# Understanding and shaping the future of work with self-determination theory

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Abstract | Self-determination theory has shaped our understanding of what optimizes worker motivation by providing insights into how work context influences basic psychological needs for competence, autonomy and relatedness. As technological innovations change the nature of work, self-determination theory can provide insight into how the resulting uncertainty and interdependence might influence worker motivation, performance and well-being. In this Review, we summarize what self-determination theory has brought to the domain of work and how it is helping researchers and practitioners to shape the future of work. We consider how the experiences of job candidates are influenced by the new technologies used to assess and select them, and how self-determination theory can help to improve candidate attitudes and performance during selection assessments. We also discuss how technology transforms the design of work and its impact on worker motivation. We then describe three cases where technology is affecting work design and examine how this might influence needs satisfaction and motivation: remote work, virtual teamwork and algorithmic management. An understanding of how future work is likely to influence the satisfaction of the psychological needs of workers and how future work can be designed to satisfy such needs is of the utmost importance to worker performance and well-being.

The nature of work is changing as technology enables new forms of automation and communication across many industries. Although the image of human-like robots replacing human jobs is vivid, it does not reflect the typical ways people will engage with automation and how technology will change job requirements in the future. A more relevant picture is one in which people interact over dispersed networks using continuously improving communication platforms mediated by artificial intelligence (AI). Examples include the acceleration of remote working arrangements caused by the COVID-19 pandemic and the increased use of remote control operations across many industries including mining, manufacturing, transport, education and health.

Historically, automation has replaced more routine physically demanding, dangerous or repetitive work in industries such as manufacturing, with little impact on professional and managerial occupations<sup>1</sup>. However, since the mid-2010s, automation has replaced many repetitive error-prone administrative tasks such as processing legal documents, directing service queries and employee selection screening<sup>2,3</sup>. Thus, work requirements for employees are increasingly encompassing tasks that cannot be readily automated, such as interpersonal negotiations and service innovations<sup>4</sup>:

in other words, work that cannot be easily achieved through algorithms.

The role of motivation is often overlooked when designing and implementing technology in the workplace, even though technological changes can have a major impact on people's motivation. Self-determination theory offers a useful multidimensional conceptualization of motivation that can help predict these impacts. According to self-determination theory<sup>5,6</sup>, three psychological needs must be fulfilled to adequately motivate workers and ensure that they perform optimally and experience well-being. Specifically, people need to feel that they are effective and masters of their environment (need for competence), that they are agents of their own behaviour as opposed to a 'pawn' of external pressures (need for autonomy), and that they experience meaningful connections with other people (need for relatedness)<sup>5,7</sup>. Meta-analytic evidence shows that satisfying these three needs is associated with better performance, reduced burnout, more organizational commitment and reduced turnover intentions8.

Self-determination theory also distinguishes between different types of motivation that workers might experience: intrinsic motivation (doing something for its own sake, out of interest and enjoyment), extrinsic motivation (doing something for an instrumental reason)

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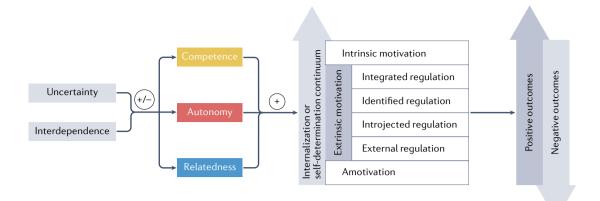


Fig. 1 | **Self-determination theory.** According to self-determination theory, satisfaction of three psychological needs (competence, autonomy and relatedness) influences work motivation, which influences outcomes. More intrinsic and internalized motivations are associated with more positive outcomes than extrinsic and less internalized motivations. These needs and motivations might be influenced by the increased uncertainty and interdependence that characterize the future of work.

and amotivation (lacking any reason to engage in an activity). Extrinsic motivation is subdivided according to the degree to which external influences are internalized (absorbed and transformed into internal tools to regulate activity engagement)<sup>5,9</sup>. According to meta-analytic evidence, more self-determined (that is, intrinsic or more internalized) motivation is more positively associated with key attitudinal and performance outcomes, such as job satisfaction, organizational commitment, job performance and proactivity than more controlled motivation (that is, extrinsic or less internalized)<sup>10</sup>. Consequently, researchers advocate the development and promotion of self-determined motivation across various life domains, including work<sup>11</sup>. Satisfaction of the three psychological needs described above is significantly related to more self-determined motivation8.

Given the impact of the needs proposed in selfdetermination theory on work motivation and consequently work outcomes (FIG. 1), it is important to find ways to satisfy these needs and avoid undermining them in the workplace. Organizational research has consequently focused on managerial and leadership behaviours that support or thwart these needs and promote different types of work motivation<sup>12-23</sup> (FIG. 2). There is also substantial research on the effects of work design (the nature and organization of people's work tasks within a job or role, such as who makes what decisions, the extent to which people's tasks are varied, or whether people work alone or in a team structure) and compensation systems on need satisfaction and work motivation<sup>24-37</sup>, and how individuals can seek to meet their needs and enhance their motivation through proactive efforts to craft their jobs<sup>38-40</sup>.

Importantly, the work tasks that people are more likely to do in future work will require high-level cognitive and emotional skills that are more likely to be developed, used, and sustained when underpinned by self-determined motivation<sup>40–50</sup>. Therefore, if individuals are to be effective in future work, it is important to understand how future work might meet — or fail to meet — the psychological needs proposed by self-determination theory. In this Review, we outline how work is changing and explain the consequences of these changes for satisfying workers' psychological needs. We then focus on two areas where technology is already changing the worker experience: when workers apply for jobs and go through selection processes; and when the design of their work what work they do, as well as how, when and where they do it — is transformed by technology. In particular, we focus on three domains where technology is already changing work design: remote work, virtual teams and algorithmic management. We conclude by discussing the importance of satisfying the psychological needs of workers when designing and implementing technologies in the workplace.

#### Future work requirements

The future workplace might evolve into one where psychological needs are better fulfilled, or one where they are neglected. In addition, there is growing concern that future work will meet the needs of people with adequate access to technology and the skills to use it, but will further diminish fulfillment for neglected and disadvantaged groups<sup>51</sup> (BOX 1). To understand how future work might align with human needs, it is necessary to map key work features to core constructs of self-determination theory. Future work might be characterized by environmental uncertainty interdependence, complexity, volatility and ambiguity<sup>52</sup>. Here we focus on uncertainty and interdependence because these features capture core concerns about the future and its implication for connections among people in the changing context of work53. Higher levels of uncertainty require more adaptive behaviours, whereas higher levels of interdependence require more social, team-oriented and network-oriented behaviours54.

We first consider the increasing role of uncertainty in the workplace. Rapid changes in technology and global supply chains mean that the environment is more unpredictable and that there is increasing uncertainty about what activities are needed to be successful. Reducing uncertainty is central to most theories of human

adaptation<sup>55</sup> and is a strong motivational basis for goals and behaviour<sup>56</sup>. If uncertainty becomes a defining and pervasive feature of organizational life, organizational leaders should think beyond reducing uncertainty and instead leverage and even create it<sup>55</sup>. In other words, in a highly dynamic context, it might be more functional and adaptive for employees and organizational leaders to consider more explorative approaches to coping with uncertainty, such as experimentation and improvization. All of these considerations imply that future effective work will require adaptive behaviours such as modifying the way work is done, and proactive behaviours such as innovating and creating new ways of working<sup>54</sup>.

Under higher levels of uncertainty, specific actions are difficult to define in advance. In contrast to action sequences that can be codified (for example, with algorithms) and repeated in predictable environments, the best action sequence is likely to involve flexibility and experimentation when the workplace is more uncertain. In this context, individuals must be motivated to explore new ideas, adjust their behaviour and engage with ongoing change. In stable and predictable environments, less self-determined forms of motivation might be sufficient to maintain the enactment of repetitive tasks and automation is more feasible as a replacement or support. However, under conditions of uncertainty, individuals will benefit from showing cognitive flexibility, creativity and proactivity, all behaviours that are more likely to emerge when people have self-determined motivation<sup>40,41,44,46–49,57</sup>.

Adaptive (coping with and responding to change) and proactive (initiating change) performance can be promoted by satisfying the needs for competence, autonomy and relatedness, and self-determined motivation<sup>4,58</sup>. For example, when individuals experience internalized motivation, they have a 'reason to' engage in the sometimes psychologically risky behaviour of proactivity<sup>40</sup>. Both adaptivity and proactivity depend on individuals having sufficient autonomy to work differently, try new ideas and negotiate multiple pathways to success. Hence, successful organizational functioning depends on people who can act autonomously to regulate their

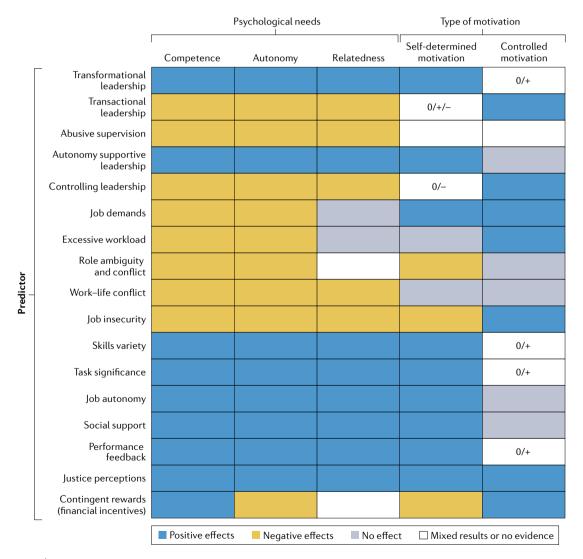


Fig. 2 | **Predictors of need satisfaction and work motivation.** Summary of research findings<sup>5–30</sup> and available meta-analyses<sup>8,10</sup>. In cases where the evidence is mixed, a negative sign indicates a negative correlation, a positive sign indicates a positive correlation, and a zero indicates no statistically significant correlation.

#### Box 1 | Inequalities caused by future work

Future work is likely to exacerbate inequalities. First, the digital divide (unequal access to, and ability to use, information communication technologies)<sup>51</sup> is likely to be exacerbated by technological advances that might become more costly and require more specialized skills. Moreover, the COVID-19 pandemic exacerbated work inequalities by providing better opportunities to those with digital access and skills<sup>210,211</sup>. The digital divide now also includes 'algorithm awareness' (knowing what algorithms do) which influences whether and how people are influenced by technology. Indeed, the degree to which algorithms influence attitudes and behaviours is negatively associated with the degree to which people are aware of algorithms and understand how they work<sup>212</sup>.

Second, future work is likely to require new technical and communication skills, as well as adaptive and proactive skills. Thus, people with such skills are more likely to find work than those who do not or who have fewer opportunities (for example, education access) to develop them. Even gig work requires that workers have access to relevant platforms and adequate skills for using them. These future work issues are therefore likely to increase gaps between skilled and non-skilled segments of the population, and consequently to increase societal pay disparities and poverty.

For example, workforce inequalities between mature and younger workers are likely to increase owing to real or perceived differences in technology-related skills, with increased disparities in the type of jobs these workers engage in<sup>210,213</sup>. Older workers might miss out on opportunities to upskill or might choose to leave the workforce early rather than face reskilling. This could decrease workforce diversity and strengthen negative stereotypes about mature workers (such as that they are not flexible, adaptable or motivated to keep up with changing times)<sup>214</sup>. Furthermore, inequalities in terms of pay have already been observed between men and women<sup>215</sup>. Increased robotization increases the gender pay gap<sup>216</sup>, and this gap is likely to be exacerbated as remote working becomes more common (as was shown during the pandemic)<sup>217</sup>. For example, one study found that salaries did not increase as much for women working flexibly compared to men<sup>218</sup>; another study found that home workers tended to be employees with young children and these workers were 50% less likely to be promoted than those based in the office<sup>140</sup>.

To promote equality in future work and ensure that psychological needs are met, managers will need to adopt 'meta-strategies' to promote inclusivity (ensuring that all employees feel included in the workplace and are treated fairly, regardless of whether they are working remotely or not), individualization of work (ensuring that work is tailored to individual needs and desires) and employee integration (promoting interaction between employees of all ages, nationalities and backgrounds)<sup>213</sup>.

behaviour in response to a more unpredictable and changing environment<sup>31,54,59</sup>.

