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ILRReview

Volume 66 | Number 1

Article 8

2-13-2013

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Abstract

The authors use monthly data from 25 production units in a German steel plant over the period 1992 to 2001 to test for impacts of teamwork and performance-related pay on productivity, accidents, and absence rates. They find that teamwork and performance pay provide incentives to workers to increase quantity at the expense of quality and to run the machines for long hours instead of spending time on maintenance. Absenteeism increases when a combination of teamwork and performance pay is applied to production units that previously had neither. Results suggest that teamwork and performance pay can create hidden costs for manufacturers and do not necessarily increase worker productivity.

Keywords

teamwork, performance pay, productivity, absenteeism, workplace accidents

Cover Page Footnote

We would like to thank the Hans Boeckler Foundation in Duesseldorf for generously funding this project, and the workers and managers of “Company X” for answering our questions. The data we use are proprietary and cannot be made available to other researchers. We will, however, provide a detailed description of the data sets and additional econometric analyses upon request. We are grateful to the editors, Tove Hammer and Lawrence Kahn, as well as two anonymous referees for their helpful and constructive comments and suggestions. Department of Management, University of Paderborn, Warburger Strasse 100, 33098 Paderborn, Germany. E-mail: bernd.frick@notes.upb.de, Institute for Labor and Personnel Economics, Mobile Life Campus, Volkswagen AG, Hermann-Muench-Strasse 1, 38440 Wolfsburg, Germany and Institute of Labour Law and Industrial Relations in the European Community, Campus II, University of Trier, 54286 Trier, Germany. Institute for Labor and Personnel Economics, Mobile Life Campus, Volkswagen AG, Hermann-Muench-Strasse 1, 38440 Wolfsburg, Germany. Email: ute.goetzen@volkswagen.de. Department of Economics, The Management School, Lancaster University, Lancaster LA1 4YX, UK. Email: r.simmons@lancaster.ac.uk.

THE HIDDEN COSTS OF HIGH-PERFORMANCE WORK PRACTICES: EVIDENCE FROM A LARGE GERMAN STEEL COMPANY

BERND J. FRICK, UTE GOETZEN, AND ROBERT SIMMONS*

The authors use monthly data from 25 production units in a German steel plant over the period 1992 to 2001 to test for impacts of teamwork and performance-related pay on productivity, accidents, and absence rates. They find that teamwork and performance pay provide incentives to workers to increase quantity at the expense of quality and to run the machines for long hours instead of spending time on maintenance. Absenteeism increases when a combination of teamwork and performance pay is applied to production units that previously had neither. Results suggest that teamwork and performance pay can create hidden costs for manufacturers and do not necessarily increase worker productivity.

[T]he development of an empirically grounded economic theory of incentives depends on research that combines the use of detailed knowledge of the organizational context, a carefully developed model that is appropriate to the context, and rich data drawn from within the organization under study. The search for research settings with these key ingredients will . . . shape the continued development of organizational economics.

Gaynor, Rebitzer, and Taylor (2001: 31)

Human resource management practices have changed radically over the past 20 years. Assembly line production organized hierarchically with well-defined line management in a top-down structure has given way to semiautonomous teams in which workers solve problems in groups and sometimes even set their own production targets (Bloom and van Reenen

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2007). Innovations in human resource management are claimed to have been at least partly responsible for increased worker productivity in both the United States and Western Europe (Lawler, Mohrman, and Benson 2001; Black and Lynch 2004). Two particular innovations that we consider in this article are growth in use of semiautonomous teams, in a context of assembly line production, and use of bonuses for team performance (performance-related pay).

We have disaggregated data on productivity, accidents, and absence rates from a large German steel company. Our focus on finely tuned data from within a large company enables us to analyze key variables with a precision that would be lacking in broader establishment-based surveys. As such our empirical analysis sits in the genre of nano-econometrics or “insider” econometrics, which has grown in personnel economics following the seminal work on steel plants in the United States by Ichniowski, Shaw, and Prenzushi (1997) (see Lazear and Shaw 2007; Ichniowski and Shaw 2009; Shaw 2009; and Bloom and Van Reenen 2010 for surveys of the literature). This approach emphasizes rigorous econometric analysis of panel data generated within one company or a few companies. An important feature of this empirical work has been the revelation that groups of human resource management policies can raise productivity in steel plants by more than is possible from isolated policies. Thus, human resource management policies can deliver important complementarities in their effects on worker productivity. In our study, we focus on the ability of a combination of semiautonomous teamwork and group performance-related pay to raise productivity in a large German steel company. We also assess some hidden costs of human resource management policies, in the form of work accidents and absenteeism.

Literature Review

A substantial literature focusing on the impact of high-performance work practices on company performance has been published.¹ For reasons discussed below we focus on performance-related pay (see Table A.1 in the Appendix)² and on (semiautonomous) teams (see Table A.2).³ It appears that, first, the introduction not only of an individual pay-for-performance system but also of team bonuses increases worker productivity in various contexts (blue-collar workers, sales people, medical doctors) and, second, that the implementation of semiautonomous teams is also associated with statistically significant and economically relevant increases in either productivity or profitability. While the evidence on the separate effect of these two instruments seems to be convincing, effects are less clear when considering “bundles” of human resource management practices, among which

¹For summaries of the early literature see Huselid and Becker (1998), Ichniowski and Shaw (2003a), and Ichniowski et al. (1996).

²Glassop (2002) provides an overview of the literature from a sociological perspective.

³For an overview see Gibbons (1998, 2005), Prendergast (1996, 1998), and Jirjahn (2002).

teamwork and bonus pay are particularly important. Summarizing the available evidence on the impact of innovative work practices on organizational performance, it appears that as expected—but irrespective of the concrete performance measures employed and the peculiar characteristics of the data sets used—specific work practices increase productivity, employee motivation, and/or profits mainly in the context of other specific practices. Unfortunately, however, little, if any, theoretical guidance is provided on how these measures interact. This, in turn, leads many researchers to search for combinations of practices that affect performance significantly in their data sets, but whose effects are idiosyncratic to that data and cannot be demonstrated with data from other settings. Moreover, the possibility that firms already performing well have a greater probability to adopt “high performance work practices”—either because they are able to bear the implementation costs or because they want to share rents with their employees—implies that the positive effect of innovative work practices on performance may not be causal but may simply reflect firm heterogeneity (Cappelli and Neumark 2001). Not surprisingly, therefore, seemingly robust cross-sectional relationships become small or even insignificant when panel data is used to account for unmeasured firm heterogeneity.⁴ Firms that adopt innovative work practices early are likely to do so because these practices are especially useful for them while those who adopt them later either decided to postpone their implementation because the practices have less value for them or because the implementation costs are likely to decrease over time.⁵

Finally, the discussion so far has not yet resulted in a consensus on the combination of measures that have to be implemented to build a high-performance work system. Our reading of the literature suggests that (semi-autonomous) teams, on the one hand, and performance-related pay, on the other hand, are among the most important ingredients of any of the bundles for which impact on firm performance is being analyzed in the literature. Admittedly, other human resource management practices have been studied in some detail too, but papers looking at the impact of (semiautonomous) teams and/or performance-related pay on either individual or firm productivity clearly dominate the literature. This does not imply, however, that other instruments such as safety regulations, information sharing, and feedback provision are unimportant. Given the emphasis that Jones, Kalmi, and Kauhanen (2010b) in their empirical analysis, Milgrom and Roberts (1995) in their theoretical exposition, and Lazear and Gibbs (2009) in their textbook place on the particular role of teams and bonus pay though, we will in our study concentrate on the separate as well as the joint impact of these two practices on the performance of individual production units in a

⁴Another reason cross-sectional relationships may become insignificant in panel data is measurement error.

⁵Another interesting strand of the literature looks at the impact of “soft” human resource management practices, such as development talks, participation, and feedback on worker productivity, and finds significantly positive effects, *inter alia*, for firms in the retail industry (see, e.g., Jones, Kalmi and Kauhanen 2006, 2010a).

large German steel company while simultaneously controlling for the (potential) influence of a large number of additional—yet (presumably) less important—measures.

