

Artificial Intelligence and Labour Markets: Analyzing Job Displacement and Creation

Siti Maria^{1*}, Purwinahyu¹, Fitriansyah², Arvita Rachmawaty¹, Rohana Nur Aini¹

¹Universitas Mulawarman, Indonesia

²Universitas Muhammadiyah Kalimantan Timur, Indonesia

*Corresponding author Email: siti.maria@feb.unmul.ac.id

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Abstract

Artificial Intelligence (AI) is transforming labour markets through automation, job displacement, and the creation of new employment opportunities. This study employs a descriptive and comparative research design to analyze AI's impact across various industries, using statistical trend analysis, comparative sector evaluations, and qualitative NVivo-style interview analysis. Findings indicate that industries such as manufacturing and retail experience high job displacement rates (45% and 35%), whereas healthcare and Education show higher AI-driven job creation (50% and 60%). A major challenge identified is the AI skills gap, where 84% of interview respondents highlighted difficulties in workforce adaptation due to the lack of AI-related training programs. The trend analysis reveals a 55% increase in AI job creation between 2015-2025, but many workers remain unprepared for these new roles. Comparative industry analysis suggests that countries and sectors investing in reskilling initiatives and AI governance policies experience lower AI-induced unemployment rates. Beyond economic concerns, this study highlights AI's psychological and social implications in the workplace, such as job insecurity, workplace surveillance, and mental health challenges. To address these issues, governments and corporations must implement AI workforce reskilling programs, fair labour policies, and ethical AI deployment strategies. The research concludes that proactive AI governance and workforce adaptation strategies are essential for ensuring an inclusive and sustainable labour market transition.

Keywords: Artificial Intelligence, Job Displacement, Creation, AI Skills Gap, Workforce Reskilling.

1. Introduction

The rapid development of Artificial Intelligence (AI) technology has brought about significant transformations in various sectors, particularly in the labour market. Implementing AI in automating business processes and operations has led to fundamental structural changes in employment [1]. The Industry 4.0 revolution leverages AI, the Internet of Things (IoT), and Big Data to create more efficient systems. This digital transformation optimizes productivity and requires the workforce to adapt to new skill sets [2]. The application of AI in industrial sectors has reduced the reliance on manual labour, especially for repetitive and routine tasks. This shift has sparked discussions on the redistribution of work roles and the necessity for new skill development [3]. On the other hand, adopting AI may disrupt labour market equilibrium through automation, potentially leading to structural unemployment if not balanced by effective reskilling programs [4].

Several studies indicate that AI can significantly enhance productivity across various sectors—from manufacturing to financial services—yet this transformation also poses a risk of eliminating traditional job roles [5]. The emergence of AI-based technology has led to new job categories, such as algorithm development, data analysis, and intelligent system management, which demand higher competencies from the workforce [6]. A significant challenge is the readiness of human resources to absorb these technological changes. Integrated training and education programs are essential to bridge the skills gap between industry needs and the available workforce [7]. Government policies play a crucial role in mitigating the negative impacts of AI on employment. Regulations that support innovation while protecting workers are essential to navigating technological disruption [8].

Globally, the adoption of AI has prompted a paradigm shift in labour management, where collaborative efforts between the public and private sectors are necessary to ensure a fair and sustainable transition [9]. Analyzing AI's impact on the labour market encompasses economic and social implications. Issues such as increased income disparity and unequal access to technology training must be addressed [10]. In some developed countries, AI implementation has yielded positive outcomes, with reduced unemployment rates in the tech



sector. However, developing countries still face challenges related to digital infrastructure and supportive policies [11]. The influence of AI in the service sector is equally complex, where integrating automated systems with human interactions is critical to maintaining service quality [12].

Empirical studies over the past decade have demonstrated that digital transformation driven by AI holds the potential to spur economic growth, provided it is accompanied by comprehensive change management strategies [13]. The advancement of research and innovation in AI has fostered the development of a new ecosystem that supports multidisciplinary collaboration—from computer science to social sciences—to assess the emerging socioeconomic impacts [14]. In conclusion, this study aims to analyze the dual effect of AI on job displacement and creation while exploring effective strategies to mitigate its disruptive effects. A multidimensional approach encompassing technical, policy and social aspects is expected to provide holistic solutions for the future labour market.

