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Responsible robot integration for inclusive and sustainable work

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Abstract
The growing integration of robots into workplace environments, propelled by the advances of Industry 5.0, is reshaping not only operational efficiency but also the social fabric of organizations. While automation offers significant productivity gains, it also risks exacerbating alienation, exclusion, and inequity if not responsibly managed. This conceptual paper examines how robotization impacts marginalized groups within organizations, including women, ethnic minorities, LGBTQ individuals, and employees with disabilities. Adopting an intersectional framework, the study connects responsible robot integration to the broader objectives of the United Nations' Sustainable Development Goals (SDGs), particularly SDG 12 (Responsible Consumption and Production) and SDG 8 (Decent Work and Economic Growth). Synthesizing insights from human-robot interaction, diversity management, and responsible innovation literature, the paper proposes a conceptual model outlining how robot design choices and organizational practices mediate inclusive or exclusive outcomes. It concludes by offering a future research agenda and practical implications for managers, designers, and policymakers committed to advancing socially sustainable digital transformations. Through this approach, the paper contributes to the emerging discourse on ensuring that technological progress aligns with principles of equity, justice, and long-term societal well-being.

Keywords Robot integration, Workplace inclusion, Responsible innovation, Industry 5.0, Sustainable development goals, Social sustainability

1 Introduction

The Fourth Industrial Revolution, often referred to as Industry 5.0, is defined by the growing integration of digital technologies such as robotics, artificial intelligence (AI), and the Internet of Things (IoT) into organizational processes and societal infrastructures. Among these advances, workplace robotization has emerged as a particularly transformative force, promising enhanced productivity, efficiency, and flexibility across a range of industries. Robots are now commonly deployed in sectors as diverse as manufacturing, healthcare, hospitality, and logistics, performing tasks that span from complex assembly operations to customer service interactions.

In this paper, the term robot refers specifically to physical, embodied robots integrated into human workplaces, including industrial robots, collaborative robots (cobots), and service robots designed for direct interaction with humans, rather than purely software-based bots or algorithmic systems. This focus encompasses robots performing physical tasks in proximity to humans, where social, ergonomic, and inclusion considerations are critical. This paper's conceptualization aligns with frameworks of physical human-robot interaction, which define robots based on their capacity to sense physical contact, render compliant behaviors, and plan safe, human-aware motions for collaborative work [1–3]. Specifically, Haddadin and Croft [1] emphasize that robots designed for physical human-robot interaction enable safer, more flexible, and more interactive operation with humans, while Kopp et al. [2] and Guertler et al. [3] outline practical and conceptual distinctions between traditional industrial robots, cobots intended for direct cooperation with human workers, and service robots deployed in sectors such as healthcare, hospitality, and retail. Accordingly, robots considered here explicitly exclude purely virtual agents, software-based automation (e.g., robotic process automation), or AI-only systems lacking any physical embodiment.

While the operational benefits of robotization have been extensively documented, a significant and underexplored question remains regarding its social consequences, specifically, how the integration of robots into workplace teams affects diversity, inclusion, and power dynamics, particularly among marginalized groups. Existing literature on physical human-robot interaction (pHRI) largely focuses on technical challenges, performance outcomes, and user acceptance, often sidelining critical issues related to social equity and the lived experiences of underrepresented employees [4, 5].

Recent research suggests that robots are not neutral actors; rather, they can reinforce existing biases through their design, deployment, and interaction scripts [6, 7]. When diversity, equity, and inclusion (DEI) principles are not explicitly embedded into the development and management of robotic systems, marginalized employees, including women, ethnic minorities, LGBTQ individuals, and employees with disabilities, may face new forms of exclusion or disadvantage within technologically enhanced workplaces. For instance, biases in robot perception, decision-making algorithms, or team role allocation may replicate and even amplify structural inequalities unless proactively addressed.

This gap is particularly concerning given global commitments to the United Nations' Sustainable Development Goals (SDGs). Marginalized employees, including women, ethnic minorities, LGBTQ individuals, and employees with disabilities, are uniquely vulnerable to exclusionary impacts of robot integration for several reasons. First, social biases embedded in robot design and deployment can mirror and amplify existing workplace inequalities, especially if robots are trained or programmed based on normative assumptions that overlook diverse identities [8, 9]. Second, marginalized workers are disproportionately concentrated in occupations with higher exposure to automation risks or in precarious roles where technological changes can destabilize job security [2, 3]. Third, physical and sensory limitations, often unaddressed in robot customization, can create new accessibility barriers for employees with disabilities, effectively excluding them from robot-enhanced workplaces [1]. Finally, intersectional identities can exacerbate these risks, as overlapping systems of discrimination compound the likelihood of being adversely affected by biased or poorly implemented robot systems. Recognizing

these differential impacts is essential to designing inclusive robot integration strategies that proactively mitigate, rather than entrench, systemic inequities.

For instance, Guertler et al. [3] discuss how social and cultural perceptions of technical competence during cobot implementation can lead to unequal participation in programming and maintenance tasks, potentially limiting opportunities for certain groups, such as women and minority workers, who are often stereotyped as less technically adept. Meanwhile, Haddadin and Croft [1] emphasize that robot safety standards and interaction control systems must account for diverse human capabilities, noting that insufficiently inclusive design can disadvantage individuals with mobility or sensory impairments by failing to accommodate their specific interaction needs. These examples illustrate tangible pathways through which marginalized employees may experience systemic disadvantages in robot-integrated workplaces, underscoring the need for intentional, inclusive design and management practices.

Specifically, *SDG 12 (Responsible Consumption and Production)* emphasizes the need to implement sustainable practices in innovation and technology development, while *SDG 8 (Decent Work and Economic Growth)* calls for inclusive and sustainable economic growth, employment, and decent work for all. Ensuring that robotization processes contribute to rather than detract from these goals thus represents a critical challenge for researchers, practitioners, and policymakers alike.

