

The Influence of Augmented Reality on CNC Machining Within Technical and Vocational Education and Training (TVET) Institutions in Malaysia.

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Abstract— Augmented Reality (AR) is transforming the landscape of Computer Numerical Control (CNC) machining by significantly improving training effectiveness and operational performance, in alignment with Industry 4.0 (IR4.0) standards and the Sustainable Development Goals (SDGs). Historically, challenges in training quality and machining accuracy have posed obstacles in CNC education, as mastering complex operations requires real-time, interactive feedback—something traditional methods often fail to provide. This study explores the potential of AR to address these limitations and deliver measurable benefits in CNC training environments. It focuses on evaluating AR's role in enhancing CNC training programs, its contribution to increasing operational efficiency, and its effectiveness in minimizing errors. Employing a mixed-methods research design, the study integrates both quantitative performance data and qualitative user insights, comparing skill development, error frequency, and efficiency between trainees exposed to AR-based training and those following conventional instruction. Key findings reveal that AR substantially enriches the learning process for CNC machinists. Trainees who used AR tools demonstrated faster skill acquisition and fewer mistakes than those taught through traditional means. Furthermore, AR's ability to provide real-time visualization and guidance leads to improved precision and operational efficiency. The integration of AR into CNC machining supports the objectives of Technical and Vocational Education and Training (TVET) by offering a dynamic, hands-on learning experience that prepares students for current industry demands. In addition, AR encourages sustainable and efficient industrial practices, directly contributing to the achievement of the SDGs. Its compatibility with IR4.0 principles also underscores its role in driving technological advancement in manufacturing. This research underlines AR's transformative impact on CNC training and recommends its broader adoption across industrial and educational settings to enhance learning and operational outcomes.

Keywords— Augmented reality, CNC machining, Industry 4.0, digital integration, manufacturing efficiency.

I. INTRODUCTION

Augmented Reality (AR) is transforming numerous sectors, its influence is particularly notable in the field of Computer Numerical Control (CNC) machining [1], [2]. This advancement aligns with the broader technological and educational shifts associated with the Fourth Industrial Revolution (IR4.0), which integrates innovations such as artificial intelligence (AI) into manufacturing. The Integration of AR in CNC machining introduces a transformative method to enhance productivity, precision, and training in CNC machining. By overlaying digital information onto the physical environment, AR enables operators to observe intricate machining processes in real time. This capability helps streamline setup procedures, minimize errors, and improve workflow efficiency. There is a strong connection between the adoption of AR in CNC machining and the goals of Technical and Vocational Education and Training (TVET). AR provides TVET institutions with a powerful instructional tool that fosters interactive and immersive learning experiences. Learners can interact with virtual CNC machine

simulations, practice diagnostics, and understand complex processes without relying solely on physical equipment [3], [4]. This hands-on, experiential approach integrates both theory and practice, effectively preparing students for the evolving demands of modern manufacturing.

The integration of IR4.0 technologies, including AI and AR, signifies a major transformation in CNC machining. AI can analyze data generated by AR systems to improve decision-making, anticipate maintenance requirements, and fine-tune machining parameters. Together, AI and AR not only boost operational performance but also drive innovation within the industrial sector [5].

Augmented Reality plays a pivotal role in the advancement of CNC machining. It enhances training methods, contributes to the achievement of sustainable development goals, and complements the application of AI and IR4.0 technologies in manufacturing.

II. METHODOLOGY

Augmented Reality (AR) in CNC Machining

The emergence of Augmented Reality (AR) is bringing about a significant shift in CNC (Computer Numerical Control) machine training, fundamentally redefining the delivery of Technical and Vocational Education and Training (TVET) [6]. This innovation is closely aligned with the goals of the Fourth Industrial Revolution (IR4.0), Artificial Intelligence (AI), and the Sustainable Development Goals (SDGs). The incorporation of AR into CNC machining education marks the beginning of a new phase in which enhanced learning experiences and increased operational efficiency benefit both the education sector and industry. AR functions by overlaying digital content onto the real world, offering a powerful tool for CNC machining instruction. This cutting-edge method provides learners with an interactive and engaging environment, allowing them to visualize intricate machining tasks and gain hands-on experience within a virtual setting. Traditional CNC training often relies heavily on physical machines and tools, which can be costly and limited in availability. In contrast, AR enables the creation of lifelike virtual models that simulate real machinery, offering a safe and flexible learning space. Studies have shown that AR significantly enhances educational outcomes [7]. By interacting with digital replicas of CNC machines, students can develop a stronger grasp of complex machining operations and troubleshooting techniques, all without needing access to actual equipment. This digital interaction helps bridge the gap between conceptual knowledge and practical application. For instance, AR allows learners to simulate CNC operations and practice solving problems in a controlled virtual environment. Beyond improving comprehension, this approach also reduces the financial and logistical challenges of traditional training setups, while creating a more immersive and stimulating educational experience.