The second feature of the evolving workplace is an increasing level of interdependence among people, systems and technology. People will connect with each other in more numerous and complex ways as communication technologies become more reliable, deeply networked and faster. For example, medical teams from disparate locations might collaborate more easily in real time to support remote surgical procedures. They will also connect with automated entities such as cobots (robots that interact with humans) and decision-making aids supported by constantly updating algorithms. For example, algorithms might provide medical teams with predictive information about patient progress based on streaming data such as heart rate. As algorithms evolve in complexity and predictive accuracy, they will modify the work context and humans will need to adapt to work with the new information created<sup>60</sup>.

This interconnected and evolving future workplace requires individuals who can interact effectively across complex networks. The nature of different communication technologies can both increase and decrease feelings of relatedness depending on the extent to which they promote meaningful interactions. Typically, work technologies are developed to facilitate productivity and efficiency. However, given that human performance is also influenced by feelings of relatedness<sup>8</sup>, it is important to ensure that communication technologies and the way networks of people are managed by these technologies can fulfill this need.

The rapid growth of networks enabled by communication technologies (for example, Microsoft Teams, Slack and Webex) has produced positive and negative effects on performance and well-being. For example, these technologies can be a buffer against loneliness for remote workers or homeworkers<sup>61</sup> and enable stronger connections among distributed workers<sup>62</sup>. However, networking platforms lead some individuals to experience more isolation rather than more connectedness<sup>63</sup>. Workplace networks might also engender these contrasting effects by, for example, building a stronger understanding between individuals in a work group who do not usually get to interact or by limiting contact to more superficial communication that prevents individuals from building stronger relationships.

Both uncertainty and interdependence will challenge people's feelings of competence. Uncertainty can lead to reduced access to predictable resources and less certainty about the success of work effort; the proliferation of networks and media can lead to feeling overwhelmed and to difficulties in managing communication and relationships. Moreover, technologies and automation can lead to the loss of human competencies as people stop using these skills<sup>64–67</sup>. For example, automating tasks that require humans to have basic financial skills diminishes opportunities for humans to develop expertise in financial skills.

Uncertainty and interdependence are likely to persist and increase in the future. This has implications for whether and how psychological needs will be satisfied or frustrated. In addition, because uncertainty and interdependence require people to behave in more adaptive and proactive ways, it is important to create future work that satisfies psychological needs.

#### The future of employee selection

Changing economies are increasing demand for highly skilled labour, meaning that employers are forced to compete heavily for talent<sup>68</sup>. Meanwhile, technological developments, largely delivered online, have radically increased the reach, scalability and variety of selection methods available to employers<sup>69</sup>. Technology-based assessments also afford candidates the autonomy to interact with prospective employers at times and locations of their choosing<sup>70,71</sup>. Furthermore, video-based, virtual, gamified and AI-based assessment technologies<sup>3,72-74</sup> have improved the fidelity and immersion of the selection process. The fidelity of a selection assessment represents the extent to which it can reproduce the physical and psychological aspects of the work situation that the assessment is intended to simulate<sup>75</sup>. Virtual environments and video-based assessments can better reproduce working environments than traditional 'paper and pencil' assessments, and AI is being used to simulate social interactions in work or similar contexts74. Immersion represents how engrossing or absorbing an assessment experience is. Immersion is enhanced by

richer media and gamified assessment elements<sup>75,76</sup>. These benefits have driven the widespread adoption of technology in recruitment practices<sup>77</sup>, but they have also attracted criticism. For example, the use of AI to analyse candidate data (such as CVs, social media profiles, text-based responses to interview questions, and videos)<sup>78</sup> raises concerns about the relevance of data being collected for selecting employees, transparency in how the data are used, and biases in selection based on these data<sup>79</sup>.

Candidates with a poor understanding of what data are being collected and how they are being used might experience a technology-based selection process as autonomy-thwarting. For example, the perceived job-relatedness of an assessment is associated with whether or not candidates view the assessment positively69,80. However, with today's technology, assessments that appear typical or basic (such as a test or short recorded interview response) might also involve the collection of additional 'trace' data such as mouse movements and clicks (in the case of tests), or ancillary information such as 'micro-expressions' or candidates' video backdrops<sup>81</sup>. We expect that it would be difficult for candidates to evaluate the job-relatedness of this information, unless provided with a rationale. Candidates may also feel increasing pressure to submit to employers' requests to share personal information, such as social media profiles, which may further frustrate autonomy to the extent that candidates are reluctant to share this information<sup>82</sup>.

Furthermore, if candidates do not understand how technology-driven assessments work and are not able to receive feedback from assessment systems, their need for competence may be thwarted<sup>83</sup>. For example, initial research shows that people perceive fewer opportunities to demonstrate their strengths and capabilities in interviews they know will be evaluated by AI, compared to those evaluated by humans<sup>83</sup>.

Finally, because candidates are increasingly interacting with systems, rather than people, their opportunities to build relatedness with employers might be stifled. A notable exemplar is the use of asynchronous video interviews70,71, a type of video-based assessment where candidates log into an online system, are presented with a series of questions, and are asked to video-record their responses. Unlike a traditional or videoconference interview, candidates completing an asynchronous video interview do not interact directly with anyone from the employer organization, and they consequently often describe the experience as impersonal<sup>84</sup>. Absent any interventions, the use of asynchronous video interviews removes the opportunity for candidates to meet the employer and get a feel for what it might be like to work for the employer, or to ask questions of their own<sup>84</sup>.

Because technologies have changed rapidly, research on candidates' reactions to these new selection methods has not kept up<sup>69</sup>. Nonetheless, to the extent that testrelated and technology-related anxiety influences motivation and performance when completing an online assessment or a video interview, the performance of applicants might be adversely affected<sup>85</sup>. Furthermore, candidate experience can influence decisions to accept a job offer and how positively the candidate will talk about the organization to other potential candidates and even clients, thereby influencing brand reputation<sup>86</sup>. Thus, technology developments offer clear opportunities to improve the satisfaction of candidates' needs and to assess them in richer environments that more closely resemble work settings. However, there are risks that technology that is needs-thwarting or is implemented in a needs-thwarting manner, will add to the uncertainty already inherent in competitive job applications. In the context of a globally competitive skills market, employers risk losing high-quality candidates.

#### The future of work design

Discussion in the popular press about the impact of AI and other forms of digitalization focuses on eradicating large numbers of jobs and mass unemployment. However, the reality is that tasks within jobs are being influenced by digitalization rather than whole jobs being replaced<sup>87</sup>. Most occupations in most industries have at least some tasks that could be replaced by AI, yet currently there is no occupation in which all tasks could be replaced<sup>88</sup>. The consequence of this observation is that people will need to increasingly interact with machines as part of their jobs. This raises work design questions, such as how people and machines should share tasks, and the consequences of different choices in this respect.

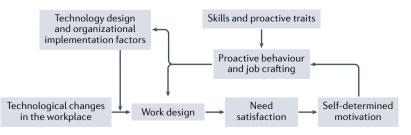
Work design theory is intimately connected to self-determination theory, with early scholars arguing that work arrangements should create jobs in which employees can satisfy their core psychological needs89. Core aspects of work design, including decision-making power, the opportunity to use skills and do a variety of tasks, the ability to ascertain the impact of one's work, performance feedback<sup>90</sup>, social contact, time pressure, emotional demands and role conflict91 are important predictors of job satisfaction, job performance<sup>92</sup> and work motivation<sup>93</sup>. Some evidence suggests that these motivating characteristics (considered 'job resources' according to the jobs demands-resources model)94 are especially important for fostering motivation or reducing strain when job demands (aspects of a job that require sustained physical, emotional or mental effort) are high93,95. For example, autonomy and social support can reduce the effect of workload on negative outcomes such as exhaustion<sup>96</sup>.

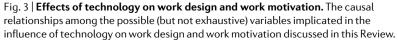
Technology can potentially influence work design and therefore employee motivation in positive ways<sup>1</sup>. Increasing workers' task variety and opportunities for more complex problem-solving should occur whenever technology takes over tasks (such as assembly line or mining work). Leaving the less routine and more interesting tasks for people to do<sup>97</sup> increases the opportunity for workers to fulfill their need for competence. For example, within manufacturing, complex production systems in which cyber-machines are connected in a factory-wide information network require strategic human decision-makers operating in complex, varied and high-level autonomy jobs<sup>98</sup>. Technology (such as social media) can also enhance social contact and support in some jobs and under some circumstances<sup>86,87</sup> (but see REF.<sup>63</sup>), increasing opportunities for meeting relatedness needs.

However, new technologies can also undermine the design of motivating work, and thus reduce workers' need satisfaction<sup>1</sup>. For example, in the aviation industry, manual flying skills can become degraded due to a lack of opportunity to practice when aircraft are highly automated<sup>99</sup>, decreasing the opportunity for pilots to meet their need for competence. As another example, technology has enabled the introduction of 'microwork' in which jobs are broken down into small tasks that are then carried out via information communication technologies<sup>100</sup>. Such jobs often lack variety, skill use and meaning<sup>101</sup>, again reducing the opportunity for the work to meet competence needs. In an analysis of robots in surgery, technology designed purely for 'efficiency' reduced the opportunities for trainee surgeons to engage in challenging tasks and resulted in impaired skill development<sup>102</sup>, and therefore probably reduced competence need satisfaction. Thus, poor work design might negatively influence work motivation through poor need satisfaction, especially the need for competence, owing to the lack of opportunity to maintain one's skills or gain new ones2.

As the above examples show, the impact of new technologies on work design, and hence on need satisfaction, is powerful - but also mixed. That is, digital technologies can increase or decrease motivational work characteristics and can thereby influence need satisfaction (FIG. 3). The research shows that there is no deterministic relationship between technology and work design; instead, the effect of new technology on work design, and hence on motivation, depends on various moderating factors<sup>1</sup>. These moderating factors include individual aspects, such as the level of skill an individual has or the individual's personality. Highly skilled individuals or those with proactive personalities might actively shape the technology and/or craft their work design to better meet their needs and increase their motivation<sup>1</sup>. For example, tech-savvy Uber drivers subject to algorithmic management sometimes resist or game the system, such as by cancelling rides to avoid negative ratings from passengers103.

More generally, individuals proactively seek a better fit with their job through behaviours such as idiosyncratic deals (non-standard work arrangements negotiated between an employee and an employer) and job crafting (changing one's work design to align one's job with personal needs, goals and skills)<sup>39,40</sup> (BOX 2).





Consequently, although there is relatively little research on proactivity in work redesign through technology, it is important to recognize that individuals will not necessarily be passive in the face of negative technologies. Just as time pressure can stimulate proactivity<sup>104</sup>, we should expect that technology that creates poor work design will motivate job crafting and other proactive behaviours from workers seeking to meet their psychological needs better<sup>105</sup>. This perspective fits with a broader approach to technology that emphasizes human agency<sup>106</sup>.

Importantly, mitigating and managing the impact of technology on work is not the sole responsibility of individuals. Organizational implementation factors (for example, whether technology is selected, designed and implemented in a participatory way or how much training is given to support the introduction of technology) and technological design factors (for example, how much worker control is built into automated systems) are also fundamental in shaping the effect of technology on work design. Understanding these moderating factors is important because they provide potential 'levers' for creating more motivating work while still capitalizing on the advantages of technologies. For example, in one case study<sup>107</sup>, several new digital technologies such as cobots and digital paper flow (systems that integrate and automate different organizational functions, such as sales and purchasing with accounting, inventory control and dispatch) were implemented following a strong technocentric approach (that is, highly focused on engineering solutions) with little worker participation, and with limited attention to creating motivating work design. A more human-centred approach could have prevented the considerable negative outcomes that followed (including friction, reduced morale, loss of motivation, errors and impaired performance)<sup>107</sup>. Ultimately, how technology is designed and implemented should be proactively adapted to better meet human competencies, needs and values.

#### Applications

In what follows, we describe three specific cases where technology is already influencing work design (virtual and remote work, virtual teamwork, and algorithmic management), and consider the potential consequences for worker need satisfaction and motivation.

