

Chapter 1

A HISTORY OF PRODUCTION SCHEDULING

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Abstract: This chapter describes the history of production scheduling in manufacturing facilities over the last 100 years. Understanding the ways that production scheduling has been done is critical to analyzing existing production scheduling systems and finding ways to improve them. The chapter covers not only the tools used to support decision-making in real-world production scheduling but also the changes in the production scheduling systems. This story goes from the first charts developed by Henry Gantt to advanced scheduling systems that rely on sophisticated algorithms. The goal of the chapter is to help production schedulers, engineers, and researchers understand the true nature of production scheduling in dynamic manufacturing systems and to encourage them to consider how production scheduling systems can be improved even more. This chapter not only reviews the range of concepts and approaches used to improve production scheduling but also demonstrates their timeless importance.

Key words: Production scheduling, history, Gantt charts, computer-based scheduling

1. INTRODUCTION

This chapter describes the history of production scheduling in manufacturing facilities over the last 100 years. Understanding the ways that production scheduling has been done is critical to analyzing existing production scheduling systems and finding ways to improve them.

The two key problems in production scheduling are, according to Wight (1984), “priorities” and “capacity.” In other words, “What should be done first?” and “Who should do it?” Wight defines *scheduling* as “establishing the timing for performing a task” and observes that, in a manufacturing firms, there are multiple types of scheduling, including the detailed scheduling of a shop order that shows when each operation must start and

complete. Cox *et al.* (1992) define *detailed scheduling* as “the actual assignment of starting and/or completion dates to operations or groups of operations to show when these must be done if the manufacturing order is to be completed on time.” They note that this is also known as *operations scheduling*, *order scheduling*, and *shop scheduling*. This chapter is concerned with this type of scheduling.

One type of dynamic scheduling strategy is to use dispatching rules to determine, when a resource becomes available, which task that resource should do next. Such rules are common in facilities where many scheduling decisions must be made in a short period of time, as in semiconductor wafer fabrication facilities (which are discussed in another chapter of this book).

This chapter discusses the history of production scheduling. It covers not only the tools used to support decision-making in real-world production scheduling but also the changes in the production scheduling systems. This story goes from the first charts developed by Henry Gantt to advanced scheduling systems that rely on sophisticated algorithms. The goal of the chapter is to help production schedulers, engineers, and researchers understand the true nature of production scheduling in dynamic manufacturing systems and to encourage them to consider how production scheduling systems can be improved even more. This review demonstrates the timeless importance of production scheduling and the range of approaches taken to improve it.

This chapter does not address the sequencing of parts processed in high-volume, repetitive manufacturing systems. In such settings, one can look to JIT and lean manufacturing principles for how to control production. These approaches generally do not need the same type of production schedules discussed here.

Although project scheduling will be discussed, the chapter is primarily concerned with the scheduling of manufacturing operations, not general project management. Note finally that this chapter is not a review of the production scheduling literature, which would take an entire volume.

For a more general discussion of the history of manufacturing in the United States of America, see Hopp and Spearman (1996), who describe the changes since the First Industrial Revolution. Hounshell (1984) provides a detailed look at the development of manufacturing technology between 1800 and 1932. McKay (2003) provides a historical overview of the key concepts behind the practices that manufacturing firms have adopted in modern times, highlighting, for instance, how the ideas of just-in-time (though not the term) were well-known in the early twentieth century.

The remainder of this chapter is organized as follows: Section 2 discusses production scheduling prior to the advent of scientific management. Section 3 describes the first formal methods for production scheduling,

many of which are still used today. Section 4 describes the rise of computer-based scheduling systems. Section 5 discusses the algorithms developed to solve scheduling problems. Section 6 describes some advanced real-world production scheduling systems. Section 7 concludes the chapter and includes a discussion of production scheduling research.

2. FOREMEN RULE THE SHOP

Although humans have been creating items for countless years, manufacturing facilities first appeared during the middle of the eighteenth century, when the First Industrial Revolution created centralized power sources that made new organizational structures viable. The mills and workshops and projects of the past were the precursors of modern manufacturing organizations and the management practices that they employed (Wilson, 2000a). In time, manufacturing managers changed over the years from capitalists who developed innovative technologies to custodians who struggle to control a complex system to achieve multiple and conflicting objectives (Skinner, 1985).

The first factories were quite simple and relatively small. They produced a small number of products in large batches. Productivity gains came from using interchangeable parts to eliminate time-consuming fitting operations. Through the late 1800s, manufacturing firms were concerned with maximizing the productivity of the expensive equipment in the factory. Keeping utilization high was an important objective. Foremen ruled their shops, coordinating all of the activities needed for the limited number of products for which they were responsible. They hired operators, purchased materials, managed production, and delivered the product. They were experts with superior technical skills, and they (not a separate staff of clerks) planned production. Even as factories grew, they were just bigger, not more complex.

Production scheduling started simply also. Schedules, when used at all, listed only when work on an order should begin or when the order is due. They didn't provide any information about how long the total order should take or about the time required for individual operations (Roscoe and Freark, 1971). This type of schedule was widely used before useful formal methods became available (and can still be found in some small or poorly run shops). Limited cost accounting methods existed. For example, Binsse (1887) described a method for keeping track of time using a form almost like a Gantt chart.

Informal methods, especially expediting, have not disappeared. Wight (1984) stated that "production and inventory management in many

companies today is really just order launching and expediting.” This author’s observation is that the situation has not changed much in the last 20 years. In some cases, it has become worse as manufacturing organizations have created bureaucracies that collect and process information to create formal schedules that are not used.

