

Discussion Paper No. 08-012

**Union Density and Varieties of Coverage:
The Anatomy of
Union Wage Effects in Germany**

Bernd Fitzenberger, Karsten Kohn, and
Alexander C. Lembcke

ZEW

Zentrum für Europäische
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Centre for European
Economic Research

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Das Wichtigste in Kürze

Tarifverhandlungen in Deutschland finden entweder auf Branchenebene oder auf Firmenebene statt; die Tarifbindung ist wesentlich höher als der Organisationsgrad der Gewerkschaften; und nicht alle Beschäftigten in einer tarifgebundenen Firma sind tarifgebunden. Diese institutionelle Aspekte legen es nahe, die Effekte der gewerkschaftlichen Macht – gemessen am Organisationsgrad in einem Arbeitsmarktsegment – von der Tarifbindung auf Firmenebene und der Tarifbindung auf individueller Ebene zu unterscheiden.

Standardergebnisse in der Theorie und empirische Ergebnisse in der Literatur lassen erwarten, dass eine Tarifbindung mit höheren Löhnen und geringerer Lohndispersion einhergeht. Jedoch kann es auch Spillover-Effekte (Übertragungseffekte) aus dem tarifgebundenen Bereich in den nicht tarifgebundenen Bereich geben. Einerseits mögen nicht tarifgebundene Firmen höhere Löhne zahlen, um die Organisation einer Gewerkschaft zu verhindern ('union threat effect'). Andererseits mag die Reduktion der Beschäftigung durch höhere Löhne im tarifgebundenen Bereich zu einem erhöhten Arbeitsangebot im nicht tarifgebundenen Bereich führen. Letzteres mag dort einen Lohndruck nach unten auslösen.

Eine Firma kann gleichzeitig tarifgebundene und nicht tarifgebundene Arbeitnehmer beschäftigen. Dies kann daran liegen, dass eine Firma gute Beschäftigte vergleichsweise gut bezahlt oder dass nur hinsichtlich eines Teils der Beschäftigten eine Verpflichtung besteht einen Tarifvertrag anzuwenden. Letzteres kann zum Beispiel der Fall sein, wenn eine Firma den Arbeitgeberverband verlassen hat. Dann gilt der Tarifvertrag noch für die bisherigen Beschäftigten (Bindungswirkung), aber nicht für neu eingestellte Beschäftigte. Ähnliches gilt, wenn die Firma aus einem Zusammenschluß einer bisher tarifgebundenen Firma und einer bisher nicht tarifgebundenen Firma entsteht.

Aufgrund der negativen Koalitionsfreiheit darf ein Tarifvertrag nicht zwischen Gewerkschaftsmitgliedern und Nichtmitgliedern diskriminieren. Daher kann es keinen individuellen Mitgliedschaftseffekt auf Löhne geben. Gleichwohl kann der Organisationsgrad in einem Arbeitsmarktsegment, als Maß für die Verhandlungsstärke der Gewerkschaften, das Ausmaß des Effektes der Tarifbindung beeinflussen. Ein höherer Organisationsgrad verstärkt den lohnerhöhenden Effekt der Tarifbindung, da die Gewerkschaften stärker ihre Präferenzen durchsetzen können. Gleichzeitig beeinflusst der Organisationsgrad auch die Löhne im nicht tarifgebundenen Bereich über die oben erwähnten Spillover-Effekte.

Dies ist die erste empirische Arbeit, die die im Folgenden genannten drei Dimensionen des gewerkschaftlichen Einflusses auf Löhne unterscheidet:

- (1) Tarifbindung durch einen Haustarifvertrag oder durch einen Flächentarifvertrag,

- (2) Tarifbindung der Firma oder individuelle Tarifbindung und
- (3) Organisationsgrad der Gewerkschaften.

Auf Basis eines sehr informativen verknüpften Arbeitnehmer-Arbeitgeber-Datensatzes, der Gehalts- und Lohnstrukturerhebung 2001, schätzt diese Arbeit gleichzeitig die Lohneffekte dieser drei Dimensionen des gewerkschaftlichen Einflusses. Hierzu werden sowohl OLS-Regressionen als auch Quantilsregressionen angewendet.

Ceteris paribus geht ein höherer Anteil von tarifgebundenen Beschäftigten in einer Firma mit höheren Löhnen und geringerer Lohndispersion einher. Dies gilt sowohl für den Flächentarifvertrag als auch für den Haustarifvertrag. Jedoch zeigt individuelle Tarifbindung in einer tarifgebundenen Firma einen negativen Einfluss auf das Lohnniveau. Der negative Einfluss der individuellen Tarifbindung ist stärker im oberen Bereich der Lohnverteilung. Die Tarifbindung reduziert daher die Lohnungleichheit. Die Ergebnisse sind mit der Hypothese vereinbar, dass Firmen einen Tarifvertrag anwenden, um eine transparente Lohnpolitik durchzuführen. Jedoch erhalten Beschäftigte in tarifgebundenen Firmen eine Risikoprämie, wenn sie nicht individuell tarifgebunden sind. Diese Beschäftigten gehören zu den erfolgreicherem Beschäftigten und sind nicht gewerkschaftlich organisiert. Die Löhne dieser erfolgreichen Beschäftigten sind höher in erfolgreichen Firmen, in denen der Effekt der Tarifbindung ebenfalls vergleichsweise hoch ist. Hier sind die Tarifverhandlungen ebenfalls erfolgreich in der Rentenextraktion.

Nach Berücksichtigung der verschiedenen Dimensionen der Tarifbindung finden sich ebenfalls signifikante Effekte des Nettoorganisationsgrades der Gewerkschaften auf das Lohnniveau und die Lohndispersion. Ceteris paribus geht ein höherer Organisationsgrad in einem Arbeitsmarktsegment im Durchschnitt einher mit niedrigeren Löhnen und der Effekt ist am stärksten für nicht tarifgebundene Beschäftigte und im oberen Bereich der Lohnverteilung. Gleichzeitig verstärkt ein höherer Organisationsgrad den Effekt der Tarifbindung auf Firmenebene. Zudem reduziert ein höherer Organisationsgrad die Lohndispersion. Dies ist mit dem Versicherungsmotiv für die Wirkung von Gewerkschaften kompatibel. Der gleichförmige negative Einfluss des Organisationsgrades auf die gesamte Lohnverteilung im nicht tarifgebundenen Bereich erfordert jedoch eine andere Erklärung. Dieses Resultat kann durch einen Rückgang der Investitionen in Reaktion auf einen Anstieg des Organisationsgrades oder durch Lohndruck nach unten in Reaktion auf den Rückgang der Beschäftigung im tarifgebundenen Bereich erklärt werden. Die vorgelegte empirische Analyse erlaubt es jedoch nicht, explizit diese beiden Hypothesen zu testen.

Die Ergebnisse dieser Arbeit verdeutlichen die Notwendigkeit, verknüpfte Arbeitnehmer-Arbeitgeber-Daten zu verwenden. Es ist wichtig, die Charakteristika von Beschäftigten und Firmen zu berücksichtigen, wenn die verschiedenen Dimensionen des Einflusses der Gewerkschaften auf die Löhne untersucht werden sollen. Leider können die hier vorgelegten Schätzungen nicht der offensichtlichen Endogenität des Organisationsgrades und der Tarifbindung Rechnung tragen. Daher können die Ergebnisse nicht als kausale Effekte interpretiert werden. Die hier vorliegenden Querschnittsdaten lassen keine Ausschlussrestriktionen zu. Das Endogenitätsproblem wird jedoch dadurch reduziert, dass in der Analyse sowohl Charakteristika der Beschäftigten als auch Charakteristika der Firmen berücksichtigt werden.

Nontechnical Summary

Collective bargaining in Germany takes place either at the sectoral level or at the firm level; collective bargaining coverage is much higher than union density; and not all employees in a covered firm are necessarily covered. This institutional setup suggests to distinguish explicitly between the effect of union power as measured by net union density in a labor market segment and the effects of coverage at the firm level as well as coverage at the individual level.

Based on standard theoretical results and based on empirical evidence in the literature, one expects that coverage is associated with higher average wages and lower wage dispersion. However, there may also exist spillover effects from the covered sector to the uncovered sector. On the one hand, uncovered firms may pay higher wages to prevent union efforts for coverage in a firm (union threat effect). On the other hand, the reduction of employment caused by higher wages in the covered sector increases labor supply in the uncovered sector, thus resulting in downward pressure on wages there.

Covered and uncovered employees may coexist at the same time in one firm. This may be due to the firm paying particularly high wages to good workers under an individual contract or due to the firm only having to pay part of its workforce according to the wage bargaining contract. The latter may for example occur when the firm leaves the employer association and only has to apply the contract to its incumbent workforce but not to the newly hired or when the firm is a merger of a formerly covered and a formerly uncovered firm.

Because of legal constraints, wage bargaining can not discriminate between union members and nonmembers. Thus, there is no individual membership effect on wages. Nevertheless, the effect of coverage should depend upon union density in a labor market segment, taking union density as an indicator of union bargaining power. It is to be expected that higher union density increases the effects of coverage on wages because a higher union density should move the bargaining outcome closer to union preferences. Furthermore, union density can also affect wages in the uncovered sector because of the aforementioned spillover effects.

This is the first empirical paper which distinguishes the three dimensions of union influence on wages, namely

- (1) coverage by firm-level or industry-wide agreements,
- (2) coverage at the firm level or the individual level, and
- (3) union density.

Using a unique linked employer-employee data set for Germany, the German Structure

of Earnings Survey 2001, and applying both OLS and quantile regressions for wages, we simultaneously analyze the respective effects on the structure of wages.

Ceteris paribus, a higher share of employees in a firm covered by industry-wide or firm-level contracts is associated with higher wages. Yet, individual bargaining coverage in a covered firm *ceteris paribus* shows a negative impact on the wage level. The negative impact of individual coverage is stronger at higher quantiles of the conditional wage distribution. Collective bargaining coverage thus reduces wage inequality. The findings are in line with the hypothesis that firms apply collective agreements in order to follow a transparent wage policy. However, a risk premium is paid to workers in a covered firm who are not paid according to a collective contract, i. e., who are not covered individually. These workers tend to be the more successful workers in the firm and tend not to be unionized. Their wages are determined by negotiations of the individual worker with the firm. The wages of these workers are particularly high in successful firms for which the coverage effect is also high since collective agreements can extract higher rents from the firms.

