Examining Crowd Work through The Historical Lens of Piecework

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ABSTRACT

The internet is empowering the rise of crowd work, gig work, and other forms of on-demand labor. A large and growing body of scholarship has attempted to predict the sociotechnical outcomes of this shift, especially addressing three questions: 1) What are the complexity limits of on-demand work?, 2) How far can work be decomposed into smaller microtasks?, and 3) What will work and the place of work look like for workers? In this paper, we look to the historical scholarship on piecework — a similar trend of work decomposition, distribution, and payment that was popular at the turn of the 20th century — to understand how these questions might play out with modern on-demand work. We identify the mechanisms that enabled and limited piecework historically, and identify whether on-demand work faces the same pitfalls or might differentiate itself. This approach introduces theoretical grounding that can help address some of the most pernicious questions in crowd work, and suggests design interventions that learn from history rather than repeat it.

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INTRODUCTION

The past decade has seen a flourishing of computationally-mediated labor. The framing of work into modular components has enabled computational hiring and management of workers at scale [66, 14, 82]. Distributed workers engage in work whenever their schedules allow, often with little to no awareness of the broader context of the work, and often with fleeting identities and associations [103, 93].

For years, such labor was limited to information work such as data annotation and surveys [80, 158, 165, 48, 118]. Howver,

physically embodied work such as driving and cleaning have now spawned multiple online labor markets as well [93, 146, 65, 141]. In this paper we will use the term *on-demand work* to capture this pair of related phenomena: first, *crowd work* [82], on platforms such as Amazon Mechanical Turk (AMT) and other sites of (predominantly) information work; and second, *gig work*, often as platforms for one-off jobs, like driving, courier services, and administrative support.

The realization that complex goals can be accomplished by directing crowds of workers has spurred the technology industry to flock to sites of labor such as AMT to explore the limits of this distributed, on–demand workforce. Researchers have also taken to the space in earnest, developing systems that enable new forms of production (e.g. [11, 15, 117]) and pursuing social scientific inquiry into the workers on these platforms [125, 135]. This research has called out identified the sociality of gig work [51], as well as the frustration and disenfranchisement that these systems embody [71, 103, 105]. Others have focused on the outcomes of this frustration, reflecting on the resistance that workers express against digitally-mediated labor markets [93, 130].

This body of research has broadly sought to answer one central question: What does the future hold for on–demand work and those who do it? Researchers have offered insights on this question along three major threads: First, what are the complexity limits of on–demand work [81]? Specifically, how complex are the goals that crowd work can accomplish, and what kinds of goals and industries may eventually utilize it? [120, 139, 77, 164, 162, 111, 56]. Second, how far can work be decomposed into smaller microtasks [83, 11, 24, 99, 84, 91, 20, 26, 112]? And third, what will work and the place of work look like for workers [71, 70, 130, 51, 18, 105]?

This research has largely sought to answer these questions by examining extant on-demand work phenomena. So far, it has not offered a framing for holistically explaining the developments in worker processes that researchers have developed, or the emergent phenomena in social environments; nor has any research gone so far as to directly predict future developments.

Piecework as a lens to understand crowdsourcing

In this paper, we offer a framing for on-demand work as a contemporary instantiation of *piecework*, a work and payment structure which breaks tasks down into discrete jobs, wherein

payment is made for work *output*, rather than for *time*. Piecework use as a lens on on–demand work is not new. Kittur et al. in 2013 referenced crowd work as piecework briefly as a loose analogy [82]. But more than this, the framing of on–demand labor as a re–instantiation of piecework gives us years of historical material to make sense of this new form of work, and allows us to reflect on–demand work through a mature theoretical lens, informed by decades of rigorous, empirical research.

More concretely, by looking at on-demand work as an instantiation (or even a continuation) of piecework, and by interrogating patterns that the historical literature identifies, we can achieve three goals. First, we can make sense of past events as part of a much larger series of an interrelated phenomenon. Second, we can reflect on differences in the features that impacted piecework historically and on-demand work today. And third, to some extent, we can use these differences to offer some predictions of what on-demand work researchers, and workers themselves, might expect to see on the horizon. For example, we will draw on the piecework literature regarding task decomposition, which was historically limited by shortcomings in measurement and instrumentation, and leverage that understanding to suggest how modern technology affects this mechanism in on-demand work — namely, by enabling precise tracking and measurement of workers via algorithms and software.

We organize this paper as follows: first, we review the definition and history of piecework to make clear the analogy to on-demand work; second, we interrogate the three major research questions above using the lens of piecework. For each question, we will survey piecework's historical perspective as well as on-demand work's current perspective, call out similarities and differences, and then hazard predictions on what piecework's history might suggest about the answers to these persistent questions for on-demand work.

A REVIEW OF PIECEWORK

The HCI community has used the term "piecework" to describe myriad instantiations of on-demand labor, but researchers have generally made this allusion in passing. Since this paper traces a much stronger parallel between (historical) piecework and (contemporary) on-demand work, a more comprehensive background on piecework will be useful. Specifically, first, we'll define "piecework" as researchers in its field understand it; and second, we'll trace the rise and fall of piecework at a high level, identifying key figures and ideas during this time. This section is not intended to be comprehensive: instead, it sets up the scaffolding necessary for our later investigations of on-demand work's three questions: complexity limits, task decomposition, and worker relationships.

What is piecework?: A primer and timeline

Aligning on-demand work with piecework requires an understanding of what piecework is. While it has had several definitions over the years, we can trace a constellation of characteristics that recur throughout the literature. We'll follow this research, collecting descriptions, examples, and definitions, to develop a working understanding.

Piecework's history traces back further perhaps than most would expect. Grier describes the process astronomers adopted of hiring young boys to calculate equations in order to betterpredict the trajectories of various celestial bodies in the 1830s [52]. George Airy was perhaps the first to rigorously apply piecework—style decomposition of tasks to work; by breaking complex calculations into constituent parts, and training young men to solve simple algebraic problems, Airy could distribute work to many more people than could otherwise complete the full calculations.

Piecework may have started in the intellectual domain of astronomical calculations and projections, but it found its foothold in manual labor. Piecework took hold in farm work [119], in textiles [9, 122], on railroads [19], and elsewhere in manufacturing [131]. Fordism and scientific management thrust piecework into higher gear, especially as mass manufacturing and a depleted wartime workforce forced industry to find new ways to eke out more production capacity.

By 1847 we find a concise definition of piecework in Raynbird's essay on piecework, particularly driven toward encapsulating the manual labor of farmwork. Raynbird does this by contrasting with the "day-labourer" — "the chief difference lies between the day-labourer, who receives a certain some of money ... for his day's work, and the task-labourer, whose earnings depend on the quantity of work done" [119]. Chadwick defines it through examples: "payment is made for each hectare which is pronounced to be well ploughed ... for each living foal got from a mare; ... for each living calf got" [25]. This framing offers an intuitive sense of piecework; "payment for results," as he calls it, is not only common in practice, but well–studied in labor economics as well [43, 152, 153, 61].

It's worth acknowledging that "this distinction [between piecerates and time-rates] was not completely clear-cut" [59]. Employers implemented piece-rates in some aspects and time-rates in others. The Rowan premium system, for example, essentially paid workers a base rate for time plus additional pay dependent on output [126]. As Rowan's premium system guaranteed an hourly rate regardless of the worker's productive output as well as additional compensation tied to performance, workers were in some senses "task-labourers", but in other senses "day-labourers". This was just one of several alternatives to strict time- and piece-rate renumeration paradigms.

It may be worth thinking about piecework through the lens of its *emergent* properties to help understand it. Raynbird argues for the merits of piecework, pointing out that "piece work holds out to the labourer an increase of wages as a reward for his skill and exertion ... he knows that all depends on his own diligence and perseverance ... [and] so long as he performs his work to the satisfaction of his master, he is not under that control to which the day—labourer is always subject". The argument that "task—labourers" enjoy freedom from control crops up in Raynbird's and later Rowan's works [119, 126].

We see this sense of independence in myriad times, locales, and industries. Satre offers a look into the lives and culture of "match-girls" — young pieceworkers, mostly women, who assembled matchsticks in the late 19th century. Of interest was

their reputation "... for generosity, independence, and protectiveness, but also for brashness, irregularity, low morality, and little education" [131]. Hagan and Fisher document piecework from 1850 through 1930 in Australia, finding similar notions of independence and autonomy among piecework newspaper compositors: "If a piece—work compositor ... decided that he did not want to work on a particular day or night, the management recognised his right to put a 'substitute' or 'grass' compositor in his place" [55]. This sense of independence and autonomy appears to be a common component of piecework.

Since workers could now choose their own schedule and style, there arose a discussion on how best to manage pieceworkers. This conversation generally regarded workers antagonistically [127], a far cry from the earlier rhetoric on piecework, which promised that piece workers would gladly work as diligently and as hard as possible because incentive—based pay rewards hard work [32].

Piecework opened the door for people who previously couldn't participate in the labor market to do so, and to acquire job skills incrementally. During World War II, women received training in narrow subsets of more comprehensive jobs, enabling work in capacities similar to conventional (male) workers [59]. Women previously had virtually no opportunities to engage in engineering and metalworking apprenticeships as men did; now, they could be trained quickly on narrowly scoped tasks, demonstrate proficiency, and become experts.

Piecework's popularity in the United States and Europe fell almost as quickly as it had climbed. Between 1938 and 1942, the proportion of metal workers under piecework systems had climbed steeply from 11% to 60% [58]. By 1961, that proportion dropped to 8% [23]. Carlson details that, from 1973 to 1980, the holdouts of piecework — where more than 50% worked under incentive wage plans — were principally in clothes—making (e.g. hosiery, footwear, and garments). Hart and Roberts offer a number of explanations for the sudden vanishing of piecework. The salient suggestions include: 1) the emergence of more effective, more nuanced incentive models — rewarding teams for complex achievements, for instance; 2) the shifting of piecework industries such as manufacturing and textiles to other countries; and 3) the quality of "multidimensional" work becoming too difficult to evaluate [59].

In summary, piecework: 1) paid workers for *quantity* of work done, rather than *time* done, but occasionally mixed the two payment models; 2) afforded workers a sense of freedom and independence; and 3) structured tasks in such a way as to facilitate more narrowly scoped training and education.

Viewing on–demand work as a modern instantiation of piecework is relatively straightforward by this definition. First, platforms such as Mechanical Turk, Uber and TaskRabbit pay by the task, though some such as Upwork do offer hourly rates as well. Second, workers are attracted to these platforms by the freedom they offer to pick the time and place of work [103, 18]. Third, system developers as on Mechanical Turk typically assume no professional skills in transcription or other areas, and attempt to build that expertise into the work flow [113,

11]. Given this alignment, many of the same properties of piecework historically will apply to on-demand work as well.

Case studies in piecework

Throughout the rest of the paper, we will return to four case studies to frame our analyses: Airy's employment of human computers; domestic and farm workers; the "match-girls" strike; and industrial and assembly-line workers. In introducing these cases at a high level, we'll trace the history of piecework while also framing the later analysis of the major research threads we named earlier: complexity, decomposition, and relationships.

Airy's computers

In the 19th century, the calculation of celestial bodies had become a competitive field, and Airy needed to compute tables that would allow sailors to locate themselves by starlight from sea. This work ostensibly called for educated people who comprehensively understood mathematics. Airy realized that he could break the tasks down and delegate the constituent parts to human computers, or people who could compute basic functions. These human computers "... possessed the basic skills of mathematics, including 'Arithmetic, the use of Logarithms, and Elementary Algebra'" [52]. As a result, many of Airy's computers had relatively rudimentary educations compared to the background of education that typically worked in the calculation of solar tables. Airy distributed tasks by mail, allowing work to be completed by a somewhat geographically distributed workforce, and paid for each piece of work completed. Airy also instituted a policy of firing his computers once they reached age 23.