3. THE RISE OF FORMAL SYSTEMS

Then, beginning around 1890, everything changed. Manufacturing firms started to make a wider range of products, and this variety led to complexity that was more than the foremen could, by themselves, handle. Factories became even larger as electric motors eliminated the need to locate equipment near a central power source. Cost, not time, was the primary objective. Economies of scale could be achieved by routing parts from one functional department to another, reducing the total number of machines that had to be purchased. Large move batches reduced material handling effort. Scientific management was the rational response to gain control of this complexity. As the next section explains, planners took over scheduling and coordination from the foremen, whose empire had fallen.

3.1 The production control office

Frederick Taylor’s separation of planning from execution justified the use of formal scheduling methods, which became critical as manufacturing organizations grew in complexity. Taylor proposed the production planning office around the time of World War I. Many individuals were required to create plans, manage inventory, and monitor operations. (Computers would take over many of these functions decades later.) The “production clerk” created a master production schedule based on firm orders and capacity. The “order of work clerk” issued shop orders and released material to the shop (Wilson, 2000b).

Gantt (1916) explicitly discusses scheduling, especially in the job shop environment. He proposes giving to the foreman each day an “order of work” that is an ordered list of jobs to be done that day. Moreover, he discusses the need to coordinate activities to avoid “interferences.” However, he also warns that the most elegant schedules created by planning offices are useless if they are ignored, a situation that he observed.

Many firms implemented Taylor’s suggestion to create a production planning office, and the production planners adapted and modified Gantt’s charts. Mitchell (1939) discusses the role of the production planning department, including routing, dispatching (issuing shop orders) and

scheduling. Scheduling is defined as “the timing of all operations with a view to insuring their completion when required.” The scheduling personnel determined which specific worker and machine does which task. However, foremen remained on the scene. Mitchell emphasizes that, in some shops, the shop foremen, who should have more insight into the qualitative factors that affect production, were responsible for the detailed assignments. Muther (1944) concurs, saying that, in many job shops, foremen both decided which work to do and assigned it to operators.

3.2 Henry Gantt and his charts

The man uniquely identified with production scheduling is, of course, Henry L. Gantt, who created innovative charts for production control. According to Cox *et al.* (1992), a *Gantt chart* is “the earliest and best known type of control chart especially designed to show graphically the relationship between planned performance and actual performance.” However, it is important to note that Gantt created many different types of charts that represented different views of a manufacturing system and measured different quantities (see Table 1-1 for a summary).

Gantt designed his charts so that foremen or other supervisors could quickly know whether production was on schedule, ahead of schedule, or behind schedule. Modern project management software includes this critical function even now. Gantt (1919) gives two principles for his charts:

1. Measure activities by the amount of time needed to complete them;
2. The space on the chart can be used to represent the amount of the activity that should have been done in that time.

Gantt (1903) describes two types of “balances”: the *man’s record*, which shows what each worker should do and did do, and the *daily balance of work*, which shows the amount of work to be done and the amount that is done. Gantt’s examples of these balances apply to orders that will require many days to complete.

The daily balance is “a method of scheduling and recording work,” according to Gantt. It has rows for each day and columns for each part or each operation. At the top of each column is the amount needed. The amount entered in the appropriate cell is the number of parts done each day and the cumulative total for that part. Heavy horizontal lines indicate the starting date and the date that the order should be done.

The man’s record chart uses the horizontal dimension for time. Each row corresponds to a worker in the shop. Each weekday spans five columns, and these columns have a horizontal line indicating the actual working time for each worker. There is also a thicker line showing the the cumulative working time for a week. On days when the worker did not work, a one-

letter code indicates the reason (e.g., absence, defective work, tooling problem, or holiday).

Table 1-1. Selected Gantt charts used for production scheduling.

Chart Type	Unit	Quantity being measured	Representation of time	Sources
Daily balance of work	Part or operation	Number produced	Rows for each day; bars showing start date and end date	Gantt, 1903; Rathe, 1961
Man's Record	Worker	Amount of work done each day and week, measured as time	3 or 5 columns for each day in two weeks	Gantt, 1981; Rathe, 1961
Machine Record	Machine	Amount of work done each day and week, measured as time	3 or 5 columns for each day in two weeks	Gantt, 1919, 1981; Rathe, 1961
Layout chart	Machine	Progress on assigned tasks, measured as time	3 or 5 columns for each day in two weeks	Clark, 1942
Gantt load chart	Machine type	Scheduled tasks and total load to date	One column for each day for two months	Mitchell, 1939
Gantt progress chart	Order	Work completed to date, measured as time	One column for each day for two months	Mitchell, 1939
Schedule Chart	Tasks in a job	Start and end of each task	Horizontal axis marked with 45 days	Muther, 1944
Progress chart	Product	Number produced each month	5 columns for each month for one year	Gantt, 1919, 1981; Rathe, 1961
Order chart	Order	Number produced each month	5 columns for each month for one year	Gantt, 1919, 1981; Rathe, 1961

Gantt's *machine record* is quite similar. Of course, machines are never absent, but they may suffer from a lack of power, a lack of work, or a failure.

McKay and Wiers (2004) point out that Gantt's man record and machine record charts are important because they not only record past performance but also track the reasons for inefficiency and thus hold foremen and managers responsible. They wonder why these types of charts are not more widely used, a fact that Gantt himself lamented (in Gantt, 1916).

David Porter worked with Henry Gantt at Frankford Arsenal in 1917 and created the first progress chart for the artillery ammunition shops there. Porter (1968) describes this chart and a number of similar charts, which were primarily progress charts for end items and their components. The unit of time was one day, and the charts track actual production completed to date and clearly show which items are behind schedule. Highlighting this type of exception in order to get management's attention is one of the key features of Gantt's innovative charts.