Having controlled for the varieties of coverage considered, we also find significant effects of net union density on the wage level and on wage dispersion. A higher share of union members in a relevant labor market segment is *ceteris paribus* associated with lower wages, and the effect is strongest among uncovered individuals and at the upper end of the wage distribution. At the same time, a higher union density reinforces the positive wage effects of coverage at the firm level. A higher union density also reduces wage dispersion. This is in line with an insurance motive of union representation. However, the uniform decline of wages in the uncovered sector across the entire wage distribution in response to an increase in union density requires a further explanation. This finding may be due to a decline of firms' capital investment when union density increases, or to downward pressure on wages because of the increase in labor supply in the uncovered sector brought about by higher wages—and thus lower employment—in the covered sector. The analysis does not allow us to distinguish between these two hypotheses.

Our results highlight the importance of using linked employer-employee data in order to control for worker as well as firm characteristics when evaluating the varieties of union effects on wages. Unfortunately, our estimations can not take account of the apparent endogeneity of union density and collective coverage, and so the results should not be interpreted as causal effects. The cross-sectional data do not provide adequate instruments for exclusion restrictions. However, the endogeneity problem is reduced by controlling for both individual and firm characteristics.

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Abstract: Collective bargaining in Germany takes place either at the industry level or at the firm level; collective bargaining coverage is much higher than union density; and not all employees in a covered firm are necessarily covered. This institutional setup suggests to explicitly distinguish union power as measured by net union density (NUD) in a labor market segment, coverage at the firm level, and coverage at the individual level. Using linked employer-employee data and applying quantile regressions, this is the first empirical paper which simultaneously analyzes these three dimensions of union influence on the structure of wages. *Ceteris paribus*, a higher share of employees in a firm covered by industry-wide or firm-level contracts is associated with higher wages. Yet, individual bargaining coverage in a covered firm shows a negative impact both on the wage level and on wage dispersion. A higher union density reinforces the effects of coverage, but the effect of union density is negative at all points in the wage distribution for uncovered employees. In line with an insurance motive, higher union density compresses the wage structure and, at the same time, it is associated with a uniform leftward movement of the distribution for uncovered employees.

Keywords: Union density, collective bargaining coverage, wage structure, quantile regression, linked employer-employee data, Structure of Earnings Survey 2001, Germany.

JEL-Classification: J31, J51, J52.

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1 Introduction

The impact of institutions on economic performance in general, and on wage setting in the labor market in particular, has been under debate for a while (OECD 2006). In times of increasingly heterogeneous economic conditions, it is often argued that institutional rigidities restrain labor market performance and the dynamics of economic development. The discussion often refers to the impact of trade unions, see e.g. the handbook Addison and Schnabel (2003).

The main channel for unions to influence the wage structure is through collective bargaining. In Germany, this influence goes beyond mere negotiation of wage premia for union members since collective agreements on individual membership premia are forbidden by constitutional law. Given the high rate of collective bargaining coverage in the German labor market, union-bargained wages apply to the larger part of all employees and unions influence the wage structure of members as well as of non-members. The design of the German wage-setting system thus offers the possibility to explicitly distinguish the effects of union density and those of collective bargaining coverage. We argue that, on the one hand, net union density as a proxy for union power influences the union's threat point in the collective bargaining process and therefore influences the bargaining outcome. Collective bargaining coverage, on the other hand, captures the actual application of bargained agreements. So density and coverage offer a pre-bargaining and a post-bargaining indicator for unions' influence in the labor market.

The empirical literature on the impact of unions on the German wage structure has so far been confined to using *either* collective bargaining coverage (e.g. Stephan and Gerlach (2003, 2005)) *or* union membership (Fitzenberger and Kohn (2005)). The studies on coverage distinguish between firm-level and industry-wide collective agreements but do not distinguish between firm-level and individual-level coverage by these agreements. Our study extends upon this literature in several dimensions. First, we use a newly available linked employer-employee data set, the German Structure of Earnings Survey (GSES, *Gehalts- und Lohnstrukturerhebung*) 2001, which is unique in the sense that it provides not only firm-level information on collective wage bargaining, but also the coverage status of the individual employees. So not only can we distinguish between different levels of collective bargaining, but also between firm-level and individual-level effects. Second, as there is no information on union membership in the GSES, we impute net union densities for homogeneously defined labor market segments from GSOEP-based estimations of Fitzenberger, Kohn, and Wang (2006). This enables us to simultaneously analyze the effects of union density and collective bargaining coverage. Third, we employ OLS as well

as quantile regressions in order to estimate impacts on wage levels and on wage dispersion.

From a methodological point of view the analysis involves the estimation of the asymptotic distribution of a weighted quantile regression estimator accounting for clustering, as the estimations contain regressors from different levels of aggregation (Angrist, Chernozhukov, and Fernández-Val 2006).

While confirming the need to employ firm-level as well as individual-level data, our results show a positive effect of a firm's decision to apply industry-wide or firm-level contracts on the level of wages. Given the share of covered employees in a firm, however, uncovered employees with individual contracts *ceteris paribus* earn higher wages. Collective bargaining coverage is found to reduce wage inequality. A higher union density reinforces the positive wage effects of coverage. A surprising result is that given coverage status, the effects of net union density on the wage level and on wage dispersion are negative. While striving for more wage equality along the entire wage distribution, powerful unions may even make concessions regarding the average wage level. Furthermore, an increase in wages for covered employees due to union influence may result in a larger labor supply in the uncovered sector, thus resulting in downward wage pressure there. This effect seems to dominate a possible positive union threat effect which may have caused firms in the uncovered sector to also pay higher wages in order to prevent coverage. Overall, our findings on the impact of union density on wage dispersion are in line with an insurance motive of union representation (Agell and Lommerud 1992, Burda 1995). However, the uniform decline of wages in the uncovered sector across the entire wage distribution in response to an increase in union density requires a further explanation. This finding may be due to a decline of investment when union density increases (Vogel 2007) or to downward pressure on wages because of the increase in labor supply in the uncovered sector brought about by higher wages—and thus lower employment—in the covered sector.

The remainder of the paper is organized as follows. Section 2 sketches constituent elements of the German system of collective wage bargaining. Section 3 briefly reviews the related literature on the nature of union wage effects and summarizes existing evidence on the effects of union density and collective bargaining coverage on the German wage structure. Our econometric investigation is presented in section 4. Section 5 concludes.

2 Collective Wage Bargaining in Germany

In Germany, there exist three fundamental regimes of wage bargaining. First, collective bargaining takes place at the industry level between a union and an employers' association. Second, a union can negotiate with single firms to sign firm-level collective contracts.

Third, employers and employees may also negotiate individual contracts. According to the German Collective Bargaining Act (*Tarifvertragsgesetz*), collectively negotiated agreements are necessarily binding for individual job matches only if the firm is a member of an employer association and, in addition, the worker is a union member.

In fact, the scope of collective agreements goes beyond the organized parties. Wages set at the firm level as well as individually bargained wages are adapted towards collective bargaining agreements, be it in order to reduce transaction costs or not to create incentives for employees to join a union. Collective agreements can also be declared generally binding by the Minister for Labor and Social Affairs.¹ In light of the traditionally high coverage, researchers in the past (e.g. Fitzenberger (1999, chapter 6)) often assumed that collective bargaining agreements apply to all employees.

Collective agreements constituting discriminatory wage policies with disadvantages for non-union members are forbidden by constitutional law (negative freedom of association, *negative Koalitionsfreiheit, Grundgesetz Art. 9*). As wage gains from union membership are not internalized, there exists a free-rider problem of missing individual incentives to join a union.² As a result, union density is considerably smaller than collective bargaining coverage. The design of the German wage-setting system thus suggests to distinguish explicitly between the effects (i) of different bargaining regimes, (ii) of bargaining coverage both at the individual and at the firm level, and (iii) of union density in a labor market segment. However, in light of the free-rider problem and of the fact that collective agreements can not discriminate between members and nonmembers, it is not meaningful to estimate a wage premium for individual membership, as done in most studies for the UK or the US (Lewis 1986, Card, Lemieux, and Riddell 2003).

2.1 Union Membership and Union Density

Union membership, which had merely shown some variation with the business cycle in former decades, has been declining steadily during more recent decades (Ebbinghaus (2003); Fitzenberger, Kohn, and Wang (2006)). The early 1980's mark the beginning of a pronounced trend towards deunionization: having started out at a gross union density (GUD, defined as the ratio of union members to the number of employees in the labor

¹The direct impact of this provision used to be of minor relevance—in the year 2003, only 0.8% of all employees subject to social security contributions were covered by agreements which were binding by declaration (BMWA 2004). Yet, the mere possibility of such a declaration constitutes incentives per se; see OECD (1994).

²However, there are additional motives for union membership. The literature discusses selective incentives provided in addition to public goods (Olson 1965), collective-voice mechanisms (Hirschmann 1970), or the existence of social norms (Akerlof 1980, Booth 1985).

market) of about 40%, GUD was down to a historically low level of 27% by the year 2004. Deunionization was interrupted by a unification effect in 1990, when West German unions were very successful in recruiting members in unified Germany. However, the upsurge in aggregate GUD was not sustainable, and deunionization continued even more rapidly in the 1990's and 2000's. Some trade unions have responded to the decline in size by merging (Keller (2005)). However, unions have not been able to reverse the trend (Ebbinghaus (2003); Fichter (1997)).

Union density governs a union's threat point in the collective bargaining process and is therefore pivotal to the bargaining outcome. Fitzenberger and Kohn (2005) argue that net union density, i. e., the share of employed union members among the number of employees, is an appropriate measure for union power. The higher the number of union members paying membership fees, the higher is the union's funding. In case of industrial conflicts, higher financial power enables the union to pay strike benefits for a longer period of time. Financial power and union representation at the shop floor increase individual support for union action, the probability and the length of a strike, and therefore the expected damage inflicted upon employers. Furthermore, financially powerful unions can invest more in public relations in order to sanitize their public image. Yet, financial obligations also increase with the size of the union. Relative financial power is thus mirrored best by the share of contributors among potentially represented workers. Moreover, as union growth comes along with increased heterogeneity within the union, conflicting interests and contradictory statements increasingly undermine the union's representative role; see also Ebbinghaus (2003) and Keller (2005). Thus net union density is preferable as compared to both gross union density and the absolute number of union members.