Virtual and remote work. Technologies have significantly altered when and where people can work, with the Covid-19 pandemic vastly accelerating the extent of working from home (BOX 3). Remote work has persisted beyond the early stages of the Covid-19 pandemic with hybrid working - where people work from home some days a week and at the workplace on other days — becoming commonplace<sup>108</sup>. The development of information communication technologies (such as Microsoft Teams) has enabled workers to easily connect with colleagues, clients and patients remotely<sup>105</sup>, for example, via online patient 'telehealth' consultations, webinars and discussion forums. Technology has even enabled the remote control of other technologies, such as manufacturing machinery, vehicles and remote systems that monitor hospital ward patient vital signs

#### Box 2 | The future of careers

Employment stability started to decline during the 1980s with the rise of public ownership and international trade, the increased use of performance-based incentives and contracts, and the introduction of new technologies. Employment stability is expected to continue to decline with the growth of gig work and continued technological developments<sup>219,220</sup>. Indeed, people will more frequently be asked to change career paths as work is transformed by technology, to use and 'sell' their transferrable skills in creative ways, and to reskill. The rise of more precarious work and new employment relationships (for example, in gig work) adds to these career challenges<sup>221</sup>. The current generation of workers is likely to experience career shocks (disruptive events that trigger a sensemaking process regarding one's career) caused by rapid technological changes, and indeed many workers have already experienced career shocks from the pandemic<sup>222</sup>. Moreover, rapid technological change and increasing uncertainty pushes organizations to hire for skill sets rather than fitting people into set jobs, requiring people to be aware of their skills and to know how to market them.

In short, the careers of the current and future workforce will be non-linear and will require people to be more adaptive and proactive in crafting their career. For this reason, the concept of a protean career, whereby people have an adaptive and self-directed career, is likely to be increasingly important<sup>223</sup>. A protean career is a career that is guided by a search for self-fulfillment and is characterized by frequent learning cycles that push an individual into constant transformation; a successful protean career therefore requires a combination of adaptivity skills and identity awareness<sup>224,225</sup>. Adaptivity allows people to forge their career by using, or even creating, emerging opportunities. Having a solid sense of self helps individuals to make choices according to personal strengths and values. However, a protean career orientation might fit only a small segment of the labour market. Change-averse individuals might regard protean careers as career-destructive and the identity changes associated with a protean career might be regarded as stressful. In addition, overly frequent transitions might limit deep learning opportunities and achievements, and disrupt important support networks<sup>221</sup>.

Nonetheless, career-related adaptive and proactive behaviours can be encouraged by satisfying psychological needs. In fact, protean careers tend to flourish in environments that provide autonomy and allow for proactivity, with support for competence and learning<sup>223,226</sup>. Moreover, people have greater self-awareness when they feel autonomous. Indeed, self-awareness is a component of authenticity and mindfulness, both of which are linked to the satisfaction of the need for autonomy<sup>227,228</sup>. Thus, supporting psychological needs during training, development and career transitions is likely to assist people in crafting successful careers.

through AI<sup>1</sup>. However, even when people are working on work premises (that is, not working remotely), an increasing amount of work in many jobs is done virtually (for example, online training or communicating with a colleague next door via email).

Working virtually is inherently tied to changes in uncertainty and interdependence. Virtual work engenders uncertainty because workplace and interpersonal cues are less available or reliable in providing virtual employees with role clarity and ensuring smooth interactions. Indeed, 'screen' interactions are more stressful and effortful than face-to-face interactions. It is more difficult to decipher and synchronize non-verbal behaviour on a screen than face-to-face, particularly given the lack of body language cues due to camera frame limitations, increasing the cognitive load for meeting attendees<sup>109-112</sup>. Non-verbal synchrony can be affected by the video streaming speed, which also increases cognitive load<sup>109-112</sup>. Virtual interactions involve 'hyper gaze' from seeing grids of staring faces, which the brain interprets as a threat<sup>109-112</sup>. Seeing oneself on screen increases self-consciousness during social interactions, which can cause anxiety, especially in women and those from minoritized groups<sup>109-112</sup>. Finally, reduced mobility from having to stay in the camera frame has been shown to reduce individual performance relative to face-to-face meetings<sup>109–112</sup>. Research on virtual interactions is still in its infancy. In one study, workers were randomly assigned to have their camera either on or off during their daily virtual meetings for a week. Those with the camera on during meetings experienced more daily fatigue and less daily work engagement than those with the camera off<sup>113</sup>.

Lower-quality virtual communication between managers and colleagues can leave individuals unclear about their goals and priorities, and how they should achieve them<sup>114</sup>. This calls for more self-regulation<sup>115</sup> because employees must structure their daily work activities and remind themselves of their work priorities and goals, without relying on the physical presence of colleagues or managers. If virtual workers must coordinate some of their work tasks with colleagues, it can be difficult to synchronize and coordinate actions, working schedules and breaks, motivate each other, and assist each other with timely information exchange<sup>115</sup>. This can make it harder for employees to acquire and share information<sup>53</sup>.

Virtual work also affects work design and changes how psychological needs can be satisfied and frustrated (TABLE 1), which has implications for both managers and employees. Physical workplace cues that usually guide work behaviours and routines in the office do not exist in virtual work, consequently demanding more autonomous regulation of work behaviours<sup>116,117</sup>. Some remote workers experience an increased sense of control and autonomy over their work environment<sup>118-120</sup> under these circumstances, resulting in lower familywork conflict, depression and turnover<sup>121,122</sup>. However, managers and organizations might rob workers of this autonomy by closely monitoring them, for example by checking their computer or phone usage<sup>123</sup>. This type of close monitoring reflects a lack of manager trust in individuals' abilities or intentions to work effectively remotely. This lack of trust leads to decreased feelings of autonomy<sup>124</sup>, increased employee home-work conflict<sup>105</sup> and distress<sup>125,126</sup>. Surveillance has been shown to decrease self-determined motivation<sup>127</sup>. It is therefore important to train managers in managing remote workers in an autonomy-supportive way to avoid these negative consequences<sup>128</sup>. The negative effects of monitoring can also be reduced if monitoring is used constructively to help employees develop through feedback129-133, and when employees participate in the design and control of the monitoring systems<sup>134,135</sup>.

Information communication technology might satisfy competence needs by increasing access to global information and communication and the ability to analyse data<sup>136</sup>. For example, online courses, training and webinars can improve workers' knowledge, skills and abilities, and can therefore help workers to carry out their work tasks more proficiently, which increases self-efficacy and a sense of competence. Furthermore, the internet allows people to connect rapidly and asynchronously with experts around the world, who may be able to provide information needed to solve a work problem that local colleagues cannot help with<sup>136</sup>. This type of remote work is increasingly occurring whether or not individuals themselves are based remotely, and can potentially enhance performance.

#### Box 3 | The 'great resignation'

'The great resignation' refers to the massive wave of employee departures during the COVID-19 pandemic in several parts of the world, including North America, Europe and China<sup>229,230</sup>, that can be attributed in part to career shocks caused by the pandemic<sup>222</sup>. In the healthcare profession, the shock consisted of an exponential increase in workload and the resulting exhaustion, coupled with the disorganization caused by lack of resources and compounded by health fears<sup>231</sup>. In other industries, the pandemic caused work disruptions by forcing or allowing people to work from home, furloughing employees for varying periods of time, or lay-offs caused by an abrupt loss of business (such as in the tourism and hospitality industries).

Scholars have speculated that these shocks have resulted in a staggering number of people not wanting to go back to work or quitting their current jobs<sup>232</sup>. For example, the hospitality and tourism industries failed to attract employees back following lay-offs<sup>233</sup>. Career shocks can trigger a sensemaking process that can lead one to question how time is spent at work and the benefits one draws from it. For example, the transition to working from home made employees question how and why they work<sup>234</sup>. Frequent health and financial concerns, juggling school closures and complications in caring for dependents have compounded exhaustion and disorganization issues. Some have even renamed 'the great resignation' as 'the great discontent' to highlight that many people reported wanting to quit because of dissatisfaction with their work conditions<sup>235</sup>.

It might be helpful to understand 'the great resignation' through the lens of basic psychological need satisfaction. Being stretched to the limit might influence the need for competence and relatedness when workers feel they have suboptimal ways to connect with colleagues and insufficient time to balance work with other life activities that connect them to family and friends<sup>128,236</sup>. The sensemaking process that accompanies career shocks might highlight a lack of meaningful work that decreases the satisfaction of the need for autonomy. This lack of need satisfaction might lead people to take advantage of the disruption to 'cut their losses' by reorienting their life priorities and career goals, leading to resignation from their current jobs<sup>237,238</sup>.

Alternatively, the experiences gained from working differently during the COVID-19 pandemic might have made many workers aware of how work could be (for example, one does not have to commute), emboldening them to demand better work design and work conditions for themselves. Not surprisingly, barely a year after 'the great resignation' many are now talking about 'the great reshuffle', suggesting that many people who quit their jobs used this time to rethink their careers and find more satisfying work<sup>239</sup>. Generally, this has meant getting better pay and seeking work that aligns better with individual values and that provides a better work–life balance: in other words, work that better meets psychological needs for competence, autonomy and relatedness.

At the same time, technology might thwart competence needs, and increase fatigue and stress. For example, constant electronic messages (such as email or keeping track of online messaging platforms such as Slack or Microsoft Teams) are likely to increase in volume when working remotely, but can be distracting and prevent individuals from completing core tasks while they respond to incoming messages<sup>136</sup>. The frustration of the need for competence can increase if individuals are constantly switching tasks to deal with overwhelming correspondence and failing to finish tasks in a timely manner. In addition, information communication technology enables access to what some individuals might perceive as an overwhelming amount of information (for example, through the internet, email and messages) which can lead to a lot of time spent sifting and processing information. This can be interpreted as a job demand that might make individuals feel incompetent if it is not clear what information is most important. Individuals might also require training in the use of information communication technology, and even then, technology can malfunction, preventing workers from completing tasks, and causing frustration and distress136,137.

Finally, remote workers can suffer from professional isolation because there are fewer opportunities to meet

or be introduced to connections that enable career development and progression<sup>138</sup>, which could influence their feelings of competence in the long run. Although some research suggests that those who work flexibly are viewed as less committed to their career<sup>139</sup> and might be overlooked for career progression<sup>140</sup>, other research has found no relationship between remote working and career prospects<sup>119</sup>.

Virtual work can also present challenges for meeting workers' need for relatedness<sup>141</sup>. Remote workers can feel isolated from, and excluded by, colleagues and fail to gain the social support they might receive if co-located<sup>142,143</sup>, weakening their sense of belonging to a team or organization<sup>144</sup> and their job performance<sup>145</sup>. This effect will probably be accentuated in the future: if the current trend for working from home continues, more people will be dissociated from office social environments more often and indefinitely. Office social environments could be degraded permanently if fewer people frequent the office on a daily basis, such that workers may not be in the office at the same time as collaborators, and there might be fewer people to ask for help or talk with informally. We do not yet know the long-term implications of a degraded social environment, but some suggest that extended virtual working could create a society where people have poor communication skills and in which social isolation and anxiety are exacerbated146. Self-determination theory suggests that it will be critical to actively design hybrid and remote work that meets relatedness needs to prevent these long-term issues. When working remotely, simple actions could be effective, such as actively providing opportunities for connecting with others, for example, through 'virtual coffee breaks'147. Individuals could also be 'buddied' up into pairs who regularly check in with each other via virtual platforms.

Hybrid work seems to offer the best of both worlds, providing opportunities for connection and collaboration while in the workplace, and affording autonomy in terms of flexible working. Some research suggests that two remote workdays a week provides the optimum balance<sup>148</sup>. However, it is likely that this balance will be affected by individual characteristics and desires, as well as by differences in work roles and goals. For example, Israeli employees with autism who had to work from home during the COVID-19 pandemic experienced significantly lower competence and autonomy satisfaction than before the pandemic<sup>149</sup>. Yet remote workers high in emotional stability and job autonomy reported higher autonomy and relatedness satisfaction compared to those with low emotional stability<sup>120</sup>. These findings suggest that managers and individuals should consider the interplay between individual characteristics, work design and psychological need satisfaction when considering virtual and remote work.

*Virtual teamwork.* Uncertainty and interconnectedness make work more complex, increasing the need for teamwork across many industries<sup>150</sup>. Work teams are groups of individuals that must both collaborate and work interdependently to achieve shared objectives<sup>151</sup>. Technology has created opportunities to develop work teams that

operate virtually. Virtual teams are individuals working interdependently towards a common goal but who are geographically dispersed and who rely on electronic technologies to perform their work<sup>152,153</sup>. Thus, virtual teamwork is a special category of virtual work that also involves collective psychological experiences (that are shaped by and interact with virtual work)<sup>154</sup>. This adds another layer of complexity and therefore requires a separate discussion.

