summary of the contributions is shown in Table 2. Note that, since this layout can be seen as a generalisation of the classical 2-machine flowshop, its complexity could be discussed only for the makespan objective, as the rest of usual objectives

Problem*	Reference	Analysis	Exact	Approximate
$DP2 \rightarrow 1    C_{max}$	Lee et al. (1993)	CA	BB	СН
	Haouari and Daouas (1999)	PP, LB	$_{ m BB}$	$_{\mathrm{CH}}$
	Karuno and Nagamochi (2002)	LB, PP		$_{\mathrm{CH}}$
	Sun et al. (2003)			$_{\mathrm{CH}}$
$DPm \rightarrow 1    C_{max}$	Potts et al. (1995)	CA		$_{\mathrm{CH}}$
	Hariri and Potts (1997)	DR, LB	$^{\mathrm{BB}}$	
$DP2 \rightarrow 1 r_j C_{max}$	Sung and Juhn (2009)	CA, PP, DR	$_{\mathrm{BB}}$	$_{\mathrm{CH}}$
$DPm \rightarrow 1 r_j C_{max}$	Komaki and Kayvanfar (2015)	$_{ m LB}$		CH, MH
$DP2 \rightarrow 1 BS C_{max}$	Lin et al. (2006)	CA, PP, LB		$_{\mathrm{CH}}$
$DPm \to 1 ST_{si} C_{max}$	Allahverdi and Al-Anzi (2006a)	$_{ m DR}$		CH, MH
$DPm \rightarrow 1 a_i, ptmn - nr C_{max}$	Hadda et al. (2007)	PP		$_{\mathrm{CH}}$
$DPm \rightarrow 1 a_i, pmtn - semi C_{max}$	Hadda et al. (2014)	PP		$_{\mathrm{CH}}$
$DPm \rightarrow 1   no - wait   C_{max}$	Mozdgir et al. (2013b)			MH
$DPm \rightarrow 1 p-batch, ST_{si} C_{max}$	Kovalyov et al. (2004)	CA		$_{\mathrm{CH}}$
$DPm \rightarrow 1 s-batch, ST_{si} C_{max}$	Kovalyov et al. (2004)	CA		$_{\mathrm{CH}}$
$DP3 \rightarrow 1 learning - effect  \sum C_j$	Wu et al. (2018)	PP	BB	MH
$DPm \rightarrow 1    \sum C_j$	Al-Anzi and Allahverdi (2006)			CH, MH
11 22 3	Blocher and Chhajed (2008)	PP, LB		ĆН
	Allahverdi and Al-Anzi (2012)	,		MH
	Framinan and Perez-Gonzalez (2017a)			CH, MH
$DPm \to 1 ST_{si}  \sum C_j$	Allahverdi and Al-Anzi (2008c)	DR		MH
	Allahverdi and Al-Anzi (2009)			MH
$DPm \to 1    \sum w_j C_j$	Tozkapan et al. (2003)	DR, LB	BB	
$DPm \rightarrow 1  L_{max}  $	Allahverdi and Al-Anzi (2006b)	210, 22	22	MH
$DPm \rightarrow 1 ST_{si} L_{max}$	Al-Anzi and Allahverdi (2007a)	DR		MH
DI W / I SI Dmax	Al-Anzi and Allahverdi (2007b)	DR		MH
$DP2 \rightarrow 1    \sum T_i$	Allahverdi and Aydilek (2015)	DIC		MH
	Lee and Bang (2016)	DR, MILP	ВВ	CH
$DPm \to 1 ST_{si}  \sum T_j$	Allahverdi et al. (2016b)	DR, WILL	ЪЪ	MH
$DPm \to 1 ST_{si}  \sum_{j} T_{j}$ $DPm \to 1 ST_{si}  T_{max}$	Aydilek et al. (2017)	DR		MH
$DPm \rightarrow 1 SI_{si} I_{max}$ $DPm \rightarrow 1  \sum U_j$	. ,	DR		
$DPM \to 1    \sum_{i} U_{j}$	Allahverdi et al. (2016a)			CH, MH
$DPm  o 1    \overline{F_l}(C_{max}, \sum C_j)$	Allahverdi and Al-Anzi (2008a)			MH
	Torabzadeh and Zandieh (2010)			MH
	Shokrollahpour et al. (2011)		MILD	MH
DD 1107 17 (G \qquad \qqqqqqqqqqqqqqqqqqqqqqqqqqqqqqqqqqqq	Seidgar et al. (2014)		MILP	MH
$DPm \to 1 ST_{si} F_l(C_{max}, \sum_i C_j)$	Tian et al. (2013)			MH
$DPm \to 1    F_l(C_{max}, \sum_i U_j)  $	Navaei et al. (2010)			MH
$DPm \rightarrow 1    F_l(C_{max}, L_{max})$	Al-Anzi and Allahverdi (2009)		TD	MH
$DPm \to 1 ST_{sd} F_l(C_{max}, T_{max})$	Maboudian and Shafaei (2009)	LB	IP	
$DPm \rightarrow 1    F_l(C_{max}, L_{max}, E_{max})$	Yan et al. (2014)	DR		MH
$DPm \rightarrow 1    F_l(maintenance, breakdowns)$	Seidgar et al. (2016)		MILP	MH

Table 2: Summary of contributions in Sections 4.2.(\*Notation is described in the additional on-line material).

are NP-hard for the 2-machine flowshop.

Regarding the case of two machines, the  $DP2 \to 1 || C_{max}$  problem has been shown to be strongly NP-hard by Lee et al. (1993), although it is polynomially solvable if, for each job, its processing time on one of the dedicated machines is high or equal than on the other machine. These authors develop a B & B procedure for the problem, together with some heuristics. Another approximate algorithm with a tighter worst case is given by Karuno and Nagamochi (2002). Some constructive, real-time heuristics are proposed for the problem by Sun et al. (2003). An extremely efficient B & B algorithm is given by Haouari and Daouas (1999). The authors show that instances with  $n \leq 200$  could be solved in few seconds, so it can be stated that this problem is optimally solvable for a large number of jobs, while there are extremely good and fast approximate algorithms if very large instances are considered.

Some extensions of the  $DP2 \rightarrow 1 || C_{max}$  problem have been also addressed: Sung and Juhn (2009)

consider that one of the components is purchased, therefore it is only available after a given time. The authors prove that this problem is NP-hard and show that only permutation schedules have to be considered. They also propose a B & B procedure and three heuristic algorithms for the problem. Note that this problem can be seen as a particular case of the  $DP2 \rightarrow 1|r_j|C_{max}$  assuming that the release date of the component that is not purchased is zero for all products, and that the processing time of the purchased component is zero for all products, a problem addressed by Komaki and Kayvanfar (2015) for m machines that is discussed below. The same problem, assuming that the assembly machine processes batches of specific jobs, and that a (non-sequence dependent) setup is required every time a batch is formed, is addressed by Lin et al. (2006), i.e. the  $DP2 \rightarrow 1|BS|C_{max}$  problem. The authors prove that this problem is strongly NP-hard also in the special case where the processing times of the assembly machine are the same for all jobs. The authors also detect some few polynomially solvable cases, and provide heuristics for the problem. Lee and Bang (2016) propose a branch and bound procedure and a constructive heuristic for the  $DP2 \rightarrow 1||\sum T_j$  problem. Finally, the three-machine case with total flowtime objective and learning effect has been addressed by Wu et al. (2018), who present a B & B procedure and a metaheuristic.

