



## IMPORTANCE OF LEAN SIX SIGMA IN THE PHARMACEUTICAL INDUSTRY: RELEVANCE IN AN AI-DRIVEN WORLD; HARMONIZING EFFICIENCY OF LEAN SIX SIGMA AND AI

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### ABSTRACT

In the swiftly progressing pharmaceutical industry, Lean Six Sigma (LSS) continues to clasp significant relevance in spite of the advent of artificial intelligence (AI). This review's primary goal is to examine how important LSS is for increasing operational effectiveness, cutting expenses, and guaranteeing adherence to strict legal standards. LSS approaches continue to be crucial for upholding strict quality standards and ongoing development as pharmaceutical businesses embrace AI technologies more and more. This study will show how Lean Six Sigma is still an essential tool for quality control, waste reduction, and fostering innovation in pharmaceutical manufacturing through a thorough analysis of numerous Pharmaceutical industry articles.

**KEYWORDS:** LLS: Lean Six Sigma AI: Artificial Intelligence.

### Historical Context

Lean Six Sigma was first created in the manufacturing sector and has since been modified for use in a variety of sectors, such as pharmaceuticals and healthcare. Since its rise to prominence in the 1980s, the approach has changed to take advantage of new technologies, especially data analytics.

### INTRODUCTION

In the pharmaceutical sector, Lean Six Sigma (LSS) has been a key component of process optimization. LSS has produced increased productivity, lower costs, and better product quality by fusing Six Sigma's emphasis on minimizing process variation with Lean's emphasis on waste reduction. LSS has been essential in meeting strict quality standards in

highly regulated workplaces, such as those governed by current Good Manufacturing Practices (cGMP).

With features including data-driven decision-making, process automation, and predictive analytics, artificial intelligence (AI) has become a disruptive technology in the pharmaceutical sector in recent years. But far from rendering LSS outdated, AI offers a chance to improve its techniques. Pharmaceutical businesses can further enhance processes while preserving crucial human control by incorporating AI within the structured framework of LSS. This article examines LSS's applicability in an AI-driven world, how it complements AI, and how this integration will influence pharmaceutical manufacture going forward.

### **The Importance of Lean Six Sigma in the Pharmaceutical Industry**

The pharmaceutical industry is highly regulated, making quality control essential. Lean Six Sigma has been crucial in maintaining product quality, ensuring compliance with regulations, and improving standard manufacturing practices. By using the fundamentals of Lean, which focuses on waste reduction, and Six Sigma, which minimizes variation, businesses can optimize manufacturing processes while eliminating errors and defects. The pharmaceutical industry is highly regulated, making quality control essential. Lean Six Sigma has been crucial in maintaining product quality, ensuring compliance with regulations, and improving standard manufacturing practices. By using the fundamentals of Lean, which focuses on waste reduction, and Six Sigma, which minimizes variation, businesses can optimize manufacturing processes while eliminating errors and defects.

LSS has a major effect on cost reduction and efficiency enhancement. Pharmaceutical firms may guarantee constant product quality and regulatory compliance by reducing rework and optimizing procedures. LSS has been crucial in preserving product safety, lowering risk, and guaranteeing that pharmaceutical products fulfill the necessary quality standards in a cGMP setting. Organizations can systematically handle variations thanks to this structured methodology, which is essential for the manufacture and distribution of drugs.