Despite the rising deployment of robots in organizational contexts, empirical and conceptual research on the intersection between robot integration and diversity and inclusion efforts remains limited. Even fewer studies approach this intersection from an explicitly intersectional perspective. Intersectionality, as conceptualized by Crenshaw [10], recognizes that individuals experience multiple, overlapping forms of discrimination based on their social identities. Applying an intersectional lens to human-robot collaboration is therefore crucial to understanding how robotization may differentially affect various groups and to designing interventions that promote equitable outcomes.

The central aim of this paper is to investigate whether, and how, the integration of robots into workplace teams mitigates or exacerbates inequalities among marginalized employees. Specifically, the study is guided by the following core question:

How does the integration of robots into workplace teams affect diversity, inclusion, and power dynamics, particularly for marginalized groups?

To address this question, the paper purposively adopts a conceptual and theoretical approach, synthesizing insights from the literature on human-robot interaction, diversity management, and responsible innovation. It proposes a conceptual framework that elucidates the mediating role of robot design choices and organizational practices in shaping inclusion outcomes. Through this synthesis, the paper contributes to emerging discussions on responsible robot integration and lays the groundwork for future empirical research on the social impacts of Industry 5.0 technologies.

The remainder of the paper is organized as follows. Section 2 presents a comprehensive review of the literature on robotization, diversity and inclusion, and responsible innovation, highlighting critical research gaps and the need for an intersectional, sustainability-oriented approach. Section 3 introduces the conceptual framework, outlining how robot integration processes are mediated by robot design choices and organizational practices and influenced by broader contextual moderators, ultimately shaping workplace inclusion and sustainability outcomes. Section 4 discusses practical and policy implications,

offering actionable recommendations for managers, human resource professionals, designers, and policymakers committed to ethical and inclusive technological adoption. Section 5 concludes the paper by summarizing key arguments, proposing a detailed future research agenda, and reflecting on the urgent need to align Industry 5.0 transformations with human-centered *SDG*s.

2 Literature review

2.1 Robotization and work transformation

The deployment of robots across industries has accelerated significantly over the past decade, fueled by advancements in artificial intelligence (AI), machine learning, sensor technologies, and broader digitalization trends associated with Industry 5.0. Robots are now integrated into diverse sectors, including manufacturing, healthcare, logistics, hospitality, and retail, performing functions that range from surgical assistance to customer service and warehouse management [6].

While early discussions around robot adoption primarily emphasized operational efficiency, cost reduction, and productivity gains, more recent scholarship has drawn attention to the broader societal implications of automation. Brynjolfsson and McAfee [11] argue that technological advances, if not responsibly managed, can disrupt labor markets, exacerbate inequality, and erode the quality of work. Similarly, the introduction of collaborative robots (cobots) raises important questions about worker autonomy, role negotiation, and psychological safety [12].

The efficiency versus social consequences debate centers on whether the benefits of robotization, such as increased output and reduced physical strain, outweigh the risks of job displacement, deskilling, and the amplification of workplace inequalities. Some scholars contend that technological change is inherently neutral, with social outcomes determined largely by regulatory and managerial decisions. Others argue that technology is socially constructed and often reproduces existing power structures and biases unless deliberate corrective actions are taken [5, 7].

Moreover, as Mutlu and Forlizzi [12] emphasize, robot integration within organizational settings does not occur in isolation. Organizational workflows, social structures, and environmental factors must adapt to accommodate robotic systems, and different organizational units may respond variably depending on their culture, readiness, and workforce composition. The interplay between technological change and social adaptation is thus critical to understanding the ultimate effects of robotization on workplaces.

2.2 Diversity, inclusion, and technology

As robots become increasingly embedded in organizational life, concerns surrounding diversity, equity, and inclusion (DEI) have gained prominence. Research shows that marginalized groups, including women, racial and ethnic minorities, LGBTQ individuals, and employees with disabilities, are often disproportionately affected by technological transformations [13]. However, the intersection of robotization and workplace diversity remains relatively underexplored.

Recent research highlights the growing recognition of diversity, equity, and inclusion (DEI) as essential considerations in human-robot interaction (pHRI). Workshops and systematic reviews reveal that pHRI studies often rely on WEIRD (Western, Educated, Industrialized, Rich, Democratic) populations, leading to limited representation of

diverse users and perpetuating biases in robot design and evaluation [6, 14]. For example, Seaborn et al. [14] identify systematic gaps in participant recruitment related to sex, gender, race, ethnicity, age, and disability, calling for more inclusive practices in both research and deployment.

Workshop-based initiatives, including the *Inclusive HRI* series, underscore the need to embed equity considerations at every stage of design and community engagement, emphasizing not only technical adjustments but also cultural and contextual awareness [15, 16]. These discussions stress that diversity must inform robot behavior, appearance, and communication modalities to avoid marginalizing users who deviate from assumed "default" profiles.

Moreover, recent work on gender and robots shows how design choices like gendered voices or appearances can reinforce stereotypes. Studies demonstrate that female-coded robots are often perceived as more sociable but less competent, reflecting harmful biases that can limit the roles marginalized individuals are offered or expected to occupy in human-robot teams [17, 18]. Other research proposes design strategies, such as gender-neutral or gender-ambiguous robots, to reduce the entrenchment of gender norms [19].

Together, these insights reveal that ignoring DEI considerations during robot integration risks exacerbating existing workplace inequalities, particularly for women, racial and ethnic minorities, LGBTQ individuals, and employees with disabilities. They point out the importance of designing robots and implementing organizational practices that account for diverse social identities, abilities, and cultural contexts.

Intersectionality, a concept introduced by Crenshaw [10], offers a critical framework for analyzing how overlapping social identities shape individuals' experiences of inclusion and exclusion. An intersectional approach reveals that marginalized employees are not affected by technology in uniform ways; rather, their experiences are mediated by the interplay of gender, race, disability, age, and other identity markers. This complexity demands careful attention to how new technologies, including robots, may replicate or challenge existing systems of inequality.

