

Data-Driven System to Analyze Potential Constraints on Manufacturing Cycle Time

Priyanka Das

Manufacturing Engineer, Cincinnati USA

Priyanka14das@gmail.com

Abstract:

This paper provides a detailed exploration of five common bottlenecks in manufacturing: machine downtime, material availability, workforce problems, production control variability, and inadequate layout and workflow. Reducing manufacturing cycle time is a strategic goal that can help companies achieve efficiency and become more reliable, less costly, and satisfy their customers' demands. However, production process congestion or delay points—bottlenecks—present a significant problem to smooth operations. The paper explores each bottleneck's description, root causes, and corresponding data analysis solutions. The report established that analyzing such vital technologies as predictive maintenance, real-time inventory management, human capital management, statistical process control, and simulation modeling demonstrates how some business limitations can be managed by using data-driven techniques. Manufacturers should, therefore, ensure that they diagnose manufacturing cycle times early enough to avoid bottlenecks. The paper further highlighted that early detection and addressing of the bottlenecks increase the cycle times, support maximum productivity, and enable firms to compete effectively. The report acknowledges that using data analytics to redesign efficient and robust manufacturing systems is critical in minimizing manufacturing cycle times.

Keywords: Bottlenecks, Manufacturing, Operations, Production, Process Congestion

1. Introduction

Time and operational efficiency is a critical measure of performance in a manufacturing environment. Manufacturing cycle time, the timeframe taken to complete product production from conception to completion, is a significant determinant of operations performance, customer satisfaction, and cost containment. Nonetheless, bottlenecks - production process congestion or delay points within the manufacturing process—disrupt operations, halt the process, add overhead expenses, and restrict the process efficiency. Research affirms that “The duration of bottlenecks and extent of their inflationary effects depend on the persistence of their underlying drivers and firms' expectations about this persistence” [6]. Understanding these bottlenecks, including their root cause and possible solutions, in a data-driven approach is crucial to revealing the paths toward minimizing their occurrence in the production cycle.

2. Machine Downtime

One of the primary issues in manufacturing environments is machine downtime, which affects the reliability of processes. The downtimes can be planned or unplanned and involve equipment breakdowns

or when the equipment must be taken offline for maintenance. Such considerations disrupt the production process and the entire manufacturing line.

Bottleneck Analysis

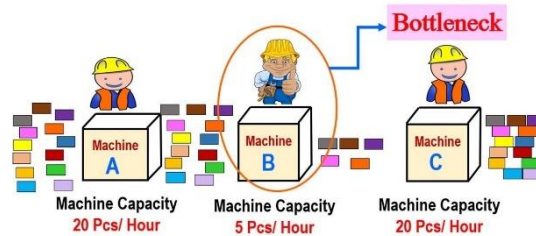


Fig. 1: Understanding bottleneck analysis

An unplanned downtime can be unpredictable, interfering with timelines and the ability to meet orders' required delivery times [7]. Such concerns lead to unsatisfied customers and decreased organizational performance. Machine downtime can result from poorly maintained equipment, reliance on old appliances, and the need for proper maintenance schedules [6]. Some organizations operate under the ‘fix it when it breaks’ mentality. Nonetheless, such strategies can increase the repair expenses and duration of a machine’s downtime, thus deepening the problem.

The solution for machine downtime is data-driven predictive maintenance. By integrating monitoring sensors into machines where performance metrics such as vibration, temperature, and usage rates are detected, manufacturers can benefit from machine learning algorithms to obtain failure predictions [4]. This also means that maintenance can be planned in advance to reduce idle time, hence using up the equipment’s life cycle to get more manufacturing cycle times.

3. Material Shortages and Supply Chain Delays

Whenever the arrival of raw materials or a component is delayed, manufacturing lines get affected, and workers and machinery remain idle. This slows down the production process and increases overhead costs due to the underutilization of resources. The problem arises majorly from inefficient inventory management techniques and unreliable supply chain partners [1]. Most manufacturers also experience poor demand forecasting, resulting in issues such as overstocking and stock-out.

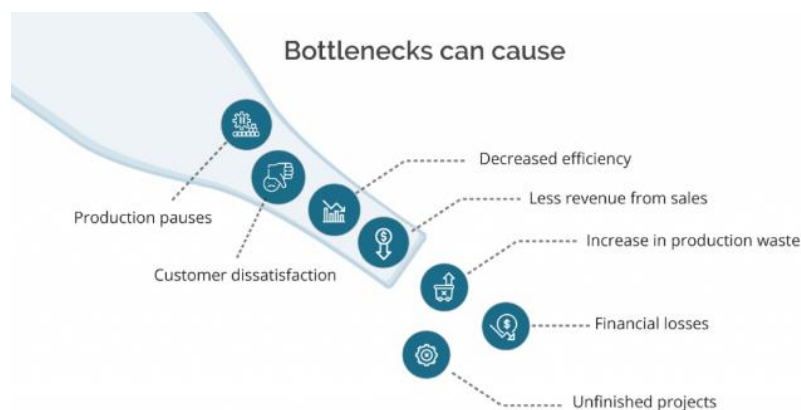


Fig. 2: Implications of bottlenecks

External factors like supplier delays, transportation inconveniences, or the occurrence of a global supply chain disruption further influence material shortage concerns.