Clark (1942) provides an excellent overview of the different types of Gantt charts, including the machine record chart and the man record chart, both of which record past performance. Of most interest to those studying production scheduling is the *layout chart*, which specifies "when jobs are to be begun, by whom, and how long they will take." Thus, the layout chart is also used for scheduling (or planning). The key features of a layout chart are the set of horizontal lines, one line for each unique resource (e.g., a stenographer or a machine tool), and, going across the chart, vertical lines marking the beginning of each time period. A large "V" at the appropriate point above the chart marks the time when the chart was made. Along each resource's horizontal line are thin lines that show the tasks that the resource is supposed to do, along with each task's scheduled start time and end time. For each task, a thick line shows the amount of work done to date. A box with crossing diagonal lines shows work done on tasks past their scheduled end time. Clark claims that a paper chart, drawn by hand, is better than a board, as the paper chart "does not require any wall space, but can be used on a desk or table, kept in a drawer, and carried around easily." However, this author observes that a chart carried and viewed by only one person is not a useful tool for communication.

As mentioned before, Gantt's charts were adapted in many ways. Mitchell (1939) describes two types of Gantt charts as typical of the graphical devices used to help those involved in scheduling. The Gantt load chart shows (as horizontal lines) the schedule of each machine and the total load on the machine to date. Mitchell's illustration of this doesn't indicate which shop orders are to be produced. The Gantt progress chart shows (as horizontal lines) the progress of different shop orders and their due dates.

For a specific job, a *schedule chart* was used to plan and track the tasks needed for that job (Muther, 1944). Various horizontal bars show the start and end of subassembly tasks, and vertical bars show when subassemblies should be brought together. Filling in the bars shows the progress of work completed. Different colors are used for different types of parts and subassemblies. This type of chart can be found today in the Gantt chart view used by project management software.

In their discussion of production scheduling, Roscoe and Freark (1971) give an example of a Gantt chart. Their example is a graphical schedule that lists the operations needed to complete an order. Each row corresponds to a different operation. It lists the machine that will perform the operation and the rate at which the machine can produce parts (parts per hour). From this information one can calculate the time required for that operation. Each column in the chart corresponds to a day, and each operation has a horizontal line from the day and time it should start to the day and time it should complete. The chart is used for measuring progress, so a thicker line parallel to the first line shows the progress on that operation to date. The authors state that a “Gantt chart is essentially a series of parallel horizontal graphs which show schedules (or quotas) and accomplishment plotted against time.”

For production planning, Gantt used an *order chart* and a *progress chart* to keep track of the items that were ordered from contractors. The progress chart is a summary of the order charts for different products. Each chart indicates for each month of the year, using a thin horizontal line, the number of items produced during that month. In addition, a thick horizontal line indicates the number of items produced during the year. Each row in the chart corresponds to an order for parts from a specific contractor, and each row indicates the starting month and ending month of the deliveries.

In conclusion, it can be said that Gantt was a pioneer in developing graphical ways to visualize schedules and shop status. He used time (not just quantity) as a way to measure tasks. He used horizontal bars to represent the number of parts produced (in progress charts) and to record working time (in machine records). His progress (or layout) charts had a feature found in project management software today: the length of the bars (relative to the total time allocated to the task) showed the progress of tasks.

3.3 Loading, boards, and lines of balance: other tools

While Gantt charts remain one of the most common tools for planning and monitoring production, other tools have been developed over the years, including loading, planning boards, and lines of balance.

Loading is a scheduling technique that assigns an operation to a specific day or week when the machine (or machine group) will perform it

(MacNiece, 1951). Loading is finite when it takes into account the number of machines, shifts per day, working hours per shift, days per week as well as the time needed to complete the order.

MacNiece (1951) also discusses *planning boards*, which he attributes to Taylor. The board described has one row of spaces for each machine, and each row has a space for each shift. Each space contains one or more cards corresponding to the order(s) that should be produced in that shift, given capacity constraints. A large order will be placed in more than one consecutive space. MacNiece also suggests that one simplify scheduling by controlling the category that has the smallest quantity, either the machines or the products or the workers. Cox *et al.* (1992) defines a *control board* as “a visual means of showing machine loading or project planning.” This is also called a *dispatching board*, a *planning board*, or a *schedule board*.

The rise of computers to solve large project scheduling problems (discussed in the next section) did not eliminate manual methods. Many manufacturing firms sought better ways to create, update, visualize, and communicate schedules but could not (until much later) afford the computers needed to run sophisticated project scheduling algorithms. Control boards of various types were the solution, and these were once used in many applications. The Planalog control board was a sophisticated version developed in the 1960s. The Planalog was a board (up to six feet wide) that hung on a wall. (See Figure 1-1.) The board had numerous rows into which one could insert gauges of different lengths (from 0.25 to 5 inches long). Each gauge represented a different task (while rows did not necessarily represent resources). The length of each gauge represented the task’s expected (or actual) duration. The Planalog included innovative “fences.” Each fence was a vertical barrier that spanned multiple rows to show and enforce the precedence constraints between tasks. Moving a fence due to the delay of one task required one to delay all subsequent dependent tasks as well.

Also of interest is the *line of balance*, used for determining how far ahead (or behind) a shop might be at producing a number of identical assemblies required over time. Given the demand for end items and a bill-of-materials with lead times for making components and completing subassemblies, one can calculate the cumulative number of components, subassemblies, and end items that should be complete at a point in time to meet the demand. This line of balance is used on a progress chart that compares these numbers to the number of components, subassemblies, and end items actually done by that point in time (See Figure 1-2). The underlying logic is similar to that used by MRP systems, though this author is unaware of any scheduling system that use a line of balance chart today. More examples can be found in O’Brien (1969) and *Production Scheduling* (1973).