The human computers captured several aspects of task decomposition that would become common. First, the work was designed such that it could be done independently and without collaboration. Second, the work was designed so that intermediate results could be quickly verified: Airy would have two workers each do the calculation, and another person compare their answers. Third, Airy identified ways to decompose the large task into narrowly-trainable subtasks.

This practice ensured two outcomes that disfavored workers. First, it eliminated any potential to advance professionally, as workers' careers ended relatively early in their careers, and without formal education in mathematics they struggled to find work for which their experience was meaningful. Second, it limited workers' ability to organize by ensuring that workers were barely in communication with each other.

Domestic and farmhand labor

The application of piecework to farm work in the late 19th century and later to manufacturing of small goods, such as garments and matches, at the turn of the 20th century proved to be a formative period for piecework as we would come to know it. Piecework regimes in farms and in homes engaged workers in assembling clothing. Textile manufacturers found that they could deliver fabric to people at their homes, asking them to sew together clothing. The manufacturers would later return to retrieve the finished garments, paying these workers for each piece of clothing completed. Farm work applied the

idea of piecework by paying workers for tasks like picking bushels of fruit or bringing to birth animals [25].

Workers could, in principle, assemble as much or as little clothing as they wanted; the reality was more grim, as Riis documented in "How the other half lives: Studies among the tenements of New York" in 1901 [122]. He found that workers endured bleak living conditions and worked long hours attempting to scrape together a living.

The match-girls' strike

Match-makers were some of the first workers in mass manufacturing to successfully rally for political causes. At the end of the 19th century, manufacturers employed women to assemble matchsticks in factories. These women rallied first in the form of a march on parliament in 1871 to protest a proposed tax, and later (more famously) in what was later called "the match-girls strike of 1888" [131].

The match-girls strike of 1888 was sparked by a worker's arbitrary docking of pay, but much deeper resentment had been simmering for years. Match-girls were already frustrated with the arbitrariness of management, poor working conditions, and having to work with hazardous phosphoric materials.

Regardless of the reasons, the lasting impact of the match—girls strike of 1888 was profound. This was one of the earliest and most famous successful worker strikes, and perhaps the beginning of "militant trade unionism" [131]. As Webb and Webb described, "the match—girls' victory turned a new leaf in Trade Union annals" [151]: in the 30 years after the match—girls strike, the Trade Union Movement enrollment grew from 20% of eligible workers to over 60%.

Match-girls were the only group in 1903 to have formed a trade union, according to Booth's account at the time [17]. Satre noted that match-girls "... pooled their resources to purchase their plumes and clothes ... and expressed their solidarity through small [and major] strikes" [17]. But they were also, as Satre confesses, known for "brashness, irregularity, low morality, and little education" [131]. These were workers who treasured their independence, but also fiercely protected one another, contributing to the common good. Their "brashness" for instance may have detracted from their public image, but almost undoubtedly contributed to their sense of solidarity, making their propensity to act against such unfair treatment and poor conditions understandable and maybe predictable.

Industrial workers

Piecework might be most familiar in the context of industrial and factory work, which largely defined manufacturing through the 20th century. Before the factory assembly line arose, however, railway companies adopted piecework regimes in the early 20th century. What followed was a flourishing of piecework management practices, as railway companies worked to find effective ways to motivate and evaluate this skilled workforce of engineers. Graves takes up a case study of the Santa Fe Railway, finding that they employed "efficiency experts" to develop a "standard time" to determine pay for each task at the company informed by "thousands of individual operations"; Graves goes on to list some of the roles required to facilitate piecework in the early 20th century — among them,

"piecework clerks, inspectors, and 'experts' " [49]. This oversight, while controversial (especially among workers [73]), paved the way for piecework to grow substantially.

The 1930s represented a boom for piecework on an unprecedented scale, especially among engineering and metalworking industries. Hart and Roberts characterize the 1930s — and more broadly the first half of the 20th century — as the "heyday" of the use of piecework. They attribute this to the shortage of male workers, who would have gone through a conventional apprenticeship process affording them more comprehensive knowledge of the total scope of work.

Piecework found its way into the war effort during World War II. With the vast majority of men drafted into service, factories found themselves turning to a predominantly female workforce that had neither the formal training nor the years of apprenticeship experience that conventional workers would have had. Rather than attempting to train this new labor force in every aspect of industrial work, these women were trained for individual tasks and assigned to that task. "Rosie the Riveter", an icon of 20th century America who represented empowerment and opportunity for women [63], was a pieceworker [35].

RESEARCH QUESTIONS

Research in crowdsourcing has spent the better part of a decade exploring how to grow the limits of crowdsourcing. This has largely involved iteratively identifying barriers to high-quality, complex work, then overcoming them through novel designs of systems, work–flows and processes (e.g. [11, 120, 81]). The question has become *whether* there are limits to on–demand work, and if so, what factors determine them. To this question, a number of contributions to the field have pressed for answers.

The exploration of on-demand work's potential and limits has principally interrogated three dimensions: First, what are the complexity limits of on-demand work? Second, how far can work be decomposed into smaller microtasks? And third, what will work and the place of work look like for workers? We'll explore these aspects of on-demand work by connecting to corresponding piecework literature and comparing its lessons to the current state of on-demand work.

Complexity Limits of On-Demand Work

A key question to the future of on-demand work is *what* precisely will become part of this economy. Paid crowdsourcing began with simple microtasks on platforms such as Amazon Mechanical Turk, but microtasks are only helpful if they build up to a larger whole. So, our first question: how complex can the work outcomes from on-demand work be?

Crowd work's perspective

Kittur et al. first opened the question of whether crowdsourcing could be used for goals that are not simple parallel tasks [81]. Their work demonstrated proof—of—concept crowdsourcing of an encyclopedia article and news summary — tasks which could be verified or repeated with reasonable expectations of similar outcomes. Seeking to raise the complexity ceiling, researchers have since created additional proof—of—concept

applications and techniques, including conversational assistants [87], medical data interpreters [87], and idea generation work–flows [162, 160, 161].

To achieve complex work, this body of research has often applied ideas from Computer Science to design new crowd-sourcing work–flows. The system designer leverages techniques such as MapReduce [81] and sequence alignment algorithms [86], arranging humans as computational black boxes within. This approach has proven a compelling one because it leverages the in–built advantages of scale, automation, and programmability that software affords.

It is now clear that this computational workflow approach works with some classes of complex tasks, but the broader wicked problems largely remain unsolved [123]. As a first example, idea generation shows promise [162, 160, 161], but there is as yet no general crowdsourced solution for the broader goal of invention and innovation [46]. Second, focused writing tasks are now feasible [78, 11, 111, 143, 2], but there is no general solution to create a cross—domain, high—quality crowd—powered author. Third, data analysis tasks such as clustering [30], categorization [7], and outlining [98] are possible, but there is no general solution for sense—making. It is not yet clear what insights would be required to enable crowdsourced solutions for these broader wicked problems.

Restricting attention to non–expert, microtask workers proved limiting. So, Retelny et al. introduced the idea of crowdsourcing with online paid *experts* from platforms such as Upwork. Expert crowdsourcing enables access to a much broader set of workers, for example designers and programmers. The same ideas can then be applied to expert "macro–tasks" [29, 54], enabling the crowdsourcing of goals such as user–centered design [120], programming [90, 42, 27], and mentorship [139]. However, there remains the open question of how complex the work outcomes from expert crowds can be.

Piecework's perspective

Piecework's body of research most squarely addresses complexity in two of the cases we looked at earlier: Airy's human computers and among industrial workers.

Airy's work on astronomical charts opened the door to greater task complexity by encoding the intelligence into the process rather than the people. Airy's computers had relatively limited education in mathematics, but by combining individual simple mathematical operations, Airy was able to create a complex composite outcome [52]. Likewise, in Ford's factories, no individual could build the entire car, but the process could emergently produce one.

However, when piecework intially entered the American economy, it was not used for complex work. Without having designed complex work processes, piecework managers were restricted to available workers' skills such as sewing: it was infeasible to provide new pieceworkers with the comprehensive education that apprenticeships imparted [59]. So, initially piecework arose for farm work, and as Raynbird and others discuss, the practice remained relatively obscure until it blossomed in the textile industry [119]. Complexity levels

remained low at the turn of the 20th century as piecework saturated New York City [122].

Measurement also limited the complexity of piecework: only tasks that could be measured and priced could be completed via piecework. Earlier we discussed Graves's and later Brown's analysis of railway workers. They identified task homogeneity and measurement as key requirements for piecework. However, complex, creative work — which is inherently heterogeneous and difficult to routinize — was unsuitable [49]. Brown's description of "efficiency experts" would corroborate this; efficiency experts can effectively gauge how long known tasks should take, but would find themselves overwhelmed if they attempted to assess creative tasks like scientific research, which can take an arbitrary number of iterations before proceeding to a subsequent step.

Moreover, piecework was limited to tasks that could be quickly and accurately evaluated. Hart et al. argue that evaluation limited piecework's complexity: at some point, evaluating multidimensional work for quality (rather than for quantity) becomes infeasible. In his words, "if the quality of the output is more difficult to measure than the quantity [...] then a piecework system is likely to encourage an over–emphasis on quantity ... and an under–emphasis on quality" [60]. Complex work, which is often subjective to evaluate, falls victim to this criteria.

Comparing the phenomena

The research on piecework tells us that we should expect piecework to thrive in industries where the nature of the work is limited in complexity [19], and become less common as work becomes more complex. However, has computation shifted piecework's previous limits of expertise, measurement, and evaluation?

In some ways, yes: technology increases non-experts' levels of expertise by giving access to information that would otherwise be unavailable. For example, taxi drivers in London endure rigorous training to pass a test known as "The Knowledge": a demonstration of the driver's comprehensive familiarity with the city's roads. This test is so challenging that veteran drivers develop significantly larger the regions of the brain associated with spatial functions such as navigation [101, 100, 137, 138, 157, 156]. In contrast, with on-demand platforms such as Uber, services such as Google Maps and Waze make it possible for people entirely unfamiliar with a city to operate professionally [136, 62]. Other examples include search engines enabling information retrieval, and word processors enabling spelling and grammar checking. By augmenting the human intellect [40], computing has shifted the complexity of work that is possible without training.

Algorithms have automated some tasks that previously fell to management. Computational systems now act as "piecework clerks" [49] to inspect, modify and combine work [71, 105]. However, these algorithms are less able than human managers to evaluate subjective work.

Implications for crowd work

Algorithms are undoubtably capable of shepherding more complex work than the linear processes available to Airy and Ford. However, as work becomes more complex, it becomes increasingly difficult to codify a process to achieve it [41, 38]. So, while algorithms will increase the complexity ceiling beyond what was possible previously with piecework, there is a fundamental limit to how complex such work can become.

Technology's ability to support human cognition will enable stronger assumptions about workers' abilities, increasing the complexity of on-demand work outcomes. Just as the shift to expert crowdsourcing increased complexity, so too will workers with better tools increase the set of tasks possible. Beyond this, further improvements would most likely come from replicating the success of narrowly-slicing education for expert work as Hart and Roberts and Grier described in their piecework examples of human computation [52] and drastically reformulating macro-tasks given the constraints of piecework [59]. To some extent, an argument can be made that MOOCs and other online education resources provide crowd workers with the resources that they need, but it remains to be seen whether that work will be appropriately valued, let alone properly interpreted by task solicitors [4]. If we can overcome this obstacle, we might be able to empower more of these workers to do complex work such as engineering, rather than doom them to "uneducated" match-girl reputations [131]. However, many such experts are already available on platforms such as Upwork, so training may not directly increase the complexity accessible to on-demand work unless it makes common expertise more broadly available.

