# Exploring the Role of Additive Manufacturing in Industry 4.0: A Review of Applications and Advancements

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Abstract—Additive manufacturing (AM), which is another name for 3D printing, is an essential technology for Industry 4.0, which can be described as the incorporation of digital technologies into the operations of manufacturing businesses. The present investigation offers a comprehensive analysis of the role that AM plays within the context of Industry 4.0. Industry 4.0, also known as the fourth industrial revolution, is an initiative that aims to integrate advanced technologies such as the internet of things, big data, and automation in order to create intelligent manufacturing processes and the accompanying infrastructure. Additive manufacturing, also known as 3D printing, is a groundbreaking technology that has the potential to revolutionize manufacturing by enabling on-demand, autonomous, and customized products. The research presented here aims at the present status of AM uses in Industry 4.0, including rapid prototyping, and end-part production. It also addresses the difficulties and constraints of additive manufacturing, as well as its merging with other Industry 4.0 technologies. Overall, this study offers useful insights into the role of AM in Industry 4.0 and its ability to transform the manufacturing industry. This review's results can assist academics, engineers, and practitioners in better understanding the present status of AM in Industry 4.0 and identifying possibilities for future study and development.

#### INTRODUCTION

As part of the fourth industrial transformation, also known as Industry 4.0, smart technologies like 'the Internet of Things' (IoT), 'artificial intelligence' (AI), and robotics will be incorporated. [1-4] The development of smart organizations and manufacturing process will make use of these technologies. The objective of this collaboration is to raise product quality while optimizing production procedures to reduce costs and enhance output. [5-8] 3D printing, also known as additive manufacturing, is a technology that enables the creation of three-dimensional objects by building them layer by layer using a digital design. [9-21] even though the fourth industrial revolution has allowed its maximum promise to be achieved. The fourth industrial revolution's important technology is AM, which enables the rapid, precise, and customized creation of complicated components.[22-25] By making it possible to build smart plants that can mass create customized goods, Industry 4.0 and additive manufacturing have the potential to revolutionize the manufacturing sector. Due to the collaboration, the manufacturing process can be monitored in real-time and optimized, which reduces wastage and enhances productivity. Customized components can also be produced on demand, which may decrease waiting times and carrying costs. [23-28] Additive manufacturing, has emerged as a transformative technology in Industry 4.0. This technology allows manufacturers to create complex parts and components with precision, speed, and cost-effectiveness, which was not possible with traditional manufacturing methods. [29-33] By using digital designs, additive manufacturing eliminates the need for tooling, molds, and other fixed assets, thereby reducing the time and costs associated with traditional manufacturing. AM is also helping manufacturers to create customized products, enabling them to meet the changing needs and preferences of customers. [34,35] By using digital design files, manufacturers can quickly and easily modify designs to meet the specific requirements of customers. This capability is particularly useful in the medical, aerospace, and automotive industries, where customized parts are often required.

Furthermore, additive manufacturing is helping manufacturers to improve their supply chain management. By producing parts on-demand, manufacturers can reduce the need for inventory, warehouse space, and transportation. This allows them to operate with greater flexibility and efficiency, thereby reducing lead times and costs.[36]



Figure 1: Industry 4.0's foundational elements.[29]

Overall, additive manufacturing is a key enabler of Industry 4.0, allowing for greater flexibility, agility, and innovation in manufacturing and production processes. Its benefits are likely to continue to grow as the technology improves and new applications are discovered. This paper explores the current state of AM applications in Industry 4.0, including its use in rapid prototyping, tooling, and end-part production. It also discusses the challenges and limitations of AM in this context, such as the need for standardization, scalability, and costeffectiveness, as well as the integration of AM with other Industry 4.0 technologies.

#### TYPES OF INDUSTRIAL REVOLUTIONS: A HISTORICAL OVERVIEW OF TRANSFORMATIVE TECHNOLOGICAL SHIFTS

The industrial revolution refers to a period of profound and rapid economic and social change that took place in Europe and North America between the late 18th and mid-19th centuries. It is characterized by the emergence of new manufacturing technologies, improvements in transportation and communication infrastructure, and the rise of capitalism and market economies. The industrial revolution is often divided into four distinct phases. [37-39]

**First Industrial Revolution the Age of Steam and Mechanization (1760-1840):** The first industrial revolution started in the late 18th century in Britain and continued until the mid-nineteenth century. It was characterized by the emergence of new manufacturing technologies, such as the steam engine, which greatly increased the efficiency of textile production. Other key innovations included the spinning jenny, power loom, and the cotton gin. These new technologies led to the growth of factories and the mass production of goods, and paved the way for the development of industrial capitalism.