For the general m-machine case, this problem has been addressed by many authors, for different objectives and with some extensions. Regarding the makespan, Potts et al. (1995) are the first to address the problem. Independently from Lee et al. (1993), they show it is strongly NP-hard, and develop a heuristic providing a worst case of 2 - 1/m (note that this reduces to that by Lee et al., 1993 if m = 2). Hariri and Potts (1997) propose a B & B algorithm able to provide optimal solutions in few seconds for more than 5,000 jobs and 10 machines. Given these results, it can be concluded that, for most realistic-size instances, this problem can be solved. In addition, the heuristics by Sun et al. (2003) –originally proposed for m = 2– are extended for the general case with excellent results.

The problem with makespan and setup times is addressed using constructive heuristics and metaheuristics by Allahverdi and Al-Anzi (2006a). Hadda et al. (2007) and Hadda et al. (2014) address the  $DPm \rightarrow 1|a_i, pmtn - semi|C_{max}$  and  $DPm \rightarrow 1|a_i, pmtn - nr|C_{max}$  problems, proposing some heuristic algorithms and giving their worst cases. The  $DPm \rightarrow 1|r_j|C_{max}$  problem is addressed by Komaki and Kayvanfar (2015) by means of constructive heuristics based on dispatching rules and metaheuristics. Three metaheuristics are also proposed by Mozdgir et al. (2013b) for the  $DPm \rightarrow 1|no - wait|C_{max}$  problem. Finally, the problem with makespan objective and batches is addressed by Kovalyov et al. (2004). The authors assume that the manufacturing operations on machine i are carried out in batches of maximum size  $\beta_i$ , and that assembly is performed in batches of maximum size  $\beta_A$ . In this setting, they explore the p-batch and s-batch cases, the latter also with setups.

The  $DPm \to 1 || \sum w_j C_j$  problem is addressed by Tozkapan et al. (2003) for the first time. The authors show that the optimal solutions are non-delay, permutation schedules (this result is later presented

independently by Blocher and Chhajed, 2008 for the un-weighted case). They propose a B & B algorithm and constructive heuristics. The rest of the existing contributions for this problem have focused on the un-weighted case: the heuristics by Tozkapan et al. (2003) are outperformed by those in Al-Anzi and Allahverdi (2006), who also propose several metaheuristics. These metaheuristics are further improved by a new set of metaheuristics by Allahverdi and Al-Anzi (2012). The best-so-far approximate heuristics for the un-weighted case are given by Framinan and Perez-Gonzalez (2017a). As mentioned before, an earlier contribution is Blocher and Chhajed (2008), who independently derive properties for some special cases of the  $DPm \to 1 ||\sum C_j$  problem and propose constructive heuristics, most of them similar/equivalent to those proposed in the previous references. Finally, when setup times have to be taken into account, Allahverdi and Al-Anzi (2008c, 2009) present several metaheuristics for the  $DPm \to 1 ||ST_{si}||\sum C_j$  problem.

Regarding due-date objectives, the  $DPm \to 1 || L_{max}$  problem is addressed by Allahverdi and Al-Anzi (2006b) using metaheuristics. This objective with sequence-independent setups is studied in Al-Anzi and Allahverdi (2007b,a), also using metaheuristics. The  $DPm \to 1 || \sum T_j$  problem has been addressed by Allahverdi and Aydilek (2015), and Lee and Bang (2016). The first reference propose some metaheuristics, while the latter proposes a MILP and a B & B procedure. The case where there are sequence-independent setups is studied by Allahverdi et al. (2016b), who propose several metaheuristics. The objective of maximum tardiness with sequence-independent setups is addressed by Aydilek et al. (2017), who study some problem properties and propose a metaheuristic. Finally, Allahverdi et al. (2016a) address the  $DPm \to 1 || \sum U_j$  problem also by means of metaheuristics.

In addition to the single criterion problems, there are several contributions focusing on a combination of criteria for the  $DPm \rightarrow 1$  layout, including:

- The  $DPm \to 1 || F_l(C_{max}, \sum C_j)$  problem has been addressed by several researchers: Allahverdi and Al-Anzi (2008a), Torabzadeh and Zandieh (2010), Shokrollahpour et al. (2011), Tian et al. (2013) in this case considering setup times—, and Seidgar et al. (2014). All these papers propose different metaheuristics and only partial comparisons exist among them, so the state-of-the-art remains unclear due to the lack of a comprehensive computational evaluation.
- Navaei et al. (2010) propose two metaheuristics for the makespan and the number of tardy jobs, i.e. the  $DPm \to 1 ||F_l(C_{max}, \sum U_j)|$  problem.
- Allahverdi and Al-Anzi (2008b) and Al-Anzi and Allahverdi (2009) develop different metaheuristics for the  $DPm \to 1 ||F_l(C_{max}, L_{max})|$  problem.
- Maboudian and Shafaei (2009) study the  $DPm \to 1|ST_{sd}|F_l(C_{max}, T_{max})$  problem, proposing a non-linear mathematical model and a lower bound.

- Yan et al. (2014) propose a metaheuristic for a linear combination of makespan, maximum earliness and maximum tardiness, i.e. the  $DPm \rightarrow 1 || F_l(C_{max}, E_{max}, T_{max})$  problem.
- Seidgar et al. (2016) address the problem with preventive maintenance and objectives related to makespan and system unavailability. A MILP model and several metaheuristics are proposed.

Finally, note that, although the problem in the  $DPm \to 1$  setting usually considered in the literature consists of finding a sequence for the jobs, Hwang and Lin (2012) address the problem of obtaining an optimal batching decision given a fixed sequence of jobs for a number of regular metrics.