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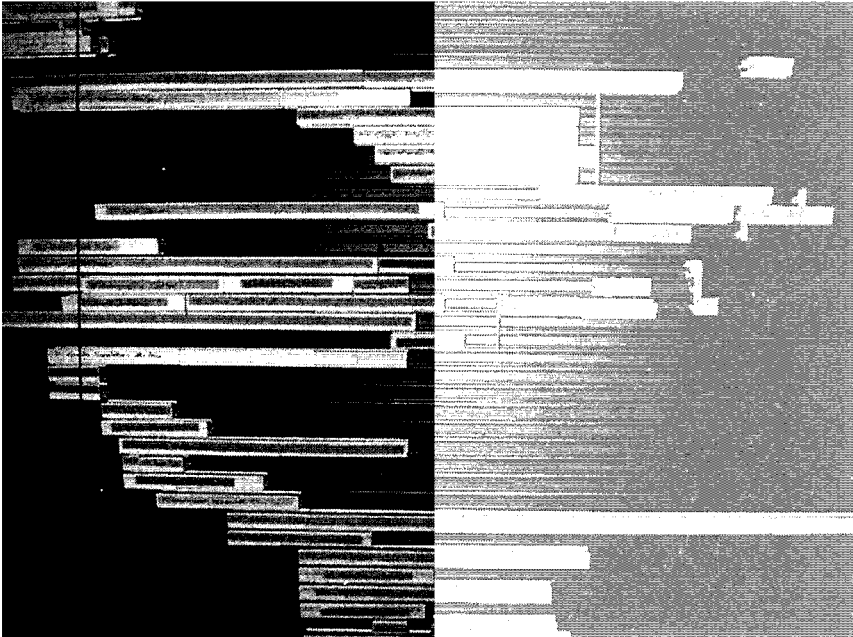


Figure 1-1. Detail of a Planalog control board (photograph by Brad Brochtrup).

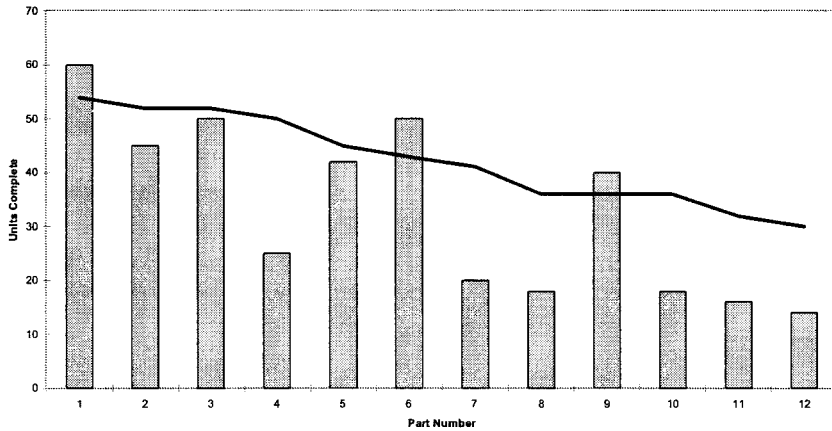


Figure 1-2. A line of balance progress chart (based on O'Brien, 1969). The vertical bars show, for each part, the number of units completed to date, and the thick line shows the number required at this date to meet planned production.

4. FROM CPM TO MRP: COMPUTERS START SCHEDULING

Unlike production scheduling in a busy factory, planning a large construction or systems development project is a problem that one can formulate and try to optimize. Thus, it is not surprising that large project scheduling was the first type of scheduling to use computer algorithms successfully.

4.1 Project scheduling

O'Brien (1969) gives a good overview of the beginnings of the critical path method (CPM) and the Performance Evaluation and Review Technique (PERT). Formal development of CPM began in 1956 at Du Pont, whose research group used a Remington Rand UNIVAC to generate a project schedule automatically from data about project activities.

In 1958, PERT started in the office managing the development of the Polaris missile (the U.S. Navy's first submarine-launched ballistic missile). The program managers wanted to use computers to plan and monitor the Polaris program. By the end of 1958, the Naval Ordnance Research Calculator, the most powerful computer in existence at the time, was

programmed to implement the PERT calculations. Both CPM and PERT are now common tools for project management.

4.2 Production scheduling

Computer-based production scheduling emerged later. Wight (1984) lists three key factors that led to the successful use of computers in manufacturing:

1. IBM developed the Production Information and Control System starting in 1965.
2. The implementation of this and similar systems led to practical knowledge about using computers.
3. Researchers systematically compared these experiences and developed new ideas on production management.

Early computer-based production scheduling systems used input terminals, centralized computers (such as an IBM 1401), magnetic tape units, disk storage units, and remote printers (O'Brien, 1969). Input terminals read punch cards that provided data about the completion of operations or material movement. Based on this status information, the scheduling computer updated its information, including records for each machine and employee, shop order master lists, and workstation queues. From this data, the scheduling computer created, for each workstation, a dispatch list (or "task-to-be-assigned list") with the jobs that were awaiting processing at that workstation. To create the dispatch list, the system used a rule that considered one or more factors, including processing time, due date, slack, number of remaining operations, or dollar value. The dispatcher used these lists to determine what each workstation should do and communicate each list to the appropriate personnel. Typically, these systems created new dispatch lists each day or each shift. Essentially, these systems automated the data collection and processing functions in existence since Taylor's day.