The best approach for avoiding this bottleneck is implementing real-time inventory tracking systems compatible with supply chain analytics. These systems help manufacturers track inventory status, anticipate future variations in demand, and facilitate orders. Data-driven supplier performance analysis is also vital as it allows firms to select stable suppliers, allowing consistent and timely material delivery [5]. The move further eliminates potential delays associated with the supply chain.

4. Workforce-Related Bottlenecks

Inadequate number of employees, human resource staff, skill and expertise gaps, or assigning the wrong tasks to employees reduces the workflow rate. Consequently, high-level specialization tasks can cause a project to be stuck in one or many phases long when the required expertise is unavailable [8]. Furthermore, insufficient human resources can lead to overworked staff, making them vulnerable to errors in the production line or decreasing their productivity and reliability.

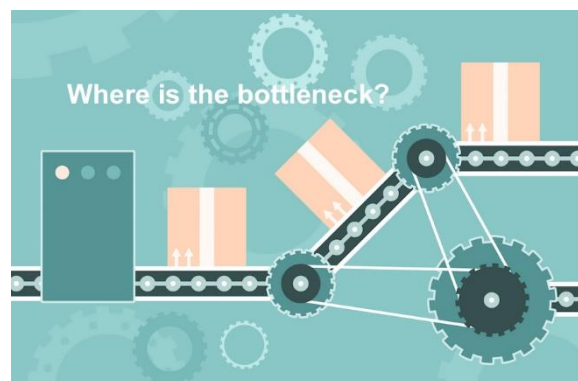


Fig. 3: Workflow bottlenecks

The workforce-related bottleneck is attributed to poor staff planning and an insufficient training program in the organization. Failure to forecast is a common problem among manufacturers, as it is hard to accurately estimate the required labor force, especially for periods of high productive activity [9]. Besides, limited training emphasis on the staff results in skill mismatch, preventing them from optimal task execution. Therefore, the solution to such a concern is to utilize workforce analytics, influencing the firm to make the right decision on staffing and training and thus increasing productivity [12]. Manufacturers can better organize the workforce requirements by analyzing historical production records in advance. In training programs, firms can rely on skills gap analysis to ensure employees are prepared for various responsibilities, reduce time wastage and skill mismatch, and enhance business operations and workflow efficiency.

5. Process Variability (West)

The bottleneck results from inconsistencies in production processes due to the variability in process cycle times. According to research on data-driven dynamic bottleneck detections, "Production systems are stochastic and dynamically changing. Therefore, the bottleneck location is usually non-static and will shift over time. Analyzing the transient (shifting) bottlenecks help managers to understand the dynamics of production systems" [4]. Process variabilities can cause undetected errors in the production line, resulting

in resource wastage and delays [6]. Additionally, inconsistent production methods can attract unexpected process output in the manufacturing line. Variation in the processes can also result from poor control structures or deviations brought by a lack of well-defined standards.

Statistics process control (SPC) and real-time monitoring systems are widely used tools to improve process variability. These systems collect and analyze production data to understand which patterns are normal and which are not [3]. Minimizing variation must be the goal of all manufacturing organizations, and by instituting standard work procedures and dealing with variability as it occurs, improved processes and reduced cycle times emerge.

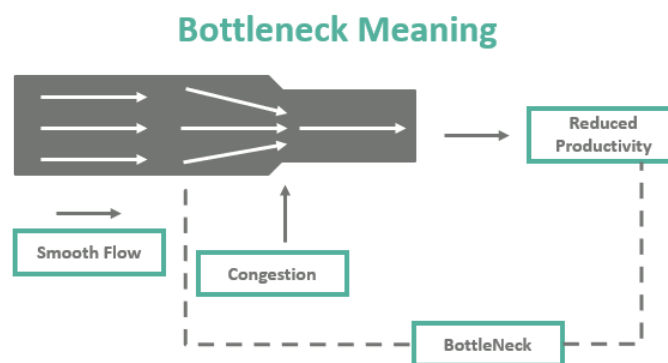


Fig. 4: Bottleneck concept

6. Inefficient Layout and Workflow

Inefficient positioning of the facilities and workflow design contribute to physical congestion through restricted mobility of material, equipment, and staff. For example, long distances between workstations or storage areas may lead to increased transit times, decreasing overall productivity. These arise from improper planning during facility setting or a lack of conducive evaluation of the layout to realize that the existing items do not meet the needs of the company’s production requirements, especially when there are changes in the production lines [11]. With time, there may be changes in product types and the overall production capacity, resulting in space overcrowding, which forces layout changes.