Problem*	Reference	Analysis	Exact	Approx.
$DPm \to Rm  C_{max}$	Navaei et al. (2013)		MILP	MH
$DPm \to Pm ST_{sd} C_{max}$	Zhang et al. (2010)		MILP	MH
$DPm  o P2  \sum C_j$	Sung and Kim (2008)	PP	BB	
$DPm \rightarrow P2  \sum_{i} C_{j}$	Al-Anzi and Allahverdi (2012)			MH
_	Allahverdi and Al-Anzi (2012)			MH
	Al-Anzi and Allahverdi (2013)			MH
$DPm \rightarrow Pm BS_{ij}, work - shift - lot  \sum w_j C_j$	Nejati et al. (2016)		IP	MH
$DPm \to Rm ST_{sd} F_l(HC,DC)$	Navaei et al. (2014)		MILP	MH
$DPm \to Rm  F_l(C_{max}, \sum C_j) $	Mozdgir et al. (2013a)		MILP	MH
$DPm \rightarrow F2  C_{max}$	Koulamas and Kyparisis (2001)	PP		CH
$DPm \rightarrow F2  C_{max}$	Komaki et al. (2017)	PP		MH
$DRm \rightarrow F2 ST_{sd}  \sum C_j$	Andres and Hatami (2011)		MILP	
$DPm \to F2 ST_{sd} \overline{F_l}(\sum C_j, T_{max})$	Hatami et al. (2010)	LB	MILP	MH
$DPm \rightarrow F2 a_i, pmtn - semi F_l(\sum w_j C_j, \sum w_j T_j, \sum w_j E_j)$	Shoaardebili and Fattahi (2015)		MILP	MH
$DPm \to F2 ST_{sd} \sharp(\sum C_j, \sum T_j)$	Cunha Campos and Claudio Arroyo (2014)			MH
$DPm \to F2  \sharp (C_{max}, F_l(\sum_{i} w_j T_j, \sum_{i} E_j))$	Tajbakhsh et al. (2014)		MILP	MH
$DPm \rightarrow F2 ST_{sd}, blocking F_l(C_{max}, \sum w_j C_j)$	Maleki-Darounkolaei et al. (2012)		MILP	MH
	Maleki-Daronkolaei and Seyedi (2013)			MH
$DPm \rightarrow F2 p-batch F_l(AT, DC)$	Wang et al. (2016)			CH, MH
$DPm \to HF2(1, DPm)  \sum C_j$	Xiong et al. (2015)	LB	MILP	CH, MH

Table 3: Summary of contributions in Sections 4.3 and 4.4 (dedicated machines with more than a single machine at assembly stage). (\*Notation is described in the additional on-line material).

## 4.3 Parallel machines in the assembly stage: $DPm \rightarrow Pm/Rm/Qm$ layouts

This case –depicted in Figure 1c– has been addressed for different objectives. The  $DPm \to Rm||C_{max}$  problem has been modelled as an MILP by Navaei et al. (2013), who also propose a metaheuristic. The  $DPm \to Pm|ST_{sd}|C_{max}$  problem is addressed by Zhang et al. (2010). These authors propose an MILP model and a decomposition approach, together with a genetic algorithm.

Regarding total completion time, Sung and Kim (2008) analyse the properties of the problem and propose a B & B procedure. Al-Anzi and Allahverdi (2012); Allahverdi and Al-Anzi (2012) and Al-Anzi and Allahverdi (2013) address the 2-machine and the general m-assembly machine problem using metaheuristics. The case of the total weighted completion time has been addressed when lot streaming and a work shift constraint is allowed by Nejati et al. (2016). A mathematical programming formulation of the problem is given and a metaheuristic is proposed to approximately solve it.

Navaei et al. (2014) address the  $DPm \to Rm|ST_{sd}|F_l(DC,HC)$  problem, where DC and HC are the delay and holding costs, respectively. An MILP model is presented, and several metaheuristics are

proposed. Finally, Mozdgir et al. (2013a) propose an MILP model and some metaheuristics for the  $DPm \to Rm|ST_{sd}|F_l(C_{max}, \sum C_j)$  problem.

## 4.4 Flowshop-type in the assembly stage: $DPm \rightarrow Fm$ and $DPm \rightarrow HFm$ layouts

The problems with a flowshop in the assembly stage –depicted in Figure 1d– have been addressed by a number of authors. Among these types of problems, the most studied is that where the flowshops consist of two stages, with the first one corresponding to a transportation stage and the second one the assembly of the components. Note that, in order to perform the transportation of all components of the product, the concurrency of operations is required. This  $DPm \to F2$  setting is denoted in some literature as the three-stage assembly flowshop scheduling problem (see e.g. Koulamas and Kyparisis, 2001). Clearly, this problem is a generalisation of the 3-machine flowshop, and it is therefore NP-hard for all well-known criteria. A limited number of objectives have been studied. For makespan, the problem is first addressed by Koulamas and Kyparisis (2001), who propose several constructive heuristics, giving their worst cases. A metaheuristic for this problem is proposed by Komaki et al. (2017). Regarding the total completion time, an MILP model for the  $DPm \to F2|ST_{sd}| \sum C_j$  problem is proposed by Andres and Hatami (2011).

Several multi-objective problems have been addressed in this layout, including:

- The problem  $DPm \to F2|ST_{sd}|F_l(\sum C_j, T_{max})$  is addressed by Hatami et al. (2010) by means of a mathematical model and metaheuristics.
- The problem  $DPm \to F2|a_i, pmtn-semi|F_l(\sum C_j, \sum T_j, \sum E_j)$  is tackled by Shoaardebili and Fattahi (2015), who present multi-objective metaheuristics.
- The problem  $DPm \to F2|ST_{sd}|\#(\sum C_j, \sum T_j)$  is addressed by Cunha Campos and Claudio Arroyo (2014), who propose a multi-objective metaheuristic (genetic algorithm).
- The problem  $DPm \to F2||\#(C_{max}, F_l(\sum w_j E_j, \sum w_j T_j))|$  is addressed by Tajbakhsh et al. (2014). The authors present a mathematical model and two metaheuristics.
- Maleki-Daronkolaei and Seyedi (2013); Maleki-Darounkolaei et al. (2012) study the  $DPm \rightarrow F2|blocking, ST_{sd}|F_l(C_{max}, \sum w_jC_j)$  problem, proposing several metaheuristics.
- Wang et al. (2016) propose some metaheuristics for the  $DPm \to F2|p-batch|F_l(AT,DC)$  problem, where AT is a function of the arrival times to the customers, and DC the delay costs.

Regarding the problems with hybrid flowshop in the assembly stage, this layout –depicted in Figure 1e–can be seen as a generalisation of the  $DPm \to Fm$  layout. It can also be employed to model a particular manufacturing stage denoted as product differentiation which is related to specific operations carried out

after the assembly of the product. The literature on the so-called Differentiation Scheduling Problem (DSP) is relatively abundant, although this problem is usually treated in isolation of the previous assembly problem and, to the best of our knowledge, the only reference addressing scheduling problems in this layout is Xiong et al. (2015), who propose an MILP model as well as some constructive heuristics and metaheuristics.

# 5 Assembly scheduling with flexible machines

In this section we review the problems involving machines capable of performing multiple operations. Depending on the layout, a solution would be given by solving an integrated assignment and scheduling problem. As in Section 4, in the next subsections we discuss a number of cases depending on the layout for the operations prior to the assembly. Furthermore, we present some results not provided in the literature in order to contribute to the classification of these types of problems.

# 5.1 Single machine prior to assembly: $1 \rightarrow \alpha_2$ layout

When a single machine is used for operations prior to the assembly, the possibility of performing these operations in a concurrent manner is not available, so they all have to be sequenced on this machine. Depending on the number of machines used for assembly in the second stage, some results can be stated regarding the properties of different scheduling problems. Therefore, we first present the general results.

**Theorem 5.1.** In a  $1 \to 1$  layout, for a given sequence of jobs  $\Pi := (\pi_1, \dots, \pi_n)$  in the second (assembly) stage, the best value of any regular objective function  $f(C_j)$  is obtained if all operations in the first stage of each job in  $\Pi$  are carried out consecutively.