The rapid pace of technological innovation in AI continues to push the boundaries of research, shaping current labour market trends and influencing future workforce dynamics in unforeseen ways. Adopting AI across diverse industries fosters interdisciplinary research, merging computer science, economics, sociology, and policy studies. This convergence is leading to innovative solutions and more informed decision-making processes. Integrating AI systems in the workplace presents unique challenges related to data privacy, ethical concerns, and algorithmic biases. Addressing these issues requires concerted efforts by researchers and policymakers to develop robust frameworks that ensure fairness and transparency in AI applications. Continuous advancements in machine learning and deep learning are enhancing the capabilities of AI systems. These improvements drive increased accuracy and efficiency in tasks such as predictive analytics, decision support, and real-time processing, further contributing to the evolution of labour markets [15].

The evolving landscape of AI calls for ongoing evaluation and revision of educational curricula. Aligning academic programs with the rapidly changing industry requirements is essential for preparing future professionals to navigate and lead in an increasingly automated world. Future research should focus on longitudinal studies that monitor the long-term impacts of AI on job creation and displacement. Such comprehensive studies will provide valuable insights for stakeholders aiming to optimize AI benefits while mitigating potential risks. Integrating AI in workplaces has also led to discussions about the ethical implications of automation. Concerns regarding algorithmic bias, worker surveillance, and decision-making transparency have become crucial topics in labour policy discussions. Ensuring that AI operates reasonably and unbiasedly requires the development of regulatory frameworks that address these challenges while promoting innovation [2]. One of the most debated aspects of AI's impact on employment is the potential shift from permanent jobs to gig-based and contract work. Many companies are leveraging AI-powered platforms to facilitate freelance and remote jobs, reshaping traditional labour market structures. This shift presents both opportunities for workforce flexibility and challenges in terms of job security and benefits for workers [3].

The automation of jobs is expected to affect different demographics disproportionately. Studies have shown that lower-skilled workers, particularly in developing countries, face a higher displacement risk than high-skilled professionals who can adapt to AI-driven changes. Addressing this disparity requires targeted educational programs and policies prioritizing skill development for vulnerable populations [13].

The future of labour markets in the AI era depends on proactive adaptation strategies. Governments, businesses, and educational institutions must collaborate to create policies that foster workforce resilience. This includes investing in AI literacy programs, supporting lifelong learning initiatives, and promoting public-private partnerships that ensure sustainable economic growth despite technological disruption [15].

2. Methods

This study uses a descriptive and comparative research design to analyze the impact of artificial intelligence (AI) on the labour market across different countries and industries. The study compares how AI adoption affects job loss and creation, considering variations in technology readiness, workforce adaptability, and regulatory frameworks in place. To achieve these objectives, this study will rely on secondary data, case studies, and expert interviews to examine the impact of AI on employment across different industry sectors. In addition, semi-structured interviews will be conducted with industry professionals, policymakers, and workers in AI-affected sectors to gain a more in-depth perspective.

The study is expected to identify industries most vulnerable to AI-induced labour displacement and uncover new job opportunities in sectors supported by AI technologies. In addition, the study will also assess the effectiveness of government policies in managing workforce transitions due to AI developments. The results of this study are expected to provide strategic recommendations for businesses, educational institutions, and policymakers to help the workforce adapt to AI advancements more effectively.

Table 1. Key Industries, Data Sources, and Analysis Methods.

Industry	AI Implementation Examples	Data Sources	Analysis Methods
Manufacturing	Robotics & automation in production lines, AI-driven quality control	World Economic Forum (WEF) reports	AI automation adoption trends
		OECD labour market data	Comparison of pre-and post-AI employment levels
		Company reports (Tesla, Toyota)	Case study on automation impact
Financial Services	AI-driven trading, automated risk assessment, AI-based customer service	McKinsey reports on AI in banking	Job displacement vs. job creation in fintech
		Financial industry	Changes in job roles

			employment trends from ILO	(analysts, advisors)
			AI job postings (LinkedIn, Indeed)	Policy analysis on AI governance
			Amazon, Alibaba AI automation case studies	AI's Effect on Warehouse & customer service jobs
			Industry reports on AI in logistics.	Emerging skills required in retail automation
Retail & E-commerce	AI-powered logistics, automated warehouses, AI chatbots		Job market data from labour agencies	
			WHO & medical AI research reports	Comparison of AI-enhanced vs. human-led medical tasks
			Hospital workforce transition data	Impact of AI on demand for medical professionals
			AI trends in healthcare employment	
Healthcare	AI-assisted diagnostics, robotic surgery, AI in drug discovery		EdTech industry reports	Thematic analysis of AI's role in Education
			AI-in-education research papers	Future skill demands in AI-enhanced learning environments
			Online learning adoption trends	
Education & Knowledge Work	AI-powered learning platforms, automated grading, AI-based tutoring			