A small number of studies have adopted a similar approach to the one we have chosen. In a truly seminal—but still not fully acknowledged—paper, Wagner, Rubin, and Callahan (1988) analyzed the impact of the introduction of nonmanagerial incentive pay in an iron foundry over an extended period of time (114 months between February 1975 and July 1984) on monthly productivity, labor costs, and grievance procedures. They find that the introduction of a group bonus increases average daily tonnage while labor costs declined and the number of grievance procedures remained constant; however, the impact of other changes in supervisory personnel and shop floor practices was not explicitly tested for.⁶ Hamilton, Nickerson, and Owan (2003) study the implementation of teamwork in a garment manufacturing facility over a period of three years for which they have weekly information on 25 different teams. They find that, contrary to expectations, an individual worker's productivity increases 14% after joining a semi-autonomous team. Moreover, high-productivity workers do not reduce their effort levels when joining a team, while particularly low-productivity workers significantly increase their effort levels. In the firm under study, the implementation of semiautonomous teams was not accompanied by the simultaneous or subsequent introduction of a group bonus. Finally, Jones, Kalmi, and Kauhanen (2010b) use weekly records for four production lines in a Finnish food-processing plant during the period 1999 to 2005 to study the impact of semiautonomous teams, company-wide profit sharing, and a group system of performance-related pay on line productivity. They find that the effects vary considerably, first, across lines and, second, depending on the specific combination of human resource management practices, suggesting the importance of complementarities.

Company Description

Company X is a large steel-producing company located in the federal state of North Rhine-Westphalia in Germany. In September 2001 the company had about 2,500 employees of whom 1,700 were working in the production of autobody sheet steel as well as steel sheets designed for the production of cans for the soft-drink industry. About 60% of the annual production (900,000 tons per year) was exported. About half of the export went to European countries. Turnover in 2001 was €770 million.

During the 1970s, Company X was one of the best performing firms in its sector with profits far above the industry average. During the 1980s, profits

⁶Moreover, Schuster (1983), Kaufman (1992) as well as Arthur and Aiman-Smith (2001) find that gainsharing (a team bonus covering the whole workforce of a particular company) has a significantly positive impact on productivity, employment, and employee suggestions. This effect, however, seems to vary considerably over time.

declined dramatically due to a number of mergers, privatizations of formerly state-owned steel companies in Western European countries, the emergence of new competitors especially from Asia, and rising costs for energy as well as for wages.

In 1993 the company lost money for the first time in its history. Management reacted with a massive layoff (1,000 employees, among them 100 white-collar employees who were fired) and changed its policies fundamentally:

- 1994: re-organization starts in the production units; requirement to meet particular production targets/goals,
- 1995: re-organization starts in administration,
- 1996: reduction of absenteeism is declared a “high priority” target, integration of formerly “independent” maintenance workers in shift teams,
- 1997: stepwise introduction of new bonus system, training in workplace safety and accident prevention, bonus system for reduced absenteeism, monitored requirement to wear hard hats,
- 1998: introduction of appraisal interviews, introduction of extended employee suggestion system,
- 1999: stepwise introduction of semiautonomous teams in production for the purpose of problem-solving activities, flexible job assignments, and quality management, and
- 2000: safety staff explicitly authorized to issue directives toward employees for violations of safety regulations.

According to the company’s top management these changes resulted in a 34% increase in gross output and a 40% increase in productivity (tons produced per hour) in 2001 as compared to 1993. Since 2002 the company is highly profitable again.

The teams whose performance we study consist of approximately 80 to 300 members who are very homogenous with regard to their qualifications but often heterogeneous with regard to their age and/or their tenure.⁷ Because voluntary employee turnover in Company X is close to zero—the firm pays about 15 to 20% more than what workers could earn elsewhere in the mainly rural area where the firm is located⁸—mutual monitoring plays an important role in the daily interaction of the production workers; “uncooperative” workers are likely to be punished by their peers (Kandel and Lazear 1992; Knez and Simester 2001). At the same time, however, the high degree of “cohesiveness” of the individual teams creates the conditions

⁷The teams are identical to what we call “production units.” Each team consists of up to five different “shift groups” (between four and five different shifts are required for continuous production under the 35-hour work week stipulated by the collective bargaining agreement in the steel industry); the size of the semiautonomous teams working in close collaboration varies between 20 and 60 people.

⁸Traditionally, the collective bargaining agreements in the metal and steel industries stipulate hourly wage rates that are considerably higher than in most other industries. Therefore, the majority of workers in Company X are interested in retaining their jobs until they reach retirement age.

Table 1. Work Accidents in Germany per 1,000 Workers, 1993–2001

<i>Year</i>	<i>All sectors</i>	<i>Metal industry</i>	<i>Firm X</i>
1993	52	70	25
1994	51	69	36
1995	48	67	61
1996	43	58	24
1997	42	58	22
1998	42	57	13
1999	41	58	11
2000	40	55	9
2001	39	52	10

Sources: Bundesministerium für Arbeit und Sozialordnung (2001: 143–45); own calculations.

Note: Accidents that have to be reported per 1,000 full-time employees.

Table 2. Absenteeism in Germany, 1996–2001

<i>Year</i>	<i>All sectors</i>	<i>Metal industry</i>	<i>Firm X</i>
1996	4.8	5.4	3.4
1997	4.2	5.2	3.3
1998	4.1	5.2	3.5
1999	4.3	5.6	3.3
2000	4.2	5.5	3.3
2001	4.2	5.5	3.2

Sources: Küsgens, Vetter, and Yoldas (2001: 264, 402); own calculations.

Note: Hours of absence as percentage of potential working hours.

under which “collusive behavior,” such as “voluntary” absenteeism, is likely to occur (see, e.g., the seminal studies by Roy 1952, 1954).

The number of work accidents in Company X was far lower than in the metal industry as a whole (10 accidents per 1,000 full-time employees compared with 52 in 2001, see Table 1) and the absence rate was also considerably lower (3.2% compared with 5.5% in 2001, see Table 2). These figures are surprising insofar as

- 1) absence rates increase with firm size (Barmby and Stephan 2000; Heywood and Jirjahn 2004) and Company X is a rather large firm, and
- 2) workplace accidents decrease with firm size, which explains the lower number of accidents in Company X. At the same time, however, the number of accidents is much lower than in other firms in the industry suggesting that worker and supervisor training as well as the company’s investments in workplace safety seem to pay off.

Workers receive a flat hourly rate supplemented, for some production units, by a bonus payment related to production unit output. A “cap” is imposed

on the bonuses to be obtained by the individual teams. Bonus payments cannot exceed a threshold level of 140% of regular hourly wages multiplied by average monthly working hours. Also, bonuses accrue to the team, not the individual. We should stress that the company explicitly wanted to reduce absenteeism and implemented bonus payments precisely as an intended incentive to reduce absences. A “present at work” bonus was installed alongside the bonus for production performance.

Note that management–labor relations have been rather peaceful in Company X: The works council maintains a cooperative relationship with top management, management consults the works council even on issues for which this is not stipulated by the Codetermination Act to gain approval or active support for its decisions, and trade union influence is limited (although most works councillors are members of IG Metall, the largest metal workers’ union in Europe).

Theoretical Considerations

Since the steel company that we are analyzing has assembly line production, the whole line could be thought of as a team. The organization of work around small- to medium-sized teams is best considered as an attempt to raise worker productivity by capturing the benefits of specialization and skill complementarities within groups. These benefits can be reinforced by learning spillovers and knowledge transfer as team members gain experience that can be shared within the group. For these effects to be realized, team size should be sufficiently small so that workers are aware of each others’ skills and performances, and team members should be located in close proximity at the workplace (Neilson 2007).