Proof. Without loss of generality, we assume the following sequence of jobs on the second machine: (1, 2, ..., j, ..., n). Let us assume that on the first machine, not all  $r_j$  operations of job j are carried out one after another, but the l-th operation of job j+1 is carried out after the k-1-th operation of job j and before the k-th operation of job j, i.e. the sequence of operations on the first machine is  $..., O_{k-1,j}^1, O_{k,j}^1, ...$  We prove the theorem by contradiction, showing that it is not possible to obtain lower values of the completion times of j and j+1 than those obtained if all operations of j are carried out one after another (i.e. in a batch).

Let  $S_1$  be the starting time of the first operation of j in the first stage. Then  $C_{j,1}$  the completion time of all operations of job j on the first machine is:

$$C_{j,1} = S_1 + \sum_{u < k} p(O_{uj}^1) + p(O_{l,j+1}^1) + \sum_{u \ge k} p(O_{uj}^1) = S_1 + \sum_{u=1}^{r_j} p(O_{uj}^1) + p(O_{l,j+1}^1)$$

And  $C_{j+1,1}$  the completion time of all operations of job j+1 on the first machine:

$$C_{j+1,1} = C_{j,1} + \sum_{u \neq l} p(O_{u,j+1}^1) = S_1 + \sum_{u=1}^{r_j} p(O_{u,j}^1) + \sum_{u=1}^{r_{j+1}} p(O_{u,j+1}^1)$$

Regarding the second machine:

$$C_{j} = C_{j,2} = \max\{S_{1} + p(\bar{O}_{j-1}^{2}); C_{j,1}\} + p(\bar{O}_{j}^{2}) = S_{1} + \max\{p(\bar{O}_{j-1}^{2}); \sum_{i=1}^{r_{j}} p(O_{uj}^{1}) + p(O_{l,j+1}^{1})\} + p(\bar{O}_{j}^{2})$$

And, for job j + 1:

$$C_{j+1} = C_{j+1,2} = \max\{C_j; C_{j+1,1}\} + p(\bar{O}_{j+1}^2)$$

In contrast, if all operations of job j are carried out in a batch and are immediately followed by the operations of job j + 1, then on the first machine we have:

$$C_{j,1}^* = S_1 + \sum_{u=1}^{r_j} p(O_{uj}^1)$$

and

$$C_{j+1,1}^* = C_{j,1}^* + \sum_{u=1}^{r_{j+1}} p(O_{u,j+1}^1) = S_1 + \sum_{u=1}^{r_j} p(O_{u,j}^1) + \sum_{u=1}^{r_{j+1}} p(O_{u,j+1}^1) = C_{j+1,1}$$

The completion times on the second machine would be:

$$C_j^* = C_{j,2}^* = \max\{S_1 + p(\bar{O}_{j-1}^2); C_{j,1}^*\} + p(\bar{O}_j^2) = S_1 + \max\{p(\bar{O}_{j-1}^2); \sum_{u=1}^{r_j} p(O_{uj}^1)\} + p(\bar{O}_j^2)$$

and

$$C_{j+1}^* = C_{j+1,2}^* = \max\{C_j^*; C_{j+1,1}^*\} + p(\bar{O}_{j+1}^2) = \max\{C_j^*; C_{j+1,1}\} + p(\bar{O}_{j+1}^2)$$

As it can be seen,  $C_j^* \leq C_j$  (indeed  $C_j^* < C_j$  unless operation l of job j+1 in the first stage takes zero time units to complete, i.e.  $p(O_{l,j+1}^1) = 0$ ), and, as a consequence,  $C_{j+1}^* \leq C_{j+1}$ . In addition, the completion times of the rest of the jobs do not change, therefore any regular objective function would yield a lower value for  $C^*$  than for C. This proves that there is no advantage in considering not to carry out all operations of the same job in a batch at the first stage.

From Theorem 5.1, two corollaries follow:

Corollary 5.1.1. For any regular objective  $f(C_j)$ , the  $1 \to 1 || f(C_j)$  problem is equivalent to the  $F2 || f(C_j)$  problem, where  $p_{jk}$  the processing times of job j on k machine of the latter problem are given by:

$$p_{j1} = \sum_{u=1}^{r_j} p(O_{uj}^1)$$

and

$$p_{j2} = p(\overline{O}_{1j}^2)$$

*Proof.* Trivial from Theorem 5.1.

Corollary 5.1.2. For any regular objective  $f(C_j)$ , the  $1 \to 0 || f(C_j)$  problem is equivalent to the  $1 || f(C_j)$  problem, where  $p_j$  the processing times of each job in the latter problem are given by:

$$p_j = \sum_{u=1}^{r_j} p(O_{uj}^1)$$

*Proof.* Trivial from Theorem 5.1.

The corollaries also serve to establish the connection between the flexible and dedicated machines assembly settings, as it can be seen in Figure 4. We are not aware of contributions explicitly addressing the results in the theorem and corollaries. However, some specific cases have been mentioned regarding Corollary 5.1.1: Cheng and Wang (1999) state that, for the makespan objective and the assembly scheduling problem with two components for each job, the problem can be solved by Johnson's algorithm if there is no commonality of the components. Also Property 2 in Liao et al. (2015) states that the  $1 \rightarrow 1|BS_j|C_{max}$  problem is equivalent to  $F2||C_{max}$  if setup times are zero.

Due to the high number of works analysing the  $1 \to \alpha_2$  setting, the existing contributions have been divided depending on the layout of the assembly stages. These are discussed in the next sections and are summarised in Table 4.

#### 5.1.1 No assembly stage: $1 \rightarrow 0$ layout

As it can be seen from Figure 4, many standard settings in the  $1 \to 0$  layout are polynomially solvable as it is equivalent to the single machine case if a regular objective is considered and no additional constraints are assumed. Therefore, existing contributions focus on problems with specific constraints, most of them related to the existence of the requirement of batch-processing certain types of components, which excludes the possibility of carrying out all operations of a job consecutively and therefore Theorem 5.1 may not be applicable.

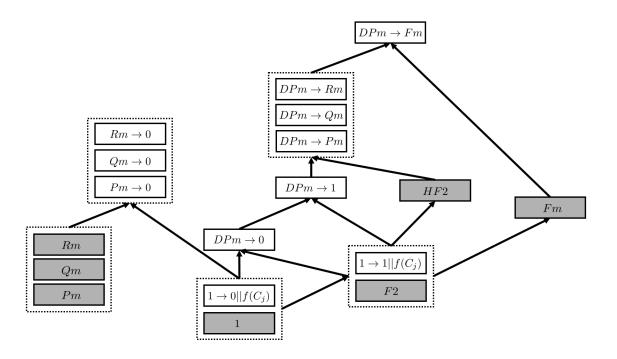


Figure 4: Complexity depending on the layout (non-assembly layouts in grey boxes).

To the best of our knowledge, the first reference on this layout is Liao and Chuang (1996), who consider the problem with setup times and an  $\epsilon$ -constrained approach where the objectives are the minimisation of the set-up times subject to a maximum number of tardy jobs, or a maximum tardiness. A number of problem properties and B & B algorithms are presented.