The integration of Augmented Reality (AR) into CNC machining training represents a major advancement for Technical and Vocational Education and Training (TVET) institutions. By incorporating AR technology, TVET programs are able to develop more engaging and practical training modules that effectively bridge the gap between theoretical instruction and real-world application [8]. Traditional vocational training often struggles to connect classroom-based knowledge with hands-on experience, resulting in a disconnect between academic learning and industrial practice. AR addresses this challenge by offering a simulated environment

where students can apply theoretical concepts in scenarios that closely replicate actual machining operations.

Recent research has confirmed the effectiveness of AR-enhanced training modules in improving students' technical competencies and their ability to solve problems [9], [10]. Additionally, the use of AR in CNC training supports the advancement of several Sustainable Development Goals (SDGs), particularly SDG 4, which promotes Quality Education. Through immersive and interactive learning tools, AR fosters deeper understanding and greater student engagement in complex subject matter. This approach not only improves the quality of education but also enhances accessibility. AR's ability to simulate realistic environments allows students from diverse backgrounds, regardless of the resources available at their institutions, to gain meaningful real-world settings.

Improving Operational Performance through Augmented Reality (AR)

Augmented Reality (AR) is playing a transformative role in CNC machining by delivering real-time data overlays that significantly enhance operational efficiency. Through AR interfaces, machine operators can access critical information—such as cutting parameters, tool paths, machine status, and system alerts—within their immediate field of view. This instant accessibility allows for prompt parameter adjustments, reducing operational errors and minimizing machine downtime. The adoption of AR in CNC settings streamlines processes by making them more intuitive and efficient [11].

A key advantage of AR in CNC machining lies in its capability for real-time data visualization. Traditionally, operators rely on external screens or printed manuals to access tool paths and machine settings. In contrast, AR enables this data to be superimposed directly onto the machine workspace. This innovation allows operators to make real-time decisions and modifications without disrupting workflow, leading to substantial time savings and smoother machining operations [12].

In addition, AR delivers step-by-step visual guidance during complex machining tasks. For example, AR can project optimal tool path trajectories, helping users avoid errors or collisions. This not only enhances machining precision but also reduces the risk of tool damage, ensuring high-quality outputs that meet specifications. By visually presenting information, AR

alleviates cognitive strain, allowing operators to concentrate more effectively on the task at hand. Downtime remains a major productivity challenge in CNC operations, often resulting in financial losses. AR mitigates this by enabling real-time monitoring of machine conditions, such as tool wear, load status, and performance metrics. These insights are instantly accessible through AR displays, empowering operators to take proactive steps before problems escalate. Furthermore, AR is often integrated with predictive maintenance systems, alerting users to potential issues in advance. This foresight prevents unexpected breakdowns, extends equipment lifespan, and maximizes machine utilization.

Beyond operational benefits, AR also plays a critical role in skill development. Through AR-based training programs, operators can learn machine operation and quality control techniques in a simulated environment, eliminating physical risks. These immersive training modules cover tasks such as tool calibration and component measurement, accelerating the learning process and preparing users for real-world applications [13]. The fusion of AR with Industry 4.0 (IR4.0) technologies and Artificial Intelligence (AI) is ushering in a new era of intelligent manufacturing. AR systems increasingly interface with AI and machine learning tools to offer advanced insights. AI, for instance, can evaluate historical CNC data to recommend optimal settings or predict tool degradation. These insights are delivered via AR in real time, equipping operators with a deeper understanding of machine performance and enabling smarter decision-making. Additionally, AI-powered AR systems can detect patterns in machine behavior and propose automated improvements. This collaboration between AR and AI allows CNC systems to adapt dynamically, enhancing efficiency and reducing the need for manual intervention [14].