A series of empirical studies documents the benefits of teamwork in terms of enhanced worker productivity (see Lazear and Shaw 2007 for a survey). Thus, teams are found to raise productivity through worker complementarity in production of clothing (Hamilton, Nickerson, and Owan 2003), to raise communication levels in steel mills (Ichniowski and Shaw 2003b), and to facilitate solutions of complex problems, again in steel mills (Boning, Ichniowski, and Shaw 2007). In their seminal study of U.S. steel mills, Ichniowski, Shaw, and Prennushi (1997) found that early on in the application of new human resource management practices in the U.S. steel industry, such policies raised worker productivity and, crucially, that the marginal benefit of each practice was increasing in the adoption of other practices. More recently, Boning et al. (2007) were able to distinguish between gross output and output net of scrap in a panel study of several U.S. steel plants. They found that combinations of human resource management policies were generally able to raise output net of scrap, that is, quality-adjusted output.

Team production does not necessarily imply the use of incentive pay, but bonuses for team performance are widely used in modern manufacturing

companies. Such bonuses enable workers and firms to share rents; bonuses also help alleviate worker concerns over inequity in pay in firms and promote perceptions of fairness, which in turn raise worker satisfaction and morale (Petrescu and Simmons 2008). These features could in principle translate into increased team productivity.

The potential problems for team incentives in the form of performance-related pay are well-documented (Neilson 2007). First, individual workers bear the cost (disutility) of their own effort but all team members benefit through performance-related pay. Team incentives tend to dilute the salary gains from work and could lead to minimal amounts of team effort as a result. Second, a free-rider problem can occur in teams. Individuals who offer low levels of effort get the same rewards as colleagues who perform high levels of effort. Third, much depends on finding a measure of team performance that workers and firms can agree on. For workers, this means a set of operationally feasible production targets that can trigger bonuses; for firms, targets should be appropriate to the broader profit goal of the organization as a whole. Production targets should also not be too soft, so that credible incentives can be established.

In contrast, decentralizing decision-making to teams might generate positive effects on productivity (as well as on behavioral aspects) by increasing employee discretion, which allows more efficient use of private information; by increasing employee effort and improving their attitudes toward work; and by encouraging team members to learn from one another and generate new knowledge (for a summary of the relevant literature see, e.g., Jones, Kalmi, and Kauhanen 2010b). Effective decentralization of decision-making often requires the adoption of complementary team incentives, because the “coupling of financial incentives with teamwork may provide the right incentives for employees both to engage in peer monitoring and to refrain from opportunistic use of increased employee discretion” (Jones et al. 2010b: 612). Thus, it is precisely the combination of team incentives and decentralized decision-making in the form of semiautonomous teams that can be thought to solve the problems that typically arise when close cooperation between teammates is likely to increase productivity and when, at the same time, peer monitoring is required to avoid “free-riding” by utility-maximizing individuals.

Our empirical analysis seeks to identify some potentially hidden costs of team production and performance-related pay. Taken singly or jointly, these human resource policies could lead to an excessive focus by workers on total output that might be rewarded by incentive pay. Quality of output and care over maintenance may be sacrificed as workers perform excessive effort in a drive to meet production targets that trigger performance bonuses. If these bonuses are not modified to control for quality of output then teamwork and performance-related pay could result in lower rather than higher team productivity. Also, if team members work excessively hard without sufficient care then increased work accidents could follow.

Model, Estimation Methods, and Data

We define *ABSENCE RATE* as the proportion of potential worker-hours in a production unit declared by the firm as absences in a given month. This is modeled by:

$$(1) \quad \begin{aligned} \text{ABSENCE RATE} = & \beta_0 + \beta_1 \text{PLD} + \beta_2 \text{MONTH} + \beta_3 \text{YEAR} \\ & + \beta_4 \text{PERSONNEL MANAGER} + \beta_5 \text{TECHNICAL MANAGER} \\ & + \beta_6 \text{SHIFT} + \beta_7 \text{HRM} + \beta_8 \text{TENURE} + \beta_9 \text{PERFORMANCE} \\ & \text{PAY} + \beta_{10} \text{TEAMWORK} + \beta_{11} \text{TEAMWORK} * \text{PERFORMANCE} \\ & \text{PAY} + \varepsilon \end{aligned}$$

where

ABSENCE RATE is the proportion of potential worker-hours in a production unit declared by the firm as absences in a given month;

PLD is a vector of production line dummies;

MONTH is a vector of month dummies;

YEAR is a vector of year dummies;

PERSONNEL MANAGER is a vector of dummy variables denoting the identities of personnel managers directly responsible for the pay and employment conditions of the units of workers;⁹

TECHNICAL MANAGER is a vector of dummy variables denoting the identities of technical managers responsible for the production operations of the shifts to which the units of workers belong;

SHIFT is a vector of five shift dummies;

HRM is a vector of variables denoting combinations of human resource management practices, derived from factor analysis;¹⁰

TENURE is the average length of tenure with the firm of each production unit; we predict that units with longer-lasting employment relations with the firm will have greater experience and will wish to sustain mutually beneficial employment relationships with the firm, resulting in lower absence rates;

⁹Since personnel and technical managers rotate across production units, teams experience changes in their supervisory staff from time to time. We take this into account by controlling for the identities of the five personnel managers and the five technical managers in charge of the 25 production units.

¹⁰The results can be obtained from the authors on request. The number of dummy variables included in this first factor analysis was 15, resulting in a varimax rotated factor matrix consisting of three components with eigenvalues >1. These factors can be described as follows: (1) action programs to increase workplace safety (representing 8 different variables: publication of first safety handbook; target: zero accidents; obligation to wear hard hats; general training of safety staff; suggestion scheme: accident reduction; target: absenteeism; implementation of absence bonus; target: accident prevention); (2) information and directives (representing 5 different variables: publication of second safety handbook; target: absence days; special training of safety staff; authorization of safety staff to issue directives; safety training of new employees); and (3) worker training to increase safety (representing 2 different variables for safety trainings of special groups of workers). About 76% of the variance can be explained by the three factors.

Table 3. Work Accidents and Absence Rates in Firm X, 1993–2001

<i>Year</i>	<i>Work accidents per 1,000 full-time employees</i>	<i>Number of working days lost due to accidents, per employee</i>	<i>Absence rate</i>
1993	25.2 (157.1)	0.51 (1.91)	—
1994	36.2 (186.8)	1.27 (5.14)	—
1995	61.3 (240.1)	2.84 (12.80)	—
1996	23.6 (151.9)	1.73 (10.12)	3.39 (3.12)
1997	22.0 (157.2)	1.30 (6.97)	3.33 (2.96)
1998	12.6 (111.5)	0.91 (6.30)	3.46 (3.49)
1999	11.0 (104.4)	0.85 (8.45)	3.32 (3.51)
2000	9.4 (96.7)	0.42 (4.01)	3.29 (3.38)
2001	10.5 (102.0)	0.40 (3.74)	3.22 (3.22)

Note: Values indicate mean (standard deviation).

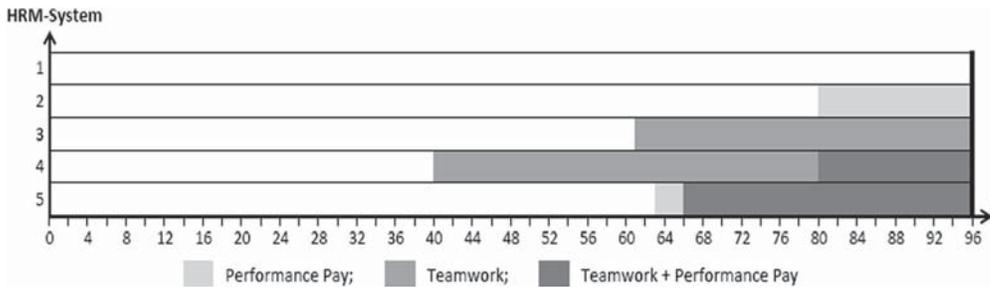
Table 4. Distribution of Monthly Observations with/without Teamwork and/or Performance Pay

<i>Variable</i>	<i>Productivity information (%)</i>	<i>Absence rates (%)</i>	<i>Accident figures (%)</i>
Neither teamwork nor performance pay	68.8	52.1	70.6
Performance pay only	19.6	25.0	15.7
Teamwork only	1.5	6.5	3.9
Teamwork with performance pay	10.1	16.4	9.9
N	2,700	3,180	5,088

PERFORMANCE PAY is a dummy variable set equal to 1 if a production unit receives some part of their pay as a performance-related component and no teamwork is involved (note that our human resource policy dummy variables are deliberately designed to be mutually exclusive); *TEAMWORK* is a dummy variable set equal to 1 if members of a production unit work jointly as a team and no performance pay is involved; *TEAMWORK*PERFORMANCE PAY* is an interactive dummy variable set equal to 1 if members of a production unit work as a team and receive some performance-related component to their pay; and ε is an i.i.d stochastic term.