Most research conceptualizes team virtuality as a construct with two dimensions: geographical dispersion and reliance on technology<sup>153,155</sup>. Notably, these dimensions are not completely independent because team members require technology to communicate and coordinate tasks when working in different locations<sup>156,157</sup>. Virtuality differs between and within teams. Team members might be in different locations on some days and the same location on other days, which changes the level of team virtuality over time. Thus, teams are not strictly virtual or non-virtual. Team virtuality influences how team members coordinate tasks and share information<sup>130</sup>, which is critical for team effectiveness (usually assessed by a team's tangible outputs, such as their productivity, and team member reactions, such as satisfaction with, or commitment to, the team)158.

Although individual team members might react differently to working in a virtual team, multi-level theory suggests that team members collectively develop shared experiences, called team emergent states<sup>159,160</sup>. Team emergent states include team cohesion (the bond among group members)<sup>161</sup>, team trust<sup>162</sup>, and team motivation and engagement<sup>159,163</sup>. These emergent states arise out of individual psychological behaviours and states164 and are influenced by factors that are internal (for example, interactions between team members) and external (for example, organizational team rewards, organizational leadership and project deadlines) to the team, as well as team structure (for example, team size and composition). Team emergent states, particularly team trust, are critical for virtual team effectiveness because reliance on technology often brings uncertainties and fewer opportunities for social control<sup>165</sup>.

Table 1   Impact of virtual and remote work on need satisfaction		
Needs	Positive effects on need satisfaction	Negative effects on need satisfaction
Autonomy	Flexible schedules Less commuting More time for other activities	Close monitoring Home–work conflict Increased demands
Competence	Worldwide access to information and communication Remote learning opportunities Increased role clarity Increased self-efficacy	Information overload Requirement to learn and maintain technological skills Technological hassles
Relatedness	Face-to-face or virtual communication Connecting with people across time and space	Social and professional isolation Lack of social support Less meaningful colleague relationships

Team virtuality is likely to affect team functioning via its impact on psychological need satisfaction, in a fashion similar to remote work. However, the need for coordination and information sharing to achieve team goals is likely to be enhanced by how team members support and satisfy each other's psychological needs<sup>166</sup>, which might be more difficult under virtual work conditions. In addition to affecting individual performance, need satisfaction within virtual teams can also influence collective-level team processes, such as coordination and trust, which ultimately affect team performance. For example, working in a virtual team might make it more difficult to feel meaningful connections because team members in different locations often have less contact than co-located team members. Virtual team members predominantly interact via technology, which — as described in the previous section — might influence the quality of relationships they can develop with their team members<sup>141,167,168</sup> and consequently the satisfaction of relatedness needs169.

Furthermore, virtual team members must master electronic communication technology (including virtual meeting and breakout rooms, internet connectivity issues, meeting across different time zones, and email overload), which can lead to frustrations and 'technostress'<sup>170</sup>. Frustrations with electronic communication might diminish the psychological need for competence because team members might feel ineffective in mastering their environment.

In sum, virtual team members might experience lower relatedness and competence need satisfaction. However, these needs are critical determinants of work motivation. Furthermore, virtual team members can also develop shared collective experiences around their need satisfaction. Thus, self-determination theory offers explanatory mechanisms (that is, team members' need satisfaction, which influences work motivation) that are at play in virtual teams and that organizations should consider when implementing virtual teams.

Algorithmic management. Algorithmic management refers to the use of software algorithms to partially or completely execute workforce management functions (for example, hiring and firing, coordinating work, and monitoring performance)<sup>2,123,171,172</sup>. This phenomenon first appeared on gig economy platforms such as Uber, Instacart and Upwork, where all management is automated<sup>173</sup>. However, it is rapidly spreading to traditional work settings. Examples include monitoring the productivity, activity and emotions of remote workers<sup>174</sup>, the algorithmic determination of truck drivers' routes and time targets<sup>175</sup>, and automated schedule creation in retail settings<sup>176</sup>. The constant updating of the algorithms as more data is collected and the opacity of this process makes algorithmic management unpredictable, which produces more uncertainty for workers<sup>177</sup>.

Algorithmic management has repercussions for work design. Specifically, whether algorithmic management systems consider human motivational factors in their design influences whether workers are given enough autonomy, skills usage, task variety, social contact, role clarity (including knowing the impact of one's work)

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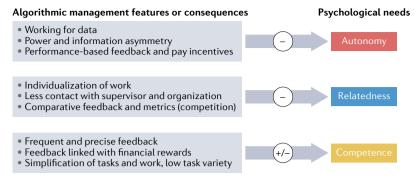


Fig. 4 | **The effects of algorithmic management on need satisfaction.** Summary of the features and consequences of algorithmic management on autonomy needs, relatedness needs and competence needs.

and a manageable workload<sup>123</sup>. So far, empirical evidence show that algorithmic management features predominantly reduce employees' basic needs for autonomy, competence and relatedness because of how they influence work design (FIG. 4).

Algorithmic management tends to foster the 'workingfor-data' phenomenon (or datafication of work)<sup>172,178,179</sup>, leading workers to focus their efforts on aspects of work that are being monitored and quantified at the expense of other tasks that might be more personally valued or meaningful. This tendency is reinforced by the fact that algorithms are updated with new incoming data, increasing the need for workers to pay close attention to what 'pays off' at any given moment. Monitoring and quantifying worker behaviours might reduce autonomy because it is experienced as controlling and narrows goal focus to only quantifiable results<sup>127,180</sup>; there is some evidence that this is the case when algorithmic management systems are used to this end<sup>172,178,181</sup>. Rigid rules about how to carry out work often determine performance ratings (for example, imposing a route to deliver goods or prescribing how equipment and materials must be used) and even future task assignments and firing decisions, with little to no opportunity for employee input<sup>182-184</sup>. Thus, the combination of telling workers what to do to reach performance targets and how to get it done significantly limits their autonomy to make decisions based on their knowledge and skills.

Some algorithmic management platforms do not reveal all aspects of a given task (for example, not revealing the client destination before work is accepted) or penalize workers who decline jobs<sup>185</sup>, thereby severely restricting their choices. This encourages workers to either overwork to the point of exhaustion, find ways to game the system<sup>184</sup>, or misbehave<sup>186</sup>. Moreover, the technical complexity and opacity of algorithmic systems<sup>187–189</sup> deprives workers of the ability to understand and master the system that governs their work, which limits their voice and enpowerment<sup>172,185,190</sup>. Workers' typical response to the lack of transparency is to organize themselves on social media to share any insights they have on what the algorithm 'wants' as a way to gain back some control over their work<sup>185,191</sup>.

Finally, algorithmic management usually provides comparative feedback (comparing one's results to other workers') and is linked to incentive pay structures, both of which reduce self-determined motivation as they are experienced as more controlling<sup>26,192</sup>. For instance, after algorithms estimated normal time standards for each 'act', algorithmic tracking and case allocation systems forced homecare nurses to reduce the 'social' time spent with patients because they were assigned more patients per day, thereby limiting nurses' autonomy to decide how to perform their work<sup>181</sup>. Because these types of quantified metric are often directly linked to performance scores, pay incentives and future allocation of tasks or schedules (that is, getting future work), algorithmic management reduces workers' freedom in decision-making related to their work, which can significantly reduce their self-determined motivation<sup>123</sup>.

Algorithmic management also tends to individualize work, which affects the need for relatedness. For example, algorithmic management inevitably transforms or reduces (sometimes even eliminates) contact with a supervisor<sup>2,182,193</sup>, leading to the feeling that the organization does not care about the worker and provides little social support<sup>194,195</sup>. 'App-workers', who obtain work through gig-work platforms such as Uber, reportedly crave more social interactions and networking opportunities<sup>179,185,194</sup> and often attempt to compensate for a lack of relatedness by creating support groups that connect virtually and physically<sup>183,191,195</sup>. Increased competitive climates due to comparative feedback or displaying team members' individual rankings<sup>175,196</sup> can also hamper relatedness. Indeed, when workers have to compete against each other to rank highly (which influences their chances of getting future work and the financial incentives they receive), they are less likely to develop trusting and supportive relationships.

Researchers have formulated contradictory predictions about the potential implications of algorithmic management on competence satisfaction. On the one hand, using quantified metrics, algorithmic management systems can provide more frequent, unambiguous and performance-related feedback, often in the form of ratings and rankings177, and simultaneously link this feedback to financial rewards. Informational feedback can enhance intrinsic motivation because it provides information about one's competence. At the same time, linking rewards to this feedback could decrease intrinsic motivation, because the contingency between work behaviour and pay limits worker discretion and therefore reduces their autonomy<sup>26</sup>. The evidence so far suggests that the mostly comparative feedback provided by algorithmic management is insufficiently informative because the value of the feedback is short-lived - continuously updating algorithms change what is required to perform well<sup>177,183,185</sup>. This short-lived feedback can undermine feelings of mastery or competence. In addition, algorithmic management is often associated with simplified tasks, and with lower problem-solving opportunities and job variety<sup>123</sup>. However, gamification features on some platforms might increase intrinsic motivation<sup>179,183</sup>.

The nascent research on the effects of algorithmic management on workers' motivation indicates mostly negative effects on self-determined forms of motivation, because the way it is designed decreases the satisfaction of competence, autonomy and relatedness needs.

Algorithmic management is being rapidly adopted across an increasing number of industries. Thus, technology developers and those who implement the technology in organizations will need to pay closer attention to how it changes work design to avoid negative effects on work motivation.

#### Summary and future directions

Self-determination theory can help predict the motivational consequences of future work and these motivational considerations should be taken into account when designing and implementing technology. More self-determined motivation will be needed to deal with the uncertainty and interdependence that will characterize future work. Thus, research examining how need satisfaction and work motivation influence people's ability to adapt to uncertainty, or even leverage it, is needed. For example, future research could examine how different managerial styles influence adaptivity and proactivity in highly uncertain work environments<sup>197</sup>. Need-satisfying leadership, such as transformational leadership (charismatic or inspirational)<sup>15</sup>, can encourage job crafting and other proactive work behaviours<sup>198,199</sup>. Transactional leadership (focused on monitoring, rewarding and sanctioning) might promote self-determined motivation during organizational crises<sup>23</sup>. In addition, research on the quality of interconnectedness (the breadth and depth of interactions and networks) could provide insight on how to manage the increased interconnectedness workers are experiencing.

Technology can greatly assist in recruiting and selecting workers; self-determination theory can inform guidelines on how to design and use such technologies. It is important that the technology is easy to use and perceived as useful to the candidates for best representing themselves<sup>200,201</sup>. This can be done by ensuring that candidates have complete instructions before an assessment starts, even possibly getting a 'practice run', to improve their feelings of competence. It is also important for candidates to feel some amount of control and less pressure associated with online asynchronous assessments. Giving candidates some choice over testing platforms and the order of questions or settings, explaining how the results will be used, or allowing candidates to ask questions, could improve feelings of autonomy70. Finally, it is crucial to enhance perceptions that the organization cares about getting to know candidates and forging connections with them despite using these tools. For example, enhancing these tools with personalized videos of organizational members and providing candidates with feedback following selection decisions might increase feelings of relatedness. These suggestions need to be empirically tested<sup>202</sup>.

More research is also needed on how technology is transforming work design, and consequently influencing worker need satisfaction and motivation. Research in behavioural health has examined how digital applications that encourage healthy behaviours can be designed to fulfill the needs for competence, autonomy and relatedness<sup>203</sup>. Whether and how technology designed for other purposes (such as industrial robots, information communication technology, or automated decisionmaking systems) can be deliberately designed to meet these core human needs remains an open question. To date, little research has examined how work technologies are created, and what can be done to influence the process to create more human-centred designs. Collaborative research across social science and technical disciplines (such as engineering and computing) is needed.

In terms of implementation, although there is a long history of studies investigating the impact of technology on work design, current digital technologies are increasingly autonomous. This situation presents new challenges: a human-centred approach to automation in which the worker has transparent influence over the technical system has frequently been recommended as the optimal way to achieve high performance and to avoid automation failures<sup>1,204</sup>. But it is not clear that this work design strategy will be equally effective in terms of safety, productivity and meeting human needs when workers can no longer understand or control highly autonomous technology.