Evaluation remains as difficult for crowd work as it did for the efficiency experts. Reputation systems for crowdsourcing platforms remain notoriously inflated [64]. Ultimately, many aspects of assessment remain subjective: whether a logo made for a client is fantastic or terrible may depend on taste.

So, in the case of complexity, the history of piecework does not yet offer compelling evidence that on—demand work will achieve far more complex outcomes than piecework did. Improvements in workflows, measurement and evaluation have already been made, and it is not clear that the remaining challenges are readily solveable. However, on—demand work will be far more broadly distributed than piecework historically was—reaching many more tasks and areas of expertise by virtue of the internet.

Decomposing Work

At its core, on-demand work has been enabled by decomposition of large goals into many small tasks. As such, one of the central questions in the literature is how finely-sliced these microtasks can become, and which kinds of tasks are amenable to decomposition. In this section, we place these questions in the context of piecework's Taylorist evolution.

Crowd work's perspective

Many contributions to the design and engineering of crowd work consist of creative methods for decomposing goals. Even when tasks such as writing and editing cannot be reliably performed by individual workers, researchers demonstrated that decompositions of these tasks into workflows can succeed [81, 11, 143, 111]. These decompositions typically take the form of workflows, which are algorithmic sequences of tasks that

manage interdependencies [14]. Workflows often utilize a first sequence of tasks to identify an area of focus (e.g., a paragraph topic [81], an error [11], or a concept [161, 163]) and a second sequence of tasks to execute work on that area. This decomposition style has been successfully applied across many areas, including food labeling [113], brainstorming [134, 160], and accessibility [87, 86, 88].

If decomposition is key to success in on-demand work, the question arises: what can, and can't, be decomposed? Moreover, how thinly can work be sliced and subdivided into smaller and smaller tasks? The general trend has been that smaller is better, and the microtask paradigm has emerged as the overwhelming favorite [144, 145]. This work illustrates a broader sentiment in both the study and practice of crowd work, that microtasks should be designed resiliently against the variability of workers, preventing a single errant submission from impacting the agenda of the work as a whole fully exploiting the abstracted nature of each piece of work [69, 89, 147]. In this sense, finer decompositions are seen as more robust – both to interruptions and errors [29] — even if they incur a fixed time cost. At the extreme, recent work has attempted demonstrated microtasks that take seconds [148, 21] or even fractions of a second [83]. However, workers perform better when similar tasks are strung together [89], or chained and arranged to maximize the attention threshold of workers [20]. Despite this, we as a community have leaned *into* the peril of low-context work, "embracing error" in crowdsourcing [83].

The general lesson has been that the more micro the task, and the more fine the decomposition, the greater the risk that workers lose context necessary to perform the work well. For example, workers edit adjacent paragraphs in inconsistent ways [11, 78], interpret tasks in different ways [74], and exhibit lower motivation [79] without sufficient context. Research has sought to ameliorate this issue by designing workflows to help workers "act with global understanding when each contributor only has access to local views" [149], typically by automatically or manually generating higher–level representations for the workers to reflect on [30, 149, 78].

As the additional context necessary to complete a task diminishes, the invisible labor of *finding* tasks [103] has arisen as a major issue. Chilton et al. illustrate the task search challenges on AMT. Workers seek out good requesters [103] and then "streak" to perform many tasks of that same type [31]. Researchers have reacted by designing task recommendation systems [e.g. 33] and minimizing the amount of time that people need to spend doing anything other than the work for which they are paid [22].

Piecework's perspective

Four major stages characterize decomposition in the history of piecework. The first stage was decomposition of an expert task such that it could be done by non-experts. This was arguably the main innovation of Airy's human computers. Rather than hire expert computers, Airy identified ways to break down astrological calculations into steps that could be completed with only a basic knowledge of mathematics. Likewise, Brown argued that piecework arose in industries where there was

significant task homogeneity and low fixed costs of machinery and training [19].

After decomposing tasks for amateurs, the second major stage was to apply the same methods to domain experts. Unlike Airy's human computers, railway engineers had significant expertise [19]. As Brown noted, however, it was still possible to discretize and measure their work. Thus, experts such as railway engineers became pieceworkers as well.

Third, decomposition led to quantification and scientific management. What can be modularized can be measured, and what can be measured can be optimized. With Taylor's formalization of scientific management in Taylorism (and Henry Ford's eponymously named Fordism), piecework in the early and mid-20th century surged, especially in industrial work. Scientific management promised that the careful measurement of workers would yield higher efficiency and output [142, 96]. While Brown points out that piecework dramatically advanced the instrumented measurement of workers, in Taylor's time highly instrumented, automatic measurement of workers was all but impossible [19]. Instead, managers conducted "stop watch time studies" [110], using completion times to inform per-task compensation, similarly to the efficiency experts hired in the Santa Fe Railway, but substantially more precise. The distillation of work into smaller units ultimately bottomed out with tasks as small as could be usefully measured [49].

The fourth and final stage was narrow expertise training. Even after work is decomposed and measured, there may not be enough workers available to do it. So, as World War II raged and there was a dearth of skilled workers, managers trained women just enough to be able to complete their tasks [59]. Over time, these women could gain proficiency and gain broader expertise.

Comparing the phenomena

Where measurement and instrumentation were limiting factors for historical piecework, computation has changed the situation so that a dream of scientific management and Taylorism—to measure every motion at every point throughout the workday and beyond—is not only doable, but trivial [150]. Where Graves directly implicates measurement as preventing scientific management from being fully utilized, modern crowd work is measuring and modeling every click, scroll, and keyboard event [129, 128]. The result is that on–demand work can articulate and track far more carefully than piecework historically could.

A second shift is the relative ease with which the metaphorical "assembly line" can be experimented with and measured. Historical manufacturing equipment could not quickly be assembled, edited, and redeployed [67]. In contrast, today system—designers can share, modify, and instantiate environments like sites of labor in a few lines of code [94, 97]. This opportunity has spurred an entire body of work investigating the effects of ordering, pacing, interruptions, and other factors accelerating scientific management that would have been all but impossible as few as 20 years ago [34, 20, 29, 28, 83].

Implications for crowd work

If decomposition in piecework progressed in four stages, we have seen three of them in on-demand work so far. First, as with piecework, on-demand work began by decomposing tasks so that anyone could complete them, as with data labeling on Amazon Mechanical Turk. Second, we began to modularize and measure external expertise (e.g., software engineering, design) so that it could be brought into crowdsourcing systems [120, 27]. Third, we used measurement to mathematically optimize workers' behaviors so that we could make the systems more efficient [154].

The fourth stage, then, appears likely to occur: narrow training of workers for expert tasks. There is demand for skilled workers in many crowdsourcing tasks, and systems to help train workers [139]. We might expect to see the rise of systems that scaffold workers into extremely narrow areas of expertise.

Finally, improved measurement and lowered costs of production have made it feasible to apply piecework methods to many domains where it may not have historically been possible. The limit is no longer measurement precision, but human cognition. Task switching and other cognitive costs make it difficult to work on tasks so far decontextualized from their original intention [89]. There will of course be tasks that can be decomposed without much context, and these will form the most fine–grained of microtasks. However, other tasks cannot be freed from context — for example, logo design requires a deep understanding of the client and their goals.

The Relationships of Workers to Work, Peers, and Others

HCI and CSCW have framed themselves around supporting work rather than becoming an infrastructural layer enabling it. While all artifacts have politics, this shift into computational labor systems has directly impacted the lives and livelihood of workers. So, it is important to understand: what will the future look like for the workers who use these systems?

Crowd work's perspective

One of the initial questions that researchers asked was, who are the crowd workers and what draws them to crowd work? Early literature emphasized motivations like fun and spare change, but this narrative soon shifted to emphasize that many workers use platforms such as Amazon Mechanical Turk as a primary source of income [75, 68, 8]. Despite this, Mechanical Turk is a low-wage affair for most workers in the United States [68, 103, 53]. Thus, those who choose to opt out of the traditional labor force and spend significant time on Mechanical Turk are especially motivated by the opportunity for autonomy and skill variety [75]. Due to valuing autonomy, it is tempting to ascribe attitudes of "pity the workers" to Turkers, but this frame is increasingly rejected by workers and designers as patronizing [70].

Workers' relationships with requesters are fraught. Workers are often blamed for any low-quality work, regardless of whether they are responsible [103, 105]. Some research is extremely open about this position, blaming unpredictable work on "malicious" workers [47] or those with "a lack of expertise, dedication [or] interest" [133]. Workers resent this position — for good reason. Irani and Silberman highlighted

the information asymmetry between workers and requesters on AMT, leading to the creation of *Turkopticon*, a site which allows Turkers to rate and review requesters [71]. Dynamo then took this critique on information asymmetry and power imbalances a step further, designing a platform to facilitate Turkers acting collectively to bring about changes to their circumstances [130]. This unbridled power that requesters have over workers and the resultant stress and frustration that this generates has been part of the undercurrent of research into the tense relationships between workers and requesters [50, 130].

Researchers have also begun to appreciate the sociality of crowd workers. Because the platforms do not typically include social spaces, workers instead congregate off-platform in forums and mailing lists. There, Turkers exchange advice on high-paying work, talk about their earnings, build social connections, and discuss requesters [103]. Many crowd workers know each other through offline and online connections, coordinating behind-the-scenes despite the platforms encouraging independent work [51, 159]. However, the frustration and mistrust that workers experience with requesters does occasionally boil over on the forums. This behavior has come to be known as "mega-drama" amongst such workers [130]. Still, the study of these communities is made challenging because most of these platforms do not themselves include social affordances for workers [108].

Piecework's perspective

Early observers believed that workers were strongly motivated by the autonomy of working in the piecework model. Clark observed textile mill pieceworkers and reported, "When he works by the day the Italian operative wishes to leave before the whistle blows, but if he works by the piece he will work as many hours as it is possible for him to stand." However, the emergent trend contrasted with this early rhetoric, as when workers began instituting "The Fix", deliberately slow work to game efficiency experts [127]. Workers, Roy found, formed even more starkly antagonistic relationships with their managers.

Soon workers began resisting piecework regimes and the methods that came along with it. The match–girls engaged in their famous strike of 1888, particularly pushing to abolish the fines that were taken out of their wages. Soon others followed suit, including women in the garment industry in Philadelphia who established collective bargaining rights [39] and national coal miners who effected an individual minimum wage in 1912 [124]

Soon, many worker organizations were weighing in on (or, more precisely, against) piecework and the myriad oversights it made in valuing workers' time [73, 121]. As mounting attention increasingly revealed problems in piecework's treatment of workers, workers themselves began to speak out about their frustration with this new regime. Organizations representing railway workers, mechanical engineers, and others began to mount advocacy in defense of workers [73, 121]. Pieceworkers' relationships with their employers eventually developed a pattern of using laborer advocacy groups [95, 5, 104, 72]. Following the template of the match–girls, collective

action grew to become a central component of negotiating with managers [57, 115].

There's a noticeable dearth of information on the interpersonal relationships among pieceworkers beyond the matchgirls at the end of the 19th century. Nevertheless, we can offer some observations: primary sources indicate that labor organizations wished for workers to identify as a collective group, "not only as railroad employees but also as members of the larger life of the community" [73]. Doing this, Ostrom and others later argued, would facilitate collective action and perhaps collective governance [116, 57, 115]. Riis also contributed to this sense of shared struggle and endurance by documenting pieceworkers in their home—workplaces, literally bringing to light the grim circumstances in which pieceworkers lived and worked [122].