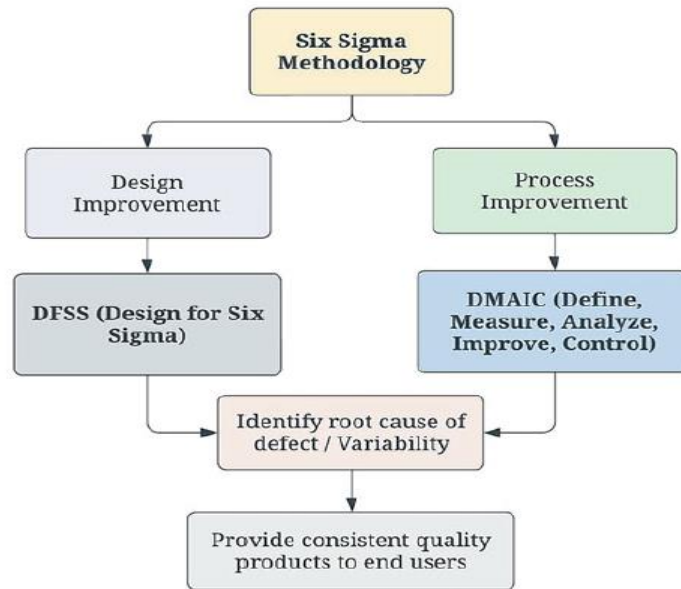
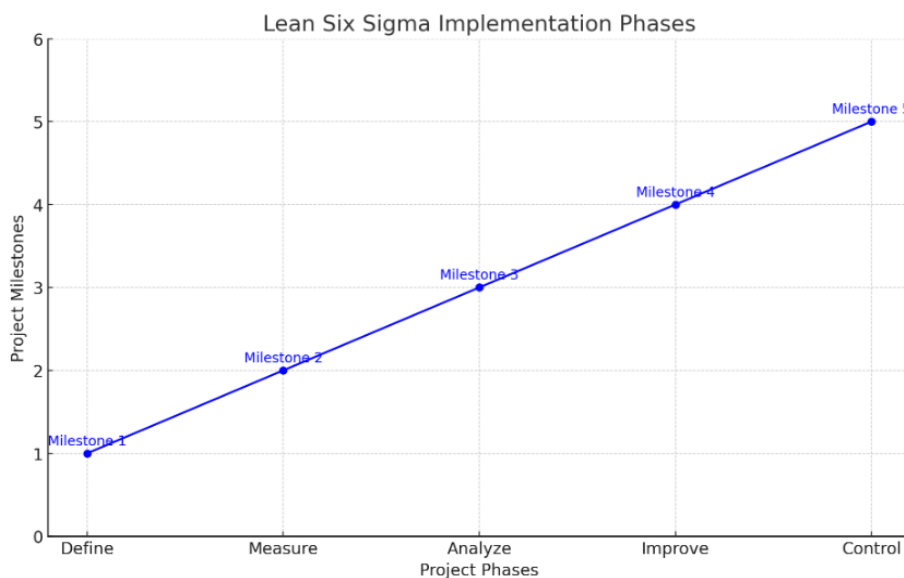


Diagram – 1: Six Sigma Model in Pharma Industry.

**Key Methodologies**

The Lean Six Sigma approach incorporates various methodologies and tools, including.

- **DMAIC (Define, Measure, Analyze, Improve, and Control):** This structured approach is fundamental for process improvement projects. It allows teams to identify root causes of problems, implement solutions, and maintain control over new processes.



Graph 1: Phases of Lean Six Sigma Implementation: This line graph shows project milestones and the DMAIC phases (Define, Measure, Analyze, Improve, and Control).

**Kaizen:** This principle supports uninterrupted expansion and involves all employees in the procedure of categorizing inefficiencies.

Other methods include,

- IDOV- Identify, Design, Optimize, Validate
- DMADV- Define, Measure, Analyze, Design, Verify
- DMEDI- Define, Measure, Explore, Develop, Implement
- ICOV- Identify, Characterize, Optimize, Validate
- DCCDI- Define, Customer Concept, Design, Implement
- DCOV- Define, Characterize, Optimize, Verify
- DMADO- Define, Measure, Analyze, Design, Optimize
- CDOV- Concept, Design, Optimize, Verify
- DIDOV- Define, Identify, Design, Optimize, Verify

### **The Role of AI in Pharmaceutical Manufacturing**

The pharmaceutical industry has seen a rapid transformation due to artificial intelligence. Predictive analytics, manufacturing automation, and better decision-making based on real-time data are all made possible by AI (Article 6). AI helps businesses improve drug discovery, speed up product development, and streamline quality control procedures by handling enormous data sets (Article 8).