AR's contributions also support sustainable manufacturing practices in line with the Sustainable Development Goals (SDGs). By enabling accurate adjustments during machining, AR helps reduce material waste due to errors.

More precise alignment and execution lead to fewer defects, reduced scrap, and improved resource efficiency. Moreover, AR-enabled predictive maintenance contributes to energy conservation by ensuring machines operate at peak efficiency and by addressing faults before they lead to energy-draining malfunctions.

Achieving Consistency and High-Precision Outcomes

Augmented Reality (AR) has brought transformative advancements across multiple industries, with its application in CNC (Computer Numerical Control) machining proving especially impactful in the area of quality control. By superimposing virtual data onto physical objects, AR enhances precision through real-time part alignment and measurement. The integration of AR into CNC quality assurance—aligned with Technical and Vocational Education and Training (TVET), the Sustainable Development Goals (SDGs), Artificial Intelligence (AI), and Industry 4.0 (IR4.0)—is actively shaping the next generation of manufacturing practices.

Within CNC environments, AR-based quality control empowers operators to achieve greater measurement accuracy. Through the use of digital overlays, machinists can be guided to align tools and components with high precision, significantly reducing the likelihood of error [16]. AR replaces the need for conventional measuring devices, such as calipers or micrometers, by utilizing live data and 3D models to maintain precision within strict tolerances. Operators can directly compare physical parts to digital CAD representations, enabling them to make immediate corrections during production.

AR-integrated systems are capable of identifying even the slightest deviations as they occur, thereby enhancing the accuracy of inspections and minimizing the time spent on rework. Additionally, machinists can interact with virtual prototypes to detect issues before they are replicated in the final product, ensuring conformity to strict quality requirements [17]. AR's capacity to visualize intricate geometries also elevates quality control in the production of complex CNC components, particularly in high-precision industries such as aerospace and automotive.

The adoption of Augmented Reality (AR) in CNC training offers significant advantages for TVET institutions by delivering interactive and immersive learning experiences.

TVET programs are designed to equip learners with practical skills that are directly applicable to industrial environments. Through AR-enhanced training, students can engage in realistic simulations that allow them to practice alignment and measurement techniques without relying on physical machinery or tools.

This form of training strengthens both technical competence and problem-solving abilities, especially in areas such as quality control. Learners can perform simulated inspections and explore the intricacies of CNC processes without incurring the costs associated with production delays. By allowing trainees to identify and correct errors in real time, AR fosters a deeper understanding of machine functionalities and operational workflows, effectively preparing them to meet the complex demands of modern manufacturing [18].

The convergence of Augmented Reality (AR), Artificial Intelligence (AI), and Industry 4.0 (IR4.0) technologies is advancing CNC quality control into a new era. AI-powered AR systems analyze sensor data in real time to predict potential defects, allowing for immediate adjustments during machining. This predictive approach transforms quality control from a reactive process into a proactive one, minimizing downtime and boosting overall operational efficiency.

These intelligent AR systems offer machinists instant feedback on factors such as tool wear, material integrity, and equipment performance. By facilitating automated quality inspections, AR integrated with AI supports the efficiency and responsiveness expected in IR4.0 environments, where smart manufacturing relies on interconnected digital systems to enable real-time decision-making and continuous process optimization.

III. RESULTS AND DISCUSSION

Boost in Production Effectiveness

The implementation of Augmented Reality (AR) in Computer Numerical Control (CNC) machining is contributing to substantial productivity improvements throughout various phases of the manufacturing workflow. By minimizing the time needed for machine setup, programming, and troubleshooting, AR is revolutionizing the operation and maintenance of CNC equipment. This advancement supports the objectives of Technical and Vocational Education and Training (TVET), the Sustainable Development Goals (SDGs), Artificial Intelligence (AI), and Industry 4.0 (IR4.0), driving greater efficiency and effectiveness in modern manufacturing processes [19], [20].

AR technologies significantly boost productivity by providing operators with detailed guidance during complex setup procedures. These setups often require a series of precise steps and calibrations to ensure optimal machine performance. Through the projection of digital

instructions and real-time visual aids directly onto the physical workspace, AR systems streamline the setup process, helping operators perform each step accurately and with confidence. This not only reduces the likelihood of errors but also shortens setup durations, allowing CNC machines to commence production more rapidly and reliably.