To investigate the effects of teamwork and performance pay on absenteeism, we model *ABSENCE RATE* as a continuous variable as shown in Equation (1). Since our dependent variable is a rate that is bounded between 0 and 1, we need to estimate a fractional response model along the lines proposed by Papke and Wooldridge (1996, 2008). Papke and Wooldridge apply fractional response model estimation to employee participation rates in pension plans (1996) and school test pass rates (2008). Our dependent variable is similar. Oberhofer and Pfaffermayr (2009) show that fractional response models can be estimated by general linearized models. Specifically,

Figure 1. The “Timing” of the Introduction of Teamwork and Performance Pay



the results from the fractional response model of Papke and Wooldridge (1996) can be replicated using the `glm` command in Stata. We apply this approach to our absence rate variable. Absence data are available on a unit/shift basis but only from October 1996, and we have 60 monthly observations of absence rates per unit/shift, giving a potential number of 3,180. Missing values mean our absence rate data are recorded for 3,001 shift-unit observations. Table 3 offers descriptive data for work accidents and absences.

For production unit-month observations where absences were recorded we find 25.0% with performance pay only, 16.4% with teamwork only, and 6.5% with teamwork and performance pay. Hence, 52.1% of observations had neither teamwork nor performance pay (see Table 4 for information on the distribution of the four regimes and Figure 1 for an illustration of the distribution of teamwork and performance pay across the units of analysis).

As noted above, to claim bonus pay, production units might perform excessive effort leading to lack of care over safety resulting in greater frequency of accidents. We have two measures of accidents in the firm. *ACCIDENTS* is number of accidents by production unit and *WORKING DAYS LOST* is production days lost from accidents. We set up the following model. For numbers of accidents, zeros represent 86% of observations and OLS estimation would be inappropriate. Days lost due to accidents have discrete values and we categorize these as 0, 1, or 2 days lost, 3 days lost, and 4 or more days lost. We proceed to estimate these categories by fixed effects conditional logit. Fixed effects models do not necessarily deliver consistent estimates in ordered or binary probit models. Chamberlain (1980) proposed a binary response fixed effects logit model in which biases were eliminated. More recent analysis has developed ordered logit models with fixed effects. In particular, we use the Blow-up and Cluster estimator proposed by Baetschmann, Staub, and Winkelmann (2011) and applied with Stata code by Dickerson, Hole, and Munford (2011). This estimator adjusts standard errors for clustering by group and does not suffer from the potential problems of the Chamberlain estimator associated with some cutoffs in the ordering leading to small sample sizes. This is a potential problem in our case as accidents have a skewed distribution. We also estimated an alternative count data model, fixed effects zero inflated negative binomial regression, and this gave similar results to fixed effects ordered logit. Our model is

$$(2) \quad Pr(\text{ACCIDENTS or (WORKING DAYS LOST)}) = \beta_{12} + \beta_{13} \text{PLD} \\ + \beta_{14} \text{YEAR} + \beta_{15} \text{PERSONNEL MANAGER} + \beta_{16} \text{TECHNICAL} \\ \text{MANAGER} + \beta_{17} \text{SHIFT} + \beta_{18} \text{HRM} + \beta_{19} \text{TENURE} + \beta_{20} \text{PERFORMANCE} \\ \text{PAY} + \beta_{21} \text{TEAMWORK} + \beta_{22} \text{TEAMWORK} * \text{PERFORMANCE} \\ \text{PAY} + \text{production unit fixed effects} + \varepsilon$$

We have 96 monthly observations for accidents by unit/shift over the period October 1993 to September 2001 giving a potential number of observations of 5,088. Dropped from the estimation were 403 observations because there was no variation over time in the outcome variable for some groups. This leaves 4,685 observations for estimation.

Next, we assess the impacts of performance pay and teamwork on production line performance. This is measured by realized output, *RO*, of each of the 25 production units working in the company. Our data allow us to distinguish output of sufficient quality to be available for sale, adjusted output denoted by *AO*. This is quality-adjusted output, which is output net of waste scrap. The waste scrap cannot be sold but can be recycled back into further production. Further measures of production unit performance are *RT*, which is running time of the production line and *ART*, which is adjusted running time, net of time taken for unscheduled maintenance of the line. We estimate the following fixed effects models:

$$(3) \quad RO \text{ (or } AO \text{ or } RT \text{ or } ART) = \beta_{23} + \beta_{24} \text{PERSONNEL} \\ \text{MANAGER} + \beta_{25} \text{TECHNICAL MANAGER} + \beta_{26} \text{MONTH} \\ + \beta_{27} \text{YEAR} + \beta_{28} \text{ORG CHANGE} + \beta_{29} \text{PERFORMANCE PAY} \\ + \beta_{30} \text{TEAMWORK} + \beta_{31} \text{TEAMWORK} * \text{PERFORMANCE PAY} + \varepsilon$$

where *ORG CHANGE* is a vector of variables denoting technical and organizational changes, derived from factor analysis.^{11,12}

¹¹The results are also available on request. The number of dummy variables included in this second factor analysis was 23, resulting in a varimax rotated factor matrix consisting of 6 components with eigenvalues >1. These factors can be described as follows: (1) training and reorganization measures (representing 5 different human resource management practices: integration of shift coordinators into shift teams; extended training of production workers; integration of mechanics and electricians into shift teams; action program to increase output; and introduction of additional quality measures); (2) organizational decentralization (representing 7 different instruments: cross-linking of production teams; introduction of autonomous maintenance; introduction of performance appraisal of shift leaders; decentralization of suggestion scheme; action program to increase capacity utilization; integration of repair services into shift teams; and introduction of fifth shift); (3) training and evaluation (representing 5 different instruments: integration of locksmiths into shift teams; extended quality training of production workers; training of production workers in electrical engineering; introduction of "shift talks"; and presentation of pilot project on capacity utilization); (4) evaluation and quality management (representing 2 different measures: introduction of "round table" for shift leaders; start of quality training); (5) new performance measures (representing 2 different instruments: introduction of service technicians; change in performance calculations); and (6) reallocation of technical staff (representing 2 different measures: reallocation of coordinating staff; separation of hood-type furnaces). About 77% of the variance can be explained by the 6 factors.

¹² The reason we had to replace HRM (the vector of variables denoting combinations of human resource management practices derived from factor analysis) in models 1 and 2 by ORG CHANGE in

For productivity measures,¹³ we have data from 25 different production units. Productivity is recorded only at the level of the production unit; no further disaggregation is possible. We have 108 monthly observations over the period October 1992 to September 2001, giving a maximum of 2,700 observations. Some missing values reduce the sample sizes to 2,673 for actual output, 2,676 for adjusted output and running time, and 2,006 for adjusted running time. Out of 25 production units, 13 delivered data on accidents (numbers and working days lost). Estimation of Equation (3) allows us to test for impacts of performance-related pay and teamwork on output and running time. Although we might predict that firms introduce teamwork and performance-related pay precisely in order to increase these measures, evidence is far from unanimous in revealing beneficial effects of these mechanisms.