Comparing the phenomena

While historical pieceworkers could be looked down on, as the match-stick girls were characterized by "brashness, irregularity, low morality, and little education", there was generally less written about quality concerns for historical pieceworkers than there is in modern on–demand work. Why the difference? One possibility is that, through writing web scripts and applying them to many tasks, it is possible for a small number of spammers have an outsized influence. Historically, it was much harder for such workers to move and get new jobs — today, they can simply accept a different task on Mechanical Turk. Another possibility: online anonymity breeds distrust [45], and where pieceworkers could be directly observed by foremen, online workers are known by little more than an account ID.

The relationship between workers and employers has also shifted: while historically the management of workers had to be done through a foreman (who necessarily had an intuitive — perhaps sympathetic — relationship with workers), the foreman of the 20th century has largely been replaced by algorithms of the 21st century [93]. The result of this change is that the agents managing work are now cold, logical, and unforgiving. Where a person might recognize that the "attention check" questions proposed by Le et al. ensure that malicious and inattentive workers are stopped, some implementations of these approaches only seem to antagonize workers. More than 30 years ago, Anderson and Schmittlein wrote: "When performance is difficult to evaluate, imperfect input measures and a manager's subjective judgment are preferable to defective (simple, observable) output measures" [6]. This frustration has only grown as requesters have had to rely on automatic management mechanisms. Only a few use the equivalent of human foremen [54, 85].

Relative to the mature state of collective action for piece-workers offline, crowd workers have struggled to make their voices heard [130, 70, 71]. Both pieceworkers and on-demand workers have struggled at times to form a collective identity necessary to organize. With workers joining and leaving the crowd labor force continuously, and with many part-time members, it is extremely difficult to corral the group to make a collective decision [130]. However, even when they can: whereas pieceworkers could physically block access to a site

of production, online labor markets provide no facilities for workers to change the experience of other workers. This is a key limitation — without it, workers cannot enforce a strike.

Implications for crowd work

The decentralization and anonymization of on-demand work, especially online crowd work, will continue to make many of its social relationships a struggle. While some workers get to know each other well on forums [103, 51], many never engage in these social spaces. Without intervention, worker relationships and collectivism are likely to be inhibited by this decentralized design. One option is to build worker centralizing points into the platform, for example asking workers to vote on each others' reputation or allowing groups of workers to collectively reject a task from the platform [155].

The history of piecework further suggests that relationships between workers and employers might be improved if employers engaged in more human management styles. Instead of delegating as many management tasks as possible to an algorithm, it might be possible to build dashboards and other information tools that empower modern crowd work foremen [85]. If the literature on piecework is to be believed, more considerate *human* management may resolve many of the tensions we've discovered among among crowd workers.

Reciprocally, crowd work may be able to inform piecework research. There exists far less literature about pieceworkers' relationships than there does today about on–demand workers' relationships. Research into on–demand labor benefits from both the accessibility of digital platforms as well as the firmer theoretical basis of Anthropology than existed at the turn of the 20th century, when piecework began to emerge. Malinowski, Boas, Mead and Boas and other luminaries throughout the first half of the 20th century effectively defined Cultural Anthropology as we know it today; participant–observation, the etic and the emic understanding of culture, and reflexivity didn't take even a resemblance of their contemporary forms until these works [102, 16, 107]. On–demand labor today may give us an opportunity to revisit open questions in piecework with a more refined lens.

DISCUSSION

In our analysis of on-demand work via the piecework lens, three issues arose: 1) the hazards of predicting the future, 2) utopian and dystopian visions, and 3) a research agenda. We will attempt to grapple with these questions here explicitly.

The Hazards of Predicting the Future

The past can't be a perfect predictor for the future; as Scholz points out, "it would be wrong to conclude that in the realm of digital labor there is nothing new under the sun" [132]. Our analysis is limited by the differences, foreseen and unforeseen, between historical piecework and modern on–demand work. For example, many of the challenges that *Dynamo* overcame in crowd collective action, such as designing for trustworthiness and ensuring anonymity, were relatively unique challenges precipitated by the affordances of the internet. For example, unlike physical work environments, people can (and often do) contribute to online communities in a one–off manner [106]. The internet makes this kind of loose affiliation feasible.

While we have attempted to understand the likely overlaps and differences between history and modern day, no analysis is perfect.

But this does not mean that attempting to draw meaningfully from historical scholarship would be folly; enough of piecework can and does inform on-demand work that HCI and CSCW might seek out historical framings for other phenomena of study as well. While we can only speculate one of (perhaps many) possible futures, history does allow us to articulate and bound which futures appear more likely.

In particular, the predictions that have emerged surrounding crowd work have run the spectrum from deep pessimism [44] to exuberant optimism [82]. In the next section, we will use the piecework foundation which informed our case studies to trace out possible dystopian and utopian futures for ondemand labor.

Utopian and Dystopian Visions

An easy narrative is to characterize the future of on-demand labor at one of two extremes. On one hand, crowd work researchers imagine the application of crowdsourcing as a potentially bright future that enables the achievement of near-impossible goals and career opportunities [140, 82, 15, 139]. On the other hand, researchers warn that on-demand labor will create exploitative sites of dispossession [132], racial discrimination [37], and invisible, deeply frustrated workers [71, 13].

A uniquely challenging facet of this topic of inquiry is the public attention that this domain has attracted. Activists have described speculative work as having "essentially been turned into modern—day slaves" [10]. Meanwhile, advocates describe it as "a project of sharing aimed at providing ordinary people with more economic opportunities and improving their lives" [36].

Piecework teaches us that, without appropriate norms and policy, the dystopian outcome has happened and will happen again. The piecework nature of on–demand work induces us "to neglect tasks that are less easy to measure" [3], rewarding us not for creativity but predictability; payment for this work may ultimately be determined by an algorithm that fundamentally doesn't understand people; the layers between us and our managers might increasingly become "defective (simple, observable)" algorithms [6], just like those which already frustrate on–demand workers [93, 130, 71]. However, social policy has advanced since the early 1900s, so as on–demand work gains popularity a repeat of *How the Other Half Lives* [122] seems less likely.

On the other hand, while piecework's nascent years were grim, they precipitated a century of extremely strong labor advocacy [59, 104]. Even today, the geist that came out of the labor union revolution inspires collective action and worker empowerment around the world: in India, workers across the nation recently engaged in the largest labor strike in human history — perhaps as many as 150 million [1]. If labor advocacy groups can find ways to permeate on–demand labor markets as some have called for [76], then the future of on–demand

labor may follow the same trajectory of worker empowerment that piecework *later* found.

The history of piecework suggests that the utopian and dystopian outcomes will *both* occur, in different parts of the world and to different people. When piecework plummeted in the United States, outsourcing rose — creating major labor issues around the world. It is entirely possible that we will create a new brand of flexible online career in developed countries, while simultaneously fueling an unskilled decentralized labor force in developing nations. As designers and researchers, this prompts the question: which outcome are we attempting to promote or avoid for who?

A Research Agenda

Piecework also helps bring into focus the areas of research that might bear the most fruit. We return to the three questions that motivated this paper: 1) "what are the complexity limits of on–demand work?" 2) "how far can work be decomposed into smaller microtasks?" and 3) "what will work and the place of work look like for workers?".

While we have arguably outpaced piecework with regard to the limits on the complexity of work, the most complex and openended wicked problems [123] remain the domain of older human collectives such as governments and organizations. In addition, we can learn from the piecework literature as it relates to the stymieing effect that mismanagement has on workers; research into the complexity limits should emphasize on finding new ways to manage workers, in particular using humans — perhaps other crowd workers — to act as modern foremen.

Piecework researchers looking into decomposition pointed out long ago that piecework is saddled by a lower limit on decomposition: "piecework does not compensate workers for time spent switching tasks" [12]. We've since studied this phenomenon in crowd work to great length both observationally [31] and experimentally [89]. We should consider whether this remains a worthwhile area to explore; unless the work we put forth directly affects the costs of task–switching — for instance, the cost of suboptimal task search, or the cognitive burden of changing tasks — we may only make incremental advances in micro–task decomposition. When the cognitive cost of understanding a task and its inputs outstrips the effort required to complete the task, decomposition seems a poor choice.

Finally, we turn to the relationships of crowd workers. The crowd work literature here can convincingly speak back to the piecework scholarship perhaps more than in the other sections. The tools that are available to us today — not just technical, but *methodological* — make it possible to discover, study, and partner with crowd workers in ways that were unimaginable to piecework researchers. A professor engages in crowd work [13] not just because it's possible, but because our community appreciates the importance of approaches such as participant—observation and ethnography as a whole [114].

CONCLUSION

On-demand work is not new, but a contemporary instantiations of piecework. In this paper, we reconsider three major research questions in on-demand work using the lens of piecework: 1) "what are the complexity limits of on-demand work?"; 2) "how far can work be decomposed into smaller microtasks?"; and 3) "what will work and the place of work look like for workers?" To do so, we draw on piecework scholarship to inform analyses of what has changed, what hasn't, and may change change soon. Reciprocally, we believe that modern on-demand work will teach us about the broader phenomenon of piecework as well. If history really does repeat itself, the best we can do is be prepared.

References

- [1] 150 Million Indian Workers Take Part In Largest Strike in Centuries. Sept. 2016. URL: http://therealnews.com/t2/index.php?option=com_content&task=view&id=31&Itemid=74&jumival=17170.
- [2] Elena Agapie, Jaime Teevan, and Andrés Monroy-Hernández. "Crowdsourcing in the field: A case study using local crowds for event reporting". In: *Third AAAI* Conference on Human Computation and Crowdsourcing. 2015.
- [3] Jonas Agell. "Why are Small Firms Different? Managers' Views". In: Scandinavian Journal of Economics 106.3 (2004), pp. 437–452. ISSN: 1467-9442. DOI: 10. 1111/j.0347-0520.2004.00371.x. URL: http://dx.doi.org/10.1111/j.0347-0520.2004.00371.x.
- [4] J Ignacio Aguaded-Gómez. "The MOOC Revolution: A new form of education from the technological paradigm". In: *Comunicar* 41.21 (2013), pp. 7–8.
- [5] John S Ahlquist and Margaret Levi. *In the interest of others: Organizations and social activism.* Princeton University Press, 2013.
- [6] Erin Anderson and David C. Schmittlein. "Integration of the Sales Force: An Empirical Examination". In: *The RAND Journal of Economics* 15.3 (1984), pp. 385–395. ISSN: 07416261. URL: http://www.jstor.org/stable/2555446.
- [7] Paul André, Aniket Kittur, and Steven P. Dow. "Crowd Synthesis: Extracting Categories and Clusters from Complex Data". In: *Proceedings of the 17th ACM Conference on Computer Supported Cooperative Work & Social Computing*. CSCW '14. Baltimore, Maryland, USA: ACM, 2014, pp. 989–998. ISBN: 978-1-4503-2540-0. DOI: 10.1145/2531602.2531653. URL: http://doi.acm.org/10.1145/2531602.2531653.
- [8] Judd Antin and Aaron Shaw. "Social Desirability Bias and Self-reports of Motivation: A Study of Amazon Mechanical Turk in the US and India". In: Proceedings of the SIGCHI Conference on Human Factors in Computing Systems. CHI '12. Austin, Texas, USA: ACM, 2012, pp. 2925–2934. ISBN: 978-1-4503-1015-4. DOI: 10.1145/2207676.2208699. URL: http://doi.acm.org/10. 1145/2207676.2208699.