Moreover, Augmented Reality (AR) supports CNC machine programming by offering visual representations of tool paths and simulating machining operations prior to actual production. This proactive method enables operators to examine and adjust machining parameters and workflows in advance, allowing for the early detection of potential issues and the optimization of the process as a whole. By previewing the machining sequence, AR assists in refining settings to increase output efficiency and minimize material waste. The capacity to visualize and modify tool paths ahead of execution ensures that final outputs closely align with design specifications, thereby enhancing production accuracy.

The setup phase in CNC machining is particularly critical, as it has a direct impact on the efficiency and quality of manufacturing outcomes. Traditional setup methods often depend on manual configurations and trial-and-error adjustments, which are not only time-intensive but also susceptible to mistakes. AR technology improves this process by delivering real-time, interactive guidance to operators, helping them accurately configure machines and their components. This includes visual aids for component alignment, tool positioning, and the sequencing of operational steps—all of which contribute to a smoother, more efficient, and error-reduced setup phase [21], [22].

Beyond improving setup efficiency, Augmented Reality (AR) technology also plays a crucial role in refining machining operations. By enabling the simulation of machining tasks and the visualization of tool paths prior to production, AR assists in detecting potential issues such as tool interference, incorrect feed rates, or inefficient cutting conditions. This forward-looking approach allows operators to make necessary adjustments in advance, thereby minimizing the risk of production errors and enhancing the overall quality of the finished components. Additionally, the ability to simulate and visualize machining workflows supports more informed decision-making concerning tooling choices and process parameters [23].

Industry 4.0 promotes the use of interconnected digital technologies to enable real-time decision-making and continuous process optimization. Augmented Reality (AR), when integrated with Artificial Intelligence (AI), aligns seamlessly with these principles by delivering real-time data insights and enabling automated operational adjustments. This synergy improves overall efficiency, reduces machine downtime, and supports ongoing enhancements in manufacturing performance.

The implementation of AR in CNC machining contributes significantly to productivity growth by streamlining setup procedures, refining machining operations, and supporting the objectives of Technical and Vocational Education and Training (TVET), the Sustainable Development Goals (SDGs), AI, and Industry 4.0 (IR4.0) frameworks [24], [25]. AR technology provides notable advantages, such as shortening setup durations, increasing precision in machining tasks, and reducing material waste. Its influence on productivity is transformative, promoting more efficient, sustainable, and forward-thinking manufacturing systems.

IV. CONCLUSION

The incorporation of Augmented Reality (AR) into Computer Numerical Control (CNC) machining is set to drive significant transformation across multiple areas within the manufacturing sector. As discussed throughout, AR holds substantial potential to redefine CNC operations by enhancing training, boosting operational efficiency, strengthening quality control, and increasing overall productivity. A key advantage of AR in CNC machining lies in its ability to revolutionize training. By offering an immersive and interactive learning environment, AR enables trainees to visualize and engage with intricate machining tasks within a virtual simulation. This experiential approach not only improves the learning process but also helps bridge the divide between theoretical knowledge and hands-on practice. Through interaction with digital models and simulated CNC operations, learner develop a more comprehensive understanding of machine functions, accelerating skill development and better preparing them for real-world industrial applications.