Technological systems, including robotic platforms, frequently inherit and perpetuate biases present in their design and programming. For example, Tanevska et al. [6] demonstrate that pHRI systems often reflect normative assumptions about users, leading to exclusionary experiences for individuals who do not fit the presumed "default" user profile. Similarly, Patel et al. [7] highlight ethical concerns around algorithmic bias in robot behavior, emphasizing the requirement for inclusive design principles to avoid discriminatory outcomes.

Recent initiatives within the pHRI community, including the *3rd Workshop on Inclusive HRI*, emphasize the urgent need to integrate DEI principles into the design, application, and evaluation of robotic systems [15].

The integration of robots into workplace teams thus has multifaceted effects on diversity, inclusion, and power dynamics, particularly for marginalized groups. On the one hand, robots can positively contribute to diversity and inclusion initiatives. For instance, Sebo et al. [4] found that robots providing verbal support can enhance the participation of outgroup members in team interactions, fostering a more inclusive environment. On the other hand, human-robot teams remain vulnerable to challenges related to prejudice and stereotypes. Research by Wullenkord and Eyssel [20] suggests that while stereotype suppression can effectively reduce negative attitudes toward robots, perspective-taking

interventions may paradoxically exacerbate biases, indicating the need for nuanced DEI strategies in human-robot collaboration.

Customization also plays a significant role in ensuring inclusive robot integration. Collaborative robots can greatly aid the inclusion of people with disabilities by adapting to individual needs, thereby making workplaces more accessible. However, such benefits are contingent on careful customization and genuinely user-centered design processes [10, 21].

Robot integration also reshapes team power dynamics. While verbal support from robots has been shown to boost participation by outgroup members, it can simultaneously lower the perceived obligation of ingroup members to support marginalized colleagues, potentially entrenching subtle exclusionary practices [12]. Moreover, experiences of verbal ostracism by robotic coworkers can harm psychological well-being and negatively influence subsequent human interactions, highlighting the importance of careful attention to relational dynamics in human-robot teams [22].

Design and implementation choices are therefore crucial. Embedding DEI principles into robotic system design is essential for preventing the amplification of existing biases and for respecting differences in gender, age, disability status, and other identity categories [6, 11]. Furthermore, successful robot integration requires not only technical deployment but also the adaptation of organizational workflows, social norms, and performance evaluation systems to accommodate new forms of collaboration [7].

To build more inclusive human-robot workplaces, organizations must invest in training and awareness initiatives that address biases toward both human and robotic coworkers. Such interventions can foster more equitable collaboration and reduce the risks of stereotype-driven exclusion [9, 12]. Robots should be developed according to inclusive design principles that proactively meet the diverse needs of users [5, 23], while organizations must implement robust monitoring and evaluation mechanisms. Key performance indicators (KPIs) should be established to track the effects of robots on worker well-being, safety, and performance, enabling continuous improvement of human-robot interaction practices [24].

Barfield [8] emphasizes that inclusive design in pHRI requires recognizing the diversity of potential robot users from the outset, including differences in gender, race, ability, and cultural background. Barfield argues that failing to consider diverse user perspectives risks reinforcing exclusionary norms and calls for participatory approaches to robot design that center marginalized voices. These recommendations underscore the need for intentional engagement with underrepresented groups throughout the design and deployment of robots to ensure that technologies do not perpetuate systemic biases or inequities.

Complementing this, Ostrowski et al. [9] provide a comprehensive review of ethics, equity, and justice challenges in pHRI. They identify key equity concerns such as biased datasets, inaccessible interaction paradigms, and exclusionary assumptions embedded in robot behaviors, while offering future research directions to advance justice-oriented pHRI. Their work highlights that equity must be considered not only in technical design but also in data governance, evaluation practices, and stakeholder engagement across the entire pHRI lifecycle.

Together, these contributions build on earlier research showing that marginalized users frequently encounter barriers to effective human-robot collaboration [8, 9]. They

reinforce the importance of embedding DEI principles in robot design and workplace integration strategies. Integrating these insights into organizational practices and technical standards can help ensure that robots support, rather than undermine, diverse employees' participation, well-being, and professional development.

These recent contributions to DEI in pHRI literature build on earlier findings regarding the risks of bias and exclusion in technological systems, further underscoring the critical need for proactive, inclusive design strategies. While robot integration presents novel opportunities to enhance diversity and inclusion, it also introduces significant risks. Addressing biases, customizing technological solutions for marginalized groups, and prioritizing inclusive design are critical strategies for supporting equitable human-robot collaboration and building socially sustainable workplaces.

2.3 Responsible innovation and sustainability

Responsible Research and Innovation (RRI) provides a valuable conceptual framework for addressing the ethical, social, and environmental implications of technological advancements. RRI advocates for anticipating potential societal impacts, incorporating diverse stakeholder perspectives, and maintaining iterative reflection and responsiveness throughout the innovation process [25].

The field of responsible innovation (RI) in robotics has evolved to provide frameworks for proactively considering the ethical, legal, and social implications (ELSI) of robot design and deployment. Lukkien et al. [26] illustrate that while principles of responsible innovation are widely endorsed, their integration into R&D practice often falters due to limited collaboration across design and implementation teams and misconceptions about co-design. They advocate for participatory action research as a tool for aligning robot design with diverse stakeholder needs, especially marginalized groups.

Salvini et al. [27] emphasize incorporating ethics by design and public engagement as key to ensuring that robotics innovation supports societal values, not just technological performance. Similarly, McBride and Stahl [28] call for iterative design and transparent processes to make robotics research socially embedded and ethically informed.

Sector-specific research, such as Ayris et al. [29] on agricultural robotics, shows how responsible innovation frameworks can guide technology deployment in ways that address power dynamics and foster trust with vulnerable communities. Studies on UAV use in agriculture [30] and mobile robots in citizen learning [31] further demonstrate how bottom-up approaches can empower users, improve acceptance, and build equity into innovation.