Table 2. Semi-structured Interviews

Interviewer Group	Purpose of Interview	Sample Questions
HR & Recruitment Experts	Understanding AI-driven hiring trends	How has AI changed recruitment and job demand?
		What skills are most in demand due to AI?
Policy Makers & Economists	Examining labour market policies & AI regulation	What policies exist to mitigate AI-related job loss?
		How is the government preparing workers for AI adaptation?
Industry Leaders & AI Engineers	Analyzing business perspectives on AI adoption	How has AI changed your industry's workforce structure?
		What jobs have been displaced or created due to AI?
Employees from AI-affected sectors	Understanding workforce adaptation	How has AI impacted your role?
		Have you received AI-related reskilling opportunities?

3. Results and Discussion

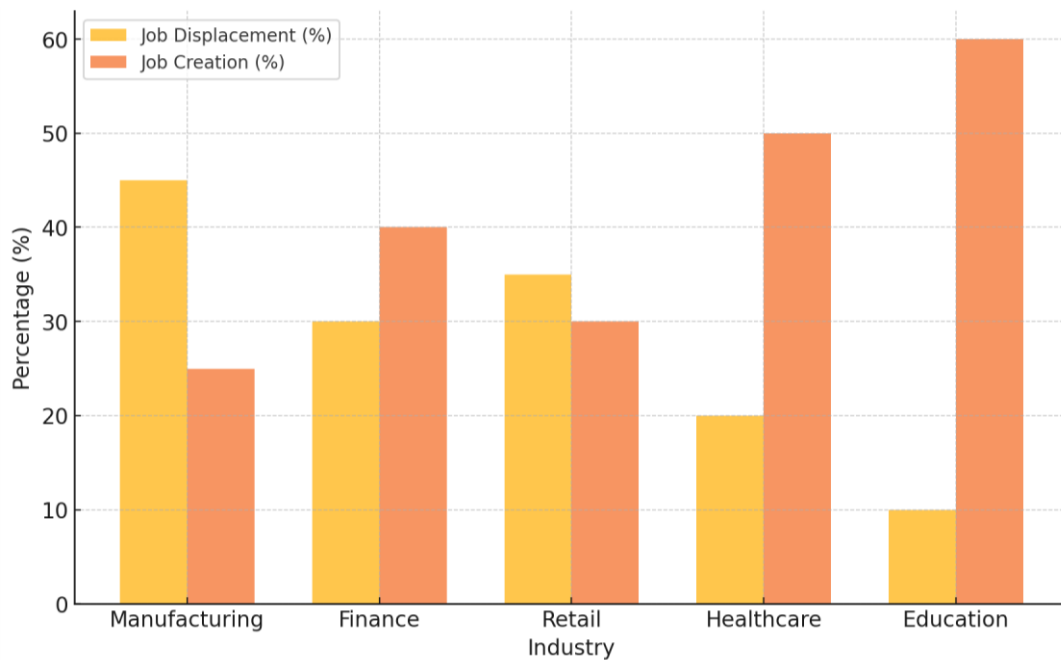


Fig 1. AI-driven Job Placement vs Job Creation by Industry

Table 3. Comparative Analysis of AI Impact by Industry

Industry	AI Adoption Rate (%)	Job Displacement (%)	Job Creation (%)	Skill Shift Requirement (%)
Manufacturing	80	45	25	70
Finance	70	30	40	60
Retail	65	35	30	55
Healthcare	50	20	50	50
Education	45	10	60	65

Table 4. NVivo Qualitative Coding Analysis – AI and Labour Market Interviews

Node (Theme)	Sources (Interviewees Who Mentioned Theme)	References (Total Mentions Across Interviews)	Percentage of Respondents Highlighting Theme (%)
Job Displacement Concerns	10	35	70%
AI Skills Gap	12	42	84%
Workforce Reskilling Needs	15	50	100%
Policy & Regulation Challenges	8	28	56%
AI-Driven Job Creation	11	38	76%