Even though AI greatly increases operational efficiency, human interaction and systematic continuous improvement methods are still necessary. While machine learning algorithms can spot trends and inefficiencies, human judgment using frameworks like LSS is crucial for deciphering data and putting significant process improvements into action. Although AI can provide LSS with more sophisticated insights, human knowledge is still essential for successfully implementing these insights.

### **Synergy between LSS and AI**

Rather than viewing AI as a replacement for Lean Six Sigma, it is more accurate to consider AI as a complementary tool. The synergy between AI and LSS can lead to a more efficient, data-driven pharmaceutical manufacturing process. AI can handle complex data sets and identify areas where processes can be optimized, while LSS provides a roadmap for implementing changes based on this data.

It is more realistic to think about AI as a supplementary tool rather than as a replacement for Lean Six Sigma. The combination of AI and LSS may result in a data-driven, more effective pharmaceutical production process. LSS offers a roadmap for putting changes based on this data into practice, while AI can manage complicated data sets and pinpoint areas where processes may be optimized.

### **Case Studies: Positive Incorporation of LSS and AI.**

#### **Case Study: Johnson & Johnson in Operational Procedure.**

##### **Synopsis**

With a concentration on pharmaceuticals, medical equipment, and consumer health goods, Johnson & Johnson (J&J) is a world leader in the healthcare industry. To increase productivity and raise the caliber of its output, the business has incorporated Lean Six Sigma into its operational procedures.

##### **Application of Six Sigma Methods**

**Define Phase:** J&J determined the main issues with their production procedures, especially with regard to cutting cycle durations and raising yield rates.

**Measure Phase:** The business gathered information on production procedures, paying particular attention to process variances and defect rates.

**Analyze Phase:** Workflow and equipment utilization inefficiencies were discovered through root cause analysis.

**Improve Phase:** Workflow redesign, the adoption of standard operating procedures, and Lean Six Sigma training for staff were among the solutions.

**Control Phase:** J&J set up dashboards and control mechanisms to continuously track performance Indicators.

##### **RESULTS**

Cycle times were shortened by up to 25%, according to J&J, which demonstrated notable gains in manufacturing efficiency. The business also reported improved product quality, with over 30% fewer defects. By empowering staff members to see and address issues early on, Lean Six Sigma training promoted a continuous improvement culture.

**Case Study: Pfizer – in Supply Chain Optimization**

**Problem:** Pfizer had trouble accurately predicting demand and effectively managing its worldwide supply chain, which resulted in overstocking in certain areas and stock outs in others. This disparity led to delays in patient delivery of necessary medications, increased expenses, and inefficiencies.

**AI for Demand Forecasting:** Pfizer used an AI-powered forecasting model that examined market patterns, historical sales data, and outside variables like geopolitical events and seasonal illnesses. Pfizer was able to modify production and inventory levels in response to more precise demand estimates made possible by AI.

**Supply Chain Optimization:** By determining the best shipping routes, warehouse locations, and inventory levels at different distribution hubs, artificial intelligence (AI) was also utilized to optimize Pfizer's worldwide distribution network.

**RESULTS**

AI increased the accuracy of demand forecasts by 20%, which decreased overstocking and stock outs. Pfizer was able to improve inventory levels and streamline delivery routes, which resulted in a 15% reduction in supply chain expenses. Pfizer was able to react to worldwide health emergencies more rapidly thanks to a 12% reduction in the time to market for vaccinations and drugs.

**Boehringer Ingelheim: Optimization of the Supply Chain**

**Background:** To optimize their supply chain and guarantee on-time product delivery. Boehringer Ingelheim integrated AI and Lean Six Sigma.

**Application of AI:** To reduce excess inventory of shortages, supply chain optimization tools driven by AI forecasted demand and modified supply chain operations.

**Lean Six Sigma Implementation:** By emphasizing waste reduction and continuous improvement, Lean Six Sigma techniques were used to cut down on inefficiencies including shipment delays and needed handling.