Collectively, these works demonstrate that responsible innovation must move beyond compliance checklists toward practices that actively anticipate and mitigate social risks, particularly for groups already facing structural disadvantages. This perspective is crucial to aligning Industry 5.0 transformations with the *UN SDG*s, ensuring robotic integration contributes to socially sustainable and inclusive workplaces.

Owen, Macnaghten, and Stilgoe [25] argue that technological development should shift from a purely science-driven agenda to one that is socially embedded and ethically informed. This perspective resonates strongly with the goals of the *UN SDG*s, particularly *SDG 12 (Responsible Consumption and Production)* and *SDG 8 (Decent Work and Economic Growth).* Robot integration into workplaces must thus be evaluated not only in

terms of operational efficiency but also in terms of its contribution to, or detriment of, global sustainability and equity goals.

Applying an RRI perspective to robot integration emphasizes four interconnected principles:

- Anticipation: Forecasting potential social risks, such as the exacerbation of inequality;
- Reflexivity: Recognizing and critically reflecting on the values embedded in technological choices;
- Inclusion: Actively engaging diverse voices throughout design, deployment, and governance processes; and.
- Responsiveness: Adapting technologies based on societal feedback and evolving ethical norms.

The application of these principles becomes particularly urgent when considering how workplace robotization may impact marginalized groups. Zirar, Ali, and Islam [13] extend the RRI framework specifically to AI and workplace technologies, warning that without deliberate and systemic interventions, automation may systematically disadvantage vulnerable populations, undermining efforts toward inclusive economic development.

Moreover, Mandischer et al. [5] emphasize the value of socially sustainable technological transitions, showing that inclusive human-robot collaboration not only benefits marginalized employees but also enhances organizational resilience and fosters innovation capacity. By embracing inclusive robotics, organizations meaningfully contribute to the *UN SDGs* while positioning themselves as ethical leaders in the emerging digital economy.

To operationalize responsible innovation in the context of robot integration, organizations must move beyond mere compliance or diversity rhetoric. Instead, they must embed social sustainability into their technology strategies from the outset. This entails intentional practices such as inclusive design, monitoring and evaluation of social impacts, customization for diverse needs, and the establishment of organizational guidelines that prioritize psychological well-being, safety, and performance [23, 24].

Ultimately, responsible robot integration must be guided by principles of equity, inclusion, and sustainability to ensure that technological progress advances, rather than impedes, the broader societal goals of fairness, justice, and human flourishing. Without deliberate attention to these dimensions, the promise of Industry 5.0 risks becoming yet another engine of inequality rather than a catalyst for sustainable development.

3 Conceptual framework and research agenda

Building on insights from responsible innovation, human-robot interaction, and intersectionality literature, this paper proposes a conceptual framework that examines how robot integration processes influence workplace inclusion and social sustainability. As illustrated in Fig. 1, robot integration acts as a central technological driver that can lead to either inclusive or exclusionary outcomes, depending on critical mediating factors.

3.1 Key concepts and relationships

Robot integration refers to the introduction and assimilation of robotic systems into human work environments. This process encompasses not only the technical aspects of

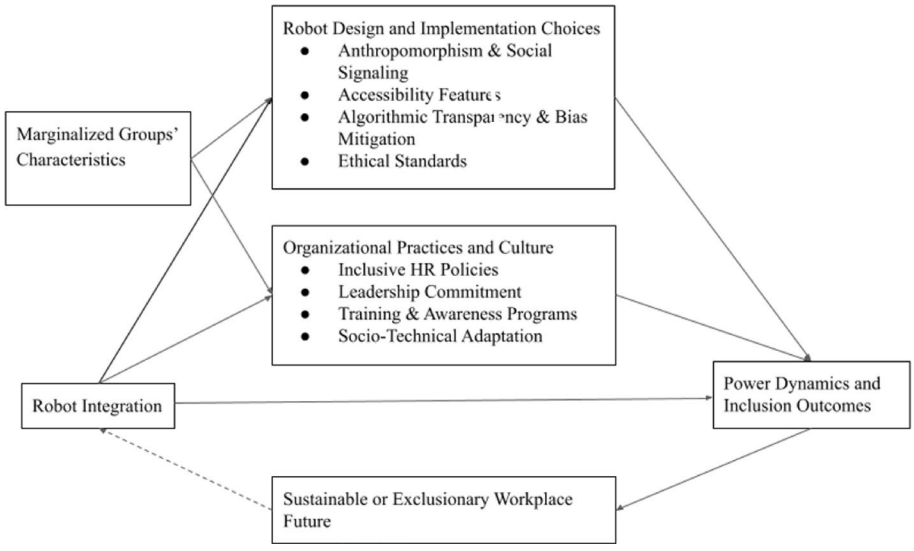

Fig. 1 illustrates the conceptual framework developed in this paper

robot deployment, task design, and workflow adjustments but also the social dynamics introduced by the presence of non-human team members [12]. Far from being a purely operational change, the integration of robots into the workplace constitutes a profound transformation of human-technology interactions with wide-ranging social implications.

The conceptual model proposed in this paper emphasizes that robot integration does not deterministically impact workplace outcomes. Rather, its effects are mediated by two critical factors: the design and implementation choices made during the development of robots, and the organizational practices and cultures into which these robots are introduced. These mediating elements shape how robotization interacts with existing social structures, biases, and equity initiatives, thereby playing a decisive role in determining the social outcomes of technological change.

Depending on the quality and orientation of these mediating processes, workplaces may experience two divergent trajectories. On one hand, robot integration can support the development of sustainable, inclusive work environments aligned with *SDG 8 (Decent Work and Economic Growth)* and *SDG 12 (Responsible Consumption and Production).* On the other hand, if poorly managed, robot integration may exacerbate existing inequalities, leading to increased marginalization, social exclusion, and injustice within organizations.