Net union density (NUD) for homogeneously defined labor market segments can not be inferred from union records and thus has to be estimated. A number of studies estimates individual determinants of union membership based on survey data.³ Estimated membership propensities can then be used to project NUD. Aggregate NUD usually falls short of GUD by about 10 percentage points. Fitzenberger, Kohn, and Wang (2006) report that after German unification, membership in East Germany started out at a higher level than in West Germany but exhibited a stronger decline afterwards. Aggregate NUD for the years 1993 and 2003 were 38% and 19% in East Germany, and 27% and 21% in West Germany.

³Lorenz and Wagner (1991), Fitzenberger, Hageney, and Ernst (1999), Schnabel and Wagner (2003, 2005, 2007), Beck and Fitzenberger (2004), Goerke and Pannenberg (2004), Fitzenberger, Kohn, and Wang (2006).

2.2 Collective Bargaining Coverage

Employees are paid according to individual contracts between the employee and the firm or according to a collective agreement. A collective agreement can be negotiated between a union and an employers' association, a union and a firm, or a works council and a firm. Arrangements between firm and works council are only allowed to govern wages or salaries if the firm is not subject to a collective contract or if the collective contract explicitly allows for this type of arrangement. Firm-level agreements involving a union are allowed to set wages even if a collective agreement exists, as long as the firm-level agreement is more specific than the collective agreement. Collective contracts may also contain opening clauses explicitly allowing deviations from the terms of the contract under particular circumstances.

Collectively negotiated agreements are compulsory only for a minority of job matches. In all other cases, the adoption of a collective contract is the result of two voluntary decisions. First, the firm decides whether to subject itself to collective agreements at all. In the interpretation of Dustmann and Schönberg (2004), firms use collective contracts as a commitment device. At a second stage, the firm and each individual employee agree on whether a collective agreement be applied for individual matches. At this latter stage, different groups of employees are expected to be selected out of collective coverage. On the one hand, high-skilled employees in upper professional status categories such as managers are paid highest wages without reference to a collective agreement. On the other hand, workers with marginal employment contracts and low-skilled employees may not be covered by collective agreements and be paid below the collective level applying for core-group coworkers. As a result, the share of covered workers within a firm is usually below one.

Collective bargaining coverage, as measured by the share of employment contracts following collective agreements, was relatively stable in West Germany until the end of the 1990's but has been declining since. By the year 2003, 45% (70%) of West German firms (employees) were covered by a collective agreement (Schnabel 2005). With 26% (47%) the corresponding coverage in East Germany was considerably lower. The 'erosion' towards more decentralized wage setting is examined by a group of studies using firm-level data,⁴ and it is reconfirmed by survey evidence from works councils discussed in Bispinck and Schulten (2003).

⁴Kohaut and Bellmann (1997), Bellmann, Kohaut, and Schnabel (1999), Kohaut and Schnabel (2003b, 2003a).

3 Union Wage Effects in the Literature

Bargaining models treat the negotiation of wages as a rent-sharing problem, the solution to which depends upon the bargaining power of the negotiating parties. In classical models unions enforce a high wage level for the represented work force. Models such as monopoly unions, right-to-manage models, or efficient bargaining predict a monotonic positive relationship between union power and the level of bargained wages (Farber (1986); Oswald (1985); Naylor (2003)).

Some more recent studies also incorporate effects on higher moments of the wage distribution. Agell and Lommerud (1992) and Burda (1995) focus on wage dispersion and discuss an insurance motive for union membership. Faced with uncertainty of future productivity or wages, risk averse employees a priori have a taste for wage compression. If the income of employees depends upon different states of nature such as demand shocks on the firm's product market (Guiso, Pistaferri, and Schivardi 2005), a union acts as agent of the work force and bargains for a compression of the wage distribution relative to the productivity distribution.⁵ The compression effect is also consistent with search and matching theories (Mortensen and Pissarides 1999). By enforcing 'equal pay for equal work' a union additionally seeks to limit favoritism and discrimination by superiors and colleagues, and to encourage solidarity among the work force; see Freeman (1982).⁶ Ceteris paribus, the degree of wage compression is the higher, the higher the bargaining power of the union.

Yet, risk-reducing insurance or equity considerations come at the price of an insurance premium or discount. If a union has a strong preference for wage equality and also wants to prevent negative employment effects, this effect can overcompensate the union's strive for a higher wage level such that a higher net union density is accompanied by a lower wage level. A priori, the sign of the overall level effect is ambiguous as there is a trade-off between reduced inequality and a higher wage level (Calmfors 1993).

Collective agreements do not constrain a firm's right to pay premia above the wage set in the collective contract. So actual wages may differ substantially from the contractual wage. This aspect is examined by the wage-drift literature and studies related to nominal, notional, or real wage rigidity; see, e.g., Bauer, Bonin, and Sunde (2003) and Pfeiffer (2003). Cardoso and Portugal (2005) analyze the gap between contractual and actual

⁵The reallocation implied by a compressed wage structure can be understood as a substitute for explicit means of redistribution such as taxation; see Agell (1999, 2002).

⁶Though the 'equal pay for equal work' campaign originally focused on equal pay for female employees, it has become a commonplace for all anti-discriminatory policies.

wages for employees covered by different types of collective agreements in Portugal.⁷ They find that the positive effect of union strength—as measured by the share of covered employees—on the level of contractual wages is partly offset by a smaller wage cushion. So higher contractual wages in sectors with a high share of covered employees do not lead to higher actual wages. Besides, firms covered by (multi- or single-) firm-level agreements pay higher wages than firms covered by industry-wide agreements.

At any rate, the impact of unions on the wage structure likely varies across the wage distribution. If collectively bargained wages serve as wage floors, the (conditional) wage distribution is compressed from below. In the wage bargaining model of Büttner and Fitzenberger (2003), for example, efficiency wages are paid in the upper part of a productivity distribution, whereas union-bargained wages above marginal productivity are binding for less productive matches. This is in line with the perception of a union representing mainly less productive employees and striving for higher wages particularly at the lower end of the distribution. Then compression of the wage distribution from below is the higher, the stronger the influence of the union.

3.1 Effects of Membership or Coverage?

The question whether union effects should be attributed to union membership or union recognition, has been discussed in the international literature for some time. Traditionally, union membership on the one hand and union recognition or collective bargaining coverage on the other hand were essentially taken as mere alternative measures; see Lewis' (1986) survey for the US. Differences were regarded as relatively unimportant, in particular for States without right-to-work law. Some more recent studies focus on the question whether coverage and membership have conceptually different impacts, such that there may be a coverage premium as well as a membership premium. Blakemore, Hunt, and Kiker (1986) and Hunt, Kiker, and Williams (1987) argue that a coverage effect at the firm level reflects monopoly power of the negotiating union, whereas individual membership effects stem from socialization in unions as institutions.

Andrews, Stewart, Swaffield, and Upward (1998) review and replicate different approaches to disentangle union wage differentials in the British context, where union members as well as non-members can work in establishments with union recognition. Studies for the UK thus distinguish between three main groups of individual statuses: covered members, covered non-members, and non-covered non-members. Andrews, Stewart, Swaffield, and Upward (1998) conclude that the estimates of membership and coverage

⁷Cardoso and Portugal (2005) refer to this gap as “wage cushion” (p. 877) in order to distinguish it from the notion of wage drift, which traditionally focusses on the change of the gap.

premia are rather sensitive with respect to the chosen specification. By and large, the membership differential should dominate the effects of coverage. However, using a similar modeling framework, but applying panel data estimation technique in order to account for possible endogeneity of union status, Koevoets (2007) finds no evidence for a membership premium nor for a coverage premium in individual wages.

A few studies stress the importance of aggregate union power. Freeman and Medoff (1981) find that the share of organized employees at the industry or State level positively influences individual wages. The share is implemented as either the percentage covered by collective bargaining (in manufacturing) or net union density (in construction). The difference is basically driven by data availability and there is no discussion of conceptual differences. In Schumacher's (1999) analysis the share of free-riders erodes union power and results in lower wages.

Stewart (1987) reckons that wage premia for closed shop regulations as extreme cases of union membership premia may differ depending on the institutional settings in which the bargaining takes place. More generally, the effects of different bargaining regimes are likely to interfere with other country-specific institutions and social norms (Flanagan 1999). For example, Card and de la Rica (2006) find that firm-level contracting in Spain results in higher wages as compared to regional and national contracts, while Hartog, Leuven, and Teulings (2002) report only minor differences between bargaining regimes in the Netherlands as a corporatist country. Analyzing union effects in Italy, Dell'Aringa and Lucifora (1994) find a positive effect of recognition in particular for local bargaining coverage, but also a negative *ceteris paribus* effect for plant-level union density.

Based on our reading of the international empirical literature, three important aspects concerning a differential impact of coverage and membership are ignored. First, the recent literature focuses on union membership and ignores union density in relevant labor market segments. Most papers estimating a differential effect of coverage and membership (Andrews, Stewart, Swaffield, and Upward (1998); Koevoets (2007)) do not allow for a wage effect of membership for uncovered workers. Second, the traditional notion of the 'union threat effect' suggests spillover effects from union activity to non-unionized workers. Firms may pay higher wages to non-unionized workers in order to prevent unionization. In the German context, this suggests that wages should increase with union density also for uncovered workers because the threat of unionization for uncovered firms increases with union density. Third, traditional labor supply spillover effects from the covered to the uncovered sector suggest an opposite spillover effect on wages. If the positive wage effect of coverage increases with union density because higher union density reflects higher bargaining power of the union, then the resulting higher wage will cause lower

employment of certain-type workers in the covered sector of a labor market segment and a higher supply of such workers in the uncovered sector. This higher labor supply may cause a downward pressure of wages in the uncovered sector, thus resulting in a negative relationship between union density and wages in the uncovered sector. Along a similar line, a negative effect of union density on wages in the uncovered sector may result from firms' investment behavior. In segments with strong unions, both covered and uncovered firms may *ceteris paribus* invest less into capital, which in turn would reduce workers' productivity and thus wages in covered as well as in uncovered firms (Vogel 2007).

Concluding, the available studies in the international empirical literature are intrinsically linked to the institutional settings for the country analyzed and rely heavily on the availability of adequate data on union status. Due to institutional differences, results from studies for the US or the UK on the differential effects of coverage and membership are unlikely to be of relevance for the German case. We argue in particular that for Germany one should investigate the effect of union density in the market for a specific type of labor as a proxy for union power, that it is meaningless to investigate wage effects of individual membership,⁸ and that it is useful to analyze also the effect of union density in the uncovered sector. The following paragraphs survey the existing literature for Germany which either studies the effects of union density or the effects of bargaining coverage separately. No paper exists so far which analyzes the wage effects of union density and coverage simultaneously.