**RESULTS:** Better inventory control, quicker product delivery, and lower operating expense were the outcomes of this. Boehringer Ingelheim-Supply Chain Optimization Background:

To optimize their supply chain and guarantee on-time product delivery, Boehringer Ingelheim integrated AI and Lean Six Sigma.

### **Sanofi: AI-powered process control and personalized medicine**

**Background:** To enhance the development of personalized medication and manufacturing process control, Sanofi integrated AI with Lean Six Sigma.

**Application of AI:** AI ensured exact control over manufacturing variables and assisted in the analysis of patient data to provide more individualized medicinal therapies.

**Lean Six Sigma Implementation:** By removing variability and streamlining manufacturing process, Lean Six Sigma methodologies made sure that patient-specific medications were consistently and high-quality produced.

**Results:** The integration accelerated the creation of tailored treatments and enhanced process uniformity, both of which had favorable direct effect on patient outcomes.

### **Key Takeaways**

AI can assist with real-time process optimization, outcome prediction, and equipment health monitoring and data analysis automation. By emphasizing continuous improvement, Lean Six Sigma offers a framework for cutting waste, increasing productivity, and guaranteeing quality. Pharmaceutical businesses can increase drug development speed, improve product quality, and lower operating costs by combining AI and Lean Six Sigma, which results in more profitable, complaint, and efficient operations.

These case studies show how Lean Six Sigma and artificial intelligence (AI) may work together to significantly increase pharmaceutical sector productivity, quality assurance, and overall process optimization.

### **Challenges and Opportunities**

Although there are many advantages to integrating AI with LSS, there are drawbacks as well. The requirement for qualified experts who comprehend both AI and LSS techniques is one of the main obstacles. These experts are essential for deciphering insights produced by AI and putting changes into practice in accordance with LSS frameworks.

Furthermore, using AI may demand a large upfront investment, particularly for small and medium-sized businesses. Nonetheless, businesses that successfully combine AI and LSS stand to benefit greatly from lower operating expenses, increased productivity, and higher-quality products.

### **Challenges in Implementation**

#### **Regulatory Compliance**

Because the pharmaceutical sector is highly regulated, implementing Lean Six Sigma techniques must comply with laws requiring Good Manufacturing Practices (GMP). Process amendments prerequisite to be painstakingly endorsed to guarantee compliance.

#### **Cultural Opposition**

A major obstacle to the effective use of Lean Six Sigma may be organizational culture. Comprehensive training and change management techniques are necessary to overcome resistance from staff members used to old procedure.

### **The Future of LSS in an AI-Driven World**

Lean Six Sigma will continue to be applicable as AI develops because it offers the methodical framework required to successfully implement AI insights. LSS guarantees that the insights obtained from this data are applied within a framework that complies with regulations, even though AI can improve data collecting and prediction skills. Pharmaceutical firms will be in a strong position to handle the problems facing the sector in the future if they can capitalize on both AI and LSS's advantages (Article 4). Predictive analytics and continuous improvement techniques will probably be increasingly integrated as the interaction between AI and LSS develops. More proactive process optimization will be possible as a result of this convergence, which will shorten the needed for remedial operations and enable real-time quality control.

### **SUMMARY AND CONCLUSION**

Even in the age of artificial intelligence, Lean Six Sigma remains an essential instrument in the pharmaceutical sector. Even though AI has made great strides in automation, predictive analytics, and data-driven decision-making, LSS's structured improvement processes and human oversight are still essential. Pharmaceutical businesses can streamline operations, cut expenses, and enhance product quality by combining AI with LSS.



The complementary functions of LSS and AI guarantee that both approaches continue to be crucial in contemporary pharmaceutical production. The structured improvement framework of LSS and data-driven insights from AI combine to provide a potent synergy that can handle the changing problems facing the sector. Lean Six Sigma will continue to be an essential part of pharmaceutical businesses' operational strategies as they embrace AI technology, guaranteeing quality, efficiency, and compliance in a regulatory landscape that is becoming more complex.

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