Interactive, computer-based scheduling eventually emerged from various research projects to commercial systems. Godin (1978) describes many prototype systems. An early interactive computer-based scheduling program designed for assembly line production planning could output graphs of monthly production and inventory levels on a computer terminal to help the scheduling personnel make their decisions (Duersch and Wheeler, 1981). The software used standard strategies to generate candidate schedules that the scheduling personnel modified as needed. The software's key benefit was to reduce the time needed to develop a schedule. Adelsberger and Kanet (1991) use the term *leitstand* to describe an interactive production scheduling decision support system with a graphical display, a database, a schedule generation routine, a schedule editor, and a schedule evaluation

routine. By that time, commercial leitstands were available, especially in Germany. The emphasis on both creating a schedule and monitoring its progress (planning and control) follows the principles of Henry Gantt. Similar types of systems are now part of modern manufacturing planning and control systems and ERP systems.

Computer-based systems that could make scheduling decisions also appeared. Typically, such systems were closely connected to the shop floor tracking systems (now called manufacturing execution systems) and used dispatching rules to sequence the work waiting at a workstation. Such rules are based on attributes of each job and may use simple sorting or a series of logical rules that separate jobs into different priority classes.

The Logistics Management System (LMS) was an innovative scheduling system developed by IBM for its semiconductor manufacturing facilities. LMS began around 1980 as a tool for modeling manufacturing resources. Modules that captured data from the shop floor, retrieved priorities from the daily optimized production plan (which matched work-in-process to production requirements and reassigned due dates correspondingly), and made dispatching decisions were created and implemented around 1984. When complete, the system provided both passive decision support (by giving users access to up-to-date shop floor information) and proactive dispatching, as well as issuing alerts when critical events occurred. Dispatching decisions were made by combining the scores of different “advocates” (one might call them “agents” today). Each advocate was a procedure that used a distinct set of rules to determine which action should be done next. Fordyce et al. (1992) provide an overview of the system, which was eventually used at six IBM facilities and by some customers (Fordyce, 2005).

Computer-based scheduling systems are now moving towards an approach that combines dispatching rules with finite-capacity production schedules that are created periodically and used to guide the dispatching decisions that must be made in real time.

4.3 Production planning

Meanwhile, computers were being applied to other production planning functions. Material requirements planning (MRP) translates demand for end items into a time-phased schedule to release purchase orders and shop orders for the needed components. This production planning approach perfectly suited the computers in use at the time of its development in the 1970s. MRP affected production scheduling by creating a new method that not only affected the release of orders to the shop floor but also gave schedulers the

ability to see future orders, including their production quantities and release dates. Wight (1984) describes MRP in detail.

The progression of computer-based manufacturing planning and control systems went through five distinct stages each decade from the 1960s until the present time (Rondeau and Litteral, 2001). The earliest systems were reorder point systems that automated the manual systems in place at that time. MRP was next, and it, in turn, led to the rise of manufacturing resources planning (MRP II), manufacturing execution systems (MES), and now enterprise resource planning (ERP) systems. For more details about modern production planning systems, see, for instance, Vollmann, Berry, and Whybark (1997).

4.4 The implementation challenge

Modern computer-based scheduling systems offer numerous features for creating, evaluating, and manipulating production schedules. (Seyed, 1995, provides a discussion on how to choose a system.) The three primary components of a scheduling system are the database, the scheduling engine, and the user interface (Yen and Pinedo, 1994). The scheduling system may share a database with other manufacturing planning and control systems such as MRP or may have its own database, which may be automatically updated from other systems such as the manufacturing execution system. The user interface typically offers numerous ways to view schedules, including Gantt charts, dispatch lists, charts of resource utilization, and load profiles. The scheduling engine generates schedules and may use heuristics, a rule-based approach, optimization, or simulation.

Based on their survey of hundreds of manufacturing facilities, LaForge and Craighead (1998) conclude that computer-based scheduling can be successful if it uses finite scheduling techniques and if it is integrated with the other manufacturing planning systems. Computer-based scheduling can help manufacturers improve on-time delivery, respond quickly to customer orders, and create realistic schedules. Finite scheduling means using actual shop floor conditions, including capacity constraints and the requirements of orders that have already been released. However, only 25% of the firms responding to their survey used finite scheduling for part or all of their operations. Only 48% of the firms said that the computer-based scheduling system received routine automatically from other systems, while 30% said that a “good deal” of the data are entered manually, and 21% said that all data are entered manually. Interestingly, 43% of the firms said that they regenerated their schedules once each day, 14% said 2 or 3 times each week, and 34% said once each week.

More generally, the challenge of implementing effective scheduling systems remains, as it did in Gantt's day (see, for instance, Yen and Pinedo, 1994, or Ortiz, 1996). McKay and Wiers (2005) argue that implementation should be based on the amount of uncertainty and the ability of the operators in the shop to recover from (or compensate for) disturbances. These factors should be considered when deciding how the scheduling system should handle uncertainty and what types of procedures it should use.

5. BETTER SCHEDULING ALGORITHMS

Information technology has had a tremendous impact on how production scheduling is done. Among the many benefits of information technology is the ability to execute complex algorithms automatically. The development of better algorithms for creating schedules is thus an important part of the history of production scheduling. This section gives a brief overview that follows the framework presented by Lenstra (2005). Books such as Pinedo (2005) can provide a more detailed review as well as links to surveys of specific subareas.

5.1 Types of algorithms

Linear programming was developed in the 1940s and applied to production planning problems (though not directly to production scheduling). George Dantzig invented the simplex method, an extremely powerful and general technique for solving linear programming problems, in 1947.