Given the likely persistence of virtual and remote work into the future, there is a critical need to understand how psychological needs can be satisfied when working remotely. Multi-wave studies that explore the boundary conditions of need satisfaction would advance knowledge around who is most likely to experience need satisfaction, when and why. Such knowledge can be leveraged to inform the design of interventions, such as supervisor training, to improve well-being and performance outcomes for virtual and remote workers. Similarly, no research to date has used self-determination theory to better understand how team virtuality affects how well team members support each other's psychological needs. Within non-virtual teams, need satisfaction is influenced by the extent to which team members exhibit need-supportive behaviours towards each other<sup>205</sup>. For example, giving autonomy and empowering virtual teams is crucial for good team performance<sup>206</sup>. Studies that track team activities and interaction patterns, including virtual communication records, over time could be used to examine the effects of need support and thwarting between virtual team members<sup>207,208</sup>

Finally, although most studies have shown negative effects of algorithmic management on workers' motivation and work design characteristics, researchers should not view the effects of algorithmic management as predetermined and unchangeable. Sociotechnical aspects of the system<sup>2,209</sup> (such as transparency, privacy, accuracy, invasiveness and human control) and organizational policies surrounding their use could mitigate the motivational effects of algorithmic management. In sum, it is not algorithms that shape workers' motivation, but how organizations design and use them3. Given that applications that use algorithmic management are developed mostly by computer and data scientists, sometimes with input from marketing specialists<sup>185</sup>, organizations would benefit from employing psychologists and human resources specialists to enhance the motivational potential of these applications.

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- Parker, S. K. & Grote, G. Automation, algorithms, and beyond: why work design matters more than ever in a digital world. *Appl. Psychol.* https://doi.org/10.1111/ apps.12241 (2020).
- Jarrahi, M. H. et al. Algorithmic management in a work context. *Big Data Soc.* 8, https://doi.org/10.1177/ 20539517211020332 (2021).
- Langer, M. & Landers, R. N. The future of artificial intelligence at work: a review on effects of decision automation and augmentation on workers targeted by algorithms and third-party observers. *Comput. Hum. Behav.* 123, 106878 (2021).
- Gagné, M., Parker, S. K. & Griffin, M. A. in Research Agenda for Employee Engagement in a Changing World of Work (eds Meyer, J. P. & Schneider, B.) 137–153 (Edward Elgar, 2021).
- 5. Deci, E. L. & Ryan, R. M. Intrinsic motivation and Self-Determination in Human Behavior (Plenum, 1985).
- Gagné, M. & Deci, E. L. Self-determination theory and work motivation. J. Organ. Behav. 26, 331–362 (2005).
- Deci, E. L. & Ryan, R. M. The 'what' and 'why' of goal pursuits: human needs and the self-determination of behavior. *Psychol. Ing.* 11, 227–268 (2000).
- Van den Broeck, A., Ferris, D. L., Chang, C.-H. & Rosen, C. C. A review of self-determination theory's basic psychological needs at work. *J. Manag.* 42, 1195–1229 (2016).
- Howard, J., Gagné, M. & Morin, A. J. S. Putting the pieces together: reviewing the structural conceptualization of motivation within SDT. *Motiv. Emot.* 44, 846–861 (2020).
- Motiv. Emot. 44, 846–861 (2020).
   10. Van den Broeck, A., Howard, J. L., Van Vaerenbergh, Y., Leroy, H. & Gagné, M. Beyond intrinsic and extrinsic motivation: a meta-analysis on self-determination theory's multidimensional conceptualization of work motivition. Organ Benchal. Rev. 11, 240, 273 (2021)
- motivation. Organ. Psychol. Rev. 11, 240–273 (2021).
   Ryan, R. M. & Deci, E. L. Self-Determination Theory: Basic Psychological Needs in Motivation, Development, and Wellness (Guilford, 2017).
- Charbonneau, D., Barling, J. & Kelloway, E. K. Transformational leadership and sports performance: the mediating role of intrinsic motivation. *J. Appl. Soc. Psychol.* **31**, 1521–1534 (2001).
- Eyal, O. & Roth, G. Principals' leadership and teachers' motivation: self-determination theory analysis. *J. Educ. Adm.* 49, 256–275 (2011).
- *Educ. Adm.* 49, 256–275 (2011).
   Fernet, C., Trépanier, S.-G., Austin, S., Gagné, M. & Forest, J. Transformational leadership and optimal functioning at work: on the mediating role of employees' perceived job characteristics and motivation. *Work Stress* 29, 11–31 (2015).
- Kovajnic, S., Schuh, S. C. & Jonas, K. Transformational leadership and performance: an experimental investigation of the mediating effects of basic needs satisfaction and work engagement. *J. Occup. Organ. Psychol.* 86, 543–555 (2013).
- Kovajnic, S., Schuh, S. C., Klaus, J., Quaquebeke, N. & Dick, R. How do transformational leaders foster positive employee outcomes? A self-determinationbased analysis of employees' needs as mediating links. J. Organ. Behav. 33, 1031–1052 (2012).
- Lian, H., Lance Ferris, D. & Brown, D. J. Does taking the good with the bad make things worse? How abusive supervision and leader-member exchange interact to impact need satisfaction and organizational deviance. Organ. Behav. Hum. Decis. Process. 117, 41–52 (2012).
- Slemp, G. R., Kern, M. L., Patrick, K. J. & Ryan, R. M. Leader autonomy support in the workplace: a meta-analytic review. *Motiv. Emot.* 42, 706–724 (2018).
- Tims, M., Bakker, A. B. & Xanthopoulou, D. Do transformational leaders enhance their followers' daily work engagement? *Leadersh. O.* 22, 121–131 (2011).
- Wang, Z. N. & Gagné, M. A Chinese–Canadian crosscultural investigation of transformational leadership, autonomous motivation and collectivistic value. *J. Leadersh. Organ. Stud.* 20, 134–149 (2013).
- Leadersh. Organ. Stud. 20, 134–142 (2013).
   Bono, J. E. & Judge, T. A. Self-concordance at work: understanding the motivational effects of transformational leaders. Acad. Manage. J. 46, 554–571 (2003).
- Gagné, M. et al. Uncovering relations between leadership perceptions and motivation under different organizational contexts: a multilevel cross-lagged analysis. J. Bus. Psychol. 35, 713–732 (2020).

- Cerasoli, C. P., Nicklin, J. M. & Ford, M. T. Intrinsic motivation and extrinsic incentives jointly predict performance: a 40-year meta-analysis. *Psychol. Bull.* 140, 980–1008 (2014).
- Cerasoli, C. P., Ničklin, J. M. & Nassrelgrgawi, A. S. Performance, incentives, and needs for autonomy, competence, and relatedness: a meta-analysis. *Motiv. Emot.* 40, 781–813 (2016).
- Deci, E. L., Koestner, R. & Ryan, R. M. A meta-analytic review of experiments examining the effects of extrinsic rewards on intrinsic motivation. *Psychol. Bull.* **125**, 627–668 (1999).
- Kuvaas, B., Buch, R., Gagné, M., Dysvik, A. & Forest, J. Do you get what you pay for? Sales incentives and implications for motivation and changes in turnover intention and work effort. *Motiv. Emot.* 40, 667–680 (2016).
- Kuvaas, B., Shore, L. M., Buch, R. & Dysvik, A. Social and economic exchange relationships and performance contingency: differential effects of variable pay and base pay. *Int. J. Hum. Resour. Manag.* **31**, 408–431 (2020).
- Nordgren Selar, A., Sverke, M., Falkenberg, H. & Gagné, M. It's [not] all'bout the money: the relative importance of performance-based pay and support for psychological needs for job performance. *Scand. J. Work Organ. Psychol.* 5, 1–14 (2020).
- Work Organ. Psychol. 5, 1–14 (2020).
  Olafsen, A. H., Halvari, H., Forest, J. & Deci, E. L. Show them the money? The role of pay, managerial need support, and justice in a self-determination theory model of intrinsic work motivation. *Scand. J. Psychol.* 56, 447–457 (2015).
- Parker, S. K., Wall, T. D. & Jackson, P. R. 'That's not my job': developing flexible employee work orientations. *Acad. Manage. J.* 40, 899–929 (1997).
- Parker, S. L., Bell, K., Gagné, M., Carey, K. & Hilpert, T. Collateral damage associated with performance-based pay: the role of stress appraisals. *Eur. J. Work Organ. Psychol.* 28, 691–707 (2019).
- 34. Thibault Landry, A., Forest, J. & Zigarmi, D. Revisiting the use of cash rewards in the workplace: evidence of their differential impact on employees' experiences in three samples using self-determination theory. *Compens. Benefits Rev.* 51, 92–111 (2019).
- Van den Broeck, A., Vansteenkiste, M., De Witte, H. & Lens, W. Explaining the relationships between job characteristics, burnout, and engagement: the role of basic psychological need satisfaction. *Work Stress* 22, 277–294 (2008).
- Weibel, A., Rost, K. & Osterloh, M. Pay for performance in the public sector — benefits and (hidden) costs. *J. Public Adm. Res. Theory* 20, 387–412 (2010).
- White, M. H. & Sheldon, K. M. The contract year syndrome in the NBA and MLB: a classic undermining pattern. *Motiv. Emot.* **38**, 196–205 (2014).
- Bakker, A. B. & van Woerkom, M. Flow at work: a self-determination perspective. Occup. Health Sci. 1, 47–65 (2017).
- Tims, M., Bakker, A. B. & Derks, D. Development and validation of the job crafting scale. *J. Vocat. Behav.* 80, 173–186 (2012).
- Parker, S. K., Bindl, U. K. & Strauss, K. Making things happen: a model of proactive motivation. *J. Manag.* 36, 827–856 (2010).
- Amabile, T. M. Effects of external evaluations on artistic creativity. J. Pers. Soc. Psychol. 37, 221–233 (1979).
- Amabile, T. M. Motivation and creativity: effects of motivational orientation on creative writers. *J. Pers. Soc. Psychol.* 48, 393–399 (1985).
- Amabile, T. M., Hennessey, B. A. & Grossman, B. S. Social influences on creativity: the effects of contracted-for reward. *J. Pers. Soc. Psychol.* 50, 14–23 (1986).
- Boggiano, A. K., Flink, C., Shields, A., Seelbach, A. & Barrett, M. Use of techniques promoting students' self-determination: effects on students' analytic problem-solving skills. *Motiv. Emot.* **17**, 319–336 (1993).
- Fabes, R. A., Moran, J. D. & McCullers, J. C. The hidden costs of reward and WAIS subscale performance. *Am. J. Psychol.* **94**, 387–398 (1981)
- Koestner, R., Ryan, R. M., Bernieri, F. & Holt, K. Setting limits on children's behavior: the differential effects of controlling vs informational styles on intrinsic motivation and creativity. *J. Pers.* 52, 231–248 (1984).