3.2 Union Density and the German Wage Structure

There exists only a sparse literature estimating the effects of union density on wages in Germany. Using the union membership projections from Beck and Fitzenberger (2004), which are averaged within labor market cells, Fitzenberger and Kohn (2005) estimate the link between union power—as measured by net union density—and measures of the wage structure within and between labor market cells spanned by the dimensions year of observation, industry, skill-level, and age of the employees. A higher union density is *ceteris paribus* associated with lower within and between-cell wage dispersion as well as with a lower wage level. The results thus corroborate the insurance argument. In line with a minimum wage interpretation of union-bargained wages, the wage distribution is compressed disproportionately from below.

Using similar measures for union density, Büttner and Fitzenberger (1998) analyze the impact of union density on wages when estimating quantile regressions for a regional

⁸This point is also supported by individual-level regressions in Goerke and Pannenberg (2004), who find no significant effect of individual union membership on wages.

wage curve. The study uses local unemployment rates and aggregate unemployment rates in order to distinguish the impact of centralized bargaining and local influences on wages. The results show that a higher union density reduces the wage dispersion. Fitzenberger (1999, chapter 6) estimates a structural model of industry-wide wage bargaining based on a union maximizing a Stone-Geary utility function. The study distinguishes two skill-types of labor and union density is allowed to affect the parameters of the utility function. The results show that, in manufacturing, an increase in union density is associated with a significantly stronger preference for high employment relative to wage levels and relative to a reduction of wage dispersion.

3.3 Bargaining Coverage and the German Wage Structure

If wage policies set in collective agreements reflect unions' objectives, the decisions of firms and individuals to adopt a collective agreement have two effects. First, differences between covered and non-covered segments would increase as the result of the unions' strive for higher wages. Second, wage compression induced through the collective contract would reduce within-segment inequality. The question which effect would prevail has been discussed for some time in the Anglo-Saxon context; see Card, Lemieux, and Riddell (2003). Related literature for Germany again is still sparse.

Dustmann and Schönberg's (2004) analysis reveals that firms applying collective contracts as a commitment device *ceteris paribus* employ a higher share of workers with an apprenticeship degree. Moreover, the employed linked data of the IAB employment statistics and the IAB establishment panel suggest that under collective coverage, employee turnover is higher, wage cuts occur more often, and (conditional) wages have a lower variance.

A couple of studies analyze subsamples of the German Structure of Earnings Survey (GSES, *Gehalts- und Lohnstrukturerhebung*). Using different cross sections (1990, 1995, 2001) of the subsample for Lower-Saxony, Gerlach and Stephan (2002, 2006a, 2006c) report Kernel density estimates of log wage distributions for labor market regimes with and without collective and firm-level wage agreements and estimate firm-level wage regressions. In the manufacturing sector, average hourly wages paid in accordance with a collective or a firm-level agreement are higher than the average of individually negotiated wages. Yet, unconditional as well as conditional wage dispersion is highest among individual contracts. Differences between regimes increased between the years 1990 and 2001. Similar results are obtained by Bechtel, Mödinger, and Strotmann (2004) based on the GSES subsample for Baden-Württemberg. Multi-level regression models in Stephan and Gerlach (2003, 2005) reveal that differences in individual wages are consistent with a higher

base wage in case of collective coverage. Returns to human capital—skill, experience, and tenure—as well as residual wage dispersion are lower under collective coverage. Gerlach and Stephan (2006b) note that collective agreements compress within-firm compensation schemes across occupations. As Heinbach and Spindler’s (2007) analysis of the GSES waves 1995 and 2001 for West Germany shows, wage premia in firms applying collective contracts are the smaller the higher the position in the (unconditional) wage distribution. Their quantile decomposition analysis in the tradition of Machado and Mata (2005) and Melly (2006) reveals that observed differences across the distribution are mainly due to different bargaining (coefficient) effects as opposed to selection effects (differences in characteristics).

In a companion paper also using the GSES 2001, Kohn and Lembcke (2007) analyze wage distributions for various labor market subgroups by means of kernel density estimation, variance decompositions, and individual and firm-level wage regressions. The thrust of findings confirms a priori expectations. Union impact through collective bargaining results in a higher wage level as well as reduced overall and residual wage dispersion. Yet, there is no clear evidence for disproportionate wage compression from below or a wage floor formed by collectively bargained low wage brackets. Moreover, the impacts are considerably heterogeneous across different labor market groups.

Heinbach (2006) merges the GSES subsample for Baden-Württemberg with information on the existence of an opening clause in collective agreements. When distinguishing between collective agreements with and those without opening clauses in firm-level regressions, he finds that mean wages for blue-collar workers in manufacturing are lower under opening clauses, but no significant wage differences exist for white-collar workers. Moreover, no significant differences exist regarding wage dispersion as measured by the standard deviation of wages.

Gürtzgen (2006) uses a longitudinal data set linking the IAB employment statistics and the IAB establishment panel (LIAB), which provides firm-level information on coverage. She concludes that selection effects are responsible for larger parts of observed premia associated with industry and firm-level contracting. Yet, once selection is accounted for, positive premia for industry-wide contracts in West Germany and for firm-level contracts in East Germany remain. The effect of collective bargaining coverage on the returns to observable attributes turns out negligible in her study.

4 Econometric Investigation

The evidence surveyed in the previous section suggests that both coverage by collective bargaining and a higher union density are associated with lower wage dispersion. Coverage is also associated with higher wage levels while the link between union density and the wage level is ambiguous. The effects of sector-wide collective agreements on wage dispersion seems to be stronger than the effect of firm-level agreements. The literature so far does not distinguish between individual coverage and firm-level coverage and results in the literature on coverage are based on firm-level coverage only. Also, there are no results in the literature regarding the joint impact of coverage and union density on wages.

Our paper is the first analysis which distinguishes between the following types of union wage effects in Germany: (i) union density, (ii) coverage by a firm-level collective agreement versus coverage by sector-wide collective agreements, and (iii) firm-level coverage versus individual coverage. We use a unique data set which allows to distinguish both (ii) and (iii), and we use membership projections from Fitzenberger, Kohn, and Wang (2006) to impute union density to our data set. We carefully analyze the interaction effects between the different measures.

We restrict our analysis to West Germany for two reasons. First, union policy in East Germany is strongly aligned to an adaption of West German standards. So wage policies are not set independently but with regard to West German wages. Second, in case of industrial conflicts, union action in East Germany relies on solidarity from West German unions. It is therefore not reasonable to assume that East German unions set their objectives independently.⁹

4.1 Data

Our study is based on the German Structure of Earnings Survey (GSES, *Gehalts- und Lohnstrukturerhebung*) 2001, a cross-sectional linked employer-employee data set containing about 850,000 employees in some 22,000 firms. While missing essentially the public sector, the GSES covers the major part of industry and private services. There are several advantages to using the GSES 2001. It is one of the largest mandatory surveys available for Germany. The sample not only includes workers in regular employment, but also

⁹When the metal working union *IG Metall* went on strike for the equalization of West and East German hours of work in the year 2003, the union had to rely on “strike tourists” from West Germany to fill their ranks. This was deemed “common practice” by union representatives (DIE WELT, 06/23/2003). However, by the time the strike affected West German firms, the solidarity of West German employee representatives declined rapidly, and the strike was finally broken off.

employees in vocational training, marginal employment, or partial retirement schemes. In contrast to earlier GSES waves and to the IAB linked employer-employee data set (LIAB), wages are neither truncated nor censored so that lower and upper parts of the wage distribution can be analyzed precisely. The data are gathered from firms' official reporting obligations. Therefore, they are more reliable than information from individual-level surveys or data not covered by duties of disclosure (Jacobebbinghaus 2002). Most importantly for our investigation, the GSES provides not only firm-level information on bargaining coverage, but the coverage status for each individual worker.

The GSES 2001 has only recently been made available for research. So far, analyses with GSES data have been restricted to administrative use or to regional subsamples (cf. Fitzenberger and Reize (2002, 2003) and the studies cited in section 3.3). For descriptions of the data set see ? and Statistisches Bundesamt (?, ?). We use the on-site-use version of the GSES available in the Research Data Center of the Federal Statistical Office in Wiesbaden. Details on the selection of the data employed in this study are provided in appendix A. We focus on prime-age male employees working full-time and analyze hourly wages for both blue-collar and white-collar workers.¹⁰ Definitions of variables used and summary statistics are displayed in table 1.

Since the GSES does not provide information on union membership, we extend the GSES by imputing individual propensities for union membership from Fitzenberger, Kohn, and Wang (2006), who estimate determinants of union membership using survey data from the German Socio-Economic Panel (GSOEP) for East and West Germany. Net union density (NUD), our measure for union power, is then obtained by means of aggregation at a cell level spanned by the dimensions region (7 states) \times industry (30 sectors) \times skill (4 groups defined by educational attainment) \times age (7 five-year brackets¹¹), yielding a total of 5,841 nonempty cells.

The cell definition is advantageous because it reflects the structure of the German wage bargaining system. The regional dimension and the sector classification account for the fact that collective negotiations take place at the industry level in different bargaining regions (*Tarifbezirke*). The observation that collective agreements further differentiate between various wage groups is captured by the dimensions skill and age. The cell-level aggregation enables us to analyze the effect of union power independent of individual membership. As pointed out above, it would make no sense to estimate individual membership premia.

¹⁰Our analysis combines blue-collar and white-collar workers as unions are assumed to follow one cohesive policy for all represented workers.

¹¹The last age bracket consists only of 55-year-old employees.

4.2 Descriptive Evidence

We focus on the core labor market group of male employees (both blue and white-collar) in West Germany (excluding Berlin) and distinguish the following three regimes of bargaining coverage:

(CC) collective contract negotiated between an employers' association and a union.

(FC) firm-level agreement negotiated between a firm and a union or a works council.

(IC) individual contract negotiated between employee and employer.

The first column of table 2 displays the size of the respective regimes in our GSES sample. The numbers are broadly in line with those in the literature cited above. 57% of West German employees are paid according to a collective contract. With another 8% covered by a firm-level agreement, this leaves about a third of the work force with individual contracts.