Results

Coefficients of focus variables are reported in Table 5. By themselves, teamwork and performance pay each have significant negative effects on absence rates. But teamwork combines with performance pay to significantly raise absence rates. To assess the combined effects of teamwork and performance pay we use the separate teamwork and performance pay dummy variables plus their interaction term as follows.¹⁴ We can rewrite Equation (1) as:

$$\begin{aligned} \text{ABSENCE RATE} = & b_0 + b_1 \text{PERFORMANCE PAY} \\ & + b_2 \text{TEAMWORK} + b_3 \text{TEAMWORK} * \text{PERFORMANCE} \\ & \text{PAY} + c' \mathbf{Z} \text{ where } \mathbf{Z} \text{ is a vector of controls.} \end{aligned}$$

Recall that the performance pay, teamwork, and interaction variables are defined to be mutually exclusive. Then b_1 is the effect of performance pay without teamwork, b_2 is the effect of teamwork without performance pay, and b_3 is the effect of having both teamwork and performance pay relative to having neither. Moreover, $(b_3 - b_1)$ is the effect of adding teamwork to a unit that already had performance pay and $(b_3 - b_2)$ is the effect of adding performance pay to a unit that already had teamwork. The significance of these last two effects can be evaluated using Wald tests.

model 3 is that the two data sets the company made available to us include different sets of (potential) determinants of absenteeism and accidents, on the one hand, and productivity and downtime, on the other hand. We admit, however, that either of these variables could affect each of our performance measures.

¹³Strictly speaking, we cannot calculate the productivity of the individual units because we can neither control for the number of workers nor for the number of hours used to generate the observed output and the observed running time. Given the information we have received from workers during our plant visits, however, we assume that differences in output and running time are due to time-invariant differences in team size and composition. Thus, we assume that the production unit fixed effects capture most of the differences in inputs.

¹⁴We are grateful to *ILRReview* editor Lawrence Kahn for suggesting this procedure.

Table 5. Impact of Teamwork and Performance Pay on Absence Rates

<i>Variable</i>	<i>GLM coefficient</i>
Average age of workers	-0.017 (-2.64)
Performance pay only	-0.108 (-2.17)
Teamwork only	-0.236 (-2.32)
Teamwork with performance pay	0.194 (2.72)
Factor 1: Action programs	-0.205 (-1.93)
Factor 2: Information and directives	-0.290 (-3.02)
Factor 3: Safety training	-0.002 (-0.10)
N	3,001

Notes: Dependent variable is absence rate measured as total hours absent as proportion of maximum working hours by production unit. Estimates are from GLM regression with robust standard errors, with dummy variables for month and year, and with hours of work to account for the size of the production units; z-values in parentheses.

Table 5 reveals that, on their own, teamwork and performance pay lead to reduced absence rates. Wald tests of the restriction that the difference of the interaction term coefficient and an individual human resource policy coefficient is equal to zero clearly reject the null (p values of 0.00 in each case). Hence, we conclude that adding teamwork to a unit that already has performance pay and adding performance pay to a unit that already has teamwork does result in a statistically significant increase in absence rate. Furthermore, adding performance pay and teamwork to a unit that has neither is shown to have a significant *positive* effect on absence rate. The size of this effect can be evaluated by computing predicted mean absence rates, using Stata's margins command. The baseline predicted absence rate with no teamwork and no performance pay system is 3.32%. When teamwork and performance pay are introduced together the predicted absence rate rises to 4.01%.

Drawing from a sample of German manufacturing firms, Heywood and Jirjahn (2004) observed that firms using teamwork had lower absence rates. This was attributed to larger costs of absence with teamwork and increased incentives to use monitoring to deter absence and reduce costs. Our results are consistent with Heywood and Jirjahn to some extent since we find that our firm is predicted to experience reduced absenteeism when it introduces teamwork without performance pay.

Our finding of an adverse effect on absenteeism from a combination of human resource policies is a new result to the literature on the effects of such practices on organizational performance. We suggest a hidden cost to

human resource management practices occurs. Teamwork and performance pay appear to promote shirking in the form of absenteeism, compared to a situation in which neither policy is in place. Of course, it is possible that teams can generate spare effort so as to be able to cover absence of teammates and continue the production process without undue disruption. Then shirking and absenteeism can co-exist with higher productivity. Our analysis refers to production units across a particular firm, and there is no reason to expect that results from a panel of firms should correspond to results from a panel of production units within a firm.

One reason for why a combination of performance pay and teamwork leads to increased absenteeism is that, with teamwork, production units can cover for absent colleagues. For example, workers can alternate who takes an unauthorized day of absence each month knowing that colleagues will conceal this from the company. Also, with performance pay, workers have the incentive, as well as the means, to take unauthorized absence as the bonus payment is capped at $140\% \times \text{regular hourly wage} \times \text{average monthly working hours}$. Presence at work, and hence absence rate, is partly a function of the remaining output that is required to reach maximum earnings possible under the bonus cap. It is, therefore, not at all surprising that 75% of all work accidents happen in the first half of each month (when workers are eagerly trying to meet their production targets) while more than 70% of all absence days (net of days lost due to work accidents) occur in the second half of the month (when workers anticipate that they will be able to meet these targets).

Perhaps surprisingly, the combined effects of action programs to increase workplace safety, of providing detailed information and issuing directives, as well as from worker safety trainings turn out to be of minor importance only. The coefficient of the second variable is statistically significant while the other two are insignificant.¹⁵

Table 6 reports estimates of coefficients from a fixed effects ordered logit model of number of accidents and days lost due to accidents. Results in both columns of Table 6 are remarkably similar and consistent. Production units with greater average age of workforce are significantly associated with greater probability of zero days lost through accidents and lower probability of one or more days. This result is consistent with the notion that more experienced production units are more careful, make fewer mistakes, and cause less production disruption through accidents than less experienced units. To some extent, an element of self-selection takes place here in that workers who are perceived to be careless are likely to have been fired, or encouraged to leave, by the company. Moreover, production units that work longer hours are associated with higher probabilities of positive accidents and positive days lost through accidents. The coefficients on teamwork and performance pay, however, are insignificant throughout, whether considered singly or jointly.

¹⁵The implementation of safety programs could have been influenced by a previous change in accident rates. This makes it difficult to reveal an effect of action programs, even in a fixed effects model.

Table 6. Fixed Effects Conditional Logit Coefficients for Probability of Accidents and Days Lost through Accidents

<i>Variable</i>	<i>Accidents</i>	<i>Days lost</i>
Age	-0.080 (2.46)	-0.079 (2.44)
Hours	0.00044 (3.43)	0.00044 (3.09)
Performance pay only	0.161 (0.64)	-0.246 (0.67)
Teamwork only	0.118 (0.30)	0.156 (0.53)
Teamwork with performance pay	0.118 (0.30)	0.082 (0.24)
N of outcomes	4,685	4,685

Notes: Dependent variables are probability of number of accidents and probability of days lost. Estimates are coefficients from fixed effects ordered logit regressions with dummy variables for month and year and with working hours to control for the size of the production units and three factors representing a wide range of safety practices ($n = 15$). Estimates are by Blow up and Cluster procedure in Stata 12; z -values in parentheses.

Since the firm's contributions to the accident insurance fund are experience-rated and increase nearly exponentially with the number of accidents reported, investing in workplace safety is likely to pay off even in our Company X that reports a below average number of accidents per year.

Therefore, performance pay, with or without teamwork, is not significantly related to an increase in accident-related loss of production. Our proposed rationalization of this effect is that accidents in the Company X steel plant are indeed random. The company has succeeded in avoiding systematic causes of accidents attributable to behavior induced by its human resource management policies and is unable to reduce accidents any further, other than by retaining older workers and keeping work hours below excessive levels.

So far we have found that teamwork combined with performance pay raises absence rates while performance pay, with or without teamwork, does not raise the likelihood of disruption to production because of accidents. We turn, finally, to our productivity models. Descriptive evidence of the effects of teamwork and/or performance pay on productivity of units is provided in the box plots displayed in Figures 2 to 5.

Column 1 of Table 7 reveals that realized output increases for units that have performance pay (but not teamwork) by about 1.8% (both output measures are normalized with their respective mean equal to zero).¹⁶ This effect is reinforced when performance pay is combined with teamwork (plus 3.4%). Adding teamwork to a unit that already has performance pay results in significantly greater realized output (p value of 0.002 from a Wald test).