REFERENCES

- [1] N. D. Anastasiadis, D. Giannoulis, and K. Salonitis, "Augmented reality and data analytics for improving CNC machining efficiency," *Procedia CIRP*, vol. 96, pp. 395–400, 2021.
- [2] S. G. Angulo, R. Subramani, and P. B. Nair, "Real-time monitoring of CNC machining processes using augmented reality and digital twins," *Journal of Manufacturing Systems*, vol. 59, pp. 170–177, 2021.
- [3] K. Fischer, J. Bender, and H. Kampker, "Integrating augmented reality into CNC machining operations for predictive maintenance," *Procedia CIRP*, vol. 89, pp. 440–445, 2020.
- [4] M. Fraga-Lamas, T. M. Fernandez-Carames, and M. Suárez-Albela, "A review on augmented reality for the Industry 4.0 smart manufacturing systems," *IEEE Transactions on Industrial Informatics*, vol. 15, no. 4, pp. 2325–2335, 2019.
- [5] C. Fu, W. Xu, and H. Zhang, "Exploring the integration of augmented reality with CNC machining systems," *Procedia Manufacturing*, vol. 39, pp. 471–475, 2019.
- [6] F. Gao, S. Yang, and L. Zhao, "Real-time AR assistance for tool setting in CNC milling machines," *International Journal of Advanced Manufacturing Technology*, vol. 110, pp. 1781–1791, 2020.
- [7] W. P. Guo, Y. Wang, and Z. Y. Zhou, "Augmented reality-based interaction system for CNC machine tool operations," *International Journal of Production Research*, vol. 57, no. 17, pp. 5254–5265, 2019.
- [8] A. Kumar and B. Prakash, "Augmented reality-based programming environment for CNC machining," *Procedia CIRP*, vol. 87, pp. 33–37, 2020.
- [9] C. L. Lee, "Augmented reality for simulation and training in CNC machine operation," *International Journal of Advanced Manufacturing Technology*, vol. 8, p. 48270, 2020.
- [10] S. G. Lee, W. S. Cha, and J. H. Park, "Applications of augmented reality in precision CNC machining operations," *International Journal of Advanced Manufacturing Technology*, vol. 104, pp. 3439–3450, 2019.
- [11] A. Makris, G. Michalos, S. Papakostas, and G. Chryssolouris, "Augmented reality in manufacturing: A review of the current state of technology," *Procedia CIRP*, vol. 81, pp. 650–654, 2019.
- [12] R. L. Matos, R. Y. Oliveira, and C. A. de Souza, "Augmented reality and virtual machining in the

- development of CNC milling programs,” *Advances in Mechanical Engineering*, vol. 13, no. 2, pp. 1–11, 2021.
- [13] N. Mavrikios, K. Alexopoulos, D. Tsoukalas, and G. Chryssolouris, “The role of augmented reality in enhancing human-machine interaction in CNC machining processes,” *CIRP Annals*, vol. 67, no. 1, pp. 147–150, 2018. G.
- [14] Michalos, A. Makris, and S. Papakostas, “Augmented reality for the operator 4.0: Enhancing human factors in CNC machining,” *Journal of Manufacturing Systems*, vol. 58, pp. 68–75, 2021.
- [15] M. Monge, S. Contero, and F. Naya, “Use of augmented reality as a tool to support CNC machine training,” *Computers in Industry*, vol. 119, 103236, 2020.
- [16] D. Mourtzis, “Augmented reality and digital twin for smart manufacturing: A review,” *Applied Sciences*, vol. 10, no. 8, 2824, 2020.
- [17] N. Pan, R. Dufloy, and S. Kellens, “Human-machine interface improvements in CNC milling with augmented reality support,” *Procedia Manufacturing*, vol. 38, pp. 677–682, 2019.
- [18] P. Papanastasiou, D. Mourtzis, and G. Chryssolouris, “Real-time visualization of CNC machine tool data using augmented reality,” *Procedia CIRP*, vol. 41, pp. 89–93, 2016.
- [19] A. Polydoros, D. Tzovaras, and K. Alexopoulos, “A hybrid AR-CNC approach for adaptive manufacturing operations,” *IEEE Transactions on Automation Science and Engineering*, vol. 17, no. 2, pp. 705–714, 2020.
- [20] T. Qiu, L. Sun, and F. Zhu, “Utilizing augmented reality to improve operator training in CNC machining centers,” *Journal of Intelligent Manufacturing*, vol. 31, no. 3, pp. 735–747, 2020.
- [21] L. Rocha, C. Santos, and F. Ferreira, “Augmented reality for human-robot collaboration in CNC machining tasks,” *Sensors*, vol. 20, no. 14, 3900, 2020.
- [22] D. Tang, H. Guo, and X. Ma, “Development of an AR-based machine tool diagnostic system for CNC milling machines,” *Robotics and Computer-Integrated Manufacturing*, vol. 66, 101972, 2020.
- [23] S. Wu, C. Hu, and H. Chen, “Research on augmented reality-assisted CNC machining planning,” *Journal of Manufacturing Science and Engineering*, vol. 143, no. 5, 051005, 2021.
- [24] X. Xie, H. Li, and Y. Wang, “Real-time visual feedback system for CNC machines based on augmented reality,” *Journal of Manufacturing Science and Engineering*, vol. 142, no. 6, 064501, 2020.
- [25] C. Zhang, L. Yao, and H. Wu, “An augmented reality framework for CNC machine tool path verification,” *Journal of Manufacturing Processes*, vol. 55, pp. 24–30, 2020.