Thus, the framework proposed here underscores that technological change is neither inherently progressive nor regressive. Its social consequences are contingent on conscious, responsible human choices made at the levels of design, deployment, and organizational governance. Recognizing and managing these choices thoughtfully is essential for ensuring that robot integration contributes to, rather than undermines, sustainable and equitable futures.

3.2 Mediating factors

3.2.1 Robot design and implementation choices

Robot design decisions profoundly influence workplace dynamics and are far from being merely technical exercises. Among the most critical design attributes are anthropomorphism and social signaling, the extent to which robots display human-like features.

Research indicates that anthropomorphic design significantly shapes employee perceptions of robots, affecting whether they are seen as helpful colleagues, neutral tools, or competitors [12]. This perception, in turn, impacts interpersonal dynamics, trust, and collaboration within teams.

Another essential dimension is algorithmic transparency and accountability. Robots whose decision-making processes are opaque may erode trust, particularly among marginalized employees who already experience systemic biases in traditional workplace structures. In contrast, transparent and explainable robot behaviors can reduce perceived biases and foster greater user confidence [23]. Algorithmic design choices thus play a pivotal role in either reinforcing or mitigating social inequities.

Accessibility features also emerge as critical elements in promoting workplace inclusion. Robots equipped with customizable interfaces, adaptive controls, and assistive functionalities can significantly enhance the participation of workers with disabilities or other specific needs [5, 10]. Absent such design considerations, robot deployment risks reproducing ableist assumptions about a "universal" worker.

Finally, embedding ethical design standards into robot development processes is necessary to ensure that principles such as fairness, respect for autonomy, and non-discrimination are upheld. As Tanevska et al. [6] argue, technical specifications themselves must reflect social values if robots are to serve as instruments of inclusion rather than exclusion.

Taken together, these aspects demonstrate that robot design is not a neutral or purely functional endeavor. Rather, it constitutes a critical site where decisions about values, inclusion, and justice are made, often with profound consequences for workplace equity and sustainability.

3.2.2 Organizational practices and culture

Equally important to robot design are the organizational structures and cultures into which robots are deployed. Organizational practices can significantly mediate how technological innovation impacts workplace dynamics, either mitigating or exacerbating social inequalities.

First, human resource management (HRM) policies play a pivotal role. Inclusive recruitment, training, promotion, and grievance-handling practices ensure that automation does not disproportionately harm marginalized groups. Without intentional HR interventions, the risk of deepening existing workplace inequalities increases markedly [24]. Organizations that embed equity principles into their HRM systems are better positioned to manage the disruptive impacts of robotization responsibly.

Leadership also emerges as a critical factor. Leadership styles and managerial attitudes toward diversity, inclusion, and technology adoption directly influence how thoughtfully robot integration is managed. Transformational and inclusive leaders are more likely to anticipate social risks, engage in open dialogue with diverse stakeholders, and champion equitable robot deployment strategies [13]. Conversely, technocratic leadership approaches that prioritize efficiency over inclusion risk reinforcing exclusionary outcomes.

Another key dimension is the establishment of training and awareness programs that address both explicit and implicit biases related to technology and diversity. Initiatives that raise awareness of stereotype-driven perceptions, whether directed at human

coworkers or robotic systems, can help foster more inclusive team dynamics and mitigate exclusionary behaviors [9]. Such programs create critical reflexive spaces where employees can engage with the social implications of technological change.

Finally, socio-technical adaptation within organizations is essential. Workflows, team norms, and performance evaluation systems must be reconfigured to accommodate the realities of human-robot collaboration, ensuring that robots are integrated in ways that respect human dignity and promote equitable participation [12]. Organizations that fail to undertake this socio-technical alignment risk creating environments where robotic integration inadvertently marginalizes vulnerable groups.

Organizational culture and practice thus decisively mediate the social consequences of robot integration. Rather than passively accepting technological change, organizations must actively design equitable structures and foster inclusive cultures to ensure that technological innovation becomes a driver of social sustainability rather than exclusion.

3.3 Other moderating factors

Beyond the primary mediators of robot design and organizational culture, several moderating factors can influence the strength, direction, and complexity of robot integration's effects on workplace inclusion and social sustainability. These contextual variables highlight that technological and organizational choices do not operate in a vacuum but are shaped by broader structural conditions.

One important moderator is organizational size and resource availability. Larger firms often have greater capacity to invest in sophisticated, inclusive robot integration strategies, including customized training programs, accessible technological adaptations, and proactive diversity initiatives. In contrast, smaller firms may face significant financial and operational constraints, limiting their ability to implement best practices and resulting in more uneven or exclusionary outcomes.

The sectoral context also matters greatly. Industries such as healthcare, manufacturing, retail, and education differ markedly in their technological needs, work processes, and workforce compositions. For example, human-robot collaboration in healthcare may emphasize empathy and trust, whereas in manufacturing, efficiency and physical safety might take precedence. These sector-specific dynamics create distinct challenges and opportunities for achieving inclusive automation.

Another crucial factor is the national and regional regulatory environment. Labor laws, equality mandates, occupational safety standards, and technological norms vary significantly across countries and regions. In jurisdictions with robust equality protections and strong governance structures, organizations may be incentivized or even mandated to prioritize social sustainability in their robot deployment strategies. Conversely, in less regulated environments, firms may experience fewer external pressures to align technological innovation with broader societal goals.

Finally, the demographic composition of the workforce and the organization's prior commitment to diversity and inclusion shape how robot integration unfolds. Organizations with an established culture of valuing diversity, equity, and inclusion (DEI) are more likely to anticipate potential risks, engage marginalized voices in technology adoption processes, and proactively design for equity. In contrast, firms with limited or superficial DEI engagement may inadvertently reproduce or intensify existing inequalities through uncritical automation practices.

Together, these moderating factors suggest that responsible robot integration is a deeply multi-layered phenomenon. It cannot be fully understood or managed without careful attention to the broader organizational, sectoral, regulatory, and cultural contexts within which technological change occurs. Recognizing these influences is essential for moving beyond simplistic narratives of automation and toward a more nuanced, equity-centered approach to technological transformation.