A specific case of this layout is addressed by Gerodimos et al. (2000): In their problem, each job is composed of two components (standard and customised), with the standard component being processed in batches. There are setup times for changing from a standard component to a customised one, and between customised components of different products. Furthermore, there is a batch availability constraint. The authors show this setting to be NP-hard for the number of late jobs, a problem for which they develop dynamic programming procedures. A version with more than two components is presented in Gerodimos et al. (1999), where the complexity of the problem for maximum lateness and for the weighted sum of tardy jobs are established. Additionally, in the case where the operations of jobs belonging to the same family have to be sequenced together –a constraint that the authors label as group technology— is studied.

Another specific problem within this layout is presented in Shi et al. (2018), where orders composed of several products belonging to different product families have to be processed in batches and there are incompatible job families, i.e. products from different families cannot be in the same batch. The problem is shown to be solvable for the makespan case, whereas for the weighted total completion time the authors

Problem*	Reference	Analysis	Exact	Approximate
$1 \to 0  BS_{sd}  \epsilon(TS, T_{max})$	Liao and Chuang (1996)	PP	BB	
$1 \to 0  BS_{sd}  \epsilon(TS, \sum U_j)$	Liao and Chuang (1996)	PP	BB	
$1 \rightarrow 0 BS, ba, nc = 2 L_{max}$	Gerodimos et al. (2000)	PP	DP	
$1 \rightarrow 0 BS, ba, nc = 2 \sum_{i} U_{i}$	Gerodimos et al. (2000)	PP,CA	DP	
$1 \rightarrow 0 BS L_{max}$	Gerodimos et al. (1999)	PP, CA		
$1 \to 0 BS  \sum w_i U_i$	Gerodimos et al. (1999)	PP, CA	DP	
$1 \to 0 BS \sum_{i} C_{i}$	Ng et al. (2002)	CA		
· · · · <b>2</b>	Erel and Ghosh (2007)	CA	DP	
$1 \rightarrow 0 BS, group - technology  \sum C_j$	Gerodimos et al. (1999)	PP, CA	DP	
	Ng et al. (2002)	CA		
	Hazir et al. (2008)		MILP	MH
$1 \to 0 BS GP(C_{max}, TCC)$	Gupta et al. (1997)	PP, CA	PA	
$1 \rightarrow 0 BS GP(TCC, C_{max})$	Gupta et al. (1997)	PP, CA	PA	
$1 \rightarrow 0   p-batch, incompt   C_{max}$	Shi et al. (2018)	PP	PA	
$1 \rightarrow 0   p-batch, incompt   \sum w_j C_j$	Shi et al. (2018)	PP		CH
$1 \rightarrow 1   n = 1, recrc - sas   C_{max}$	Kusiak (1989)	PP, CA		,
$1 \rightarrow 1   n = 1, recrc - sas, product - batch   C_{max}$	Kusiak (1989)			CH
$1 \rightarrow 1  recrc - sas  C_{max}$	Kusiak (1989)	PP, CA		
$1 \rightarrow 1   recrc - sas, product - batch   C_{max}$	Kusiak (1989)			CH
$1 \to 1 BS, ba, nc = 2 C_{max}$	Cheng and Wang (1999)	PP, CA	DP (special cases)	
	Lin and Cheng (2002)	CA		
$1 \to 1 BS, nc = 2 C_{max}$	Cheng and Wang (1999)	PP, CA	DP (special cases)	
	Lin and Cheng (2002)	CA		
$1 \rightarrow 1   deteriorating, BS   C_{max}$	Jung and Kim (2016)		MILP	
$1 \rightarrow 1 pm, deteriorating, BS C_{max}$	Jung and Kim (2016)		MILP	
$1 \to 1 BS C_{max}$	Liao et al. (2015)		MILP	CH
$1 \rightarrow 1 BS C_{max}$	Jung et al. (2017)		MILP	MH
$1 \rightarrow 1 BS_{component}, product - batch  \sum C_j$	Yokoyama (2004)	PP		СН
$1 \to Pm n = 1, recrc - sas C_{max}$	He and Babayan (2002)	CA	MILP	
$1 \to Pm complex C_{max}$	He and Babayan (2002)		MILP	CH
	Gaafar and Masoud (2005)			MH
	Liao and Liao (2008)		BB	MH
	Gaafar et al. (2008)			MH
	Teymourian et al. (2016)			MH

Table 4: Summary of contributions in Section 5.1 (single machine processing).(\*Notation is described in the additional on-line material).

propose a constructive heuristic.

The NP-hardness of the problem with total completion time assuming setup times among families of products is established by Ng et al. (2002) and Erel and Ghosh (2007) independently. The latter authors also propose a dynamic programming algorithm. Finally, Hazir et al. (2008) propose an MILP and several metaheuristics for this problem.

The problems  $1 \to 0|BS_j|GP(C_{max}, TCC)$  and  $1 \to 0|BS_j|GP(TCC, C_{max})$  where TCC denotes the total carrying costs are addressed by Gupta et al. (1997), who study their complexity, derive some properties and propose some constructive heuristics.

A specific case of this problem that will not be treated here is given by the so-called multiple orders per job scheduling problem (see e.g. Laub et al., 2007). This problem arises in the semiconductor manufacturing and TFT-LCD industries, where a number of orders –possibly belonging to different customers– should be grouped together in special transfer facilities (FOUPs) to be processed as a batch (either p-batch or s-batch). Therefore, the problems of simultaneously grouping the orders into FOUPs and scheduling them have to be

addressed. Although this problem is a particular case of the order scheduling problem, in view of its very specific features, it is not addressed here and the reader is referred to e.g Mason and Chen (2010) for a recent paper on the topic.

#### 5.1.2 Single machine for assembly: $1 \rightarrow 1$ layout

All except one of the references involve the makespan as objective (see Table 4). To the best of our knowledge, the first reference on this layout is Kusiak (1989), who addresses the problems of scheduling a single product, and several products with or without batches. The jobs may require several steps of manufacturing and assembly, which can be modelled with recirculation constraints, i.e.: the  $1 \rightarrow 1|recrc - sas|C_{max}$  or  $1 \rightarrow 1|recrc - sas, product - batch|C_{max}$  problems. For the problem without batches, Kusiak (1989) develops an optimal algorithm. In the light of Theorem 5.1, this algorithm is an extension for the recirculation case of the well-known Johnson's algorithm for the  $F2||C_{max}$  problem, although we are not aware that this aspect is mentioned by the author. For the problems with batches, the author proposes some constructive heuristics.

Cheng and Wang (1999) address the scheduling of jobs consisting of two components, a unique component for each product and a common component for all products, the latter being produced in batches with a setup time. The authors show that the problem is NP-hard, and identify properties to reduce the search space, as well as specific cases of the problem that are polynomially solvable. Lin and Cheng (2002) develop further results on the complexity of these problems and prove that they are strongly NP-hard.

Jung and Kim (2016) propose MILP models and constructive heuristics for the problems with makespan objective with/without preventive maintenance activities, batch setups and deterioration rates.