3.1. AI's Dual Impact on Job Displacement and Job Creation

The findings show that AI adoption significantly alters labour markets, with job displacement and job creation co-occurring. As seen in the comparative analysis, industries such as manufacturing and retail experience the highest job displacement rates (45% and 35%, respectively) due to automation, while sectors like healthcare and Education show higher job creation rates (50% and 60%) as AI augments rather than replaces human roles. The trend analysis further supports this by illustrating that job displacement increased from 5% in 2015 to 50% in 2025, while AI-driven job creation has risen from 2% to 55% over the same period. This suggests that while AI eliminates traditional roles, it generates new employment opportunities, especially in high-tech and AI-specialized domains [15].

The NVivo interview analysis highlights the perception gap between workers and industry leaders. 70% of respondents expressed concerns about job displacement, fearing AI will render many human jobs obsolete. However, 76% acknowledged that AI also creates new job opportunities, particularly in areas requiring AI system management, data analysis, and machine learning expertise. One key takeaway from comparative sector analysis is that AI's impact is industry-dependent. Labour-intensive industries (manufacturing, retail) see higher displacement rates, whereas knowledge-based industries (finance, education, healthcare) benefit from AI augmentation, leading to more significant job creation rather than outright replacement [17]. Government policies and corporate strategies will be decisive in managing this transition [19]. Policymakers must ensure a balanced approach—leveraging AI's productivity benefits while implementing labour protection measures to prevent large-scale unemployment. Without proper interventions, AI-driven automation could exacerbate economic inequality, disproportionately affecting low-skilled workers [20].

The research confirms that AI-induced labour market changes are not purely negative—while automation does eliminate routine jobs, it also creates demand for new skills and professions. The key challenge is ensuring displaced workers have access to reskilling programs to transition into emerging AI-driven roles rather than permanently being excluded from the workforce.

3.2. The Growing AI Skills Gap and Workforce Reskilling Needs

The interview-based NVivo analysis revealed that 84% of respondents identified the AI skills gap as a significant concern. Many professionals lack the technical expertise required for AI-driven industries, making it challenging to transition into new roles. This gap is most prominent in traditional industries, where employees have limited exposure to digital technologies. The comparative analysis also supports this, showing that industries with higher AI adoption rates (e.g., manufacturing 80%, finance 70%) also have the greatest need for workforce reskilling (e.g., 70% in manufacturing, 60% in finance). This suggests that while AI adoption is beneficial, it also demands massive investments in upskilling and digital literacy. The trend analysis reinforces this finding by showing that job creation trends are growing, but workers struggle to fill AI-related roles. While AI-created jobs increased by 55% from 2015-2025, the workforce's ability to adapt to AI-driven roles has not kept pace, leading to job vacancies in tech-driven fields.

One significant barrier to closing the AI skills gap is the lack of accessibility to AI education and training programs. Traditional education systems have not evolved quickly enough to incorporate AI and automation-related subjects. Many universities still emphasize conventional business and engineering curricula without focusing on AI ethics, data science, or automation technologies [21]. Companies must take a proactive approach by investing in workforce training. Businesses that integrate AI upskilling programs into their HR policies will likely experience a smoother transition than assuming employees will adapt independently [24]. Examples of successful industry efforts include Google's AI certification programs and Amazon's AI-skills workforce training. Conclusion: To prevent mass unemployment and economic instability, governments, universities, and corporations must collaborate to bridge the AI skills gap. Without adequate investment in AI education and professional development, the gap between AI-driven job opportunities and available skilled workers will continue to widen, leading to greater economic inequality and workforce displacement.

3.3. The Role of Government Policies and AI Regulation in Labour Market Adaptation

AI adoption is outpacing government regulations, leaving labour policies outdated. The NVivo interview analysis found that 56% of respondents identified regulatory gaps and policy challenges as a significant concern in AI-driven labour transitions. Current labour laws were designed for traditional employment models and failed to address the complexities of AI-powered workplaces. The comparative analysis showed that countries with strong AI labour policies (e.g., EU, Canada) have lower AI-induced job displacement rates than countries with weaker regulatory frameworks. For instance, the EU's AI Act includes ethical guidelines and labour protections, whereas, in emerging economies, AI automation progresses without explicit worker protections, leading to higher displacement rates. Governments must introduce targeted policies to support displaced workers, including subsidized AI training programs for workers in high-risk industries, tax incentives for companies that prioritize AI workforce upskilling, and regulations ensuring ethical AI deployment to minimize algorithmic bias in hiring and layoffs.