- [9] Peter Baker. "Production restructuring in the textiles and clothing industries". In: New Technology, Work and Employment 8.1 (1993), pp. 43–55. ISSN: 1468–005X. DOI: 10.1111/j.1468-005X.1993.tb00033.x. URL: http://dx.doi.org/10.1111/j.1468-005X.1993.tb00033.x.
- [10] Jeff Bercovici. AOL-Huffpo Suit Seeks \$ 105M: 'This Is About Justice'. Apr. 2011. URL: http://www.forbes.com/sites/jeffbercovici/2011/04/12/aol-huffpo-suit-seeks-105m-this-is-about-justice/#1544785f305d.
- [11] Michael S. Bernstein et al. "Soylent: A Word Processor with a Crowd Inside". In: Proceedings of the 23Nd Annual ACM Symposium on User Interface Software and Technology. UIST '10. New York, New York, USA: ACM, 2010, pp. 313–322. ISBN: 978-1-4503-0271-5. DOI: 10.1145/1866029.1866078. URL: http://doi.acm.org/10.1145/1866029.1866078.
- [12] Truman F Bewley. Why wages don't fall during a recession. Harvard University Press, 1999.
- [13] Jeffrey Bigham. My MTurk (half) Workday. July 2014. URL: http://www.cs.cmu.edu/~jbigham/posts/2014/half-workday-as-turker.html.
- [14] Jeffrey P. Bigham, Michael S. Bernstein, and Eytan Adar. "Human-Computer Interaction and Collective Intelligence". In: *Handbook of Collective Intelligence*. MIT Press, 2015, pp. 57–84. ISBN: 9780262029810. URL: http://repository.cmu.edu/cgi/viewcontent.cgi? article=1264{\&}context=hcii.
- [15] Jeffrey P. Bigham et al. "VizWiz: Nearly Real-time Answers to Visual Questions". In: Proceedings of the 23Nd Annual ACM Symposium on User Interface Software and Technology. UIST '10. New York, New York, USA: ACM, 2010, pp. 333–342. ISBN: 978-1-4503-0271-5. DOI: 10.1145/1866029.1866080. URL: http://doi.acm.org/10.1145/1866029.1866080.
- [16] Franz Boas. *Race, language, and culture*. University of Chicago Press, 1940.
- [17] Charles Booth. Life and Labour of the People in London. Vol. 8. Macmillan and Company, 1903.
- [18] Robin Brewer, Meredith Ringel Morris, and Anne Marie Piper. ""Why Would Anybody Do This?": Understanding Older Adults' Motivations and Challenges in Crowd Work". In: *Proceedings of the 2016 CHI Conference on Human Factors in Computing Systems*. CHI '16. ACM, 2016, pp. 2246–2257. ISBN: 978–1-4503–3362–7. DOI: 10.1145/2858036.2858198. URL: http://doi.acm.org/10.1145/2858036.2858198.
- [19] Charles Brown. "Firms' Choice of Method of Pay". In: Industrial & Labor Relations Review 43.3 (1990), 165S-182S. DOI: 10.1177/001979399004300311. eprint: http://ilr.sagepub.com/content/43/3/165S.full.pdf+html. URL: http://ilr.sagepub.com/content/43/3/165S.abstract.

- [20] Carrie J. Cai, Shamsi T. Iqbal, and Jaime Teevan. "Chain Reactions: The Impact of Order on Microtask Chains". In: *Proceedings of the 2016 CHI Conference on Human Factors in Computing Systems*. CHI '16. ACM, 2016, pp. 3143–3154. ISBN: 978–1-4503–3362–7. DOI: 10.1145/2858036.2858237. URL: http://doi.acm.org/10.1145/2858036.2858237.
- [21] Carrie J. Cai et al. "Wait-Learning: Leveraging Wait Time for Second Language Education". In: *Proceedings of the 33rd Annual ACM Conference on Human Factors in Computing Systems*. CHI '15. Seoul, Republic of Korea: ACM, 2015, pp. 3701–3710. ISBN: 978-1-4503-3145-6. DOI: 10.1145/2702123.2702267. URL: http://doi.acm.org/10.1145/2702123.2702267.
- [22] Chris Callison-Burch. "Crowd-workers: Aggregating information across turkers to help them find higher paying work". In: Second AAAI Conference on Human Computation and Crowdsourcing. 2014.
- [23] Norma W Carlson. "Time rates tighten their grip on manufacturing industries". In: *Monthly Lab. Rev.* 105 (1982), p. 15.
- [24] L. Elisa Celis et al. "Assignment Techniques for Crowdsourcing Sensitive Tasks". In: Proceedings of the 19th ACM Conference on Computer-Supported Cooperative Work & Social Computing. CSCW '16. ACM, 2016, pp. 836–847. ISBN: 978–1-4503–3592–8. DOI: 10.1145/2818048.2835202. URL: http://doi.acm. org/10.1145/2818048.2835202.
- [25] Edwin Chadwick. "Openi, at the Meeting of the National Association for the Promotion of Social Science, held at York, in September, 1864". In: *Journal of the Statistical Society of London* 28.1 (1865), pp. 1–33. ISSN: 09595341. URL: http://www.jstor.org/stable/2338394.
- [26] Joseph Chee Chang, Aniket Kittur, and Nathan Hahn. "Alloy: Clustering with Crowds and Computation". In: Proceedings of the 2016 CHI Conference on Human Factors in Computing Systems. CHI '16. ACM, 2016, pp. 3180–3191. ISBN: 978–1-4503–3362–7. DOI: 10. 1145/2858036.2858411. URL: http://doi.acm.org/10. 1145/2858036.2858411.
- [27] Yan Chen, Steve Oney, and Walter S. Lasecki. "Towards Providing On-Demand Expert Support for Software Developers". In: Proceedings of the 2016 CHI Conference on Human Factors in Computing Systems. CHI '16. ACM, 2016, pp. 3192–3203. ISBN: 978-1-4503-3362-7. DOI: 10.1145/2858036.2858512. URL: http://doi.acm.org/10.1145/2858036.2858512.
- [28] Justin Cheng, Jaime Teevan, and Michael S. Bernstein. "Measuring Crowdsourcing Effort with Error–Time Curves". In: *Proceedings of the 33rd Annual ACM Conference on Human Factors in Computing Systems*. CHI '15. ACM, 2015, pp. 1365–1374. ISBN: 978–1-4503–3145–6. DOI: 10.1145/2702123.2702145. URL: http://doi.acm.org/10.1145/2702123.2702145.

- [29] Justin Cheng et al. "Break It Down: A Comparison of Macro- and Microtasks". In: Proceedings of the 33rd Annual ACM Conference on Human Factors in Computing Systems. CHI '15. Seoul, Republic of Korea: ACM, 2015, pp. 4061–4064. ISBN: 978-1-4503-3145-6. DOI: 10.1145/2702123.2702146. URL: http://doi.acm.org/10.1145/2702123.2702146.
- [30] Lydia B. Chilton et al. "Cascade: Crowdsourcing Taxonomy Creation". In: Proceedings of the SIGCHI Conference on Human Factors in Computing Systems. CHI '13. Paris, France: ACM, 2013, pp. 1999–2008. ISBN: 978-1-4503-1899-0. DOI: 10.1145/2470654.2466265. URL: http://doi.acm.org/10.1145/2470654.2466265.
- [31] Lydia B. Chilton et al. "Task Search in a Human Computation Market". In: *Proceedings of the ACM SIGKDD Workshop on Human Computation*. HCOMP '10. ACM, 2010, pp. 1–9. ISBN: 978–1-4503–0222–7. DOI: 10.1145/1837885.1837889. URL: http://doi.acm.org/10.1145/1837885.1837889.
- [32] William Alexander Graham Clark. *Cotton Textile Trade in Turkish Empire, Greece, and Italy.* Vol. 10. US Government Printing Office, 1908.
- [33] Dan Cosley et al. "SuggestBot: Using Intelligent Task Routing to Help People Find Work in Wikipedia". In: Proceedings of the 12th International Conference on Intelligent User Interfaces. IUI '07. Honolulu, Hawaii, USA: ACM, 2007, pp. 32–41. ISBN: 1-59593-481-2. DOI: 10.1145/1216295.1216309. URL: http://doi.acm.org/10.1145/1216295.1216309.
- [34] Peng Dai et al. "And Now for Something Completely Different: Improving Crowdsourcing Workflows with Micro-Diversions". In: *Proceedings of the 18th ACM Conference on Computer Supported Cooperative Work & Social Computing*. CSCW '15. Vancouver, BC, Canada: ACM, 2015, pp. 628–638. ISBN: 978-1-4503-2922-4. DOI: 10.1145/2675133.2675260. URL: http://doi.acm.org/10.1145/2675133.2675260.
- [35] Andrea Rees Davies and Brenda D Frink. "The origins of the ideal worker: The separation of work and home in the United States from the market revolution to 1950". In: *Work and Occupations* 41.1 (2014), pp. 18–39.
- [36] Jan Drahokoupil and Brian Fabo. The Sharing Economy That Is Not: Shaping Employment In Platform Capitalism. July 2016. URL: https://www.socialeurope.eu/2016/07/sharing-economy-not-shaping-employment-platform-capitalism/.
- [37] Benjamin G Edelman, Michael Luca, and Dan Svirsky. "Racial Discrimination in the Sharing Economy: Evidence from a Field Experiment". In: *Harvard Business School NOM Unit Working Paper* 16-069 (2015).
- [38] Amy C. Edmondson. *Teaming: How organizations learn, innovate, and compete in the knowledge economy.* San Francisco, California: John Wiley & Sons, 2012.

- [39] Boris Emmet. "Trade Agreements In The Women's Clothing Industries Of Philadelphia". In: *Monthly Review of the U.S. Bureau of Labor Statistics* 6.1 (1918), pp. 27–39. ISSN: 23291354, 23291362. URL: http://www.jstor.org/stable/41829256.
- [40] Douglas C Engelbart. "Augmenting human intellect: a conceptual framework (1962)". In: *PACKER*, *Randall and JORDAN*, *Ken. Multimedia. From Wagner to Virtual Reality. New York: WW Norton & Company* (2001), pp. 64–90.
- [41] Samer Faraj and Yan Xiao. "Coordination in Fast-Response Organizations". In: *Management Science* 52.8 (2006), pp. 1155–1169. URL: http://mansci.journal.informs.org/content/52/8/1155.short.
- [42] Ethan Fast and Michael S. Bernstein. "Meta: Enabling Programming Languages to Learn from the Crowd". In: Proceedings of the 29th Annual Symposium on User Interface Software and Technology. UIST '16. Tokyo, Japan: ACM, 2016, pp. 259–270. ISBN: 978-1-4503-4189-9. DOI: 10.1145/2984511.2984532. URL: http://doi.acm.org/10.1145/2984511.2984532.
- [43] David N Figlio and Lawrence W Kenny. "Individual teacher incentives and student performance". In: *Journal of Public Economics* 91.5 (2007), pp. 901–914.
- [44] Karën Fort, Gilles Adda, and K Bretonnel Cohen. "Amazon mechanical turk: Gold mine or coal mine?" In: *Computational Linguistics* 37.2 (2011), pp. 413–420.
- [45] Batya Friedman, Peter H. Khan Jr., and Daniel C. Howe. "Trust Online". In: *Commun. ACM* 43.12 (Dec. 2000), pp. 34–40. ISSN: 0001-0782. DOI: 10.1145/355112. 355120. URL: http://doi.acm.org/10.1145/355112. 355120.
- [46] Mark Fuge et al. "Analysis of collaborative design networks: A case study of openideo". In: *Journal of Computing and Information Science in Engineering* 14.2 (2014), p. 021009.
- [47] Ujwal Gadiraju et al. "Understanding Malicious Behavior in Crowdsourcing Platforms: The Case of Online Surveys". In: *Proceedings of the 33rd Annual ACM Conference on Human Factors in Computing Systems*. CHI '15. ACM, 2015, pp. 1631–1640. ISBN: 978–1-4503–3145–6. DOI: 10.1145/2702123.2702443. URL: http://doi.acm.org/10.1145/2702123.2702443.
- [48] David Geiger et al. "Managing the Crowd: Towards a Taxonomy of Crowdsourcing Processes." In: AMCIS. 2011.
- [49] Carl Graves. "Applying Scientific Management Principles to Railroad Repair Shops the Santa Fe Experience, 1904-18". In: *Business and Economic History* 10 (1981), pp. 124–136. ISSN: 08946825. URL: http://www.jstor.org/stable/23702539.
- [50] Mary Gray. Fixing the Chaotic Crowdworker Economy. Aug. 2015. URL: http://www.bloombergview.com/articles/2015-08-12/fixing-the-chaotic-crowdworker-economy.