Liao et al. (2015) propose an MILP model and some properties for the problem based on Jonhson's algorithm for the  $1 \to 1|BS|C_{max}$  problem, also addressed by Jung et al. (2017) when the number of components of the jobs is dynamic, constant setup times, and product batches. An MILP model and a genetic algorithm are proposed.

Finally, Yokoyama (2004) addresses the problem with completion time as objective in the case of setups in the manufacturing machine, i.e. the  $1 \to 1|BS_{component}, product - batch| \sum C_j$  problem. This author analyses some properties of the problem and proposes a constructive heuristic.

## 5.1.3 Parallel machines for assembly: $1 \rightarrow Pm$ layout

Note that, for this layout, it is not possible to establish that carrying out all operations of a job consecutively in the first machine will produce better schedules for a regular objective function. We are only aware of papers studying the makespan objective in this layout (see Table 4). This problem is NP-hard (see Figure 4 and note that  $Pm||C_{max}$  is already NP-hard). He and Babayan (2002) are the first to analyse the problem

of single and n-job scheduling with and without multiple assembly operations (which involves recirculation and precedence constraints). They show that the single-job problem with simple assembly is polynomially solvable, and show some equivalences among the other problems, proposing an MILP model, a lower bound, and some constructive heuristics.

Some metaheuristics for this problem are proposed by Gaafar and Masoud (2005), which are outperformed by Liao and Liao (2008). These authors also propose a B & B algorithm for the problem. Independently, Gaafar et al. (2008) and Teymourian et al. (2016) propose additional metaheuristics. It is relevant to mention that only partial comparisons among these metaheuristics have been carried out, so the state-of-the-art regarding approximate methods for the problem is unclear.

## 5.2 Parallel machines prior to assembly: $Pm/Rm/Qm \rightarrow \alpha_2$ layout

In view of the existing contributions (summarised in Table 5), we discuss the cases where there is no processing at the assembly stage in Section 5.2.1, whereas the rest of the cases are discussed in Section 5.2.2.

Problem*	Reference	Analysis	Exact	Approximate
$P2 \rightarrow 0    \sum C_j$	Yang (2005)	CA		
·· <b>—</b> ··	Yang and Posner (2005)	PP		$_{\mathrm{CH}}$
$Pm \rightarrow 0 p-batch, incompt C_{max}$	Shi et al. (2018)	PP		CH
$Pm \to 0    \sum C_j$	Blocher and Chhajed (1996)	PP, CA	MILP	$_{\mathrm{CH}}$
·· <b>-</b> ·	Yang (2005)	CA		
	Yang and Posner (2005)	PP		$_{\mathrm{CH}}$
$Pm \to 0   p_j = 1   \sum C_j$	Blocher and Chhajed (1996)	CA		
	Yang (2005)	CA		
$Pm \to 0   p_j = 1   L_{max}$	Yang (2005)	CA		
$Pm \to 0   p_j = 1   \sum w_j C_j$	Yang (2005)	CA		
$Pm \to 0    \sum w_j \overline{C_j}$	Leung et al. (2006a)			$_{\mathrm{CH}}$
	Leung et al. (2008b)			CH
$Pm  o 0  prmpt  \sum w_j C_j$	Leung et al. (2008a)	CA		CH
$Pm \rightarrow 0   p - bat\overline{ch}, incompt   \sum w_j C_j$	Shi et al. (2018)		MILP	MH
$Pm \rightarrow 0    L_{max}$	Su et al. (2013)			$_{ m CH}$
$Rm \to 0  split  \sum C_j$	Xu et al. (2015)	PP	MILP	$_{\mathrm{CH}}$
$ Qm \rightarrow 0  \sum w_j C_j$	Leung et al. (2007b)			$_{\mathrm{CH}}$
$Qm \rightarrow 0 pmtn \sum w_i C_i$	Leung et al. (2007b)			CH
$Rm \rightarrow 0   d_i = d \sum_i U_i$	Ng et al. (2003)	CA		
$Rm \to 0   d_i = d   \sum_i w_i U_i$	Ng et al. (2003)	CA		CH
$Pm \rightarrow 1 recrc C_{max}$	He et al. (2001)		MILP	
$Pm \rightarrow 1 recrc - complex C_{max}$			MILP	$_{\mathrm{CH}}$
$Rm \to 1 BS_{sd} C_{max}$	Kheirandish et al. (2015)		MILP	MH
$Qm  o 1    C_{max}$	Koulamas and Kyparisis (2007)	PP		CH
$Pm \to Pm  F_l(JIT, \text{mean longest waiting duration})$	Chen et al. (2015)		MILP	MH
$Rm \to DF2 ST_{sd} F_l(\sum w_j E_j^2, \sum w_j T_j^2, \sum U_j, C_{max})$	Dalfard et al. (2011)		MILP	MH

Table 5: Summary of contributions in Section 5.2 (parallel flexible machines). (\*Notation is described in the additional on-line material).

#### **5.2.1** Flexible Order scheduling: $Pm/Rm/Qm \rightarrow 0$ layout

The complexity of a number of problems in the  $Pm \to 0$  layout is established by Yang (2005), some of them with specific constraints (see Table 5). His results prove that most of the problems are NP-hard even for

2 machines and unit processing times, with the exception of the maximum lateness and sum of completion times for unit processing times.

The first reference for the problem with total completion time objective is by Blocher and Chhajed (1996), who present some properties of the problem (such as an optimal procedure for the  $p_j = 1$  case), an MILP model, and propose constructive heuristics. Yang and Posner (2005) present some heuristics for the  $Pm \to 0 || \sum_j C_j$  problem, together with their worst case bounds. Xu et al. (2015) address the  $Rm \to 0 || \sum_j C_j$  problem where each component can be split arbitrarily into continuous sublots. Several problem properties and heuristics with their worst case bounds are presented. Leung et al. (2007b) address the  $Qm \to 0 || \sum_j w_j C_j$  with and without preemption, proposing some heuristics and giving their worst case. Leung et al. (2006a, 2008b) propose several heuristics for the  $Pm \to 0 || \sum_j w_j C_j$ . Leung et al. (2008a) study the same problem where preemption is allowed. The complexity of the problem is analysed, and some heuristics are presented.

For the specific problem of parallel batch machines with incompatible product families, Shi et al. (2018) study the objectives of makespan and weighted total completion time minimisation. A constructive heuristic based on some problem properties is proposed for the first objective, whereas a MILP model and a metaheuristic are presented for the second.

Regarding due-date related objectives, Su et al. (2013) address the problem for the maximum lateness, presenting a set of constructive heuristics together with their worst case lower bounds. Ng et al. (2003) address the  $Pm \to 0 || \sum w_j U_j$  problem when  $d_j = d$  and  $p_{ij} \in \{0,1\}$ . They show that the problem is NP-hard even when  $w_j = 1$ . They propose an approximate algorithm with its worst case lower bound.