In the 1950s, research into sequencing problems motivated by production scheduling problems led to the creation of some important algorithms, including Johnson's rule for the two-machine flowshop, the earliest due date (EDD) rule for minimizing maximum lateness, and the shortest processing time (SPT) rule for minimizing average flow time (and the ratio variant for minimizing weighted flow time).

Solving more difficult problems required a different approach. Branch-and-bound techniques appeared around 1960. These algorithms implicitly enumerated all the possible solutions and found an optimal solution. Meanwhile, Lagrangean relaxation, column generation techniques for linear programming, and constraint programming were developed to solve integer programming problems.

The advent of complexity theory in the early 1970s showed why some scheduling problems were hard. Algorithms that can find optimal solutions to these hard problems in a reasonable amount of time are unlikely to exist.

Since decision-makers generally need solutions in a reasonable amount of time, search algorithms that could find near-optimal solutions became more important, especially in the 1980s and 1990s. These included local search algorithms such as hillclimbing, simulated annealing, and tabu search. Other innovations included genetic algorithms, ant colony optimization, and other evolutionary computation techniques. Developments in artificial intelligence led to agent-based techniques and rule-based procedures that mimicked the behavior of a human organization.

5.2 The role of representation

Solving a difficult problem is often simplified by representing it in the appropriate way. The representation may be a transformation into another problem that is easy to solve. More typically, the representation helps one to find the essential relationships that form the core of the challenge. For instance, when adding numbers, we place them in a column, and the sum is entered at the bottom. When doing division, however, we use the familiar layout of a long division problem, with the divisor next to the dividend, and the quotient appears above the bar. For more about the importance of representation in problem-solving, see Simon (1981), who discussed the role of representation in design.

Solving scheduling problems has been simplified by the use of good representations. Modern Gantt charts are a superior representation for most traditional scheduling problems. They clearly show how the sequence of jobs results in a schedule, and they simplify evaluating and modifying the schedule.

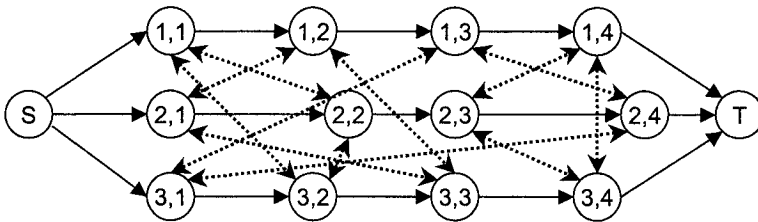


Figure 1-3. A disjunctive graph for a three-job, four-machine job shop scheduling problem.

MacNiece (1951) gives a beautiful example of using a Gantt chart to solve a scheduling problem. The problem is to determine if an order for an assembly can be completed in 20 weeks. The Gantt chart has a row for each machine group and bars representing already planned work to which he adds the operations needed to complete the order. He argues that using a Gantt chart is a much quicker way to answer the question.

Gantt charts continue to be refined in attempts to improve their usefulness. Jones (1988) created an innovative three-dimensional Gantt chart that gives each of the three key characteristics (jobs, machines, and time) its own axis.

Another important representation is the disjunctive graph, which was introduced by Roy and Sussmann (1964). The disjunctive graph is an excellent way to represent the problem of minimizing the makespan of a job shop scheduling problem (see Figure 1-3). Note that this representation represents each activity with a node. (Activity-on-arc representations have been used elsewhere.) The dashed edges in the graph represent the precedence constraints between tasks that require the same resource. Thus, these show the decisions that must be made. When the disjunctive arcs have been replaced with directed arcs, the graph provides a way to calculate the makespan. This representation also inspired many new algorithms that use this graph.

6. ADVANCED SCHEDULING SYSTEMS

Advances in information technology have made computer-based scheduling systems feasible for firms of all sizes. While many have not taken advantage of them (as discussed above), some firms have created advanced systems that use innovative algorithms. Each of these systems formulates the problem in a unique way that reflects each firm's specific scheduling objectives, and the system collects, processes, and generates information as part of a larger system of decision-making.

This section highlights the diversity of the approaches used to solve these scheduling problems. Many years of research on optimization methods have created a large set of powerful algorithms that can be applied to generate schedules, from mathematical programming to searches that use concepts from artificial intelligence.

6.1 Mathematical programming

An aluminum can manufacturing facility uses mathematical programming to create a weekly schedule (Katok and Ott, 2000). The can

plant uses six production lines, each of which can make up to one million cans in an eight-hour shift. The cans are used by three filling plants. Each week the can plant must decide what to produce, where to store inventory, and how to satisfy demand (from inventory or production). A changeover is required when a production line switches from one can label to another. These changeovers are undesirable due to the scrap that is created and the downtime incurred. The problem of minimizing total production cost subject to satisfying demand and capacity constraints is a type of multi-level capacitated lot-sizing problem. It was formulated as a mixed-integer program and can be solved using GAMS in less than one minute.

One of the world's largest underground mines uses a mathematical programming approach to develop long-term production schedules (Newman et al., 2005). The mining operations, which began over 100 years ago, now yield nearly 24 million tons of iron ore each year. The production scheduling problem is to determine, for the next five years, which parts of the mine should be mined each month. Different parts of the mine contain different amounts of three ore types. The objective is to minimize the total deviation from the amount of each type of ore desired each month. The mixed-integer problem formulation includes constraints that reflect the nature of the mining operations and the resources available. Because the problem has nearly 66,000 binary variables, the scheduling system uses specialized algorithms to remove and aggregate the decision variables and add additional constraints. This resulting problem, programmed in AMPL, has 700 integer variables and can be solved using CPLEX in about five minutes.