Turning to the share of covered employees within firms, figure 1 reveals a bimodal distribution. About 40% of all employees work in firms which do not apply any collective or firm-level agreements at all. Another 7% of employees work in firms with full coverage. This leaves more than one half of all employees in firms with partial coverage which enable us to distinguish between individual and firm-level effects. Among the latter group, firms with relatively high coverage rates dominate.¹²

Table 3 reports summary statistics for cell-level net union density NUD. Whereas the first row reports raw numbers for the cells, the second row provides an employment-weighted measure by summarizing at the individual level.¹³ With respective average NUD of 19 and 23%, net union density is markedly lower than collective bargaining coverage. Again, the numbers match those in the literature.

Columns two to five in table 2 summarize log hourly wages by wage-setting regimes. On average, employees with individual contracts earn the lowest wages (2.786). Wages paid according to a collective agreement are markedly higher (2.810), and the highest wages are paid by firms subject to a firm-level agreement (2.833). Wage dispersion as measured by the standard deviation of log hourly wages is lowest among employees under collective

¹²Note that our analysis does exclude white-collar workers in the highest professional status category who would reasonably be expected to pursue management objectives and who would be paid without reference to collective wage setting.

¹³Note first that the cell dimensions define NUD at a relatively aggregate level. However, NUD is not identical for all employees in a firm. Note second that the statistics at the individual level in table 3 do not summarize imputed individual propensities for union membership, but the assigned cell-level union density.

coverage (0.286) and only slightly higher in case of firm-level contracts (0.314). Employees with individually negotiated wages face a remarkably higher variation (0.420).¹⁴

The descriptive evidence is thus consistent with the considerations in the literature outlined above. Yet, the observed differences in wage levels and wage dispersion are not necessarily caused by the different bargaining regimes. First, they may conceal differences in union power between different labor market segments. Second, they may result from underlying heterogeneity in employee or firm characteristics. Both of these issues are investigated by means of OLS and quantile wage regressions.

4.3 OLS Wage Regressions

We analyze the different channels of union impact on the wage level by means of wage regressions with individual and firm-level controls. Log hourly wage Y are regressed on the set of covariates $X \equiv [Z, F, V]$ including individual worker characteristics Z , firm characteristics F , and a vector of union variables V . The estimates are based on a sample of individuals $i = 1, \dots, N$ in firms $c = 1, \dots, C$. Sampling weights account for different sampling probabilities. Moreover, since our data are sampled with clustering at the firm level and X contains information from different levels of aggregation, the estimated covariance of the estimator $\hat{\beta}$ has to account for clustering (Froot 1989, Moulton 1990, Williams 2000), i.e. standard errors should be consistent with respect to correlation within firms.

The set of possible union variables V contains individual dummy variables for collective contracts (CC) and firm-level contracts (FC), leaving individual contracts as the base category; the shares of employees in each firm covered by a collective contract (SHARECC) or a firm-level contract (SHAREFC); and net union density (NUD) at the cell level. Allowing also for interaction effects between the variables from different levels, a benchmark specification writes

$$\begin{aligned}
Y_{ic} = & \beta_0 + Z_{ic}\beta_Z + F_c\beta_F + CC_{ic}\beta_{V1} + FC_{ic}\beta_{V2} \\
& + SHARECC_c\beta_{V3} + SHAREFC_c\beta_{V4} + NUD_{ic}\beta_{V5} \\
& + CC_{ic} \cdot SHARECC_c\beta_{V6} + FC_{ic} \cdot SHAREFC_c\beta_{V7} \\
& + CC_{ic} \cdot NUD_{ic}\beta_{V8} + FC_{ic} \cdot NUD_{ic}\beta_{V9} \\
& + SHARECC_c \cdot NUD_{ic}\beta_{V10} + SHAREFC_c \cdot NUD_{ic}\beta_{V11} + u_{ic},
\end{aligned} \tag{1}$$

¹⁴More detailed evidence for wage distributions of different groups of employees (men, women working full-time, and women working part-time, separate for blue-collar and white-collar workers in East and West German firms) is provided in the companion paper Kohn and Lembcke (2007).

where β_{V1} to β_{V5} measure base effects, β_{V6} and β_{V7} capture a different nature of individual coverage in high-coverage firms as compared to low-coverage firms, and β_{V8} and β_{V9} allow for the fact that union power may be targeted toward covered employees only. Positive parameters β_{V10} and β_{V11} would indicate that strong unions achieve their wage objective most successfully in high-coverage firms.

Table 4 displays results for different subsets of union variables, using our preferred set of all individual and firm-level covariates.¹⁵ Specification (i), including only dummy variables for individual coverage, yields significant but rather small effects with different signs for collective and firm-level contracts. While employees subject to a collective contract earn 0.9% less than employees with individual contracts, employees with a firm-level contract earn 1.9% more. Results for the shares of covered employees in specification (ii) are different, though. Here, both collective and firm-level contracts show a positive and significant effect, which is in line with comparable firm-level studies reviewed in section 3.3. An increase in the share of employees in a firm covered by a collective (firm-level) contract by 10 percentage points (pp) is associated with a 0.34% (0.67%) increase in wages. Individual coverage and firm-level shares are combined in specification (iii). While the share variables have a pronounced positive effect, individual coverage by firm-level or collective agreement shows negative *ceteris paribus* effects. It therefore proves important to distinguish the effects of individual coverage and firm-level shares of covered employees. The net effects for a covered individual in a firm with full coverage are negative.

Specification (iv) additionally allows for interaction effects, which turn out negative. So individual coverage is particularly detrimental to the individual wage level in firms with a high share of workers covered by a collective agreement. However, this does not hold for firm-level agreements, as the effect of $FC \times SHARE_{FC}$ is small and insignificant. Average partial effects for individual coverage remain negative. For example, the marginal effect for individual coverage by a collective contract, evaluated at the average coverage rate of 0.565, is -10.1% .¹⁶ So an employee in a firm with an average rate of collective coverage *ceteris paribus* earns about 10% less than an uncovered employee in the same firm. In turn, the marginal effect of an increase in the share of covered employees differs between covered and uncovered employees. While both effects are positive, the effect for covered employees is reduced by the interaction term. In combination, the marginal effect for covered employees is a 0.8% wage increase for a 10 pp increase in the share of employees covered by a collective contract, while the wage increase is 1.8% for uncovered employees.

¹⁵For a sensitivity analysis regarding the covariates see table 5 below.

¹⁶ $-0.048 - 0.094 \cdot 0.565 = -0.101$. If not indicated otherwise, illustrative numbers for marginal effects in the following are evaluated at the respective average coverage shares. When interpreting the results of our preferred specification below we explicitly turn to average partial effects.

Specifications (v) to (viii) introduce net union density into the regressions. In all specifications the base effect of net union density has a negative sign and is significant at the 1% level. Moreover, the inclusion of NUD does basically not alter the effects of bargaining coverage. Only the coefficients of CC and FC become slightly more pronounced. Again, we generally find a positive effect of collective coverage at the firm level, but negative ceteris paribus effects of collective bargaining coverage for the individual. In specification (v) the NUD effect takes up the effects of the omitted coverage variables. When coverage effects are included in specification (vi), an increase in NUD of 10 pp is ceteris paribus associated with a decline in wages by about 1%. So either unions put only a small weight on their wage-level objective, or they are not very effective in transforming their power into a wage pay-off. Specification (vii), which additionally allows for interaction of union density and individual coverage, indicates a corresponding decline of about 3% for employees with individual contracts. The positive interaction effects then imply a reduction of only 1% for employees covered by a collective contract, and even a slightly wage-increasing effect of NUD in case of firm-level contracts. So stronger unions achieve higher wages for covered employees only if the bargaining takes place at the firm level. Unions are least effective with respect to—or put least emphasis on—the interests of uncovered employees.

The inclusion of interaction terms between NUD and the coverage shares in specification (viii) does not have additional explanatory power. It neither yields significant coefficients, nor does it raise the R^2 . So we resort to specification (vii) as our preferred specification for further analysis.

Column (c) of table 5 reproduces the results of the preferred specification. In the lower panel of this table we further report average partial effects (APE).¹⁷ The numbers corroborate the above findings. On average, the partial effect of individual coverage is negative, while the firm-level shares of covered employees have a positive effect. This finding would be in line with a risk premium paid to individuals who do not subject themselves to collective bargaining coverage.¹⁸ The APE of net union density is also negative. This result is consistent with an insurance premium in accordance with the insurance motive for union representation as discussed in the literature (Agell and Lommerud 1992, Burda 1995, Fitzenberger and Kohn 2005). Alternatively, it would also

¹⁷The APE of, say, CC is calculated as $\widehat{APE} = \hat{\beta}_{CC} + \hat{\beta}_{CC \times SHARECC} \cdot \overline{SHARECC} + \hat{\beta}_{NUD \times CC} \cdot \overline{NUD}$. With demeaned variables, coefficients could directly be interpreted as average partial effects. However, given our focus to disentangle the different impacts of, say, NUD for covered and for uncovered employees, it is not reasonable to rely on APEs exclusively.

¹⁸Note that our estimations control for a large set of individual and firm characteristics, including, i. a., firm-size and professional status (see table 1). Of course, we can not fully exclude the possibility of selection effects based on unobserved differences within the categories of worker and firm characteristics.

be consistent with the argument that firms in segments with strong unions *ceteris paribus* invest less into capital—which in turn would reduce workers’ productivity and thus their wages (Vogel 2007)—or with the notion that workers who are unemployed because of higher wages in the covered sector put downward pressure on wages in the uncovered sector.

In order to test the sensitivity of our preferred specification with respect to the set of included covariates, table 5 uses our preferred set of union variables and displays the results of specifications including

- (a) no covariates.
- (b) only worker characteristics such as human capital variables (educational attainment, age, tenure) and workplace-related characteristics (region, indicators for shift-work or work on Sundays, etc.).
- (c) worker (see above) and firm characteristics such as size and industry of the firm or average characteristics of the firm’s workforce.¹⁹

Controlling for individual-level and firm-level characteristics notably reduces the partial effects of both collective coverage and net union density, and controls (in cross-sectional wage regressions at least partially) for likely endogeneity issues in union density and coverage. For example, the average partial effect of CC is -9% in specification (c), while it would be -20% in specification (a). For covered employees, the partial effect of SHARECC even changes sign—whereas a higher share of covered employees is associated with a higher wage in specification (c), the effect would be negative in specification (a). The effect of NUD also changes sign between specifications (b) and (c). The latter suggests that the type of endogeneity of NUD differs regarding individual-level and firm-level characteristics. Controlling for individual characteristics increases the estimated NUD coefficients. This result is consistent with NUD being negatively correlated with individual characteristics that tend to be associated with higher wages. Unions tend to represent workers with lower wages. In contrast, controlling for firm-level characteristics reduces the estimated NUD coefficients. This result is consistent with NUD being positively correlated with firm characteristics that tend to be associated with higher wages. The motivation to unionize is larger when there exist rents which could be appropriated from successful firms which tend to pay higher wages.