¹⁶The company did not have an explicit performance appraisal system for its production units. If recent changes in unit productivity led management to adopt teamwork for that unit then we may be estimating a spurious relationship between adoption and post-adoption productivity. If adoption decisions were imposed arbitrarily without a formal review of the unit's performance trend then the adoption of a human resource management practice for a given production unit is more likely to be exogenous with respect to that unit. Informal conversations with company managers lead us to this latter view.

Figure 2. Box Plot of Realized Output by Type of Work Organization

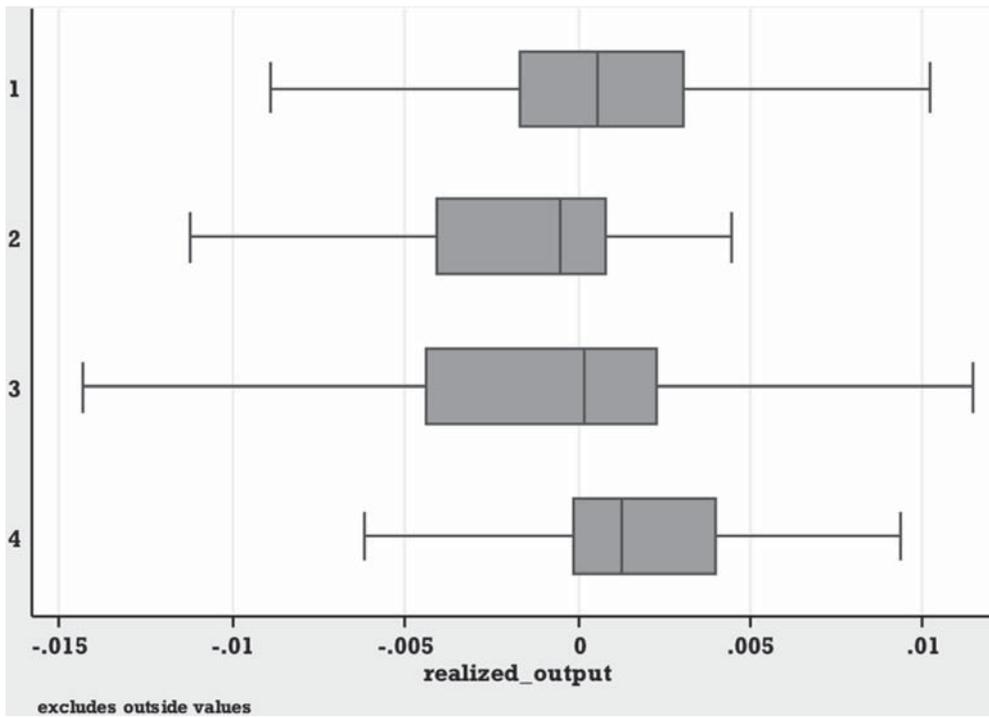


Figure 3. Box Plot of Adjusted Output by Type of Work Organization

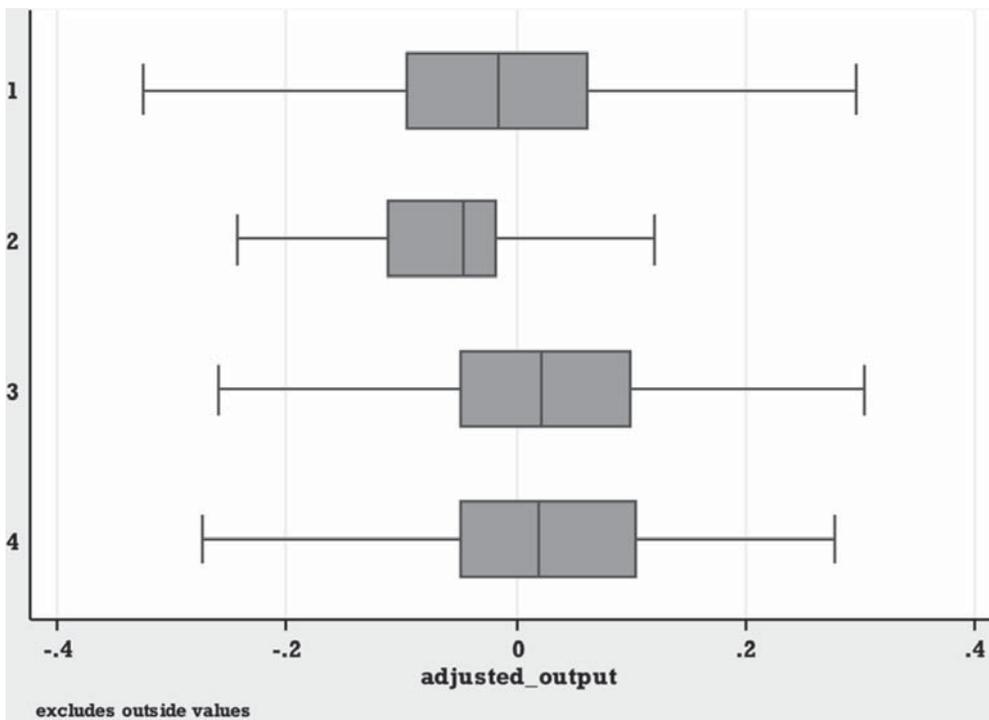
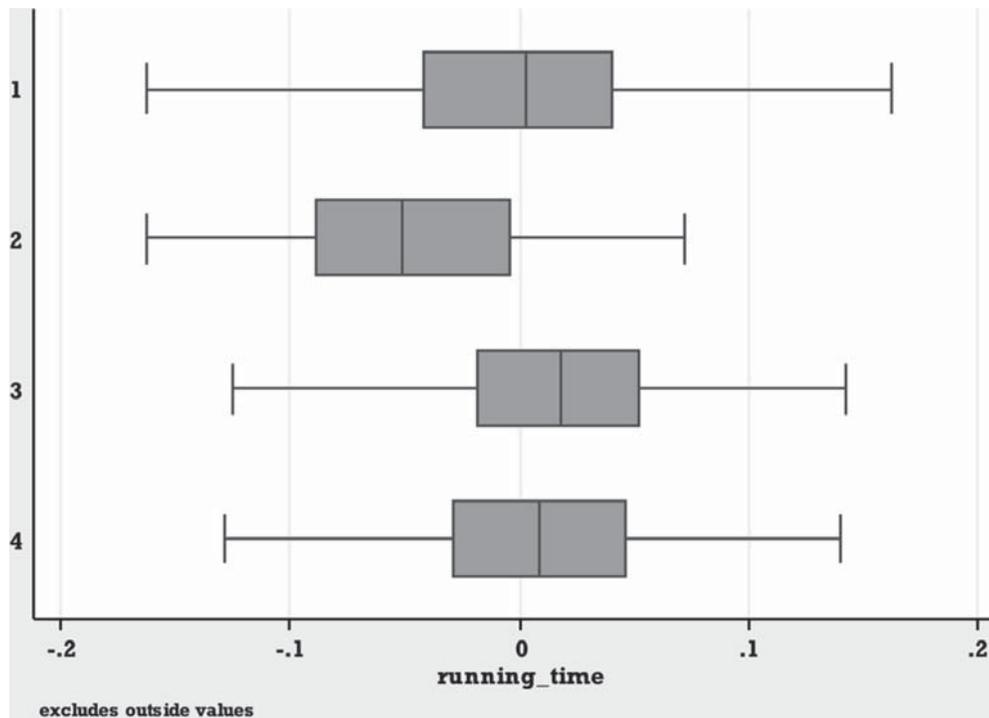