6.2 Other solution approaches

Mathematical programming is not the only approach for solving scheduling problems. Approaches based on concepts from artificial intelligence and other areas of operations research can also be successful.

A Japanese steel plant uses a rule-based *cooperative scheduling* approach to create production schedules for three converters, nine sets of refining equipment, and five continuous casters, which together process up to 15,000 tons of steel each day (Numao, 1994). The unit of production is a 300-ton charge. Subschedules for a set of similar charges are backwards scheduled from casting, the bottleneck operation. The scheduling engine then merges the subschedules, which may be overlapping, and resolves any conflicts. The scheduling engine uses the rules in the rule base to satisfy a variety of general and domain-specific constraints. The scheduling system was designed to allow the user to modify the schedule at any point during the process, but especially after the scheduling engine merges the subschedules.

The system, implemented in a rule-based language, reduced the time needed to create a daily schedule from 3 hours to 30 minutes.

To solve the slab design problem, a different large steel plant uses a scheduling heuristic based on matching and bin packing (Dawande et al., 2005). Steel slabs are about 0.2 meters thick, 2 meters wide, and 12 meters long. They weigh between 15 and 40 tons. Steel slabs are used to create steel coils and sheets, and a single slab can be used to satisfy more than one customer order. The slab design problem is to determine the number of slabs that need to be produced, to specify each slab's size, and to assign orders to the slabs. Orders that require the same grade of steel and the same surface finish can be assigned to the same slab. The scheduling objective is to minimize the number of slabs and to minimize surplus weight. The scheduling engine (programmed using C++) can find good solutions in a few minutes.

Kumar et al. (2005) presents an innovative optimization algorithm to create cyclic schedules for robotic cells used in semiconductor manufacturing. The firm that manufactures these cells can use the algorithm to find a sequence of robot moves that maximizes that particular cell's capacity. The algorithm, which finds least common multiple cycles, uses a genetic algorithm to search the set of robot move cycles, while linear programming is used to evaluate each cycle. The algorithm requires a few minutes to find a near-optimal solution for complex robotic cells with 16 stations.

6.3 It takes a system

As mentioned earlier in this chapter, a scheduling system includes much more than the scheduling engine. Links to corporate databases are needed to extract information automatically. User interfaces are needed for the scheduling personnel to enter and update data, to view and modify schedules, and generate reports.

Sophisticated mathematical programming techniques use software that scheduling personnel do not understand. Thus, it is necessary to construct user interfaces that use terms and concepts that are familiar. These can be programmed from the ground up, or one can use common office software as the interface. For example, the can plant scheduling system mentioned above uses an Excel-based interface for entering data.

It is also important to note that developing a scheduling system requires carefully formulating a problem that includes the plant-specific constraints, validating the problem formulation, and creating specialized algorithms to find solutions using a reasonable amount of computational effort.

7. CONCLUSIONS

Since the separation that established production scheduling as a distinct production management function, the large changes in production scheduling are due to two key events. The first is Henry Gantt's creation of useful ways to understand the complex relationships between men, machines, orders, and time. The second is the overwhelming power of information technology to collect, visualize, process, and share data quickly and easily, which has enhanced all types of decision-making processes. These events have led, in most places, to the decline of shop foremen, who used to rule factories, and to software systems and optimization algorithms for production scheduling.

The bad news is that many manufacturing firms have not taken advantage of these developments. They produce goods and ship them to their customers, but the production scheduling system is a broken collection of independent plans that are frequently ignored, periodic meetings where unreliable information is shared, expeditors who run from one crisis to another, and ad-hoc decisions made by persons who cannot see the entire system. Production scheduling systems rely on human decision-makers, and many of them need help.

This overview of production scheduling methods should be useful to those just beginning their study of production planning and control. In addition, practitioners and researchers should use this chapter to consider what has been truly useful to improve production scheduling practice in the real-world.

REFERENCES

- Adelsberger, H., Kanet, J., 1991, "The Leitstand - A New Tool for Computer Integrated Manufacturing," *Production and Inventory Management Journal*, **32**(1):43-48.
- Binsse, H.L., 1887, "A short way to keep time and cost," *Transactions of the American Society of Mechanical Engineers*, **9**:380-386.
- Clark, W., 1942, *The Gantt Chart, a Working Tool of Management*, second edition, Sir Isaac Pitman & Sons, Ltd., London.
- Cox, J.F., Blackstone, J.H., and Spencer, M.S., 1992, *APICS Dictionary*, American Production and Inventory Control Society, Falls Church, Virginia.
- Dawande, M., Kalagnanam, J., Lee, H. S., Reddy, C., Siegel, S., and Trumbo, M., 2005, in *Handbook of Production Scheduling*, Herrmann J.W., ed., Springer, New York.
- Duersch, R.R., and Wheeler, D.B., 1981, "An interactive scheduling model for assembly-line manufacturing," *International Journal of Modelling & Simulation*, **1**(3):241-245.
- Fordyce, K., 2005, personal communication.