¹⁹This specification is the same as specification (vii) in table 4. Note that estimating the model with firm-fixed effects is not feasible because the share variables, and in particular the coverage shares, do not vary within a firm.

The findings of the sensitivity analysis highlight the importance of controlling for individual as well as firm-level characteristics to account for these endogeneity issues. The effects of both NUD and bargaining coverage on the level of wages are substantially reduced if the full set of employer-employee information is controlled for. Therefore, for the subsequent quantile regressions, we only report results controlling for both individual and firm-level characteristics.

4.4 Quantile Regression Results

Least squares regressions focus on the wage level (average wage) only. Yet, union effects may be expected to differ across the distribution, reflecting, e. g., union policies targeted specifically towards low-wage earners. This would imply effects on wage dispersion. We analyze differences across the conditional wage distribution by means of quantile regressions, which were introduced by Koenker and Bassett (1978). Analogously to the OLS regressions in the preceding section, sampling weights are employed and inference has to account for clustering. We show in appendix B how to estimate the asymptotic variance $VAR(\hat{\beta}(\tau))$ accounting for weights and cluster effects.²⁰

Table 6 reports quantile regression results for our preferred specification. Again, the upper panel reports regression coefficients and the lower panel the corresponding average partial effects. In general, effects at the median are close to those obtained from least squares estimation, and the estimated coefficients are significant.²¹

The effects of coverage shares at the firm level (both SHARECC and SHAREFC) do not change much across the distribution. So a firm’s decision to apply a collective or a firm-level contract increases wages across the entire distribution in a similar way. However, the negative impact of collective bargaining coverage for the individual is stronger in upper parts of the conditional distribution. While the APE of a collective agreement is -6% at the 10th percentile, it increases up to -12% at the 90th percentile. Therefore, collective coverage at the individual level reduces wage inequality. The adoption of a collective contract is in fact a means to reduce unjustified (as judged on the basis of observable characteristics) pay gaps between employees, thereby encouraging solidarity among the workforce. Since the coverage effect is also negative in the lower part of the wage distribution, there is no evidence for a negative selection out of collective coverage in this part of the distribution. The effect of firm-level agreements on individual wage

²⁰So far, the approach is not standard in econometric software packages such as STATA, the package employed in this paper. Bootstrapping as an alternative way to estimate $VAR(\hat{\beta}(\tau))$ is not feasible due to computational constraints at the Research Data Center.

²¹Only the interaction of FC and SHAREFC is insignificant at all quantiles, as in the OLS regression.

dispersion is also negative, but not as pronounced as that of collective contracts.

The impact of union density also varies markedly across the wage distribution. The negative base effect is strongest at the upper end of the distribution. Yet, the positive interaction effects of NUD and the coverage regimes CC and FC also increase throughout the distribution. Consequently, the differences in the impact of union power on covered and uncovered employees are most severe at the upper end of the distribution. The APE of NUD indicates that, on average, a 10 pp increase in union density comes along with no significant effect at the 10th percentile, and with a significant reduction of 2.4% at the 90th percentile. So in fact, union power reduces wage inequality, which is in line with the insurance motive of union representation discussed in the related literature. However, our findings can not be solely attributed to the insurance motive because then one should find positive wage effects in the lower part of the wage distribution even if the effect on the mean is negative. The uniformly negative effect on wage levels at all quantiles first suggests that negative spillover effects from wage increases and lower employment in the covered sector to the non-covered sector dominate. The hypothesis of a union threat effect is rejected on this ground. Second, firms in labor market segments with strong unions *ceteris paribus* invest less into capital—which reduces labor productivity and wages across the entire distribution (Vogel 2007). We can not discriminate between these two possible explanations.

5 Conclusions

The design of the German wage-setting system suggests to distinguish explicitly between union power as measured by union density and actual bargaining outcomes measured by different regimes of collective bargaining coverage. Using data from the German Structure of Earnings Survey (GSES) 2001, a newly available linked employer-employee data set, we simultaneously analyze both channels of union impact on the structure of wages.

Employing OLS and quantile wage regressions, we find that the firm-level share of employees subject to collective bargaining or firm-level agreements has a positive impact on the average wage—firms which employ a collective contract on average pay higher wages. As Card and de la Rica (2006) reckon, higher wages in firm-level contracts are at least partially a non-competitive phenomenon. Yet, individual bargaining coverage in a covered firm *ceteris paribus* shows a negative impact both on the wage level and on wage dispersion. The negative impact of individual coverage is stronger at higher quantiles of the conditional wage distribution. Collective bargaining coverage thus reduces wage inequality. The findings are in line with the hypothesis that firms apply collective agree-

ments in order to follow a transparent wage policy. However, a risk premium is paid to workers in a covered firm who are not paid according to a collective contract, i. e., to those who are not covered individually. These workers tend to be the more successful workers in the firm and tend not to be unionized. Their wages are determined by negotiations of the individual worker with the firm. Wages of these workers are particularly high in successful firms for which the coverage effect is also high since collective agreements can extract higher rents from the firms.

Having controlled for the varieties of coverage considered, we also find significant effects of net union density on the wage level and on wage dispersion. A higher share of union members in a relevant labor market segment is *ceteris paribus* associated with lower wages, and the effect is strongest among uncovered individuals and at the upper end of the wage distribution. At the same time, a higher union density reinforces the positive wage effects of coverage at the firm level. A higher union density also reduces wage dispersion. This is in line with an insurance motive of union representation. However, the uniform decline of wages in the uncovered sector across the entire wage distribution in response to an increase in union density requires a further explanation. This finding may be due to a decline of firms' capital investment when union density increases (Vogel 2007) or to downward pressure on wages because of an increase in labor supply in the uncovered sector brought about by higher wages—and thus lower employment—in the covered sector. Our analysis does not allow us to distinguish between these two hypotheses, which should be explored in future research.

Our results highlight the importance of using linked employer-employee data in order to control for worker as well as firm characteristics when evaluating union effects. Unfortunately, our estimations can not take account of the apparent endogeneity of union density and collective coverage, and so the results should not be interpreted as causal effects. The cross-sectional data do not provide adequate instruments for exclusion restrictions. Empirical evidence in the literature regarding the endogeneity of union status variables is ambiguous; see Robinson (1989), Card (1996), and DiNardo and Lee (2004). However, the endogeneity problem in our study is reduced by controlling for both individual and firm characteristics. Future research might explore further the interaction of unions and collective bargaining with country-specific institutions (Addison, Teixeira, and Zwick (2006), Hübler and Jirjahn (2003), and Klikauer (2004)).

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A German Structure of Earnings Survey 2001

The German Structure of Earnings Survey (GSES, *Gehalts- und Lohnstrukturerhebung*) 2001 is a linked employer-employee data set administered by the German Statistical Office in accordance with European and German law (European Council Regulation (EC) No 530/1999, amended by EC 1916/2000; German Law on Wage Statistics, *LohnStatG*). It is a sample of all firms in manufacturing and private service sectors with at least ten employees. Sampling takes place at the firm or establishment level. At a first stage, firms are randomly drawn from every Federal State, where the sampling probability varies between 5.3% for the largest state (North Rhine-Westphalia) and 19.4% for the smallest (Bremen). At the second stage, employees are randomly chosen from the firms sampled at the first stage. The share of employees sampled depends upon the firm size and ranges between 6.25% for the largest firms and 100% for firms with less than 20 employees. The data set provides sampling weights.

The GSES 2001 is available for on-site use at Research Centers of the Federal States' Statistical Offices (FDZ) since the year 2005. This study uses an anonymized use-file which includes all firms and employees from the original data except for one firm in Berlin (the only firm in Berlin falling into NACE section C). Regional information is condensed to 12 "states", and some industries have been aggregated at the two-digit level. Overall, the use-file consists of 22,040 sites with 846,156 sampled employees.

We focus on prime-age (25–55-year-old) male full-time employees in West Germany (without Berlin), including both blue and white-collar workers. Employees in vocational training, interns, and employees subject to partial retirement schemes are left out because compensation for these groups does not follow the regular compensation schedule, but special regulations or even special collective bargaining agreements do apply. We also exclude white-collar workers in the highest professional status category (category 1) who can reasonably be expected to pursue management objectives and whose wages are hardly in the focus of collective wage setting. Individuals who worked less than 90% of their contractual working hours in October 2001 and individuals paid subject to a collective contract with a missing identification number for the agreement are dropped.

Part-time and full-time employees are distinguished based on the employer's assessment recorded in the GSES. For blue-collar workers, actual working time and not contractual working time is relevant for monthly payments. We exclude individuals with an actual working time of more than 390 hours in October 2001.

We analyze gross hourly wages including premia. This measure is more appropriate than wages without premia if premia are paid on a regular basis. We impose a lower

bound of one euro for hourly wages.

B Standard Errors for Quantile Regression with Sampling Weights and Clustering

The asymptotic distribution of $\beta(\tau)$ for a given quantile τ in a non-iid setting is

$$\sqrt{N}(\hat{\beta}(\tau) - \beta(\tau)) \sim N(0, J(\tau)^{-1}\Sigma(\tau)J(\tau)^{-1}) \quad (2)$$

with

$$\Sigma(\tau) \equiv E[(\tau - \mathbf{1}\{Y < X'\beta(\tau)\})^2 XX'] \quad (3)$$

and

$$J(\tau) \equiv E[f_y(X'\beta(\tau)|X)XX'] = E[f_u(0|X)XX'], \quad (4)$$

assuming a correctly specified model (Angrist, Chernozhukov, and Fernández-Val 2006). f_u denotes the density of the error term; compare Hendricks and Koenker (1992), Koenker (2005), and Melly (2006).