**Second Industrial Revolution (1870-1914):** The second industrial revolution, referred to be the technical revolution, started in the late nineteenth century and continued until the beginning of World War I. It was defined by a surge of new inventions, such as the internal combustion engine, telephone, light bulb, and aircraft. These new technologies led to the

growth of new industries, such as the automobile and electrical industries, and transformed the way people lived and worked. [36-39]

**Third Industrial Revolution (1960s-1990s):** The third industrial age, formerly referred to be the digital revolution, run from the 1960s to the 1990s. It was characterized by the emergence of new technologies such as the computer, the internet, and the mobile phone, which transformed the way people communicate, work, and access information. These new technologies also led to the growth of new industries, such as the software and telecommunications industries, and paved the way for the rise of the information economy. [37-39]

**Fourth Industrial Revolution (2010s-present):** The fourth industrial revolution, also known as Industry 4.0, refers to the continuing change of the manufacturing and production sectors as a result of new technologies such as the Internet of Things, artificial intelligence, and sophisticated automation. The merging of physical and digital systems, the creation of smart manufacturing, and the greater use of robotics and data analytics are all hallmarks of this transformation. The fourth industrial revolution is anticipated to change how we live and work, as well as have a significant effect on the global economy. [37-39]

 Table 1: Comparison among various industrial phases. [37-39]

Industrial Phase	Time Period	Key Innovations	Major Economic Developments
First Industrial	1760s- 1840s	Steam engine, spinning jenny, power loom, locomotive	Factory system, urbanization, increased trade
Second Industrial	1870s- 1914	Electricity, internal combustion engine, steel, chemistry	Globalization, rise of multinational companies
Third Industrial	1960s- 2000s	Computers, semiconductors, telecommunications	Growth of service industries, outsourcing
Fourth Industrial	Present day	Artificial intelligence, IoT, 3D printing, robotics	U

# THE ROLE OF ADDITIVE MANUFACTURING IN INDUSTRY

3D printing, also known as additive manufacturing, has been identified as an important component of Industry 4.0, the fourth phase of industrial change defined by the merging of digital technologies and production mechanization. Additive manufacturing enables the creation of highly customized and complicated shapes with less waste and quicker development periods, thereby enabling the digitalization and automation concepts of Industry 4.0. Furthermore, the use of additive manufacturing in Industry 4.0 can result in new business models and income sources, as well as improved supply chain adaptability and speed. Integrating additive manufacturing into Industry 4.0, on the other hand, poses difficulties, such as the need for more advanced materials and processes, as well as more complex software and hardware.[36] Overall, additive manufacturing has the ability to greatly change the manufacturing industry while also playing an important part in the current Industry 4.0 transformation.

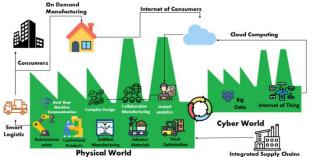


Figure 2: Smart Manufacturing Components of Industry 4.0 [45]

# CURRENT STATE OF AM APPLICATION IN INDUSTRY 4.0

AM has been a key driver of Industry 4.0 and has made significant progress in recent years. AM technologies are being used across various industries for different applications, including prototyping, tooling, and end-part production. [40]

**Prototyping:** AM is extensively used in rapid prototyping, enabling designers and engineers to quickly produce and test product designs. AM has also enabled the development of new design and product optimization strategies that were not previously possible.[41]

**Tooling:** AM is increasingly being used to produce customized tooling for manufacturing processes. Traditional tooling is expensive and time-consuming to produce, but with AM, tooling can be produced quickly and at a lower cost. This allows manufacturers to be more agile and flexible in their production processes.

**End-part production**: AM is being used for the production of end-use parts, particularly in low-volume production, and where customization or complexity is required. In some cases, AM can produce parts that are impossible or difficult to manufacture using traditional methods. This can result in lighter, more durable, and more efficient parts.

In the aerospace industry, AM is being used to produce lightweight components and reduce the weight of aircraft, which translates into lower fuel consumption and emissions. In the medical industry, AM is being used to produce custom implants, prosthetics, and surgical instruments, enabling a more personalized approach to healthcare. In the automotive industry, AM is being used to produce spare parts and small series production, leading to reduced costs and faster time-tomarket.[43] Despite the significant progress made in AM, there are still some challenges that need to be addressed, such as the need for higher production rates, improved materials, and quality control. However, it is clear that AM will continue to play a vital role in Industry 4.0, enabling manufacturers to produce complex parts with greater flexibility, speed, and efficiency.