- Fordyce, K., Dunki-Jacobs, R., Gerard, B., Sell, R., and Sullivan, G., 1992, "Logistics Management System: an advanced decision support system for the fourth tier dispatch or short-interval scheduling," *Production and Operations Management*, **1**(1):70-86.
- Gantt, H.L., 1903, "A graphical daily balance in manufacture," *Transactions of the American Society of Mechanical Engineers*, **24**:1322-1336.
- Gantt, H.L., 1916, *Work, Wages, and Profits*, second edition, Engineering Magazine Co., New York. Reprinted by Hive Publishing Company, Easton, Maryland, 1973.
- Gantt, H.L., 1919, *Organizing for Work*, Harcourt, Brace, and Howe, New York. Reprinted by Hive Publishing Company, Easton, Maryland, 1973.
- Godin, V.B., 1978, "Interactive scheduling: historical survey and state of the art," *AIIE Transactions*, **10**(3):331-337.
- Hopp, W.J., and Spearman, M.L., 1996, *Factory Physics*, Irwin/McGraw-Hill, Boston.
- Hounshell, D.A., 1984, *From the American System to Mass Production 1800-1932*, The Johns Hopkins University Press, Baltimore.
- Jones, C.V., 1988, "The three-dimensional gantt chart," *Operations Research*, **36**(6):891-903.
- Katok, E., and Ott, D., 2000, Using mixed-integer programming to reduce label changes in the Coors aluminum can plant, *Interfaces*, **30**(2):1-12.
- Kumar, S., Ramanan, N., and Sriskandarajah, C., 2005, "Minimizing cycle time in large robotic cells," *IIE Transactions*, **37**(2):123-136.
- LaForge, R.L., and Craighead, C.W., 1998, "Manufacturing scheduling and supply chain integration: a survey of current practice," American Production and Inventory Control Society, Falls Church, Virginia.
- Lenstra, J.K., 2005, "Scheduling, a critical biography," presented at the Second Multidisciplinary International Conference on Scheduling: Theory and Applications, July 18-21, 2005, New York.
- MacNiece, E.H., 1951, *Production Forecasting, Planning, and Control*, John Wiley & Sons, Inc., New York.
- McKay, K.N., 2003, Historical survey of manufacturing control practices from a production research perspective, *International Journal of Production Research*, **41**(3):411-426.
- McKay, K.N., and Wiers, V.C.S., 2004, *Practical Production Control: a Survival Guide for Planners and Schedulers*, J. Ross Publishing, Boca Raton, Florida. Co-published with APICS.
- McKay, K.N., and Wiers, V.C.S., 2005, The human factor in planning and scheduling, in *Handbook of Production Scheduling*, Herrmann J.W., ed., Springer, New York.
- Mitchell, W.N., 1939, *Organization and Management of Production*, McGraw-Hill Book Company, New York.
- Muther, R., 1944, *Production-Line Technique*, McGraw-Hill Book Company, New York.
- Newman, A., Martinez, M., and Kuchta, M., 2005, A review of long- and short-term production scheduling at LKAB's Kiruna mine, in *Handbook of Production Scheduling*, Herrmann J.W., ed., Springer, New York.
- Numao, M., 1994, Development of a cooperative scheduling system for the steel-making process, in *Intelligent Scheduling*, Zweben, M., and Fox, M.S., eds., Morgan Kaufmann Publishers, San Francisco.
- O'Brien, J.J., 1969, *Scheduling Handbook*, McGraw-Hill Book Company, New York.
- Ortiz, C., 1996, "Implementation issues: a recipe for scheduling success," *IIE Solutions*, March, 1996, 29-32.
- Pinedo, M., 2005, *Planning and Scheduling in Manufacturing and Services*, Springer, New York.

- Porter, D.B., 1968, "The Gantt chart as applied to production scheduling and control," *Naval Research Logistics Quarterly*, **15**(2):311-318.
- Production Scheduling*, 1973, American Institute of Certified Public Accountants, New York.
- Rondeau, P.J., and Litteral, L.A., 2001, "Evolution of manufacturing planning and control systems: from reorder point to enterprise resource planning," *Production and Inventory Management Journal*, Second Quarter, 2001:1-7.
- Roscoe, E.S., and Freark, D.G., 1971, *Organization for Production*, fifth edition, Richard D. Irwin, Inc., Homewood, Illinois.
- Roy, B., and Sussmann, B., 1964, "Les problems d'ordonnancement avec contraintes disjonctives." Note DS No. 9 bis, SEMA, Montrouge.
- Seyed, J., 1995, "Right on schedule," *OR/MS Today*, December, 1995:42-44.
- Simon, H.A., 1981, *The Sciences of the Artificial*, second edition, MIT Press, Cambridge, Massachusetts.
- Skinner, W., 1985, The taming of the lions: how manufacturing leadership evolved, 1780-1984, in *The Uneasy Alliance*, Clark, K.B., Hayes, R.H., and Lorenz, C., eds., Harvard Business School Press, Boston.
- Vieira, G.E., Herrmann, J.W., and Lin, E., 2003, Rescheduling manufacturing systems: a framework of strategies, policies, and methods," *Journal of Scheduling*, **6**(1):35-58.
- Vollmann, T.E., Berry, W.L., and Whybark, D.C., 1997, *Manufacturing Planning and Control Systems*, fourth edition, Irwin/McGraw-Hill, New York.
- Wight, O.W., 1984, *Production and Inventory Management in the Computer Age*, Van Nostrand Reinhold Company, Inc., New York.
- Wilson, J.M., 2000a, "History of manufacturing management," in *Encyclopedia of Production and Manufacturing Management*, Paul M. Swamidass, ed., Kluwer Academic Publishers, Boston.
- Wilson, J.M., 2000b, "Scientific management," in *Encyclopedia of Production and Manufacturing Management*, Paul M. Swamidass, ed., Kluwer Academic Publishers, Boston.
- Yen, B.P.-C., and Pinedo, M., "On the design and development of scheduling systems," Proceedings of the Fourth International Conference on Computer Integrated Manufacturing and Automation Technology, October 10-12, 1994:197-204.



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