We estimate $VAR(\hat{\beta}(\tau))$ by

$$\widehat{VAR}(\hat{\beta}(\tau)) = \frac{1}{N}\hat{J}(\tau)^{-1}\hat{\Sigma}(\tau)\hat{J}(\tau)^{-1} \quad (5)$$

with

$$\hat{\Sigma}(\tau) = \frac{1}{N}\sum_{i=1}^N(\tau - \mathbf{1}\{Y_i < X_i'\hat{\beta}(\tau)\})^2 X_i X_i' \quad (6)$$

and

$$\hat{J}(\tau) = \frac{1}{N}\sum_{i=1}^N \hat{f}_i X_i X_i' \quad (7)$$

for the case without weights and without clustering. We use the ‘‘Hendricks-Koenker sandwich’’

$$\hat{f}_i = 2h_N / (X_i'(\hat{\beta}(\tau + h_N) - \hat{\beta}(\tau - h_N))) \quad (8)$$

and employ Hall and Sheater’s (1988) rule for the bandwidth h_N :

$$h_N = \frac{1}{N^{1/3}} z_\alpha^{2/3} [1.5s(\tau)/s''(\tau)]^{1/3}, \quad (9)$$

where z_α satisfies $\Phi(z_\alpha) = 1 - \alpha/2$ for the construction of $1 - \alpha$ confidence intervals and $s(\tau)$ denotes the sparsity function.²² As in Koenker (1994), we use the normal distribution to estimate

$$s(\tau)/s''(\tau) = \frac{f^2}{2(f'/f)^2 + [(f'/f)^2 - f''/f]} = \frac{\phi(\Phi(\tau)^{-1})^2}{2(\Phi(\tau)^{-1})^2 + 1}. \quad (10)$$

In analogy to Angrist, Chernozhukov, and Fernández-Val (2004), we take account of sampling weights by replacing (6) with

$$\hat{\Sigma}(\tau) = \frac{1}{N} \sum_{i=1}^N w_i^2 (\tau - \mathbf{1}\{Y_i < X_i' \hat{\beta}(\tau)\})^2 X_i X_i' \quad (11)$$

and (7) with

$$\hat{J}(\tau) = \frac{1}{N} \sum_{i=1}^N w_i \hat{f}_i X_i X_i'. \quad (12)$$

Clustering allows for dependence of observations within clusters (see Froot (1989), Moulton (1990), or Williams (2000) for the case of OLS). We take account of clustering at the firm level and acknowledge that the sampling weights in the GSES are equal for all individuals $i = 1, \dots, N_c$ within a cluster c . With sampling weights w_c normalized to sum to one, $\sum_{c=1}^C w_c = 1$, (11) and (12) generalize to

$$\hat{\Sigma}(\tau) = \frac{1}{N} \sum_{c=1}^C w_c^2 \sum_{i=1}^{N_c} \sum_{j=1}^{N_c} X_{ic} (\tau - \mathbf{1}\{Y_{ic} < X_{ic}' \hat{\beta}(\tau)\}) (\tau - \mathbf{1}\{Y_{jc} < X_{jc}' \hat{\beta}(\tau)\}) X_{jc}' \quad (13)$$

and

$$\hat{J}(\tau) = \frac{1}{N} \sum_{c=1}^C w_c \sum_{i=1}^{N_c} \hat{f}_{ic} X_{ic} X_{ic}'. \quad (14)$$

²²The sandwich formula is extensively described in Koenker (2005, pp. 79–80). Koenker also mentions the “Powell sandwich”, which is employed by, e. g., Angrist, Chernozhukov, and Fernández-Val (2006).

C Tables and Figures

Table 1: Definition of Variables

Label	Description	mean	std. dev.
Individual Level			
AGE	Age in years/10.	3.963	0.799
AGESQ	AGE squared.	16.34	6.441
TENURE	Tenure in years/10.	0.924	0.923
TENURESQ	TENURE squared.	1.705	2.716
LOW_EDUC	Low level of education: no training beyond a school degree (or no school degree at all).	0.144	0.351
MED_EDUC	Intermediate level of education: vocational training.	0.679	0.467
HIGH_EDUC	High level of education: university or technical college degree.	0.108	0.311
NA_EDUC	Missing information on the level of education.	0.069	0.253
BC_STAT1	Blue-collar worker, professional status category 1: vocationally trained or comparably experienced worker with special skills and highly involved tasks.	0.119	0.323
BC_STAT2	Blue-collar worker, professional status category 2: vocationally trained or comparably experienced worker.	0.225	0.418
BC_STAT3	Blue-collar worker, professional status category 3: worker trained on-the-job.	0.156	0.363
BC_STAT4	Blue-collar worker, professional status category 4: laborer.	0.084	0.277
WC_STAT2	White-collar worker, professional status category 2: executive employee with limited procuration.	0.162	0.369
WC_STAT3	White-collar worker, professional status category 3: employee with special skills or experience who works on his own responsibility on highly involved or complex tasks.	0.103	0.303
WC_STAT4	White-collar worker, professional status category 4: vocationally trained or comparably experienced employee who works autonomously on involved tasks.	0.104	0.305
WC_STAT5	White-collar worker, professional status category 5: vocationally trained or comparably experienced employee working autonomously.	0.040	0.196
WC_STAT6	White-collar worker, professional status category 6: employee working on simple tasks.	0.008	0.087
NIGHT	Individual worked night shifts.	0.228	0.436
SUNDAY	Individual worked on Sundays or on holidays.	0.153	0.391
SHIFT	Individual worked shift.	0.147	0.354
OVERTIME	Individual worked overtime.	0.264	0.441
Firm Level			
S_FEM	Share of female employees.	0.325	0.241
S_AGE1	Share of employees of age 20 or younger.	0.041	0.067
S_AGE2	Share of employees of age 21–25.	0.078	0.075
S_AGE3	Share of employees of age 26–30.	0.096	0.074
S_AGE4	Share of employees of age 31–35.	0.145	0.082
S_AGE5	Share of employees of age 36–40.	0.174	0.069
S_AGE6	Share of employees of age 41–45.	0.143	0.076
S_AGE7	Share of employees of age 46–50.	0.121	0.075

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... table 1 continued

Label	Description	mean	std. dev.
S_AGE8	Share of employees of age 51–55.	0.103	0.073
S_AGE9	Share of employees of age 56–60.	0.068	0.063
S_AGE10	Share of employees of age 61 or older.	0.042	0.056
S_TENURE1	Share of employees with less than 1 year of tenure.	0.162	0.157
S_TENURE2	Share of employees with 1–2 years of tenure.	0.205	0.150
S_TENURE3	Share of employees with 3–5 years of tenure.	0.150	0.125
S_TENURE4	Share of employees with 6–10 years of tenure.	0.168	0.120
S_TENURE5	Share of employees with 11–15 years of tenure.	0.117	0.097
S_TENURE6	Share of employees with 16–20 years of tenure.	0.064	0.072
S_TENURE7	Share of employees with 21–25 years of tenure.	0.055	0.068
S_TENURE8	Share of employees with 26–30 years of tenure.	0.039	0.059
S_TENURE9	Share of employees with 31 or more years of tenure.	0.038	0.062
S_LOW_EDUC	Share of employees with LOW_EDUC.	0.198	0.194
S_MED_EDUC	Share of employees with MED_EDUC.	0.639	0.227
S_HIGH_EDUC	Share of employees with HIGH_EDUC.	0.072	0.136
S_NA_EDUC	Share of employees with NA_EDUC.	0.113	0.229
HOURSWORKED	Average hours worked in the firm.	154.2	23.7
S_IRREG	Share of employees for whom any of NIGHT, SUNDAY, or SHIFT applies.	0.178	0.232
S_OVERTIME	Share of employees working overtime.	0.178	0.260
S_BC	Share of blue collar workers.	0.478	0.327
S_NOT_FT	Share of employees who do not work full-time.	0.224	0.212
FIRMSIZE1	Firm has between 10 and 49 employees.	0.416	0.493
FIRMSIZE2	Firm has between 50 and 249 employees.	0.350	0.477
FIRMSIZE3	Firm has between 250 and 499 employees.	0.109	0.312
FIRMSIZE4	Firm has between 500 and 999 employees.	0.073	0.260
FIRMSIZE5	Firm has between 1000 and 1999 employees.	0.040	0.195
FIRMSIZE6	Firm has 2000 or more employees.	0.020	0.140
SECTOR1	Mining and quarrying (NACE: 10–14)	0.011	0.105
SECTOR2	Manufacture of food products, beverages and tobacco (NACE: 15–16)	0.034	0.181
SECTOR3	Manufacture of textiles and textile products; leather and leather products (NACE: 17–19)	0.019	0.138
SECTOR4	Manufacture of wood and wood products; pulp, paper and paper products (NACE: 20–21)	0.033	0.179
SECTOR5	Publishing, printing and reproduction of recorded media (NACE: 22)	0.036	0.186
SECTOR6	Manufacture of coke, refined petroleum products and nuclear fuel; chemicals and chemical products (NACE: 23–24)	0.027	0.162
SECTOR7	Manufacture of rubber and plastic products (NACE: 25)	0.033	0.178
SECTOR8	Manufacture of other non-metallic mineral products (NACE: 26)	0.028	0.164
SECTOR9	Manufacture of basic metals; fabricated metal products, except from machinery and equipment (NACE: 27–28)	0.055	0.229
SECTOR10	Manufacture of machinery and equipment n.e.c. (NACE: 29)	0.045	0.207
SECTOR11	Manufacture of electrical machinery and apparatus n.e.c. (NACE: 31)	0.025	0.157
SECTOR12	Manufacture of electrical and optical equipment; radio, television, and communication equipment and apparatus (NACE: 30 + 32)	0.021	0.144