- McGraw, K. O. in *The Hidden Costs of Reward* (eds Lepper. M. R. & Greene, D.) 33–60 (Erlbaum, 1978).
- McGraw, K. O. & McCullers, J. C. Evidence of a detrimental effect of extrinsic incentives on breaking a mental set. J. Exp. Soc. Psychol. 15, 285–294 (1979).
- Utman, C. H. Performance effects of motivational state: a meta-analysis. *Personal. Soc. Psychol. Rev.* 1, 170–182 (1997).
- Vanteenkiste, M., Simons, J., Lens, W., Sheldon, K. M. & Deci, E. L. Motivating, learning, performance, and persistence: the synergistic effects of intrinsic goal contents and autonomy-supportive contexts. *J. Pers. Soc. Psychol.* 87, 246–260 (2004).
- 51. Van Dijk, J. *The Digital Divide* (Wiley, 2020). 52. Latham, G. P. & Ernst, C. T. Keys to motivating
- Latham, G. P. & Ernst, C. T. Keys to motivating tomorrow's workforce. *Hum. Resour. Manag. Rev.* 16, 181–198 (2006).
- Yang, L. et al. The effects of remote work on collaboration among information workers. *Nat. Hum. Behav.* 6, 43–54 (2022).
   Griffin, M. A., Neal, A. & Parker, S. K. A new model of
- Griffin, M. A., Neal, A. & Parker, S. K. A new model of work role performance: positive behavior in uncertain and interdependent contexts. *Acad. Manage. J.* 50, 327–347 (2007).
- Griffin, M. A. & Grote, G. When is more uncertainty better? A model of uncertainty regulation and effectiveness. *Acad. Manage. Rev.* 45, 745–765 (2020).
- Van Den Bos, K. & Lind, E. A. in *Handbook of the* Uncertain Self (eds Arkin, R. M., Oleson, K. C. & Carroll, P. J.) 122–141 (Routledge, 2013).
- Amabile, T. M. The social psychology of creativity: a componential conceptualization. J. Pers. Soc. Psychol. 45, 357–376 (1983).
- Gagné, M., Forest, J., Vansteenkiste, M., Crevier-Braud, L. & Broeck, A. The multidimensional work motivation scale: validation evidence in seven languages and nine countries. *Eur. J. Work Organ. Psychol.* 24, 178–196 (2015).
- Wall, T. D. & Jackson, P. R. in *The Changing Nature of Work* (ed. Howard, A.) 139–174 (Jossey-Bass, 1995).
- Sturm, T. et al. Coordinating human and machine learning for effective organizational learning. *MIS Q.* 45, 1581–1602 (2021).
- Hislop, D. et al. Variability in the use of mobile ICTs by homeworkers and its consequences for boundary management and social isolation. *Inf. Organ.* 25, 222–232 (2015).
- Kellogg, K. C., Orlikowski, W. J. & Yates, J. Life in the trading zone: structuring coordination across boundaries in postbureaucratic organizations. *Organ. Sci.* 17, 22–44 (2006).
- Lisitsa, E. et al. Loneliness among young adults during covid-19 pandemic: the mediational roles of social media use and social support seeking. J. Soc. Clin. Psuchol. 39, 708–726 (2020).
- J. Soc. Clin. Psychol. 39, 708–726 (2020).
   Bhardwaj, S., Bhattacharya, S., Tang, L. & Howell, K. E. Technology introduction on ships: the tension between safety and economic rationality. Saf. Sci. 115, 329–338 (2019).
- Rani, U. & Furrer, M. Digital labour platforms and new forms of flexible work in developing countries: algorithmic management of work and workers. *Compet. Change* 25, 212–236 (2021).
- Schörpf, P., Flecker, J., Schönauer, A. & Eichmann, H. Triangular love–hate: management and control in creative crowdworking. *N. Technol. Work Employ.* 32, 43–58 (2017).
- World Economic Forum. The future of jobs: employment, skills and workforce strategy for the fourth industrial revolution. WEF https://www.weforum.org/reports/ the-future-of-jobs (2016).
- World Economic Forum. The future of jobs report 2020. WEF https://www.weforum.org/reports/ the-future-of-jobs-report-2020 (2020).
- Woods, S. A., Ahmed, S., Nikolaou, I., Costa, A. C. & Anderson, N. R. Personnel selection in the digital age: a review of validity and applicant reactions, and future research challenges. *Eur. J. Work Organ. Psychol.* 29, 64–77 (2020).
- Lukacik, E.-R., Bourdage, J. S. & Roulin, N. Into the void: a conceptual model and research agenda for the design and use of asynchronous video interviews. *Hum. Resour. Manag. Rev.* 32, 100789 (2020).
- Dunlop, P. D., Holtrop, D. & Wee, S. How asynchronous video interviews are used in practice: a study of an Australian-based AVI vendor. *Int. J. Sel.* Assess. https://doi.org/10.1111/jisa.12372 (2022).
- Armstrong, M. B., Ferrell, J. Z., Collmus, A. B. & Landers, R. N. Correcting misconceptions about

gamification of assessment: more than SJTs and badges. Ind. Organ. Psychol. 9, 671–677 (2016).

- Armstrong, M. B. Landers, R. N. & Collmus, A. B. in *Emerging Research and Trends in Camification* (eds Cangadharbatla, H. & Davis, D. Z.) 140–165 (IGI Global, 2016).
- Kotlyar, I. & Krasman, J. Virtual simulation: new method for assessing teamwork skills. *Int. J. Sel.* Assess. https://doi.org/10.1111/ijsa.12368 (2021).
- Alexander, A. L., Brunyé, T. T., Sidman, J. & Weil, S. A. From Gaming to Training: A Review of Studies on Fidelity, Immersion, Presence, and Buy-in and Their Effects on Transfer in PC-Based Simulations and Games (DARWARS Training Impact Group, 2005).
- Buil, I., Catalán, S. & Martínez, E. Understanding applicants' reactions to gamified recruitment. *J. Bus. Res.* **110**, 41–50 (2020).
- Basch, J. M. & Melchers, K. G. The use of technologymediated interviews and their perception from the organization's point of view. *Int. J. Sel. Assess.* 29, 495–502 (2021).
- Raghavan, M., Barocas, S., Kleinberg, J. & Levy, K. in Proc. 2020 Conf. Fairness Account. Transparency 469–481 (ACM, 2020).
- Tippins, N. T., Oswald, F. L. & McPhail, S. M. Scientific, legal, and ethical concerns about Al-based personnel selection tools: a call to action. *Pers. Assess. Decis.* 7, 1 (2021).
- Hausknecht, J. P., Day, D. V. & Thomas, S. C. Applicant reactions to selection procedures: an updated model and meta-analysis. *Pers. Psychol.* 57, 639–683 (2004).
- Auer, F. M., Mersy, G., Marin, S., Blaik, J. & Landers, R. N. Using machine learning to model trace behavioral data from a game-based assessment. *Int. J. Sel. Assess.* **30**, 82–102 (2021).
- Cook, R., Jones-Chick, R., Roulin, N. & O'Rourke, K. Job seekers' attitudes toward cybervetting: scale development, validation, and platform comparison. *Int. J. Sel. Assess.* 28, 383–398 (2020).
- Langer, M., König, C. J. & Hemsing, V. Is anybody listening? The impact of automatically evaluated job interviews on impression management and applicant reactions. J. Manag. Psychol. 35, 271–284 (2020).
- Guchait, P., Ruetzler, T., Taylor, J. & Toldi, N. Video interviewing: a potential selection tool for hospitality managers — a study to understand applicant perspective. *Int. J. Hosp. Manag.* 36, 90–100 (2014)
- perspective. Int. J. Hosp. Manag. 36, 90–100 (2014).
   Vansteenkiste, M. et al. Autonomous and controlled regulation of performance-approach goals: their relations to perfectionism and educational outcomes. Motiv. Emot. 34, 333–353 (2010).
- McCarthy, J. M. et al. Applicant perspectives during selection: a review addressing "so what?," "what's new?," and "where to next?" J. Manag. 43, 1693–1725 (2017).
- Jesuthasan, R. & Boudreau, J. W. Reinventing Jobs: A Four-Step Approach for Applying Automation to Work (Harvard Business, 2018).
   Brynjolfsson, E., Mitchell, T. & Rock, D. What can
- Brynjolfsson, E., Mitchell, T. & Rock, D. What can machines learn, and what does it mean for occupations and the economy? AEA Pap. Proc. 108, 43–47 (2018).
- Hackman, J. R. & Lawler, E. E. Employee reactions to job characterisitics. J. Appl. Psychol. 55, 259–286 (1971).
- Hackman, J. R. & Oldham, G. R. Development of the job diagnostics survey. J. Appl. Psychol. 60, 159–170 (1975).
- Parker, S. K., Wall, T. D. & Cordery, J. L. Future work design research and practice: towards an elaborated model of work design. J. Occup. Organ. Psychol. 74, 413–440 (2001).
- Humphrey, S. E., Nahrgang, J. D. & Morgeson, F. P. Integrating motivational, social and contextual work design features: a meta-analytic summary and theoretical extension of the work design literature. J. Appl. Psychol. 92, 1332–1356 (2007).
- Gagné, M. & Panaccio, A. in Oxford Handbook of Employee Engagement, Motivation, and Self-Determination Theory (ed. Gagné, M.) 165–180 (Oxford Univ. Press, 2014).
- Demerouti, E., Bakker, A. B., Nachreiner, F. & Schaufeli, W. B. The job demands–resources model of burnout. J. Appl. Psychol. 86, 499–512 (2001).
- Bakker, A. B. & Demerouti, E. Job demands-resources theory: taking stock and looking forward. *J. Occup. Health Psychol.* 22, 273–285 (2017).
- Bakker, A. B., Demerouti, E. & Euwema, M. C. Job resources buffer the impact of job demands on burnout. *J. Occup. Health Psychol.* **10**, 170–180 (2005).
- 97. Walsh, S. M. & Strano, M. S. *Robotic Systems and Autonomous Platforms* (Woodhead, 2019).

- Waschull, S., Bokhorst, J. A. C., Molleman, E. & Wortmann, J. C. Work design in future industrial production: transforming towards cyber-physical systems. *Comput. Ind. Eng.* 139, 105679 (2020)
- Haslbeck, A. & Hoermann, H.-J. Flying the needles: flight deck automation erodes fine-motor flying skills among airline pilots. *Hum. Factors* 58, 533–545 (2016).
- Lehdonvirta, V. & Ernkvist, M. Knowledge Map of the Virtual Economy: Converting the Virtual Economy into Development Potential (World Bank, 2011).
- 101. Kittur, A. et al. in *Proc. 2013 Conf. Comput. Support. Coop. Work* 1301–1318 (ACM, 2013).
- Beane, M. Shadow learning: building robotic surgical skill when approved means fail. *Adm. Sci. O.* 64, 87–123 (2019).
- 103. Mohlmann, M. & Zalmanson, L. in *Proc. Int. Conf. Inf. Syst.* 1–17 (ICIS, 2017).
- 104. Ohly, S. & Fritz, C. Work characteristics, challenge appraisal, creativity, and proactive behavior: a multi-level study. *J. Organ. Behav.* **31**, 543–565 (2010).
- Wang, B., Liu, Y. & Parker, S. K. How does the use of information communication technology affect individuals? A work design perspective. *Acad. Manag. Ann.* 14, 695–725 (2020).
   Orlikowski, W. J. The duality of technology: rethinking
- Orlikowski, W. J. The duality of technology: rethinking the concept of technology in organizations. *Organ. Sci.* 3, 398–427 (1992).
- 107. Kadir, B. A. & Broberg, O. Human-centered design of work systems in the transition to industry 4.0. *Appl. Ergon.* 92, 103334 (2021).
- 108. Bloom, N. How working from home works out (Stanford Univ., 2020).
- Bailenson, J. N. Nonverbal overload: a theoretical argument for the causes of Zoom fatigue. *Technol. Mind Behav.* https://doi.org/10.1037/tmb0000030 (2021).
- Jun, H. & Bailenson, J. N. in International Handbook of Emotions and Media (eds Döveling, K. & Konijn, E. A.) 303–315 (Routledge, 2021).
- 111. Ratan, R., Miller, D. B. & Bailenson, J. N. Facial appearance dissatisfaction explains differences in zoom fatigue. *Cyberpsychol. Behav. Soc. Netw.* 25, 124–129 (2021).
- 112. Riedl, R. On the stress potential of videoconferencing: definition and root causes of Zoom fatigue. *Electron. Mark.* https://doi.org/10.1007/s12525-021-00501-3 (2021).
- Shockley, K. M. et al. The fatiguing effects of camera use in virtual meetings: a within-person field experiment. *J. Appl. Psychol.* **106**, 1137–1155 (2021).
   Raghuram, S., Garud, R., Wiesenfeld, B. & Gupta, V.
- 114. Raghuram, S., Garud, R., Wiesenfeld, B. & Gupta, V Factors contributing to virtual work adjustment. J. Manag. 27, 383–405 (2001).
- 115. Raghuram, S., Wiesenfeld, B. & Garud, R. Technology enabled work: the role of self-efficacy in determining telecommuter adjustment and structuring behavior. *J. Vocat. Behav.* 63, 180–198 (2003).
- 116. Muraven, M. Autonomous self-control is less depleting. *J. Res. Personal.* **42**, 763–770 (2008).
- 117. Muraven, M., Gagne, M. & Rosman, H. Helpful self-control: autonomy support, vitality, and depletion. *J. Exp. Soc. Psychol.* 44, 573–585 (2008).
- 118. Feldman, D. C. & Gainey, T. W. Patterns of telecommuting and their consequences: framing the research agenda. *Hum. Resour. Manag. Rev.* 7, 369–388 (1997).
- 119. Gajendran, R. S. & Harrison, D. A. The good, the bad, and the unknown about telecommuting: metaanalysis of psychological mediators and individual consequences. J. Appl. Psychol. **92**, 1524–1541 (2007).
- Perry, S. J., Rubino, C. & Hunter, E. M. Stress in remote work: two studies testing the demand-controlperson model. *Eur. J. Work Organ. Psychol.* 27, 577–593 (2018).
- 121. Kossek, E. E., Lautsch, B. A. & Eaton, S. C. Telecommuting, control, and boundary management: correlates of policy use and practice, job control, and work–family effectiveness. *J. Vocat. Behav.* 68, 347–367 (2006).
- 122. Johnson, A. et al. A review and agenda for examining how technology-driven changes at work will impact workplace mental health and employee well-being. *Aust. J. Manag.* **45**, 402–424 (2020).
- Parent-Rocheleau, X. & Parker, S. K. Algorithms as work designers: how algorithmic management influences the design of jobs. *Hum. Resour. Manag. Rev.* https://doi.org/10.1016/j.hrmr.2021.100838 (2021).