Figure 3: Ford Motor Company is evaluating the Stratasys Infinite Build 3D printer for large-scale 3D manufacturing of automobile components.[44]

Overall, AM has proven to be a game-changer in the field of rapid prototyping, enabling faster product development, reduced costs, and greater design flexibility. As the technology continues to improve, we can expect to see even more innovative applications of AM in the future.

**Jigs and fixtures:** AM can be used to produce customized jigs and fixtures for manufacturing processes. These tools are used to hold parts in place during production, ensuring that they are correctly aligned and positioned. By using AM to produce jigs and fixtures, manufacturers can reduce lead times and costs associated with traditional manufacturing methods.

**Molds:** AM is used to produce molds for various manufacturing processes, including injection molding and casting. By using AM, Molds with complicated shapes can be produced that would be challenging or impossible to make using conventional production techniques. Furthermore, AM can decrease the time and expense involved with mold production, allowing for a quicker time-to-market. Cutting tools: AM can be used to produce customized cutting tools, including drill bits and milling cutters. By using AM, manufacturers can produce cutting tools with complex geometries, enabling more precise and efficient machining. Additionally, AM can reduce the time and cost associated with producing cutting tools, enabling faster production cycles.

**Dies and punches:** AM can be used to produce dies and punches for sheet metal forming processes. By using AM, manufacturers can produce customized dies and punches with complex geometries, enabling more precise and efficient forming. Additionally, AM can reduce the time and cost associated with producing dies and punches, enabling faster production cycles.

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Overall, AM is increasingly being used to produce customized tooling for manufacturing processes, enabling faster time-tomarket, reduced costs, and greater design flexibility. As the technology continues to evolve, we can expect to see even more innovative applications of AM for tooling production.

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AM is increasingly being used to produce tooling for manufacturing processes. The ability to quickly produce customized tooling using AM has revolutionized the way manufacturers approach tooling design and production. Here are some examples of AM used for tooling.

### THE CHALLENGES AND LIMITATIONS OF AM AS WELL AS THE INTEGRATION OF AM WITH OTHER **INDUSTRY 4.0 TECHNOLOGIES**

AM has made significant progress in recent years, there are still several challenges and limitations that need to be addressed. Additionally, the integration of AM with other Industry 4.0 technologies presents both opportunities and challenges. Here are some of the challenges and limitations of AM and the integration of AM with other Industry 4.0 technologies

### **Challenges and limitations of AM**

Limited material options: While there has been progress in developing new materials for AM, the range of materials available is still limited compared to traditional manufacturing methods.

Surface finish and accuracy: AM parts may require additional post-processing to achieve the desired surface finish and accuracy, which can add to the production time and cost.

Production rate: While AM has made significant progress in terms of speed, it still lags behind traditional manufacturing methods in terms of production rate, making it less suitable for mass production

Quality control: Quality control of AM parts can be challenging due to the layer-by-layer nature of the manufacturing process, making it more difficult to detect defects.

Integration of AM with other Industry 4.0 technologies Data integration: Integration of AM with other Industry 4.0 technologies requires data integration between different systems and processes, which can be challenging.

Internet of Things (IoT): IoT sensors can be used to monitor AM processes in real-time, enabling predictive maintenance and reducing downtime.

Augmented Reality (AR): AR can be used to visualize and simulate AM processes, helping designers to optimize the design of the part before printing, and engineers to identify defects and improve the quality of printed parts.

Robotics: Robotics can be used to automate the AM process, improving efficiency and accuracy.

By integrating AM with other Industry 4.0 technologies, manufacturers can address some of the challenges and limitations of AM, improving the quality, speed, and efficiency of production.

### CONCLUSION

In conclusion, additive manufacturing, or 3D printing, is a key technology in Industry 4.0, which aims to integrate digital technologies into manufacturing processes to create smart and interconnected systems. This comprehensive review has provided valuable insights into the role of AM in Industry 4.0, including its current applications in rapid prototyping, tooling, and end-part production, as well as its potential to transform manufacturing by enabling on-demand, decentralized, and customized production. The review has also highlighted the challenges and limitations of AM, as well as the need for integration with other Industry 4.0 technologies. The knowledge gained from this review can help researchers, engineers, and practitioners to better understand the current state of AM in Industry 4.0 and to identify opportunities for further research and development. As such, the findings of this review have significant implications for the future of the manufacturing industry, and the potential for AM to revolutionize the way we produce goods.

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