# **5.2.2** One or more machines for assembly: $Pm/Rm/Qm \rightarrow \alpha_2$ layout $(\alpha_2 \neq 0)$

The contributions on this layout are rather scarce as compared with other problem types (see summary in Table 5). Regarding the case with a single machine for assembly, the  $Pm \to 1|recrc|C_{max}$  problem has been first addressed by He et al. (2001), who analyse the cases of single and multiple job product with simple/complex assembly. They propose MILP models, some equivalence properties, and constructive heuristics. Without recirculation, Kheirandish et al. (2015) address the  $Rm \to 1|BS_{sd}$ ,  $product - batch|C_{max}$  problem, for which the authors formulate an MILP model and a metaheuristic. Finally, an asymptotically optimal heuristic for the  $Qm \to 1||C_{max}$  problem is given by Koulamas and Kyparisis (2007).

With respect to the case where the assembly takes place in parallel machines, Chen et al. (2015) propose an MILP model and a metaheuristic for the case where orders are composed of several jobs (which in turn are composed of several components), with the bi-objective of the weighted mean tardiness and earliness, and the mean longest waiting time of the order.

Dalfard et al. (2011) address the  $Rm \to DF2|ST_{sd}|F_l(\sum w_jT_j^2, \sum w_jE_j^2, C_{max}, \sum U_j)$  problem. An MILP

model and metaheuristics are proposed for the problem.

# 5.3 Flowshop-type prior to assembly: $Fm/PFm/HFm \rightarrow \alpha_2$ layout

Problem*	Reference	Analysis	Exact	Approximate
$F2 \rightarrow 1    \sum w_j C_j$	Yokoyama and Santos (2005)	PP	BB	
$F2 \rightarrow 1   \overrightarrow{prmu}  \sum w_j C_j$	Yokoyama and Santos (2005)	PP	$_{ m BB}$	
$Fm \rightarrow 1   recrc - complex, prmu, ba   \sum w_i C_i$	Yokoyama (2001)		$_{ m BB}$	
$Fm  o 1   recrc - complex, prmu, ba   \sum w_j C_j$ $Fm  o 1   prmu, product-batch, BS_{ij}   \sum C_j$	Yokoyama (2008)	PP, LB	$_{ m BB}$	CH
$PFm \rightarrow 1  prmu  C_{max}$	Hatami et al. (2013)		MILP	MH
	Hatami et al. (2014b)			CH
	Li et al. (2015)			MH
$PFm \rightarrow 1   prmu, ST_{sd}   C_{max}$	Hatami et al. (2014a)			CH
	Hatami et al. (2015b)			CH, MH
$HF2, Pm, Pm \rightarrow 1    C_{max}$	Fattahi et al. (2013b)	PP	MILP	CH
	Shan et al. (2014)		MILP	
	Komaki et al. (2016)	PP	MILP	CH, MH
$HF2, 1, Pm \rightarrow Pm BS_{ij}, product - batch C_{max}$	Fattahi et al. (2013a)	PP		MH
$HF2, Pm, Pm \rightarrow 1 BS_{ij} C_{max}$	Fattahi et al. (2014)		$_{\mathrm{BB}}$	MH
$HF2, Qm, 1 \rightarrow DP2 ST_{sd}, product - batch C_{max}$	Nikzad et al. (2015)		MILP	MH
$HFm, Pm_1 \dots Pm_S \to Pm_A   recrc - complex   C_{max}$	Mahdavi et al. (2011)		MILP	CH, MH

Table 6: Summary of contributions in Section 5.3 (flowshop-type layout prior to assembly). (\*Notation is described in the additional on-line material).

This layout corresponds to Figure 2d in the case of a flowshop, to Figure 2e in the case of a parallel flowshop, and to Figure 2f in the case of a hybrid flowshop. These types of problems are NP-complete for any objective even for the  $F2 \to 1$  layout, as the latter can be seen as a generalisation of the three-machine flowshop (see Figure 4). In Table 6 we summarise the main contributions.

Regarding the flowshop layout in the  $\alpha_1$  field, to the best of our knowledge, the problem has been addressed only by Yokoyama (2001), Yokoyama and Santos (2005) and Yokoyama (2008). In Yokoyama and Santos (2005), the authors propose a B & B procedure for the  $F2 \to 1 || \sum w_j C_j$  problem with and without the permutation constraint. Yokoyama (2008) addresses the  $Fm \to 1 || prmu, product - batch, BS_{ij} || \sum C_j$  problem, deriving some approximate procedures and lower bounds. Finally, Yokoyama (2001) addresses a specific case of  $Fm \to 1 || recrc - complex, prmu, ba|| \sum w_j C_j$  using a B & B procedure.

Regarding the case of the parallel flowshop in the  $\alpha_1$  field, perhaps the best-known case is the  $PFm \to 1$  layout, which is also called distributed assembly scheduling problem. The problem has been addressed just for the makespan objective, Hatami et al. (2013) and Hatami et al. (2014b) being the first works describing the problem and proposing an MILP and a metaheuristic, and constructive heuristics respectively. Li et al. (2015) address the same problem and propose a genetic algorithm that compares favourably to the constructive heuristics by Hatami et al. (2014b). Finally, constructive heuristics and metaheuristics for the  $PFm \to 1|prmu, ST_{sd}|C_{max}$  are proposed in Hatami et al. (2014a) and in Hatami et al. (2015b) respectively.

Finally, regarding the hybrid flowshop, to the best of our knowledge, it has been addressed first by Fattahi et al. (2013b), who tackle the  $HF2, Pm1, \ldots, Pm_S \to 1 || C_{max}$  problem. These authors propose an

MILP model and constructive heuristics. However, the MILP model contains a mistake which is fixed by Shan et al. (2014). The heuristics proposed by Fattahi et al. (2013b) are outperformed by a metaheuristic proposed by Komaki et al. (2016), who also propose some constructive heuristics for the problem. Two extensions of the previous problem are presented by Fattahi et al. (2013a) and Fattahi et al. (2014). The first reference proposes metaheuristics for the case with machine dependent setups and product-batch restrictions, whereas in the second reference a branch and bound and a metaheuristic are proposed for the problem with machine dependent setups. The HF2, Qm,  $1 \rightarrow DP2|ST_{sd}$ ,  $product - batch|C_{max}$  problem is studied by Nikzad et al. (2015), who propose an MILP model and several metaheuristics. Finally, a multi-level assembly case is addressed by Mahdavi et al. (2011), where the authors process the components of a product in a hybrid flowshop followed by several stages of subassemblies and assemblies with the objective of makespan minimisation. This problem can be regarded as  $HFm \rightarrow 1|recrc|C_{max}$  to model the recirculation required in the assembly stage. The problem is modelled using an MILP, and some heuristics and metaheuristics are proposed.

## 6 Distributed assembly scheduling

In this section we review the contributions related to scheduling jobs using different assembly layouts. Note that here distributed has a different meaning than in the so-called distributed assembly flowshop layout, as in the latter case the assembly operation is not distributed at all.

Therefore, in this problem there are several identical f factories, each one consisting of an assembly layout, so the problem is to schedule all jobs in these settings, which includes the assignment of jobs to the factories and the scheduling of these jobs within the factories. Using the notation proposed in Section 3, the layout of this type of problem can be denoted as  $(\alpha_1 \to \alpha_2) \to 0$ , where the term within parentheses indicates the layout of each identical factory.