- [51] Mary L. Gray et al. "The Crowd is a Collaborative Network". In: Proceedings of the 19th ACM Conference on Computer-Supported Cooperative Work & Social Computing. CSCW '16. ACM, 2016, pp. 134– 147. ISBN: 978-1-4503-3592-8. DOI: 10.1145/2818048. 2819942. URL: http://doi.acm.org/10.1145/2818048. 2819942.
- [52] David Alan Grier. When computers were human. Princeton University Press, 2013.
- [53] Neha Gupta et al. "Turk-Life in India". In: Proceedings of the 18th International Conference on Supporting Group Work. GROUP '14. Sanibel Island, Florida, USA: ACM, 2014, pp. 1–11. ISBN: 978-1-4503-3043-5. DOI: 10.1145/2660398.2660403. URL: http://doi.acm.org/10.1145/2660398.2660403.
- [54] Daniel Haas et al. "Argonaut: macrotask crowdsourcing for complex data processing". In: *Proceedings of the VLDB Endowment* 8.12 (2015), pp. 1642–1653.
- [55] J. Hagan and C. Fisher. "Piece Work and Some of Its Consequences in the Printing and Coal Mining Industries in Australia, 1850-1930". In: *Labour History* 25 (1973), pp. 19–39. ISSN: 00236942. URL: http://www.jstor.org/stable/27508091.
- [56] Nathan Hahn et al. "The Knowledge Accelerator: Big Picture Thinking in Small Pieces". In: Proceedings of the 2016 CHI Conference on Human Factors in Computing Systems. CHI '16. ACM, 2016, pp. 2258– 2270. ISBN: 978-1-4503-3362-7. DOI: 10.1145/2858036. 2858364. URL: http://doi.acm.org/10.1145/2858036. 2858364.
- [57] Russell Hardin. *Collective action*. Resources for the Future, 1982.
- [58] Robert A Hart. "Piecework Versus Timework in British Wartime Engineering". In: (2005).
- [59] Robert A Hart and J Elizabeth Roberts. "The rise and fall of piecework–timework wage differentials: market volatility, labor heterogeneity, and output pricing". In: (2013).
- [60] Robert A Hart et al. "the rise and fall of piecework". In: IZA World of Labor (2016).
- [61] John S. Heywood, W. S. Siebert, and Xiangdong Wei. "Payment by Results Systems: British Evidence". In: British Journal of Industrial Relations 35.1 (1997), pp. 1–22. ISSN: 1467-8543. DOI: 10.1111/1467-8543. 00038. URL: http://dx.doi.org/10.1111/1467-8543. 00038.
- [62] Sam Hind and Alex Gekker. "Outsmarting Traffic, Together': Driving as Social Navigation". In: *Exchanges:* the Warwick Research Journal 1.2 (2014), pp. 165–180.
- [63] Maureen Honey. Creating Rosie the Riveter: class, gender, and propaganda during World War II. Univ of Massachusetts Press, 1985.
- [64] John J. Horton, Leonard N. Stern, and Joseph M. Golden. "Reputation Inflation: Evidence from an Online Labor Market". 2015.

- [65] House Cleaning, Handyman, Lawn Care Services in Austin, Denver, Kansas City, Minneapolis and San Francisco Zaarly. Sept. 2015. URL: https://www.zaarly.com/.
- [66] Jeff Howe. Crowdsourcing: How the power of the crowd is driving the future of business. Random House, 2008.
- [67] Te C Hu. "Parallel Sequencing and Assembly Line Problems". In: *Operations Research* 9.6 (1961), pp. 841–848. DOI: 10.1287/opre.9.6.841. eprint: http://dx.doi.org/10.1287/opre.9.6.841. URL: http://dx.doi.org/10.1287/opre.9.6.841.
- [68] Panagiotis G Ipeirotis. "Demographics of mechanical turk". In: (2010).
- [69] Shamsi T. Iqbal and Brian P. Bailey. "Effects of Intelligent Notification Management on Users and Their Tasks". In: Proceedings of the SIGCHI Conference on Human Factors in Computing Systems. CHI '08. ACM, 2008, pp. 93–102. ISBN: 978–1-60558–011–1. DOI: 10.1145/1357054.1357070. URL: http://doi.acm.org/10.1145/1357054.1357070.
- [70] Lilly C. Irani and M. Six Silberman. "Stories We Tell About Labor: Turkopticon and the Trouble with "Design"". In: *Proceedings of the 2016 CHI Conference on Human Factors in Computing Systems*. CHI '16. ACM, 2016, pp. 4573–4586. ISBN: 978–1-4503–3362–7. DOI: 10.1145/2858036.2858592. URL: http://doi.acm.org/10.1145/2858036.2858592.
- [71] Lilly C. Irani and M. Six Silberman. "Turkopticon: Interrupting Worker Invisibility in Amazon Mechanical Turk". In: *Proceedings of the SIGCHI Conference on Human Factors in Computing Systems*. CHI '13. ACM, 2013, pp. 611–620. ISBN: 978–1-4503–1899–0. DOI: 10.1145/2470654.2470742. URL: http://doi.acm.org/10.1145/2470654.2470742.
- [72] Sanford M Jacoby. "Union–management cooperation in the United States: Lessons from the 1920s". In: *Industrial & Labor Relations Review* 37.1 (1983), pp. 18–33.
- [73] B.M. Jewell. The problem of piece work. The Problem of Piece Work nos. 1-16. Bronson Canode Print. Co., 1921. URL: https://books.google.com/books?id=NN5NAQAAIAAJ.
- [74] Sanjay Kairam and Jeffrey Heer. "Parting Crowds: Characterizing Divergent Interpretations in Crowdsourced Annotation Tasks". In: *Proceedings of the 19th ACM Conference on Computer-Supported Cooperative Work & Social Computing*. CSCW '16. San Francisco, California, USA: ACM, 2016, pp. 1637–1648. ISBN: 978-1-4503-3592-8. DOI: 10.1145/2818048.2820016. URL: http://doi.acm.org/10.1145/2818048.2820016.
- [75] Nicolas Kaufmann, Thimo Schulze, and Daniel Veit. "More than fun and money. Worker Motivation in Crowdsourcing—A Study on Mechanical Turk." In: *AMCIS*. Vol. 11. 2011, pp. 1–11.

- [76] Sarah Kessler. What Does A Union Look Like In The Gig Economy? Feb. 2015. URL: http://www.fastcompany.com/3042081/what-does-a-union-look-like-in-the-gig-economy.
- [77] Joy Kim and Andrés Monroy-Hernández. "Storia: Summarizing Social Media Content Based on Narrative Theory Using Crowdsourcing". In: *Proceedings of the 19th ACM Conference on Computer–Supported Cooperative Work & Social Computing*. CSCW '16. ACM, 2016, pp. 1018–1027. ISBN: 978–1-4503–3592–8. DOI: 10.1145/2818048.2820072. URL: http://doi.acm.org/10.1145/2818048.2820072.
- [78] Joy Kim et al. "Mechanical Novel: Crowdsourcing Complex Work through Revision". In: *Proceedings of the 20th ACM Conference on Computer Supported Cooperative Work* & Social Computing. 2017.
- [79] Peter Kinnaird, Laura Dabbish, and Sara Kiesler. "Workflow Transparency in a Microtask Marketplace". In: Proceedings of the 17th ACM International Conference on Supporting Group Work. GROUP '12. Sanibel Island, Florida, USA: ACM, 2012, pp. 281–284. ISBN: 978-1-4503-1486-2. DOI: 10.1145/2389176.2389219. URL: http://doi.acm.org/10.1145/2389176.2389219.
- [80] Aniket Kittur, Ed H. Chi, and Bongwon Suh. "Crowd-sourcing User Studies with Mechanical Turk". In: Proceedings of the SIGCHI Conference on Human Factors in Computing Systems. CHI '08. ACM, 2008, pp. 453–456. ISBN: 978–1-60558–011–1. DOI: 10.1145/1357054. 1357127. URL: http://doi.acm.org/10.1145/1357054. 1357127.
- [81] Aniket Kittur et al. "CrowdForge: Crowdsourcing Complex Work". In: *Proceedings of the 24th Annual ACM Symposium on User Interface Software and Technology*. UIST '11. ACM, 2011, pp. 43–52. ISBN: 978–1-4503–0716–1. DOI: 10.1145/2047196.2047202. URL: http://doi.acm.org/10.1145/2047196.2047202.
- [82] Aniket Kittur et al. "The Future of Crowd Work". In: *Proceedings of the 2013 Conference on Computer Supported Cooperative Work*. CSCW '13. ACM, 2013, pp. 1301–1318. ISBN: 978–1-4503–1331–5. DOI: 10. 1145/2441776.2441923. URL: http://doi.acm.org/10. 1145/2441776.2441923.
- [83] Ranjay A. Krishna et al. "Embracing Error to Enable Rapid Crowdsourcing". In: *Proceedings of the 2016 CHI Conference on Human Factors in Computing Systems*. CHI '16. ACM, 2016, pp. 3167–3179. ISBN: 978–1-4503–3362–7. DOI: 10.1145/2858036.2858115. URL: http://doi.acm.org/10.1145/2858036.2858115.
- [84] Pavel Kucherbaev et al. "ReLauncher: Crowdsourcing Micro-Tasks Runtime Controller". In: Proceedings of the 19th ACM Conference on Computer-Supported Cooperative Work & Social Computing. CSCW '16. ACM, 2016, pp. 1609–1614. ISBN: 978–1-4503–3592– 8. DOI: 10.1145/2818048.2820005. URL: http://doi.acm. org/10.1145/2818048.2820005.