Overcoming inefficient layouts and workflows requires the use of process-mapping tools and simulation models. Manufacturers can use such solutions to redesign workflows and maximize operational efficiencies. From material and personnel traffic data, one can pinpoint organizational problem areas and try out layout changes virtually with minimal disruption before implementing the improvements [10]. The above approach ensures space organization and avoids unnecessary movements in the manufacturing zones, enhancing production speed [2].

7. Conclusion

Bottlenecks in the manufacturing process remain a key obstacle to cycle time optimization. Although applying data-driven techniques opens up great opportunities for optimizing operations, every approach must follow due diligence for the utmost outcomes. Various factors, including machinery downtimes, material shortages, workforce productivity constraints, process fluctuations, and inefficient layout design, affect the improvement of bottleneck approaches in manufacturing. The primary technologies for overcoming such concerns include predictive maintenance, real-time monitoring, workforce analytics, and simulation, enabling effective identification and elimination of bottlenecks. In turn, these strategies

contribute to shorter production cycles, reduced overhead costs, and enhanced competitive advantage in the world market.

References

1. Celasun, Oya, et al. "Supply Bottlenecks: Where, Why, How Much, and What Next?" *International Monetary Fund*, 2022.
2. Ani, Mohd Norzaimi Che, and Ishak Abdul Azid. "Solving the Production Bottleneck Through Minimizing the Waste of Motion for Manual Assembly Processes." *Advanced Structured Materials*, 2020, pp. 185–97. https://doi.org/10.1007/978-3-030-46036-5_17.
3. He, Q. Peter, and Jin Wang. "Statistical process monitoring as a big data analytics tool for smart manufacturing." *Journal of Process Control*, 67, 2018, pp. 35-43. <https://doi.org/10.1016/j.jprocont.2017.06.012>
4. Lai, Xingjian, et al. "Data-driven Dynamic Bottleneck Detection in Complex Manufacturing Systems." *Journal of Manufacturing Systems*, vol. 60, July 2021, pp. 662–75. <https://doi.org/10.1016/j.jmsy.2021.07.016>.
5. Nandakumar, Nikhil, et al. "Bottleneck Identification and Process Improvement by Lean Six Sigma DMAIC Methodology." *Materials Today Proceedings*, vol. 24, Jan. 2020, pp. 1217–24. <https://doi.org/10.1016/j.matpr.2020.04.436>.
6. Rees, Daniel, and Phurichai Rungcharoenkitkul. "Bottlenecks: causes and macroeconomic implications." *BIS Bulletin*, 48, 2021, pp. 1-4. https://www.bis.org/publ/bisbull48_appendix.pdf.
7. Rocha, Eugénio M., and Maria J. Lopes. "Bottleneck Prediction and Data-driven Discrete-event Simulation for a Balanced Manufacturing Line." *Procedia Computer Science*, vol. 200, Jan. 2022, pp. 1145–54. <https://doi.org/10.1016/j.procs.2022.01.314>.
8. Rosso, Stefano, et al. "An Optimization Workflow in Design for Additive Manufacturing." *Applied Sciences*, vol. 11, no. 6, Mar. 2021, p. 2572. <https://doi.org/10.3390/app11062572>.
9. Schwemmer, Julia, and Thorsten Schmidt. "Workforce Engagement Within Decentrally Controlled Production Systems." *CRC Press eBooks*, 2023, pp. 240–54. <https://doi.org/10.1201/9781003327523-17>.
10. Subramaniyan, Mukund, et al. "A Generic Hierarchical Clustering Approach for Detecting Bottlenecks in Manufacturing." *Journal of Manufacturing Systems*, vol. 55, Mar. 2020, pp. 143–58. <https://doi.org/10.1016/j.jmsy.2020.02.011>.
11. Wang, Ling, et al. "A Review of Reinforcement Learning Based Intelligent Optimization for Manufacturing Scheduling." *Complex System Modeling and Simulation*, vol. 1, no. 4, Dec. 2021, pp. 257–70. <https://doi.org/10.23919/csms.2021.0027>.
12. West, Nikolai, et al. "A Holistic Methodology for Successive Bottleneck Analysis in Dynamic Value Streams of Manufacturing Companies." *Lecture Notes in Mechanical Engineering*, 2021, pp. 612–19. https://doi.org/10.1007/978-3-030-90700-6_69.