- 124. Seppälä, T., Lipponen, J., Pirttila-Backman, A.-M. & Lipsanen, J. Reciprocity of trust in the supervisor– subordinate relationship: the mediating role of autonomy and the sense of power. *Eur. J. Work Organ. Psychol.* **20**, 755–778 (2011).
- 125. Parker, S. K., Knight, C. & Keller, A. *Remote Managers* Are Having Trust Issues (Harvard Business, 2020).
- 126. Staples, D. S. A study of remote workers and their differences from non-remote workers. J. End User Comput. 13, 3–14 (2001).
- 127. Enzle, M. E. & Anderson, S. C. Surveillant intentions and intrinsic motivation. J. Pers. Soc. Psychol. 64, 257–266 (1993).
- 128. Senécal, C., Vallerand, R. J. & Guay, F. Antecedents and outcomes of work-family conflict: toward a motivational model. *Pers. Soc. Psychol. Bull.* 27, 176–186 (2001).
- 129. Aiello, J. R. & Shao, Y. in Human–Computer Interaction: Applications and Case Studies (eds Smith, M. J. & Salvendy, C.) 1011–1016 (Elsevier Science, 1993).
- Criffith, T. L. Monitoring and performance: a comparison of computer and supervisor monitoring. *J. Appl. Soc. Psychol.* 23, 549–572 (1993).
- Stone, E. F. & Stone, D. L. in *Research in Personnel and Human Resource Management* Vol. 8 (eds Ferris, G. R. & Rowland, K. M.) 349–411 (JAI, 1990).
   Wells, D. L., Moorman, R. H. & Werner, J. M.
- 132. Wells, D. L., Moorman, R. H. & Werner, J. M. The impact of the perceived purpose of electronic performance monitoring on an array of attitudinal variables. *Hum. Resour. Dev. O.* 18, 121–138 (2007).
- 133. Ravid, D. M., Tomczak, D. L., White, J. C. & Behrend, T. S. EPM 20/20: a review, framework, and research agenda for electronic performance monitoring. J. Manag. 46, 100–126 (2020).
- De Tienne, K. B. & Abbott, N. T. Developing an employee-centered electronic monitoring system. *J. Syst. Manag.* 44, 12–13 (1993).
   Stanton, J. M. & Barnes-Farrell, J. L. Effects of
- 135. Stanton, J. M. & Barnes-Farrell, J. L. Effects of electronic performance monitoring on personal control, task satisfaction, and task performance. J. Appl. Psychol. 81, 738–745 (1996).
- Day, A., Barber, L. K. & Tonet, J. in *The Cambridge Handbook of Technology and Employee Behavior* (ed. Landers, R. N.) 580–607 (Cambridge Univ. Press, 2019).
- 137. Day, Á., Scott, N. & Kevin Kelloway, E. in New Developments in Theoretical and Conceptual Approaches to Job Stress Vol. 8 (eds Perrewé, P. L. & Ganster, D. C.) 317–350 (Emerald, 2010).
- 138. Cooper, C. D. & Kurland, N. B. Telecommuting, professional isolation, and employee development in public and private organizations. J. Organ. Behav. 23, 511–552 (2002).
- 139. Coltrane, S., Miller, E. C., DeHaan, T. & Stewart, L. Fathers and the flexibility stigma. *J. Soc. Issues* 69, 279–302 (2013).
- 140. Bloom, N., Liang, J., Roberts, J. & Ying, Z. J. Does working from home work? evidence from a Chinese experiment. *Q. J. Econ.* **130**, 165–218 (2014).
- 141. Charalampous, M., Grant, C. A., Tramontano, Ć. & Michailidis, E. Systematically reviewing remote e-workers' well-being at work: a multidimensional approach. *Eur. J. Work Organ. Psychol.* 28, 51–73 (2019).
- 142. Bloom, N. Don't Let Employees Pick Their WFH Days (Harvard Business, 2021).
- 143. Schade, H. M., Digutsch, J., Kleinsorge, T. & Fan, Y. Having to work from home: basic needs, well-being, and motivation. *Int. J. Environ. Res. Public Health* 18, 1–18 (2021).
- 144. Morganson, V. J., Major, D. A., Oborn, K. L., Verive, J. M. & Heelan, M. P. Comparing telework locations and traditional work arrangements: differences in work–life balance support, job satisfaction, and inclusion. *J. Manag. Psychol.* 25, 578–595 (2010).
- Solden, T. D., Veiga, J. F. & Dino, R. N. The impact of professional isolation on teleworker job performance and turnover intentions: does time spent teleworking, interacting face-to-face, or having access to communication-enhancing technology matter? *J. Appl. Psychol.* **93**, 1412–1421 (2008).
   Peiperl, M. & Baruch, Y. Back to square zero:
- Peiperl, M. & Baruch, Y. Back to square zero: the post-corporate career. *Organ. Dyn.* 25, 7–22 (1997).
- 147. Akkirman, A. D. & Harris, D. L. Organizational communication satisfaction in the virtual workplace. *J. Manag. Dev.* 24, 397–409 (2005)
- J. Manag. Dev. 24, 397–409 (2005).
   148. Golden, T. D. & Veiga, J. F. The impact of extent of telecommuting on job satisfaction: resolving inconsistent findings. J. Manag. 31, 301–318 (2005).

- 149. Goldfarb, Y., Gal, E. & Golan, O. Implications of employment changes caused by COVID-19 on mental health and work-related psychological need satisfaction of autistic employees: a mixed-methods longitudinal study. *J. Autism Dev. Disord.* **52**, 89–102 (2022).
- O'Neill, T. A. & Salas, E. Creating high performance teamwork in organizations. *Hum. Resour. Manag. Rev.* 28, 325–331 (2018).
- 151. Hollenbeck, J. R., Beersma, B. & Schouten, M. E. Beyond team types and taxonomies: a dimensional scaling conceptualization for team description. *Acad. Manage. Rev.* **37**, 82–106 (2012).
- 152. Gilson, L. L., Maynard, M. T., Young, N. C. J., Vartiainen, M. & Hakonen, M. Virtual teams research: 10 years, 10 themes, and 10 opportunities. *J. Manag.* 41, 1313–1337 (2015).
- Raghuram, S., Hill, N. S., Gibbs, J. L. & Maruping, L. M. Virtual work: bridging research clusters. *Acad. Manag. Ann.* 13, 308–341 (2019).
- 154. Handke, L., Klonek, F. E., Parker, S. K. & Kauffeld, S. Interactive effects of team virtuality and work design on team functioning. *Small Group. Res.* **51**, 3–47 (2020).
- Foster, M. K., Abbey, A., Callow, M. A., Zu, X. & Wilbon, A. D. Rethinking virtuality and its impact on teams. *Small Group. Res.* 46, 267–299 (2015).
- 156. Lautsch, B. A. & Kossek, E. E. Managing a blended workforce: telecommuters and non-telecommuters. *Organ. Dyn.* 40, 10–17 (2011).
- 157. Mesmer-Magnus, J. R., DeChurch, L. A., Jimenez-Rodriguez, M., Wildman, J. & Shuffler, M. A meta-analytic investigation of virtuality and information sharing in teams. *Organ. Behav. Hum. Decis. Process* **115**, 214–225 (2011).
- Mathieu, J. & Gilson, L. in Oxford Handbook of Organizational Psychology Vol. 2 (ed. Kozlowski, S. W.) 910–930 (Oxford Univ. Press, 2012).
- Chen, C. & Kanfer, R. Toward a systems theory of motivated behavior in work teams. *Res. Organ. Behav.* 27, 223–267 (2006).
- 160. Marks, M. A., Mathieu, J. E. & Zaccaro, S. J. A temporally based framework and taxonomy of team processes. *Acad. Manage. Rev.* 26, 356–376 (2001).
- 161. Beal, D. J., Cohen, R. R., Burke, M. J. & McLendon, C. L. Cohesion and performance in groups: a meta-analytic clarification of construct relations. *J. Appl. Psychol.* 88, 989–1004 (2003).
- 162. de Jong, B., Dirks, K. T. & Gillespie, N. M. Trust and team performance: a meta-analysis of main effects, moderators, and covariates. J. Appl. Psychol. 101, 1134–1150 (2016).
- Barrick, M. R., Thurgood, G. R., Smith, T. A. & Courtright, S. H. Collective organizational engagement: linking motivational antecedents, strategic implementation, and firm performance. Acad. Manage. J. 58, 111–135 (2015).
   Waller, M. J., Okhuysen, C. A. & Saghafian, M.
- 164. Waller, M. J., Okhuysen, G. A. & Saghafian, M. Conceptualizing emergent states: a strategy to advance the study of group dynamics. *Acad. Manag. Ann.* **10**, 561–598 (2016).
- 165. Breuer, C., Hüffmeier, J. & Hertel, G. Does trust matter more in virtual teams? A meta-analysis of trust and team effectiveness considering virtuality and documentation as moderators. J. Appl. Psychol. 101, 1151–1177 (2016).
- Gagne, M. A model of knowledge-sharing motivation. *Hum. Resour. Manage.* 48, 571–589 (2009).
   Sewell, G. & Taskin, L. Out of sight, out of mind
- 107. sewen, U. & Iaskin, L. Out of sight, out of mind in a new world of work? Autonomy, control, and spatiotemporal scaling in telework. *Organ. Stud.* 36, 1507–1529 (2015).
- 1507–1529 (2015).
  168. Tietze, S. & Nadin, S. The psychological contract and the transition from office-based to home-based work. *Hum. Resour. Manag. J.* 21, 318–334 (2011).
- Orsini, C. & Rodrigues, V. Supporting motivation in teams working remotely: the role of basic psychological needs. *Med. Teach.* 42, 828–829 (2020).
- 170. Ragu-Nathan, T. S., Tarafdar, M., Ragu-Nathan, B. S. & Tu, Q. The consequences of technostress for end users in organizations: conceptual development and empirical validation. *Inf. Syst. Res.* **19**, 417–433 (2008).
- Lee, M. K. Understanding perception of algorithmic decisions: fairness, trust, and emotion in response to algorithmic management. *Big Data Soc.* 5, 2053951718756684 (2018).
   Cal, U., Jensen, T. B. & Stein, M.-K. Breaking the
- 172. Gal, U., Jensen, T. B. & Stein, M.-K. Breaking the vicious cycle of algorithmic management: a virtue ethics approach to people analytics. *Inf. Organ.* **30**, 100301 (2020).