- [85] Anand Kulkarni et al. "Mobileworks: Designing for quality in a managed crowdsourcing architecture". In: *IEEE Internet Computing* 16.5 (2012), pp. 28–35.
- [86] Walter Lasecki et al. "Real-time Captioning by Groups of Non-experts". In: *Proceedings of the 25th Annual ACM Symposium on User Interface Software and Technology*. UIST '12. Cambridge, Massachusetts, USA: ACM, 2012, pp. 23–34. ISBN: 978-1-4503-1580-7. DOI: 10.1145/2380116.2380122. URL: http://doi.acm.org/10.1145/2380116.2380122.
- [87] Walter S. Lasecki et al. "Chorus: A Crowd-powered Conversational Assistant". In: Proceedings of the 26th Annual ACM Symposium on User Interface Software and Technology. UIST '13. St. Andrews, Scotland, United Kingdom: ACM, 2013, pp. 151–162. ISBN: 978-1-4503-2268-3. DOI: 10.1145/2501988.2502057. URL: http://doi.acm.org/10.1145/2501988.2502057.
- [88] Walter S. Lasecki et al. "Real-time Crowd Control of Existing Interfaces". In: *Proceedings of the 24th Annual ACM Symposium on User Interface Software and Technology*. UIST '11. Santa Barbara, California, USA: ACM, 2011, pp. 23–32. ISBN: 978-1-4503-0716-1. DOI: 10.1145/2047196.2047200. URL: http://doi.acm.org/10.1145/2047196.2047200.
- [89] Walter S. Lasecki et al. "The Effects of Sequence and Delay on Crowd Work". In: *Proceedings of the 33rd Annual ACM Conference on Human Factors in Computing Systems*. CHI '15. ACM, 2015, pp. 1375–1378. ISBN: 978–1-4503–3145–6. DOI: 10.1145/2702123. 2702594. URL: http://doi.acm.org/10.1145/2702123. 2702594.
- [90] Thomas D. LaToza et al. "Microtask Programming: Building Software with a Crowd". In: *Proceedings of the 27th Annual ACM Symposium on User Interface Software and Technology*. UIST '14. Honolulu, Hawaii, USA: ACM, 2014, pp. 43–54. ISBN: 978-1-4503-3069-5. DOI: 10.1145/2642918.2647349. URL: http://doi.acm.org/10.1145/2642918.2647349.
- [91] Edith Law et al. "Curiosity Killed the Cat, but Makes Crowdwork Better". In: Proceedings of the 2016 CHI Conference on Human Factors in Computing Systems. CHI '16. ACM, 2016, pp. 4098–4110. ISBN: 978–1-4503–3362–7. DOI: 10.1145/2858036.2858144. URL: http://doi.acm.org/10.1145/2858036.2858144.
- [92] John Le et al. "Ensuring quality in crowdsourced search relevance evaluation: The effects of training question distribution". In: SIGIR 2010 workshop on crowdsourcing for search evaluation. 2010, pp. 21–26.
- [93] Min Kyung Lee et al. "Working with Machines: The Impact of Algorithmic and Data-Driven Management on Human Workers". In: Proceedings of the 33rd Annual ACM Conference on Human Factors in Computing Systems. CHI '15. ACM, 2015, pp. 1603–1612. ISBN: 978-1-4503-3145-6. DOI: 10.1145/2702123. 2702548. URL: http://doi.acm.org/10.1145/2702123. 2702548.
- [94] Lawrence Lessig. Code. Lawrence Lessig, 2006.

- [95] Margaret Levi et al. "Union democracy reexamined". In: *Politics & Society* 37.2 (2009), pp. 203–228.
- [96] Alain Lipietz. "Towards Global Fordism?" In: New Left Review 0.132 (Mar. 1982). Last updated — 2013– 02–24, p. 33. URL: http://search.proquest.com/ docview/1301937328?accountid=14026.
- [97] Greg Little et al. "TurKit: Human Computation Algorithms on Mechanical Turk". In: Proceedings of the 23Nd Annual ACM Symposium on User Interface Software and Technology. UIST '10. ACM, 2010, pp. 57–66. ISBN: 978-1-4503-0271-5. DOI: 10.1145/1866029. 1866040. URL: http://doi.acm.org/10.1145/1866029. 1866040.
- [98] Kurt Luther et al. "Crowdlines: Supporting Synthesis of Diverse Information Sources through Crowdsourced Outlines". In: *Third AAAI Conference on Human Computation and Crowdsourcing*. 2015.
- [99] Ioanna Lykourentzou et al. "Personality Matters: Balancing for Personality Types Leads to Better Outcomes for Crowd Teams". In: *Proceedings of the 19th ACM Conference on Computer–Supported Cooperative Work & Social Computing*. CSCW '16. ACM, 2016, pp. 260–273. ISBN: 978–1-4503–3592–8. DOI: 10.1145/2818048.2819979. URL: http://doi.acm.org/10.1145/2818048.2819979.
- [100] Eleanor A. Maguire, Rory Nannery, and Hugo J. Spiers. "Navigation around London by a taxi driver with bilateral hippocampal lesions". In: *Brain* 129.11 (2006), pp. 2894–2907. ISSN: 0006-8950. DOI: 10.1093/brain/awl286. eprint: http://brain.oxfordjournals.org/content/129/11/2894.full.pdf. URL: http://brain.oxfordjournals.org/content/129/11/2894.
- [101] Eleanor A. Maguire et al. "Navigation-related structural change in the hippocampi of taxi drivers". In: Proceedings of the National Academy of Sciences 97.8 (2000), pp. 4398-4403. DOI: 10.1073/pnas.070039597. eprint: http://www.pnas.org/content/97/8/4398.full.pdf. URL: http://www.pnas.org/content/97/8/4398.abstract.
- [102] Bronislaw Malinowski. Argonauts of the Western Pacific: An account of native enterprise and adventure in the archipelagoes of Melanesian New Guinea. Routledge, 2002.
- [103] David Martin et al. "Being a Turker". In: Proceedings of the 17th ACM Conference on Computer Supported Cooperative Work & Social Computing. CSCW '14. Baltimore, Maryland, USA: ACM, 2014, pp. 224–235. ISBN: 978-1-4503-2540-0. DOI: 10.1145/2531602. 2531663. URL: http://doi.acm.org/10.1145/2531602. 2531663.
- [104] Jamie K McCallum. *Global unions, local power: the new spirit of transnational labor organizing*. Cornell University Press, 2013.

- [105] Brian McInnis et al. "Taking a HIT: Designing Around Rejection, Mistrust, Risk, and Workers' Experiences in Amazon Mechanical Turk". In: Proceedings of the 2016 CHI Conference on Human Factors in Computing Systems. CHI '16. ACM, 2016, pp. 2271– 2282. ISBN: 978-1-4503-3362-7. DOI: 10.1145/2858036. 2858539. URL: http://doi.acm.org/10.1145/2858036. 2858539.
- [106] Brian James McInnis et al. "One and Done: Factors Affecting One-time Contributors to Ad-hoc Online Communities". In: *Proceedings of the 19th ACM Conference on Computer-Supported Cooperative Work & Social Computing.* CSCW '16. San Francisco, California, USA: ACM, 2016, pp. 609–623. ISBN: 978-1-4503-3592-8. DOI: 10.1145/2818048.2820075. URL: http://doi.acm.org/10.1145/2818048.2820075.
- [107] Margaret Mead and Franz Boas. *Coming of age in Samoa*. Penguin, 1973.
- [108] Vincent Miller. *Understanding digital culture*. Sage Publications, 2011.
- [109] Brad Myers, Scott E. Hudson, and Randy Pausch. "Past, Present, and Future of User Interface Software Tools". In: ACM Trans. Comput.-Hum. Interact. 7.1 (Mar. 2000), pp. 3–28. ISSN: 1073-0516. DOI: 10.1145/ 344949.344959. URL: http://doi.acm.org/10.1145/ 344949.344959.
- [110] Milton J Nadworny. Scientific management and the unions, 1900-1932; a historical analysis. Harvard University Press, 1955.
- [111] Michael Nebeling et al. "WearWrite: Crowd-Assisted Writing from Smartwatches". In: Proceedings of the 2016 CHI Conference on Human Factors in Computing Systems. CHI '16. ACM, 2016, pp. 3834—3846. ISBN: 978-1-4503-3362-7. DOI: 10.1145/2858036. 2858169. URL: http://doi.acm.org/10.1145/2858036. 2858169.
- [112] Edward Newell and Derek Ruths. "How One Microtask Affects Another". In: Proceedings of the 2016 CHI Conference on Human Factors in Computing Systems. CHI '16. ACM, 2016, pp. 3155–3166. ISBN: 978–1-4503–3362–7. DOI: 10.1145/2858036.2858490. URL: http://doi.acm.org/10.1145/2858036.2858490.
- [113] Jon Noronha et al. "Platemate: Crowdsourcing Nutritional Analysis from Food Photographs". In: *Proceedings of the 24th Annual ACM Symposium on User Interface Software and Technology*. UIST '11. Santa Barbara, California, USA: ACM, 2011, pp. 1–12. ISBN: 978-1-4503-0716-1. DOI: 10.1145/2047196.2047198. URL: http://doi.acm.org/10.1145/2047196.2047198.
- [114] Judith S Olson and Wendy A Kellogg. Ways of Knowing in HCI. Springer, 2014.
- [115] Mancur Olson. Logic of collective action public goods and the theory of groups Rev. ed.. 1965.
- [116] Elinor Ostrom. *Governing the commons: The evolution of institutions for collective action.* Cambridge university press, 1990.

- [117] Gabriele Paolacci, Jesse Chandler, and Panagiotis G Ipeirotis. "Running experiments on amazon mechanical turk". In: *Judgment and Decision making* 5.5 (2010), pp. 411–419.
- [118] Alexander J. Quinn and Benjamin B. Bederson. "Human Computation: A Survey and Taxonomy of a Growing Field". In: *Proceedings of the SIGCHI Conference on Human Factors in Computing Systems*. CHI '11. ACM, 2011, pp. 1403–1412. ISBN: 978–1-4503–0228–9. DOI: 10.1145/1978942.1979148. URL: http://doi.acm.org/10.1145/1978942.1979148.
- [119] Hugh Raynbird. Essay on Measure Work, locally known as task, piece, job, or grate work (in its application to agricultural labour). 1847.
- [120] Daniela Retelny et al. "Expert Crowdsourcing with Flash Teams". In: *Proceedings of the 27th Annual ACM Symposium on User Interface Software and Technology.* UIST '14. ACM, 2014, pp. 75–85. ISBN: 978–1-4503–3069–5. DOI: 10.1145/2642918.2647409. URL: http://doi.acm.org/10.1145/2642918.2647409.
- [121] Frank Richards. "Is Anything the Matter with Piecework". In: ASME. 1904.
- [122] Jacob August Riis. How the other half lives: Studies among the tenements of New York. Penguin, 1901.
- [123] Horst WJ Rittel and Melvin M Webber. "Dilemmas in a general theory of planning". In: *Policy sciences* 4.2 (1973), pp. 155–169.
- [124] D. H. Robertson. "A Narrative of the Coal Strike". In: *The Economic Journal* 22.87 (1912), pp. 365–387. ISSN: 00130133, 14680297. URL: http://www.jstor.org/stable/2221944.
- [125] Joel Ross et al. "Who Are the Crowdworkers?: Shifting Demographics in Mechanical Turk". In: *CHI '10 Extended Abstracts on Human Factors in Computing Systems*. CHI EA '10. ACM, 2010, pp. 2863–2872. ISBN: 978–1-60558–930–5. DOI: 10.1145/1753846.1753873. URL: http://doi.acm.org/10.1145/1753846.1753873.
- [126] James Rowan. "A Premium System of Remunerating Labour". In: *Proceedings of the Institution of Mechanical Engineers* 61.1 (1901), pp. 865–882.
- [127] Donald Roy. "Efficiency and" the fix": Informal intergroup relations in a piecework machine shop". In: *American journal of sociology* (1954), pp. 255–266.
- [128] Jeffrey Rzeszotarski and Aniket Kittur. "CrowdScape: Interactively Visualizing User Behavior and Output". In: Proceedings of the 25th Annual ACM Symposium on User Interface Software and Technology. UIST '12. Cambridge, Massachusetts, USA: ACM, 2012, pp. 55–62. ISBN: 978-1-4503-1580-7. DOI: 10.1145/2380116. 2380125. URL: http://doi.acm.org/10.1145/2380116. 2380125.