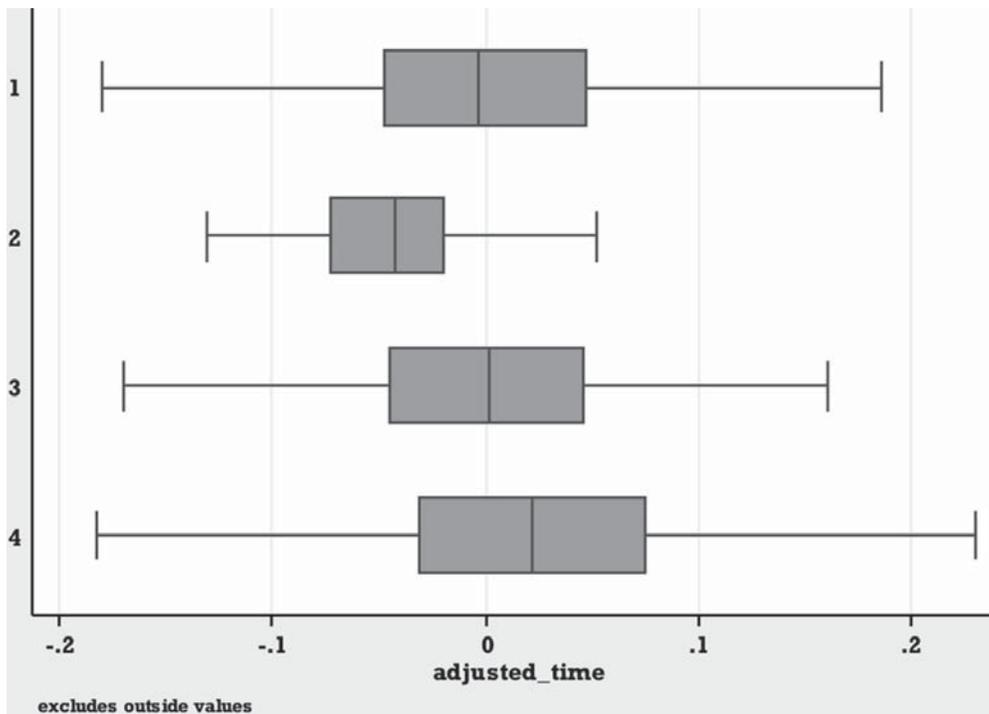
Figure 4. Box Plot of Running Time by Type of Work Organization



On its own, teamwork has no statistically significant impact on realized output. Adding performance-related pay to a unit that has teamwork delivers significantly higher gross output from production units (p value of 0.023). However, when output is adjusted for waste scrap the picture changes radically. Column 2 of Table 7 shows that neither teamwork nor performance pay, nor the combination of the two, deliver significantly greater *adjusted* output. Adding teamwork to a unit with performance pay does not lead to significantly greater adjusted output (p value of 0.117). Similarly, adding performance pay to a unit with teamwork does not result in significantly greater adjusted output (p value of 0.094). Our results here run counter to the findings of Ichniowski et al. (1997) and Boning et al. (2007) for U.S. steel plants; we do not find evidence of genuine productivity gains in our particular German steel company through either teamwork or performance pay or the combination of these.

Column 3 of Table 7 reveals that the application of performance pay on its own is associated with longer machine running times (plus 2.2%; again, both measures are normalized with their mean equal to zero). On its own, teamwork is associated with shorter running time (minus 4.1%). Adding teamwork to a unit with performance pay has no statistically significant impact on operating time (p value of 0.108 from a Wald test). Adjusted running time takes account of down time required for unscheduled maintenance. Correcting for maintenance time (column 4 of Table 7), we find that teamwork, without performance-related pay, is associated with

Figure 5. Box Plot of Adjusted Running Time by Type of Work Organization



where 1 = neither teamwork nor performance pay
 2 = teamwork only
 3 = performance pay only
 4 = teamwork with performance pay

The mean differences of the normalized output and running time measures are always statistically significant:

Realized output: $F = 22.3, p < .01$

Adjusted output: $F = 18.0, p < .01$

Running time: $F = 13.6, p < .01$

Adjusted running time: $F = 3.2, p < .05$

lower adjusted running time (minus 5.4%). Also, adding teamwork to a unit with performance pay leads to a significant loss of adjusted running time. Teamwork combined with performance pay results in adjusted running time of minus 4.1%, compared with absence of each policy.

The 23 additional (and presumably less important) human resource management practices that have been introduced in Company X during the period under investigation and summarized in six different variables derived from factor analysis seem to have no clear-cut impact on either output or running time: While training and reorganization measures, organizational decentralization, and training and evaluation measures have a statistically significant yet economically moderate positive effect on gross output, this effect is statistically significant but negative for the former two variables in the remaining three models (adjusted output, running time, and adjusted running time). The coefficients of evaluation and quality management measures, new performance metrics, and reallocation of technical

Table 7. Impact of Teamwork and Performance Pay on Output and Running Time

<i>Variable</i>	<i>Realized output</i>	<i>Adjusted output</i>	<i>Running time</i>	<i>Adjusted running time</i>
Tenure	0.003 (0.91)	0.033 (3.41)	-0.006 (-1.69)	-0.0011 (-2.02)
Performance pay only	0.018 (3.61)	0.006 (0.35)	0.022 (3.45)	-0.001 (-0.11)
Teamwork only	0.011 (1.18)	-0.023 (-0.72)	-0.041 (-3.35)	-0.054 (-3.02)
Teamwork with performance pay	0.034 (4.99)	0.033 (1.46)	0.011 (1.24)	-0.041 (-2.62)
Factor 1: Training and Reorganization	0.018 (3.03)	-0.044 (-2.18)	-0.022 (-2.84)	-0.034 (-2.64)
Factor 2: Organizational Decentralization	0.013 (2.18)	-0.063 (-3.19)	-0.024 (-3.22)	-0.038 (-3.26)
Factor 3: Training and Evaluation	0.013 (6.92)	0.034 (5.19)	0.013 (5.38)	-0.007 (-1.72)
Factor 4: Evaluation and Quality Management	-0.000 (-0.11)	-0.036 (-5.26)	-0.017 (-6.26)	0.003 (0.64)
Factor 5: New Performance Measures	0.002 (0.95)	0.010 (1.86)	0.011 (4.91)	-0.015 (-2.32)
Factor 6: Reallocation of Technical Staff	-0.001 (-0.44)	-0.015 (-2.01)	-0.019 (-6.51)	-0.008 (-1.83)
R ²	0.080	0.087	0.149	0.098
N	2,673	2,676	2,676	2,006

Notes: Dependent variables are as noted in column headings. Estimates are from fixed effects regressions with dummy variables for month, year, and reconstruction of production sites ($n = 4$) to account for worker accommodation and learning. Controlling for the size of the production units by, e.g., hours of work is not possible because that information is missing in this second data set; t -statistics in parentheses.

staff exhibit a similar inconsistent pattern across the four models (4 out of 12 coefficients are not statistically significant and 6 of the statistically significant 8 coefficients have the “wrong” sign, indicating a negative instead of a positive impact on either output or running time).¹⁷

Overall, the results from Table 7 suggest that teamwork and performance pay provide incentives to workers to raise production quantity at the expense of quality and also serve to run the machines for longer hours instead of spending sufficient time on maintenance. The steel company has used gross output as its measure by which performance pay is calculated and this appears to have been a mistaken policy, because “people respond as strongly to badly designed incentives as they do to well-structured ones. And when those badly designed incentives are strong, they can lead to really egregious

¹⁷Additional estimations (not reported here but available from the authors on request) reveal that, first, the main effects (i.e., teamwork and bonus payments) are statistically insignificant in most cases (6 out of 8 coefficients fail to reach statistical significance) when a linear time trend is introduced in the estimations. Second, interacting the joint effect of teamwork and bonus payments with a linear and a quadratic time trend indicates that in two models (running time and adjusted running time) the effect is initially negative but becomes positive after some “learning period” of 84 and 95 months. This seems to suggest that the costs of implementing certain human resource management practices may have been underestimated so far.

forms of behavior, and the results can then be horrendous” (Roberts 2010: 125).