To the best of our knowledge, the only type of problem addressed is to schedule jobs over distributed factories consisting of dedicated parallel machines and a single assembly stage. More specifically, the  $(DPm \rightarrow 1) \rightarrow 0$  layout has been addressed for the following objectives:

- Makespan: This objective was first addressed by Deng et al. (2016), proposing an MILP model for the problem and a metaheuristic (Memetic algorithm).
- Total Completion Time. This problem is addressed by Xiong et al. (2014), who present several metaheuristics for the problem with setups, i.e. the  $(DPm \to 1) \to 0|BS_j| \sum C_j$  problem.
- Biobjective: Xiong and Xing (2014) address the  $(DPm \to 1) \to 0|BS_j|F_l(C_{max}, \sum C_j)$  problem, proposing a genetic algorithm and a variable local search. However, these algorithms are not compared

with those of the corresponding single-criteria cases.

Regarding the case with unrelated machines in each factory, Hatami et al. (2015a) and Hatami et al. (2016) propose a MILP model for the problem with elegibility constraints, i.e. for the  $(DRm \to 1) \to 0 |M_j| C_{max}$  problem.

## 7 General layout (job-shop) assembly models

In this section, we deal with the contributions that solve a general (job-shop) problem, in many cases with multiple assemblies and sub-assemblies. To the best of our knowledge, the first of these contributions is Agrawal et al. (1996), who propose an MILP model and some heuristics. This model is enhanced by Roach and Nagi (1996) in order to consider ordering constraints. The model considered by these authors assumes a single product, although ordered with different quantities and due dates. For this problem, a hybrid simulated annealing-genetic algorithm is proposed by Roach and Nagi (1996)

Cummings Mckoy and Egbelu (1998) propose another general MILP model for a job shop with different products (each one with a different structure of assembly/sub-assemblies operations) and setups, with the objective of makespan minimisation. The variables of the model contain 7 sub indices, which serve as an indicator of the complexity of the model. A heuristic approach to find approximate solutions is also given.

A specific model including availability, resources, and assembly area constraints is presented in Kolisch and Hess (2000) with the objective of minimisation of the weighted tardiness of the orders. A genetic algorithm for the generic assembly problem is presented by Pongcharoen et al. (2002), taking into account penalties for earliness and for tardiness. Also Du et al. (2016) propose a metaheuristic for a general-layout assembly problem, although only a sample instance is solved.

Kyparisis and Koulamas (2002) address a general problem consisting of r-serial stages, with stage k containing  $m_k$  machines in charge of carrying out the operations of the jobs. At stage k, a given operation i can take place in a subset of  $l_i^k$  machines. The job cannot pass on to the following stage until all operations in the previous stage have been completed. It can be seen that this model encompasses several models presented in this paper, although it cannot accommodate for instance the  $PFm \to 1$  layout, or the distributed layout. The authors address the problem for the makespan objective and propose a general constructive heuristic for the problem.

In Bhongade and Khodke (2012) two constructive heuristics for the problem with flexible machines and makespan as objective are presented. Two versions of genetic algorithms are proposed by Wang et al. (2011) for the general assembly problem with makespan objective.

Finally, it is worth mentioning that a number of papers have addressed the problem of lot streaming in

the general flowshop setting, including Chan et al. (2008b), Chan et al. (2008a), and Wong et al. (2009). Furthermore, Liu (2009) shows that lot streaming techniques are also beneficial in the  $Jm \to 0$  layout.

### 8 Conclusions and future research lines

In this paper, we have reviewed a large number of papers in order to provide a comprehensive overview on scheduling with assembly operations. A number of conclusions and directions for future research can be derived:

- Regarding the assembly scheduling problems with dedicated machines:
  - The  $DPm \to 1$  seems to be a well-studied layout for different objectives and constraints. Nevertheless, since this is a key layout, in order to tackle more complex settings, some results would need to be reinforced along the following directions:
    - \* The  $DP2 \to 1|r_j|C_{max}$  and the  $DPm \to 1|r_j|C_{max}$  problems have been independently studied by Sung and Juhn (2009) and Komaki and Kayvanfar (2015) respectively and the methods proposed have not been contrasted.
    - \* Although there are several metaheuristics available for the  $DPm \to 1 || F_l(C_{max}, \sum C_j)$  problem (see Section 4.2), most of them have not been compared among each other, therefore the state-of-the-art remains unclear. Furthermore, it would be of interest if these heuristics are competitive for the single objective cases (i.e. considering only makespan or completion time as objectives).
    - \* When addressing the multicriteria problem, the predominant approach adopted has been to weight the objective functions, and we are only aware of one paper discussing  $\epsilon$ -constrained or Pareto-set approaches for rather specific constraints (Seidgar et al., 2016).
  - Although the  $DPm \to 1$  layout has been widely studied with respect to a number of different objectives, the numerous algorithms available have not been extended to the  $DPm \to Pm$  counterpart.
  - The  $DPm \to \alpha_2$  layout can be regarded as a modelling simplification of more complex, dedicated layouts where the operations prior to the assembly are carried out. We have witnessed that a frequent layout would consist of dedicated flowshops that process the components of the product to be later assembled, i.e. the  $DPFm \to \alpha_2$  layout. However, we are not aware of papers dealing with these scheduling problems.

- Several works on the  $DPm \to Rm/Qm/Pm$  layouts involve the development of MILP models. However, to the best of our knowledge, there are no computational results regarding their (relative) efficiency.
- There are a number of contributions for the multi-criteria assembly scheduling problem in the DPm → Fm layout, most of them consisting of metaheuristics for the multicriteria weighted approach. It would be interesting to 1) establish whether some of these metaheuristics perform efficiently for other multi-criteria problems in this layout, and 2) assess their performance for the extreme (i.e. single-criteria) case.
- Regarding the assembly scheduling with flexible machines:
  - Although there are some contributions on the  $1 \to 1$  layout, its connection with the 2-machine flowshop scheduling problem has not been explicitly stated up to Section 5.1.
  - The connection among order scheduling problems and flexible order scheduling has not been thoroughly explored. Clearly, the former can be modelled as a special case of the latter, therefore it would be interesting to compare the structure of the solutions and procedures.
  - For the  $1 \to Pm$  layout, only the makespan objective has been considered. Furthermore, for this case, the state of the art of the solution procedures for the problem is unclear.
  - In general, contributions for some layouts within the flexible machine case are scarce, some examples being the  $Fm \to \alpha_2$  and  $PFm \to \alpha_2$  layouts.
- Regarding the distributed assembly scheduling it has to be mentioned that most of the approximate
  methods employed in the distributed setting do not make use of the results available for the corresponding single factory problem.
- Finally, with respect to the general assembly problems, it would be of interest to compare the relative efficiency of the different MILP models proposed.

As a final comment, the picture emerging from the review carried out in this paper pictures a field with many contributions in the last decades and some well-studied problems, but also with numerous topics worth further research. We hope that the classification and review carried out would serve to foster future work in this relevant area for manufacturing operations.

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