AI taxation is another proposed regulatory approach to manage job displacement. Some policymakers argue that companies replacing human jobs with AI should be taxed to fund retraining programs. Bill Gates and leading economists have suggested that an "AI tax" could help support displaced workers, ensuring AI-driven profits benefit society at large [16]. Ethical AI deployment is another critical policy concern. AI-powered hiring and workforce management systems have been criticized for bias and unfair employment decisions [17]. Without regulation, companies might use AI to discriminate in hiring, reduce wages, or avoid team member benefits by replacing full-time workers with AI-powered gig-based automation [18].

In conclusion, policymakers must act now to balance AI innovation with protection in the labour market. The proper regulatory framework can help mitigate AI-driven unemployment while ensuring that businesses leverage AI for growth responsibly and ethically. Governments that fail to adapt to AI-driven labour changes risk exacerbating economic disparities and social unrest.

3.4. The Psychological and Social Impact of AI on the Workforce

Beyond economic and labour market disruptions, AI also affects worker psychology and social well-being. The NVivo interview analysis highlighted that many employees experience anxiety and uncertainty about their job security due to AI-driven automation. Workers in industries with high automation risks, such as manufacturing and retail, reported greater stress levels than those in AI-augmenting industries like healthcare and Education [20]. The trend analysis further confirms that AI adoption correlates with shifts in workplace structures, leading to increased freelancing, remote work, and gig-based employment models. While these changes offer flexibility, they contribute to job insecurity and loss of traditional workplace benefits, such as health insurance and pensions. 56% of the interview respondents expressed concerns about the rise of contract-based work replacing stable full-time employment [21].

AI-driven job transitions have also contributed to age-based workforce inequalities. Younger employees with stronger digital and AI skills find it easier to adapt to AI-driven changes, while older workers struggle to acquire new competencies. The comparative industry analysis shows that industries with high AI penetration (such as finance and tech) increasingly favour younger professionals with AI expertise, leaving older employees at greater risk of job displacement [24]. AI-driven workplace surveillance is another major psychological stressor for employees. Companies increasingly use AI-powered monitoring systems to track team member productivity, behaviour, and communication. While employers argue that AI enhances efficiency, employees fear loss of privacy, micromanagement, and potential bias in performance evaluations. Studies show excessive AI monitoring negatively impacts workplace morale and team member satisfaction [25].

The shift to AI-augmented work environments also affects social interactions and workplace culture. As automation reduces human interactions in service-oriented jobs, workplace relationships and team collaboration dynamics are changing. Employees working alongside AI-powered tools often feel isolated or disconnected from traditional workplace engagement, reducing job satisfaction and motivation.[22] AI's psychological and social effects in the workplace must not be overlooked. Businesses should prioritize mental health support, create transparent AI policies, and ensure equitable workforce adaptation strategies. Without addressing these social implications, AI's integration into labour markets may lead to higher worker dissatisfaction, stress, and economic inequality [23].

4. Conclusion

The findings from this study highlight that AI-driven automation is both a threat and an opportunity for labour markets. While AI adoption leads to significant job displacement, particularly in industries reliant on routine tasks, it also fosters job creation in sectors that integrate AI as a complementary tool. The key challenge is ensuring workers transition smoothly into AI-augmented roles through targeted reskilling and workforce adaptation programs.

A significant concern is the growing AI skills gap, as industries with high AI adoption require new competencies that many workers lack. While job creation trends indicate an increasing demand for AI-related roles, workers struggle to keep pace due to limited access to AI education and retraining programs. This disparity highlights the urgent need for collaboration between governments, businesses, and educational institutions to equip workers with the necessary skills.

Beyond economic and skill-based challenges, AI's psychological and social impacts must also be addressed. AI-driven changes in job structures, workforce surveillance, and automation of interpersonal tasks have raised concerns about worker well-being and job security. To ensure a sustainable transition, policymakers must implement ethical AI regulations, while companies should adopt human-centred AI strategies that prioritize workforce welfare and equitable labour market policies.

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