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... table 1 continued

Label	Description	mean	std. dev.
SECTOR13	Manufacture of medical, precision and optical instruments, watches and clocks (NACE: 33)	0.023	0.149
SECTOR14	Manufacture of transport equipment (NACE: 34–35)	0.032	0.176
SECTOR15	Manufacture n.e.c. (NACE: 36–37)	0.024	0.154
SECTOR16	Electricity, gas and water supply (NACE: 40–41)	0.025	0.155
SECTOR17	Construction (NACE: 45)	0.082	0.274
SECTOR18	Sale, maintenance and repair of motor vehicles and motorcycles; retail sale of automotive fuel (NACE: 50)	0.031	0.173
SECTOR19	Wholesale trade and commission trade except of motor vehicles and motorcycles (NACE: 51)	0.056	0.231
SECTOR20	Retail trade, except from motor vehicles and motorcycles; repair of personal and household goods (NACE: 52)	0.050	0.219
SECTOR21	Hotels and restaurants (NACE: 55)	0.027	0.161
SECTOR22	Land transport; transport via pipelines; air transport (NACE: 60 + 62)	0.028	0.165
SECTOR23	Water transport (NACE: 61)	0.008	0.088
SECTOR24	Supporting and auxiliary transport activities; activities of travel agencies (NACE: 63)	0.044	0.204
SECTOR25	Post and telecommunications (NACE: 64)	0.023	0.150
SECTOR26	Financial intermediation, except from insurance and pension funding; activities auxiliary to financial intermediation, except from insurance and pension funding (NACE: 65 + 67.1)	0.022	0.148
SECTOR27	Insurance and pension funding, except compulsory social security; activities auxiliary to insurance and pension funding (NACE: 66 + 67.2)	0.016	0.126
SECTOR28	Real estate activities; renting of machinery and equipment without operator and of personal and household goods (NACE: 70–71)	0.015	0.123
SECTOR29	Computer and related activities (NACE: 72)	0.022	0.146
SECTOR30	Research and development; other business activities (NACE: 73–74)	0.075	0.264
PUBLIC1	Firm is privately owned.	0.923	0.267
PUBLIC2	Firm is partly public-owned (<50%).	0.021	0.144
PUBLIC3	Firm is mainly public-owned (>50%).	0.056	0.230
REGION1	Firm is located in Schleswig-Holstein or Hamburg.	0.106	0.308
REGION2	Firm is located in Lower Saxony or Bremen.	0.158	0.365
REGION3	Firm is located in North Rhine-Westphalia.	0.203	0.402
REGION4	Firm is located in Hesse.	0.105	0.306
REGION5	Firm is located in Rhineland-Palatinate or Saarland.	0.104	0.305
REGION6	Firm is located in Baden-Württemberg.	0.158	0.365
REGION7	Firm is located in Bavaria.	0.166	0.372

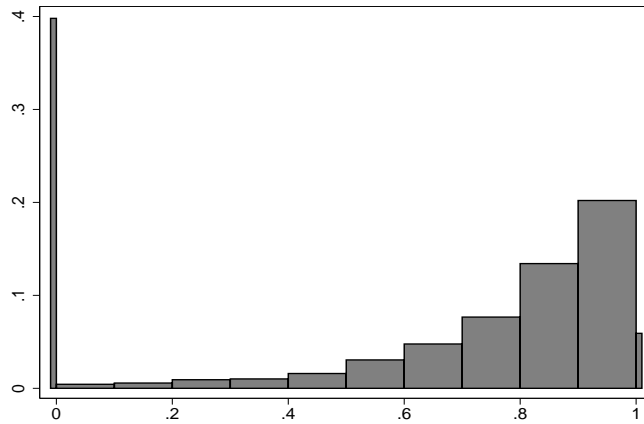
Data source: Extended GSES 2001.

Table 2: Wage Setting Regimes and Wages

regime	coverage share	log hourly wages			
		mean	min	max	std. dev.
collective coverage (CC)	0.565	2.810	0.056	4.700	0.286
firm-level coverage (FC)	0.075	2.833	1.434	4.754	0.314
individual contract (IC)	0.360	2.786	0.046	5.097	0.420
total		2.804	0.046	5.097	0.343
N	316,805				

Log hourly wages (in Euros). Data source: Extended GSES 2001.

Figure 1: Bargaining Coverage Within Firms



Histogram: Share of employees covered by collective or firm-level contracts as fraction of firm's total employment. Data source: Extended GSES 2001.

Table 3: Net Union Density

	mean	min	max	std. dev.	#
Cells	0.188	0	0.500	0.101	5,841
Employees	0.228	0	0.500	0.102	316,805

Data source: Extended GSES 2001.

Table 4: Wage Regressions I: Different Measures of the Wage Setting System

variable	(i)		(ii)		(iii)		(iv)		(v)		(vi)		(vii)		(viii)	
	coef.	std. dev.	coef.	std. dev.	coef.	std. dev.	coef.	std. dev.	coef.	std. dev.	coef.	std. dev.	coef.	std. dev.	coef.	std. dev.
CC	-0.009*	(0.004)			-0.107**	(0.006)	-0.048**	(0.011)			-0.107**	(0.006)	-0.082**	(0.012)	-0.085**	(0.005)
FC	0.019*	(0.010)			-0.095**	(0.013)	-0.081**	(0.031)			-0.094**	(0.013)	-0.149**	(0.033)	-0.070**	(0.026)
SHARECC			0.034**	(0.005)	0.148**	(0.008)	0.176**	(0.009)			0.147**	(0.008)	0.171**	(0.008)	0.172**	(0.008)
SHAREFC			0.067**	(0.011)	0.169**	(0.017)	0.165**	(0.018)			0.168**	(0.016)	0.165**	(0.018)	0.159**	(0.018)
SHARECC×CC							-0.094**	(0.015)					-0.096**	(0.015)	-0.097**	(0.015)
SHAREFC×FC							-0.012	(0.044)					-0.031	(0.043)	-0.021	(0.041)
NUD									-0.458**	(0.142)	-0.111*	(0.048)	-0.296**	(0.055)	-0.304**	(0.051)
NUD×CC													0.203**	(0.032)	0.193**	(0.045)
NUD×FC													0.367**	(0.068)	0.496**	(0.100)
NUD×SHARECC															0.027	(0.062)
NUD×SHAREFC															-0.135	(0.119)
R ²	0.703		0.705		0.709		0.709		0.703		0.709		0.710		0.710	
N	316,805		316,805		316,805		316,805		316,805		316,805		316,805		316,805	

Regressions include a full set of worker and firm characteristics. Estimation by OLS, observations weighted by inverse sampling probabilities. Clustered standard errors in parentheses. */ **: significance at the 5% / 1% level. Data source: Extended GSES 2001.

Table 5: Wage Regressions II: Different Sets of Covariates

	(a)		(b)		(c)≡(vii)	
	coef.	std. dev.	coef.	std. dev.	coef.	std. dev.
CC	0.030	(0.033)	-0.057**	(0.018)	-0.082**	(0.012)
FC	-0.169*	(0.074)	-0.121**	(0.045)	-0.149**	(0.033)
SHARECC	0.708**	(0.015)	0.227**	(0.009)	0.171**	(0.008)
SHAREFC	0.644**	(0.033)	0.185**	(0.020)	0.165**	(0.018)
SHARECC×CC	-0.781**	(0.043)	-0.160**	(0.018)	-0.096**	(0.015)
SHAREFC×FC	-0.454**	(0.073)	-0.075	(0.047)	-0.031	(0.043)
NUD	-0.783**	(0.057)	0.213**	(0.040)	-0.296**	(0.055)
NUD×CC	0.812**	(0.071)	0.296**	(0.059)	0.203**	(0.032)
NUD×FC	0.783**	(0.171)	0.453**	(0.118)	0.367**	(0.068)
Controls						
individual characteristics	no		yes		yes	
firm-level characteristics	no		no		yes	
R ²	0.143		0.660		0.710	
N	316,805		316,805		316,805	
Average Partial Effects						
CC	-0.200**	(0.009)	-0.075**	(0.006)	-0.087**	(0.005)
FC	-0.025	(0.052)	-0.025	(0.030)	-0.068*	(0.028)
SHARECC	0.266**	(0.018)	0.137**	(0.009)	0.117**	(0.009)
SHAREFC	0.610**	(0.033)	0.179**	(0.019)	0.162**	(0.016)
NUD	-0.265**	(0.038)	0.414**	(0.045)	-0.154**	(0.048)

Regressions by OLS, observations weighted by inverse sampling probabilities. Upper panel: regression coefficients. Lower panel: corresponding average partial effects. Clustered standard errors in parentheses. * / **: significance at the 5% / 1% level. Data source: Extended GSES 2001.

Table 6: Wage Regressions III: Quantile Regressions

Percentile	(10)		(25)		(50)		(75)		(90)	
	coef.	std. dev.	coef.	std. dev.	coef.	std. dev.	coef.	std. dev.	coef.	std. dev.
CC	-0.035*	(0.016)	-0.049**	(0.011)	-0.071**	(0.012)	-0.105**	(0.013)	-0.124**	(0.018)
FC	-0.104**	(0.033)	-0.135**	(0.029)	-0.157**	(0.031)	-0.169**	(0.034)	-0.183**	(0.047)
SHARECC	0.168**	(0.009)	0.184**	(0.009)	0.188**	(0.008)	0.176**	(0.009)	0.158**	(0.013)
SHAREFC	0.129**	(0.027)	0.170**	(0.018)	0.173**	(0.015)	0.159**	(0.014)	0.131**	(0.035)
SHARECC×CC	-0.104**	(0.019)	-0.117**	(0.014)	-0.109**	(0.014)	-0.094**	(0.016)	-0.074**	(0.022)
SHAREFC×FC	0.002	(0.050)	-0.035	(0.036)	-0.030	(0.036)	-0.025	(0.037)	-0.010	(0.065)
NUD	-0.173**	(0.057)	-0.223**	(0.039)	-0.256**	(0.045)	-0.315**	(0.056)	-0.391**	(0.086)
NUD×CC	0.149**	(0.040)	0.151**	(0.028)	0.155**	(0.029)	0.210**	(0.035)	0.209**	(0.051)
NUD×FC	0.199**	(0.061)	0.278**	(0.065)	0.349**	(0.075)	0.417**	(0.084)	0.489**	(0.074)
N	316,805		316,805		316,805		316,805		316,805	
Average Partial Effects										
CC	-0.056**	(0.007)	-0.077**	(0.006)	-0.094**	(0.006)	-0.107**	(0.006)	-0.116**	(0.008)
FC	-0.059*	(0.029)	-0.076**	(0.023)	-0.081**	(0.024)	-0.078**	(0.024)	-0.074	(0.042)
SHARECC	0.109**	(0.011)	0.117**	(0.008)	0.126**	(0.008)	0.123**	(0.009)	0.117**	(0.012)
SHAREFC	0.129**	(0.025)	0.168**	(0.016)	0.171**	(0.014)	0.157**	(0.013)	0.131**	(0.033)
NUD	-0.074	(0.044)	-0.117**	(0.032)	-0.142**	(0.040)	-0.165**	(0.049)	-0.237**	(0.074)

Regressions include a full set of worker and firm characteristics. Quantile regression, observations weighted by inverse sampling probabilities. Upper panel: regression coefficients. Lower panel: corresponding average partial effects. Clustered standard errors in parentheses; see appendix B for details of the implementation. */ **: significance at the 5% / 1% level. Data source: Extended GSES 2001.