- 173. Rosenblat, A. Uberland: How Algorithms are Rewriting the Rules of Work (Univ. California Press. 2018).
- Charbonneau, É. & Doberstein, C. An empirical assessment of the intrusiveness and reasonableness of emerging work surveillance technologies in the public sector. *Public Adm. Rev.* **80**, 780–791 (2020).
- 175. Levy, K. E. C. The contexts of control: information, power, and truck-driving work. *Inf. Soc.* **31**, 160–174 (2015).
- Vargas, T. L. Consumer redlining and the reproduction of inequality at dollar general. *Qual. Sociol.* 44, 205–229 (2021).
- Stark, D. & Pais, I. Algorithmic management in the platform economy. *Sociologica* 14, 47–72 (2020).
   Schafheitle, S. et al. No stone left unturned? Toward a
- From Softannework for the impact of datafication technologies on organizational control. Acad. Manag. Discov. 6, 455–487 (2020).
- 179. Norlander, P., Jukic, N., Varma, A. & Nestorov, S. The effects of technological supervision on gig workers: organizational control and motivation of Uber, taxi, and limousine drivers. *Int. J. Hum. Resour. Manag.* 32, 4053–4077 (2021).
- Carayon, P. Effects of electronic performance monitoring on job design and worker stress: results of two studies. *Int. J. Human–Computer Interact.* 6, 177–190 (1994).
- 181. Moore, S. & Hayes, L. J. B. in Humans and Machines At Work: Dynamics of Virtual Work (eds. Moore, P. V., Upchurch, M. & Whittaker, X.) 101–124 (Palgrave Macmillan, 2018).
- 182. De Cremer, D. *Leadership by Algorithm* (Harriman House, 2020).
- 183. Goods, C., Veen, A. & Barratt, T. "Is your gig any good?" Analysing job quality in the Australian platform-based food-delivery sector. *J. Ind. Relat.* 61, 502–527 (2019).
- 184. Wood, A. J., Graham, M., Lehdonvirta, V. & Hjorth, I. Good gig, bad gig: autonomy and algorithmic control in the global gig economy. *Work Employ. Soc.* 33, 56–75 (2019).
- Duggan, J., Sherman, U., Carbery, R. & McDonnell, A. Algorithmic management and app-work in the gig economy: a research agenda for employment relations and HRM. *Hum. Resour. Manag. J.* **30**, 114–132 (2020).
- 186. Reid-Musson, E., MacEachen, E. & Bartel, E. 'Don't take a pool': worker misbehaviour in on-demand ride-hail carpooling. *N. Technol. Work Employ.* 35, 145–161 (2020).
- Anthony, C. When knowledge work and analytical technologies collide: the practices and consequences of black boxing algorithmic technologies. *Adm. Sci. O.* 66, 1173–1212 (2021).
- Zednik, C. Solving the black box problem: a normative framework for explainable artificial intelligence. *Phil. Technol.* 34, 265–288 (2021).
- 189. Schlicker, N. et al. What to expect from opening up 'black boxes'? Comparing perceptions of justice between human and automated agents. *Comput. Hum. Behav.* **122**, 106837 (2021).
- 190. Terry, E., Marks, A., Dakessian, A. & Christopoulos, D. Emotional labour and the autonomy of dependent self-employed workers: the limitations of digital managerial control in the home credit sector. *Work Employ. Soc.* https://doi.org/10.1177/ 0950017020979504 (2021).
- 191. Gregory, K. 'My life is more valuable than this': understanding risk among on-demand food couriers in Edinburgh. *Work Employ. Soc.* 35, 316–331 (2021).
   192. Dweck, C. S. & Leggett, E. L. A social-cognitive
- Dweck, C. S. & Leggett, E. L. A social-cognitive approach to motivation and personality. *Psychol. Rev.* 25, 109–116 (1988).
- 193. Wesche, J. S. & Sonderegger, A. When computers take the lead: the automation of leadership. *Comput. Hum. Behav.* **101**, 197–209 (2019).
- 194. Duggan, J., Sherman, U., Carbery, R. & McDonnell, A. Boundaryless careers and algorithmic constraints in the gig economy. *Int. J. Hum. Resour. Manag.* https://doi.org/10.1080/09585192.2021.1953565 (2021).
- Timko, P. & van Melik, R. Being a Deliveroo rider: practices of platform labor in Nijmegen and Berlin. *J. Contemp. Ethnogr.* **50**, 497–523 (2021).
   Leclercq-Vandelannoitte, A. An ethical perspective
- 196. Leclercq-Vandelannoitte, A. An ethical perspective on emerging forms of ubiquitous IT-based control. *J. Bus. Ethics* **142**, 139–154 (2017).
- 197. Cai, Z., Parker, S. K., Chen, Z. & Lam, W. How does the social context fuel the proactive fire? A multilevel review and theoretical synthesis. *J. Organ. Behav.* 40, 209–230 (2019).
- 198. Hetland, J., Hetland, H., Bakker, A. B. & Demerouti, E. Daily transformational leadership and employee job

crafting: the role of promotion focus. *Eur. Manag. J.* **36**, 746–756 (2018).

- 199. Schmitt, A., Den Hartog, D. N. & Belschak, F. D. Transformational leadership and proactive work behaviour: a moderated mediation model including work engagement and job strain. J. Occup. Organ. Psychol. 89, 588–610 (2016).
- Lee, Y., Lee, J. & Hwang, Y. Relating motivation to information and communication technology acceptance: self-determination theory perspective. *Comput. Hum. Behav.* 51, 418–428 (2015).
- Nikou, S. A. & Economides, A. A. Mobile-based assessment: integrating acceptance and motivational factors into a combined model of self-determination theory and technology acceptance. *Comput. Hum. Behav.* 68, 83–95 (2017).
- 202. Basch, J. M. et al. A good thing takes time: the role of preparation time in asynchronous video interviews. *Int. J. Sel. Assess.* 29, 378–392 (2021).
- Peters, D., Calvo, R. A. & Ryan, R. M. Designing for motivation, engagement and wellbeing in digital experience. *Front. Psychol.* 9, 797 (2018).
- experience. Front. Psychol. 9, 797 (2018).
  204. Grote, G., Ryser, C., Wäfler, T., Windischer, A. & Weik, S. KOMPASS: a method for complementary function allocation in automated work systems. Int. J. Hum. Comput. Stud. 52, 267–287 (2000).
- 205. Jungert, T., Van den Broeck, A., Schreurs, B. & Osterman, U. How colleagues can support each other's needs and motivation: an intervention on employee work motivation. *Appl. Psychol.* **67**, 3–29 (2018).
- 206. Kirkman, B. L., Rosen, B., Tesluk, P. E. & Gibson, C. B. The impact of team empowerment on virtual team performance: the moderating role of face-to-face interaction. *Acad. Manage. J.* 47, 175–192 (2004).
- Klonek, F., Gerpott, F. H., Lehmann-Willenbrock, N. & Parker, S. K. Time to go wild: how to conceptualize and measure process dynamics in real teams with high-resolution. *Organ. Psychol. Rev.* 9, 245–275 (2019).
- Waller, M. J., Uitdewilligen, S., Rico, R. & Thommes, M. S. in *The Emerald Handbook of Group* and *Team Communication Research* (eds Beck, S. J., Keyton, J. & Poole, M. S.) 135–153 (Emerald, 2021).
- Makarius, E. E., Mukherjee, D., Fox, J. D. & Fox, A. K. Rising with the machines: a sociotechnical framework for bringing artificial intelligence into the organization. *J. Bus. Res.* **120**, 262–273 (2020).
   Lythreatis, S., Singh, S. K. & El-Kassar, A.-N.
- Lythreatis, S., Singh, S. K. & El-Kassar, A.-N. The digital divide: a review and future research agenda. *Technol. Forecast. Soc. Change* **175**, 121359 (2021).
- 211. Lai, J. & Widmar, N. O. Revisiting the digital divide in the COVID-19 era. *Appl. Econ. Perspect. Policy* 43, 458–464 (2021).
- 212. Gran, A.-B., Booth, P. & Bucher, T. To be or not to be algorithm aware: a question of a new digital divide? *Inf. Commun. Soc.* 24, 1779–1796 (2021).
- 213. Parker, S. K. & Andrei, D. M. Include, individualize, and integrate: organizational meta-strategies for mature workers. *Work Aging Retire*. 6, 1–7 (2019).
- 214. Petery, G. A., Iles, L. J. & Parker, S. K. Putting successful aging into context. *Ind. Organ. Psychol.* 13, 377–382 (2020).
- 215. Graf, N., Brown, A. & Patten, E. The narrowing, but persistent, gender gap in pay. *Pew Research Center* http://www.www.pewresearch.org/ft\_18-04-06\_wage\_ gap/ (2018).
- Aksoy, C. G., Özcan, B. & Philipp, J. Robots and the gender pay gap in Europe. *Eur. Econ. Rev.* 134, 103693 (2021).
- 217. Madgavkar, A., White, O., Krishnan, M., Mahajan, D. & Azcue, X. COVID-19 and gender equality: countering the regressive effects. *McKinsey* https://www.mckinsey. com/featured-insights/future-of-work/covid-19-andgender-equality-countering-the-regressive-effects (2020).
- Class, J. Blessing or curse? Work–family policies and mother's wage growth over time. *Work Occup.* 31, 367–394 (2004).
- 219. Valletta, R. G. Declining job security. *J. Labor. Econ.* **17**, S170–S197 (1999).
- Givord, P. & Maurin, E. Changes in job security and their causes: an empirical analysis for France, 1982–2002. *Eur. Econ. Rev.* 48, 595–615 (2004).
- Baruch, Y. & Vardi, Y. A fresh look at the dark side of contemporary careers: toward a realistic discourse. *Br. J. Manag.* 27, 355–372 (2016).
- 222. Akkermans, J., Richardson, J. & Kraimer, M. L. The Covid-19 crisis as a career shock: implications for careers and vocational behavior. *J. Vocat. Behav.* **119**, 103434 (2020).

- 223. Gubler, M., Arnold, J. & Coombs, C. Reassessing the protean career concept: empirical findings, conceptual components, and measurement. J. Organ. Behav. 35, S23-S40 (2014).
- 224. Hall, D. T. Careers in Organizations (Scott Foresman, 1976)
- 225. Hall, D. T. Careers In And Out Of Organizations (SAGE, 2002).
- 226. Hall, D. T. & Mirvis, P. H. in The Career Is Dead -Long Live The Career: A Relational Approach To Careers (ed. Hall, D. T.) 15–45 (Jossey-Bass, 1996). 227, Kernis, M. H. & Goldman, B. M. A Multicomponent
- Conceptualization of Authenticity: Theory and Research Vol. 38 (Zana, M. P.) 283-357 (Academic, 2006).
- 228. Ryan, W. S. & Ryan, R. M. Toward a social psychology of authenticity: exploring within-person variation in autonomy, congruence, and genuineness using self-determination theory. Rev. Gen. Psychol. 23, 99-112 (2019).
- 229. Klotz, A. The COVID vaccine means a return to work. And a wave of resignations. NBC https://www. nbcnews.com/think/opinion/covid-vaccine-means return-work-wave-resignations-ncna1269018 (2021).
- 230. Tharoor, I. The 'great resignation' goes global. Washington Post https://www.washingtonpost.com/ world/2021/10/18/labor-great-resignation-global/ (2021)
- 231. Sheather, J. & Slattery, D. The great resignation how do we support and retain staff already stretched

to the limit? BJM Opinion https://blogs.bmj.com/ bmj/2021/09/21/the-great-resignation-how-dowe-support-and-retain-staff-already-stretched-totheir-limit/ (2021).

- 232. Hirsch, P. B. The great discontent. J. Bus. Strategy 42,
- 439–442 (2021).
  233. Williamson, I. O. The 'great resignation' is a trend that began before the pandemic — and bosses need to get used to it. *The Conversation* https:// theconversation.com/the-great-resignation-is-a-trendthat-began-before-the-pandemic-and-bosses-need-to-get-used-to-it-170197 (2021).
- 234. Hopkins, J. C. & Figaro, K. A. The great resignation: an argument for hybrid leadership. Int. J. Bus. Manag. *Res.* 9, 393–400 (2021).
  235. Gandhi, V. & Robison, J. The 'great resignation' is
- really the 'great discontent'. Gallup https://www.gallup. com/workplace/351545/great-resignation-reallygreat-discontent.aspx (2021).
- 236. Warner, M. A. & Hausdorf, P. A. The positive interaction of work and family roles: using need theory to further understand the work-family interface. J. Manag. Psychol. 24, 372-385 (2009).
- 237. Richer, S. F., Blanchard, C. & Vallerand, R. J. A motivational model of work turnover. J. Appl. Soc. Psychol. **32**, 2089–2113 (2002).
- 238. Gillet, N., Gagné, M., Sauvagère, S. & Fouquereau, E. The role of supervisor autonomy support, organizational

support and autonomous and controlled motivation in predicting employees' satisfaction and turnover intentions. Eur. J. Work Organ. Psychol. 22, 450–460 (2013).

239. Christian, A. How the great resignation is turning into the great reshuffle. BBC https://www.bbc.com/ worklife/article/20211214-great-resignation-intogreat-reshuffle (2021).

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