Conclusions

Our empirical results cast considerable doubt on the alleged benefits to manufacturing firms from teamwork and performance-related pay. In terms of productivity enhancement, we find that gains from these human resource policies disappear once a correction to output is made for non-useable scrap. A quality-adjusted measure of output does not reveal benefits from teamwork or performance-related pay or a combination of the two. Moreover, the impact of these practices on adjusted running time (i.e., running time corrected for unscheduled maintenance work) is again statistically significant and negative. We also found some evidence of hidden costs of a combination of human resource management practices in the form of higher absence rates. Taken together, our results question the benefits of new human resource management practices and suggest that managers should devote greater consideration to potential or actual hidden costs of incentive-based policies.¹⁸ In our case, it appears that individual human resource policies can reduce absenteeism but, either singly or jointly, fail to raise adjusted output.

Interestingly, when our empirical results were shown to Company X, its management expressed surprise and launched an investigation into its human resource management policies. Unfortunately, the company was unwilling to support a follow-up academic study. Nevertheless, it would be desirable to undertake further empirical research to cross-check our findings against data from other companies, in both manufacturing and service sectors, in Germany and elsewhere.

¹⁸We agree with Kalmi, Jones, and Kauhanen (2008: 29) that econometric case studies have higher construct validity and internal validity than competing approaches, but there are doubts about their external validity.

Appendix
Table A.1. Summary of Selected Empirical Studies on the Performance Effects of Incentive Pay^a

<i>Author(s) (Year of publication)</i>	<i>Data</i>	<i>Findings</i>
Banker, Lee, Potter, and Srinivasan (2001)	3,776 sales employees in 10 outlets of a large retail firm (August 1989–January 1992; $n = 14,651$ observations)	Implementation of a performance-based compensation plan leads to an increase in sales per hour and employee of about 4%. More than half (2.4%) of the increase is due to a selection effect (low-performing staff quits), the remaining 1.6% are due to an incentive effect (stayers work harder).
Barro and Beaulieu (2003)	140 doctors employed by a large hospital company in 72 different practices (January 1998–December 1999; $n = 1,243$ doctor-month-observations)	Doctors who switched from a fixed salary to a profit-sharing plan increased their profitability significantly while the least productive doctors left the company. Finally, after implementing the profit-sharing plan, the company attracted new doctors who were on average more productive than those previously employed under the salary contract.
Brooks, May, and Mishra (2001)	175 firms adopting long-term accounting-based performance plans between 1971 and 1989	Announcement of adoption is associated with a positive market reaction. This result, however, is not only compatible with an incentive-alignment explanation but also with a signaling explanation.
Gaynor, Rebitzer, and Taylor (2004)	961 physicians contracting with one health maintenance organization (1994–1997)	Medical expenditures vary significantly with the intensity of the incentive to cut costs. Moreover, high-powered group incentives improve the efficiency in the allocation of resources when the allocation process is based on the professional judgement of peers.
Haley (2003)	7 workers employed at medium-sized strip-cutting firm in the Midwest of the U.S. (January 1997–May 1999)	Workers are paid according to 8 different piece-rate contracts. Depending on the specification of the model, worker's effort response to changes in the piece rate varies between 0.4 and 1.5.
Hansen (1997)	Monthly data on 21 call-center employees (June 1991 through November 1992)	Depending on the specification, worker productivity (measured by minutes spent per call) increased between 10 and 18% after the implementation of a group incentive plan.
Jones, Kalmi, and Kauhanen (2010b)	Weekly data from 4 production lines of a large food-processing plant (January 1999–December 2005; $n = 1,456$ observations)	Addition of performance-related pay to semiautonomous teams leads to a substantial productivity increase in 3 of the 4 lines (ranging from 9–26%) while in the remaining line no change in productivity occurs.
Lazear (2000)	2,755 individuals working as installers, 19-month period (mid 1994–late 1995; $n = 29,837$ observations)	Worker productivity (units-per worker-per day) increased significantly (by about 44%) when the hourly wage was replaced by a piece-rate pay system. Half of this increase is due to the incentive effect (installers work harder), the other half is due to the selection effect (less productive installers leave the firm and are replaced by more productive workers).

continued

Table A.1. Continued

<i>Author(s) (Year of publication)</i>	<i>Data</i>	<i>Findings</i>
Oettinger (1999, 2001)	Daily sales performance of 127 stadium vendors over the entire 1996 baseball season ($n = 3,580$ vendor-game observations)	Depending on the date of their hire, vendors receive different commission rates (high seniority vendors receive 10% more than medium seniority vendors who, in turn, receive 10% more than the most recently hired vendors). Sales of vendors with medium commission are 7% and those of vendors with high commission are 24% higher than those of vendors with low commission. Moreover, labor supply is a function of the commission. Under the piece-rate system gross worker productivity is 23% higher than under the fixed wage regime. Net productivity (taking into consideration only well-planted trees) is 14% higher.
Paarsch and Shearer (1999)	17 workers in a Canadian tree-planting firm in 1991 receiving a piece rate as well as a fixed wage ($n = 979$ observations)	A 1% increase in the piece rate leads to a 2.1% increase in worker productivity. Thus, firm profits would increase by at least 17% if the firm implemented the optimal static contract.
Paarsch and Shearer (2000)	155 tree planters in spring and summer 1994 ($n = 4,578$ observations)	

^aWe report results of longitudinal studies only where the impact of a change in the remuneration system (i.e., from a fixed wage to a performance-related pay system) is analyzed. Studies using cross-sectional data (i.e., comparing the performance of workers under different pay systems in different firms) are not considered (see, inter alia, Brown 1992 and Weiss 1987). Moreover, we also neglect cross-section studies looking at the impact of profit- and/or gain-sharing on firm performance (see, inter alia, Heywood, Jirjahn, and Tsertsvadze 2005).

Table A.2. Summary of Selected Empirical Studies on the Performance Effects of (Semi-) Autonomous Teams^a

<i>Author(s) (Year of publication)</i>	<i>Data</i>	<i>Findings</i>
Banker, Field, Schroeder, and Sinha (1996)	Weekly and monthly data from 4 teams working in an electro-mechanical assembly plant (April 1992–December 1993; $n = 84$ and $n = 355$)	Following the introduction of semiautonomous teams, product quality (measured by the defect rate) and labor productivity increased significantly over time.
Boning, Ichniowski and Shaw (2007)	34 production lines from 19 U.S. steel mills (5-year period during 1990s; $n = 2,355$ monthly observations)	Productivity (tons of steel that meet established quality standards) increases significantly after the introduction of incentive pay and the implementation of problem-solving teams.
Cooke (1994)	841 manufacturing companies in Michigan (1989)	Value added per employee is significantly higher in firms with teamwork and/or group-based incentives (i.e., profit or gain sharing). This positive influence is more pronounced in unionized than in nonunionized companies.
Hamilton, Nickerson, and Owan (2003)	Weekly information on 25 teams employed at a garment manufacturing facility (January 1995–December 1997, $n > 20,000$ person weeks)	On average, an individual worker's productivity increases about 14% after joining a semiautonomous team. High-productivity workers joined teams first. More heterogeneous teams (measured by average productivity of their members) were more productive.
Jones and Kato (2007)	Daily information on 134 manual production workers in a nonunionized subsidiary of a multinational firm with 225 employees (1 January 1999–30 November 2001; $n > 77,000$ observations)	Introduction of teamwork (in June 1999) enhances individual productivity (by about 3%), lowers rejection rate (by about 27%), and increases downtime (by about 25%). All these improvements dissipate over time (at a rate of 10–16% per 100 days in a team).
Knez and Simester (2001)	Monthly data on ground crews at 32 airports served by Continental Airlines (January 1994 through November 1996; $n > 1,000$ observations)	On-time departure performance increased significantly (between 2.8 and 5.6%) after the introduction of a group-based incentive. The autonomous work groups were apparently successful in inducing mutual monitoring (teams consist of 40–60 members).

^aWe report results of longitudinal studies only when the impact of a change in the organization of work is analyzed (i.e., from individuals working on their own to semiautonomous teams). Studies using cross-sectional data (i.e., comparing the performance of employees working individually and those working in teams) are not considered (see, *inter alia*, Belman, Drago, and Wooden 1992; Drago and Garvey 1998; Hunter, MacDuffie, and Doucet 2002). Moreover, we do not look specifically at experimental studies (see, *inter alia*, Nalbantian and Schotter 1997).

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