3.4 Conceptual model

Figure 1. *Conceptual framework illustrating how robot integration, mediated by specific constructs within robot design choices, organizational practices, and marginalized groups' characteristics, shapes power dynamics, workplace inclusion, and social sustainability.*

The model identifies robot integration as a central technological driver that can lead to either inclusive or exclusionary outcomes, depending on two key mediators. The first is *robot design and implementation choices*, which encompass critical decisions such as the degree of anthropomorphism, the transparency of algorithmic processes, the incorporation of accessibility features, and the adherence to ethical design standards. The second mediator is *organizational practices and culture*, which includes human resource management (HRM) policies, leadership styles, diversity and inclusion initiatives, training and awareness programs, and broader socio-technical adaptations within the workplace.

These mediating factors collectively influence *power dynamics and inclusion* within human-robot teams. Depending on the interplay between robot design choices and organizational practices, workplaces may either progress toward sustainable, inclusive environments that support marginalized groups or regress toward increased marginalization, social exclusion, and inequality patterns.

This conceptual model underscores that technological change alone does not determine organizational or societal outcomes. Rather, it is the conscious and responsible management of robot integration processes, at both the technological and organizational levels, that critically shapes whether robotization advances or undermines *SDG*s.

To provide greater theoretical clarity, the framework details specific constructs illustrating how marginalized groups' characteristics interact with robot integration processes. Robot design and implementation choices include anthropomorphism and social signaling, which refer to gendered, racialized, or age-associated design cues that can shape marginalized employees' perceptions of safety, competence, and belonging. Accessibility features, such as customizable controls, adaptive interfaces, and assistive functionalities, accommodate diverse physical, sensory, and cognitive abilities. Algorithmic transparency and bias mitigation involve designing robots with explainable decision-making processes and auditing algorithms for fairness to reduce the replication of existing biases. Ethical standards emphasize applying design justice principles to ensure robots do not reinforce stereotypes or exclusionary norms.

Within organizational practices and culture, inclusive HR policies encompass recruitment, promotion, training, and grievance mechanisms that preempt and address inequities amplified by robot integration. Leadership commitment involves managers' proactive engagement with marginalized employees to identify potential barriers and opportunities during technology adoption. Training and awareness programs target the mitigation of implicit biases toward both robots and marginalized human colleagues, fostering more equitable collaboration. Socio-technical adaptation refers to adjusting

workflows, performance evaluation systems, and team norms to integrate robots in ways that prioritize equity and psychological safety.

The characteristics of marginalized groups can interact with these mediators through mechanisms such as stereotype amplification, where marginalized employees may be assigned fewer skill-building tasks or less visible roles based on biased robot behaviors or perceptions. Exclusion from skill development can occur when barriers prevent access to robot-related technical upskilling, reinforcing occupational segregation. Additionally, psychological impacts, including experiences of alienation, stress, or reduced belonging, can arise when robot design or integration processes fail to consider diverse needs.

3.5 Future research agenda

Given the emergent and rapidly evolving nature of human-robot work environments, there is an urgent need for further research to deepen our understanding of how responsible technological integration can be achieved. Several key areas of inquiry emerge from the proposed conceptual framework.

First, future studies should focus on the relationship between robot design and inclusion outcomes. It is crucial to investigate how specific design features, such as voice characteristics, physical appearance, and responsiveness, shape the experiences of employees from diverse social backgrounds. Questions about which inclusive design principles are most effective across different industry sectors remain largely unanswered. Research in this domain could provide critical guidelines for engineers, designers, and organizations seeking to align robot development processes with equity goals.

Another important area of exploration concerns organizational adaptation processes. As robots are introduced into workplaces, human resource management (HRM) policies, leadership practices, and workplace norms inevitably evolve. Further inquiry is needed to uncover how HR systems adapt to support equitable integration, which leadership styles are most effective in fostering inclusive human-robot collaboration, and how organizations can systematically measure and monitor inclusion outcomes over time.

A third avenue for investigation relates to the intersectional impacts of robot integration. Little is currently known about how overlapping social identities, such as gender, disability, race, and ethnicity, mediate workers' experiences of robotic collaboration. Understanding whether robot integration can exacerbate or mitigate intersectional marginalization is critical to making sure that automation advances rather than undermines diversity and inclusion goals.

Further research is also warranted on the longitudinal effects of robot integration. Few studies have examined the long-term consequences of working alongside robots, particularly for marginalized employees. Key questions include whether early interventions and inclusive robot designs lead to cumulative advantages over time in terms of career progression, job satisfaction, and psychological well-being. Longitudinal studies could offer vital details about the lasting social impacts of automation and inform best practices for human-robot workplace design.

Finally, the policy and regulatory implications of responsible robot integration require greater scholarly attention. Research should explore what types of regulatory frameworks are necessary. This effort aims to ensure that technological innovation supports the *Sustainable Development Goals* (*SDG*s), especially *SDG 8 (Decent Work and*

Economic Growth) and *SDG 12 (Responsible Consumption and Production).* Investigations into how public policy can incentivize socially responsible technology deployment across different organizational contexts would meaningfully contribute to both academic debates and practical policymaking.

Together, these future research directions demonstrate the need for interdisciplinary, context-sensitive, and equity-driven approaches to studying human-robot workplace collaboration. Only through sustained inquiry into these complex dynamics can scholars and practitioners hope to guide technological innovation toward truly inclusive, equitable, and sustainable outcomes.

4 Implications for practice and policy

The integration of robots into workplace teams presents both significant opportunities and serious risks for diversity, equity, and inclusion. Insights from research on human-robot interaction, diversity management, and responsible innovation highlight how design choices, organizational practices, and marginalized groups' characteristics interact to shape workplace inclusion and social sustainability outcomes. Translating these findings into actionable guidance, this section outlines recommendations for managers, human resource professionals, designers, and policymakers committed to ensuring that technological advancement supports equitable and sustainable futures.