- [129] Jeffrey M. Rzeszotarski and Aniket Kittur. "Instrumenting the Crowd: Using Implicit Behavioral Measures to Predict Task Performance". In: *Proceedings of the 24th Annual ACM Symposium on User Interface Software and Technology*. UIST '11. Santa Barbara, California, USA: ACM, 2011, pp. 13–22. ISBN: 978-1-4503-0716-1. DOI: 10.1145/2047196.2047199. URL: http://doi.acm.org/10.1145/2047196.2047199.
- [130] Niloufar Salehi et al. "We Are Dynamo: Overcoming Stalling and Friction in Collective Action for Crowd Workers". In: *Proceedings of the 33rd Annual ACM Conference on Human Factors in Computing Systems*. CHI '15. ACM, 2015, pp. 1621–1630. ISBN: 978–1-4503–3145–6. DOI: 10.1145/2702123.2702508. URL: http://doi.acm.org/10.1145/2702123.2702508.
- [131] Lowell J. Satre. "After the Match Girls' Strike: Bryant and May in the 1890s". In: *Victorian Studies* 26.1 (1982), pp. 7–31. ISSN: 00425222, 15272052. URL: http://www.jstor.org/stable/3827491.
- [132] Trebor Scholz. *Digital labor: The Internet as play-ground and factory*. Routledge, 2012.
- [133] Victor S. Sheng, Foster Provost, and Panagiotis G. Ipeirotis. "Get Another Label? Improving Data Quality and Data Mining Using Multiple, Noisy Labelers". In: Proceedings of the 14th ACM SIGKDD International Conference on Knowledge Discovery and Data Mining. KDD '08. Las Vegas, Nevada, USA: ACM, 2008, pp. 614–622. ISBN: 978-1-60558-193-4. DOI: 10.1145/1401890.1401965. URL: http://doi.acm.org/10.1145/1401890.1401965.
- [134] Pao Siangliulue et al. "Toward Collaborative Ideation at Scale: Leveraging Ideas from Others to Generate More Creative and Diverse Ideas". In: *Proceedings of the 18th ACM Conference on Computer Supported Cooperative Work & Social Computing*. CSCW '15. Vancouver, BC, Canada: ACM, 2015, pp. 937–945. ISBN: 978-1-4503-2922-4. DOI: 10.1145/2675133.2675239. URL: http://doi.acm.org/10.1145/2675133.2675239.
- [135] Six Silberman. Stop citing Ross et al. 2010, "Who are the crowdworkers?". Mar. 2015. URL: https://medium.com/@silberman/stop-citing-ross-et-al-2010-who-are-the-crowdworkers-b3b9ble8d300.
- [136] Thiago H Silva et al. "Traffic condition is more than colored lines on a map: characterization of waze alerts". In: *International Conference on Social Informatics*. Springer. 2013, pp. 309–318.
- [137] Walter Skok. "Knowledge Management: London Taxi Cabs Case Study". In: *Proceedings of the 1999 ACM SIGCPR Conference on Computer Personnel Research*. SIGCPR '99. New Orleans, Louisiana, USA: ACM, 1999, pp. 94–101. ISBN: 1-58113-063-5. DOI: 10.1145/299513.299625. URL: http://doi.acm.org/10.1145/299513.299625.
- [138] Walter Skok. "Managing knowledge within the London taxi cab service". In: *Knowledge and Process Management* 7.4 (2000), p. 224.

- [139] Ryo Suzuki et al. "Atelier: Repurposing Expert Crowdsourcing Tasks As Micro-internships". In: Proceedings of the 2016 CHI Conference on Human Factors in Computing Systems. CHI '16. ACM, 2016, pp. 2645–2656. ISBN: 978–1-4503–3362–7. DOI: 10.1145/2858036. 2858121. URL: http://doi.acm.org/10.1145/2858036. 2858121.
- [140] John C. Tang et al. "Reflecting on the DARPA Red Balloon Challenge". In: *Commun. ACM* 54.4 (Apr. 2011), pp. 78–85. ISSN: 0001–0782. DOI: 10.1145/1924421. 1924441. URL: http://doi.acm.org/10.1145/1924421. 1924441.
- [141] TaskRabbit connects you to safe and reliable help in your neighborhood. Sept. 2015. URL: https://www.taskrabbit.com/.
- [142] Frederick Winslow Taylor. *The principles of scientific management*. Harper, 1914.
- [143] Jaime Teevan, Shamsi T. Iqbal, and Curtis von Veh. "Supporting Collaborative Writing with Microtasks". In: *Proceedings of the 2016 CHI Conference on Human Factors in Computing Systems*. CHI '16. ACM, 2016, pp. 2657–2668. ISBN: 978–1-4503–3362–7. DOI: 10.1145/2858036.2858108. URL: http://doi.acm.org/10.1145/2858036.2858108.
- [144] Jaime Teevan, Daniel J. Liebling, and Walter S. Lasecki. "Selfsourcing Personal Tasks". In: CHI '14 Extended Abstracts on Human Factors in Computing Systems. CHI EA '14. ACM, 2014, pp. 2527–2532. ISBN: 978–1-4503–2474–8. DOI: 10.1145/2559206. 2581181. URL: http://doi.acm.org/10.1145/2559206. 2581181.
- [145] Jaime Teevan et al. "Productivity Decomposed: Getting Big Things Done with Little Microtasks". In: Proceedings of the 2016 CHI Conference Extended Abstracts on Human Factors in Computing Systems. CHI EA '16. ACM, 2016, pp. 3500–3507. ISBN: 978–1-4503–4082–3. DOI: 10.1145/2851581.2856480. URL: http://doi.acm.org/10.1145/2851581.2856480.
- [146] Uber. Sept. 2015. URL: https://www.uber.com/.
- [147] Rajan Vaish et al. "Low Effort Crowdsourcing: Leveraging Peripheral Attention for Crowd Work". In: Second AAAI Conference on Human Computation and Crowdsourcing. 2014.
- [148] Rajan Vaish et al. "Twitch Crowdsourcing: Crowd Contributions in Short Bursts of Time". In: *Proceedings of the 32Nd Annual ACM Conference on Human Factors in Computing Systems*. CHI '14. Toronto, Ontario, Canada: ACM, 2014, pp. 3645–3654. ISBN: 978-1-4503-2473-1. DOI: 10.1145/2556288.2556996. URL: http://doi.acm.org/10.1145/2556288.2556996.
- [149] Vasilis Verroios and Michael S Bernstein. "Context trees: Crowdsourcing global understanding from local views". In: Second AAAI Conference on Human Computation and Crowdsourcing. 2014.

- [150] E. Waltz. "How i quantified myself". In: *IEEE Spectrum* 49.9 (Sept. 2012), pp. 42–47. ISSN: 0018-9235. DOI: 10.1109/MSPEC.2012.6281132.
- [151] Sidney Webb and Beatrice Webb. *The History of Trade Unionism*. 1894.
- [152] Martin L Weitzman. "The new Soviet incentive model". In: *The Bell Journal of Economics* (1976), pp. 251–257.
- [153] Martin L. Weitzman. "The "Ratchet Principle" and Performance Incentives". In: *The Bell Journal of Economics* 11.1 (1980), pp. 302–308. ISSN: 0361915X. URL: http://www.jstor.org/stable/3003414.
- [154] Peng Dai Mausam Daniel S Weld. "Decision–theoretic control of crowd–sourced workflows". In: *Twenty–Fourth Association for the Advancement of Artificial Intelligence Conference on Artificial Intelligence*. 2010.
- [155] Mark E. Whiting et al. "Crowd Guilds: Worker-led Reputation and Feedback on Crowdsourcing Platforms". In: CSCW: Computer-Supported Cooperative Work and Social Computing. 2017.
- [156] Katherine Woollett and Eleanor A Maguire. "Acquiring "the Knowledge" of London's layout drives structural brain changes". In: *Current biology* 21.24 (2011), pp. 2109–2114.
- [157] Katherine Woollett, Hugo J. Spiers, and Eleanor A. Maguire. "Talent in the taxi: a model system for exploring expertise". In: *Philosophical Transactions of the Royal Society of London B: Biological Sciences* 364.1522 (2009), pp. 1407–1416. ISSN: 0962-8436. DOI: 10.1098/rstb.2008.0288. eprint: http://rstb.royalsocietypublishing.org/content/364/1522/1407. full.pdf. URL: http://rstb.royalsocietypublishing.org/content/364/1522/1407.
- [158] Shao-Yu Wu, Ruck Thawonmas, and Kuan-Ta Chen. "Video Summarization via Crowdsourcing". In: *CHI* "11 Extended Abstracts on Human Factors in Computing Systems. CHI EA '11. ACM, 2011, pp. 1531–1536. ISBN: 978–1-4503–0268–5. DOI: 10.1145/1979742. 1979803. URL: http://doi.acm.org/10.1145/1979742. 1979803.
- [159] Ming Yin et al. "The Communication Network Within the Crowd". In: *Proceedings of the 25th International Conference on World Wide Web*. International World Wide Web Conferences Steering Committee. 2016, pp. 1293–1303.
- [160] Lixiu Yu, Aniket Kittur, and Robert E. Kraut. "Distributed Analogical Idea Generation: Inventing with Crowds". In: *Proceedings of the 32Nd Annual ACM Conference on Human Factors in Computing Systems*. CHI '14. Toronto, Ontario, Canada: ACM, 2014, pp. 1245–1254. ISBN: 978-1-4503-2473-1. DOI: 10.1145/2556288.2557371. URL: http://doi.acm.org/10.1145/2556288.2557371.

- [161] Lixiu Yu, Aniket Kittur, and Robert E. Kraut. "Distributed Analogical Idea Generation with Multiple Constraints". In: *Proceedings of the 19th ACM Conference on Computer-Supported Cooperative Work & Social Computing*. CSCW '16. ACM, 2016, pp. 1236–1245. ISBN: 9781450324731. DOI: 10.1145/2556288. 2557371. URL: http://dl.acm.org/citation.cfm?id=2611105.2557371.
- [162] Lixiu Yu, Aniket Kittur, and Robert E. Kraut. "Encouraging "Outside-The-Box" Thinking in Crowd Innovation Through Identifying Domains of Expertise". In: Proceedings of the 19th ACM Conference on Computer-Supported Cooperative Work & Social Computing. CSCW '16. ACM, 2016, pp. 1214–1222. ISBN: 978-1-4503-3592-8. DOI: 10.1145/2818048. 2820025. URL: http://doi.acm.org/10.1145/2818048. 2820025.
- [163] Lixiu Yu, Aniket Kittur, and Robert E. Kraut. "Encouraging "Outside- The- Box" Thinking in Crowd Innovation Through Identifying Domains of Expertise". In: *Proceedings of the 19th ACM Conference on*

- Computer-Supported Cooperative Work & Social Computing. CSCW '16. San Francisco, California, USA: ACM, 2016, pp. 1214—1222. ISBN: 978-1-4503-3592-8. DOI: 10.1145/2818048.2820025. URL: http://doi.acm.org/10.1145/2818048.2820025.
- [164] Alvin Yuan et al. "Almost an Expert: The Effects of Rubrics and Expertise on Perceived Value of Crowdsourced Design Critiques". In: Proceedings of the 19th ACM Conference on Computer—Supported Cooperative Work & Social Computing. CSCW '16. ACM, 2016, pp. 1005–1017. ISBN: 978–1-4503–3592–8. DOI: 10.1145/2818048.2819953. URL: http://doi.acm.org/10.1145/2818048.2819953.
- [165] M. C. Yuen, I. King, and K. S. Leung. "A Survey of Crowdsourcing Systems". In: *Privacy, Security, Risk and Trust (PASSAT) and 2011 IEEE Third International Conference on Social Computing (SocialCom), 2011 IEEE Third International Conference on.* Oct. 2011, pp. 766–773. DOI: 10.1109/PASSAT/SocialCom.2011.203.