Ensuring that robot integration enhances, rather than undermines, workplace inclusion and social sustainability demands proactive interventions at multiple levels.

From a managerial perspective, it is imperative to recognize that technological deployment is not a neutral process. Managers play a central role in shaping how robots are integrated into teams and how inclusion goals are prioritized throughout this transition. Organizations must therefore develop and institutionalize inclusive robot deployment policies that explicitly consider the needs of marginalized employees. These policies should require that new technologies undergo equity impact assessments before adoption, ensuring that potential biases in robot design and implementation are identified and addressed. Managerial decisions regarding task allocation, workflow redesign, and performance evaluation must be made through a DEI-informed lens to prevent the emergence of new forms of occupational stratification or exclusion.

As highlighted by Seaborn et al. [14] and Mandl et al. [17], barriers such as stereotype amplification and exclusion from skill development can arise when marginalized employees are overlooked during technology integration. Organizations should implement HR policies that proactively identify and address these risks, ensuring equitable access to training opportunities for robot-related tasks and fair assignment of skill-building responsibilities.

Consistent with findings from Haddadin and Croft [1] and Tanevska et al. [6], robot design features such as adaptive interfaces, customizable controls, and assistive functionalities are essential to accommodate diverse physical, sensory, and cognitive needs. Developers should prioritize inclusive design principles from the outset, aligning technological innovation with accessibility standards to support employees with disabilities.

Literature on organizational dynamics (e.g., Zirar et al. [13]; Guertler et al. [3]) underscores the moderating role of leadership in fostering equitable technology adoption. Managers who engage marginalized employees, anticipate potential exclusionary

impacts, and model inclusive attitudes set the stage for responsible robot integration that benefits all workers.

Human resource management practices are also critical to the success of inclusive robot integration. Traditional HRM frameworks, which often assume exclusively human actors, must be reimagined to account for human-robot collaboration dynamics. Recruitment and onboarding processes should prepare employees to work alongside robotic systems in ways that foster mutual respect, psychological safety, and equitable task-sharing. Moreover, team-building initiatives should explicitly incorporate robots as members of diverse, functional teams, emphasizing their role as tools for empowerment rather than replacements for human labor. Regular training programs that address unconscious biases toward both marginalized human coworkers and robotic colleagues are essential for cultivating inclusive workplace cultures. To ensure continuous improvement, organizations should institutionalize periodic inclusion audits that evaluate how robot integration affects different employee groups in terms of participation, career advancement, job satisfaction, and well-being.

Beyond the organizational sphere, important policy implications must be considered. Governments and regulatory bodies bear responsibility for ensuring that the rapid spread of workplace automation aligns with social equity goals. Regulatory frameworks governing the ethical use of robots must move beyond technical safety standards to incorporate principles of fairness, non-discrimination, and inclusion. These frameworks should mandate that organizations deploying workplace robots conduct equity audits as part of their compliance requirements. Furthermore, policymakers should consider offering incentives, such as tax breaks or innovation grants, to companies that demonstrate exemplary inclusive robot integration practices. Public procurement policies could also serve as powerful levers by requiring that vendors adhere to ethical and inclusive design standards when supplying robotic systems to public sector organizations.

Another critical area for policy intervention involves data governance and algorithmic accountability. Since robot behaviors are often driven by machine learning algorithms trained on historical data, there is a risk that existing social biases will be embedded into new robotic systems. Regulators must therefore require transparency regarding the data sources and training methodologies used in robot development. Independent third-party auditing mechanisms should be established to assess whether workplace robots meet inclusion and non-discrimination standards before and after deployment.

The implications extend into broader societal debates about ethical consumption and sustainable development. As consumers become increasingly attuned to the social and environmental impacts of production processes, the inclusivity of workplace automation may emerge as a key concern in ethical consumption choices. Companies that integrate robots responsibly, ensuring that automation promotes decent work and social sustainability, could gain reputational advantages among increasingly conscientious consumers. Conversely, firms that use automation to displace marginalized workers or exacerbate inequities may face backlash from stakeholders who expect businesses to uphold human rights and sustainability standards.

From the perspective of sustainable development, responsible robot integration offers an opportunity to advance multiple *SDG*s simultaneously. In addition to contributing to *SDG 8 (Decent Work and Economic Growth)* and *SDG 12 (Responsible Consumption and Production)*, inclusive automation strategies can support *SDG 10 (Reduced Inequalities)*

and *SDG 5 (Gender Equality)* by mitigating the risks of automation-driven marginalization. However, realizing these benefits requires deliberate alignment between technological innovation, organizational governance, and public policy interventions.

The future of work in a robotized world will depend on today's choices about technology design, implementation, and governance. Organizations must move beyond efficiency-driven narratives of automation and instead adopt a broader vision of technological progress that centers on human dignity, fairness, and inclusivity. Similarly, policymakers must act to ensure that technological innovation serves public interests rather than merely corporate profits. Embedding DEI principles into robot integration processes is not only an ethical imperative but also a strategic necessity for building resilient, innovative, and sustainable organizations in the digital age.

The stakes are particularly high given the accelerating pace of technological change. Without deliberate intervention, there is a risk that automation will deepen existing social divides, leaving marginalized groups further behind. Conversely, if robot integration is managed responsibly, it can serve as a powerful lever for expanding opportunities, fostering social cohesion, and advancing the goals of a more equitable and sustainable global economy. Therefore, both practitioners and policymakers must approach robotization not as an isolated technological project but as a deeply social and ethical endeavor requiring careful stewardship.

5 Conclusion

This paper has argued that the integration of robots into workplace environments is not merely a technical evolution but a profound social transformation that must be guided by principles of diversity, equity, inclusion (DEI), and sustainability. Drawing on insights from responsible research and innovation (RRI), physical human-robot interaction (pHRI), and intersectionality theory, a conceptual framework was proposed to illustrate how robot integration processes are mediated by design and organizational choices, shaping inclusion outcomes and broader workplace power dynamics. Far from being inevitable or neutral, the effects of robotization on work are deeply contingent on human decisions about how new technologies are developed, deployed, and managed.

The analysis revealed that inclusive robot integration can enhance workplace diversity, expand opportunities for marginalized groups, and contribute to *SDG*s such as *Decent Work (SDG 8)* and *Responsible Consumption and Production (SDG 12).* However, without deliberate interventions, there is a real risk that robotization could exacerbate existing inequalities, marginalize vulnerable workers, and undermine efforts toward sustainable and equitable development. Technological advancement, in itself, does not guarantee social progress; responsible governance of innovation is essential.

Given the accelerating pace of Industry 5.0 transformations, there is an urgent need to reframe technological innovation agendas around human-centered and socially sustainable goals. Organizations must move beyond narrow efficiency logics and embrace inclusive robot deployment policies that prioritize equity and fairness alongside productivity. Human resource management (HRM) practices must evolve to foster inclusive team dynamics that integrate robots as collaborators rather than disruptors of social cohesion. Policymakers, for their part, must implement regulatory frameworks that embed inclusion standards into the very fabric of workplace automation.

At the same time, it is clear that addressing the social challenges of robotization cannot be achieved through technological or managerial solutions alone. A genuinely responsible approach to robot integration demands multidisciplinary collaboration across fields such as engineering, computer science, organizational studies, sociology, psychology, and ethics. Future research must interrogate the long-term, intersectional impacts of robotization and explore the unintended consequences of automation and design innovative interventions that align technological advancement with human flourishing.

The vision of Industry 5.0 must be reimagined as more than a race toward technological sophistication; it must be recast as a project of human-centered sustainable development. Embedding values of inclusion, fairness, and social responsibility into every stage of technological innovation is crucial for increasing the likelihood that the promises of Industry 5.0 benefit all members of society, rather than reinforcing existing inequities or creating new forms of exclusion.

Building on the conceptual framework outlined in this paper, the following research questions are proposed to guide future investigations into the inclusive and sustainable integration of workplace robots:

1. *How do different robot design features (e.g., appearance, voice, responsiveness) affect marginalized employees' experiences of inclusion?*
   Existing studies, e.g [17, 18]. , , focus on gendered robot design, but broader inclusive design features for other marginalized groups remain unexplored.
2. *What organizational practices most effectively mitigate bias and exclusion in human-robot teams?*
   Organizational dynamics in pHRI are discussed conceptually, e.g [28]. , , yet empirical validation on practical DEI strategies is lacking.
3. *How do intersectional identities (e.g., gender, disability, ethnicity) mediate experiences of working alongside robots?*
   There is an absence of research specifically addressing how overlapping identities shape experiences in human-robot workplaces.
4. *What leadership styles and managerial approaches best support equitable robot integration?*
   Leadership's moderating role is recognized [13], but evidence-based recommendations for inclusive leadership in robotized teams remain unexamined.
5. *How does robot integration influence psychological well-being and organizational belonging over time?*
   There is a lack of longitudinal studies on how robot integration affects psychological well-being and organizational belonging among marginalized employees.
6. *What are the long-term career impacts of robotization for marginalized workers?*
   There is no empirical work exploring how robot integration affects long-term career trajectories or progression among vulnerable groups.
7. *How can inclusive design principles for workplace robots be operationalized across diverse industries?*
   While inclusive design has been suggested conceptually, e.g [8]. , , operationalizing these principles across sectors remains unstudied.
8. *In what ways do national labor laws and technology standards shape organizational approaches to ethical robot use?*

Although regulatory discussions exist (e.g., the EU AI Act), they do not connect specific labor standards with the equity implications of robot integration.

9. *How does the prior organizational commitment to DEI affect the outcomes of robot deployment?*
   There is an absence of research examining how existing DEI cultures shape the social consequences of automation and robot deployment.
10. *What role do workers' perceptions of robots as competitors versus collaborators play in shaping inclusion outcomes?*
    Some studies, e.g [4]. , , show robots influencing team dynamics, but perceptions among marginalized workers specifically remain underexplored.
11. *How can organizations measure the impact of robot integration on diversity and inclusion metrics over time?*
    There is no guidance on developing DEI metrics specific to human-robot collaboration.
12. *What regulatory mechanisms are most effective in ensuring that workplace robots adhere to fairness and non-discrimination standards?*
    While ethical frameworks exist, empirical or conceptual studies on effective regulation for workplace robots are lacking.
13. *How can ethical auditing of algorithmic decision-making in robotic systems be institutionalized within organizations?*
    Ethical AI auditing frameworks exist but do not specifically address embodied workplace robots in organizational settings.
14. *What forms of training and education best prepare employees to collaborate inclusively with robotic coworkers?*
    There is limited discussion on training interventions, e.g [20]. , , but comprehensive models for DEI-oriented training are lacking.
15. *How do industry-specific factors (e.g., healthcare vs. logistics vs. manufacturing) moderate the social effects of robot integration?*
    Sectoral differences in robot adoption have been noted, e.g [3, 32, 33]. , , but their impacts on equity remain systematically unexplored.

    These questions call attention to the urgent need for interdisciplinary, context-sensitive, and equity-driven approaches to studying human-robot workplace collaboration. Only through sustained inquiry into these complex dynamics can scholars and practitioners hope to guide technological innovation toward truly inclusive and sustainable outcomes.

6 Limitations

This paper is conceptual in nature and does not include empirical validation of the proposed framework. The analysis is based on a purposive literature synthesis that may not capture all relevant studies, particularly in fast-evolving technological domains. Additionally, it does not account for potential cultural, industry-specific, or organizational factors that could moderate the framework's applicability. Future empirical research across diverse organizational, cultural, and sectoral contexts is essential to test, refine, and expand these conceptual insights.

Author contributions
S.O. conceived the study, developed the conceptual framework, conducted the literature review, and wrote the full manuscript. S.O. is solely responsible for all content, analysis, and revisions.

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