

## **Expensive and low-price places to live**

**Regional price levels and the agglomeration  
wage differential in Western Germany**

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Auch mit seiner neuen Reihe „IAB-Discussion Paper“ will das Forschungsinstitut der Bundesagentur für Arbeit den Dialog mit der externen Wissenschaft intensivieren. Durch die rasche Verbreitung von Forschungsergebnissen über das Internet soll noch vor Drucklegung Kritik angeregt und Qualität gesichert werden.

Also with its new series "IAB Discussion Paper" the research institute of the German Federal Employment Agency wants to intensify dialogue with external science. By the rapid spreading of research results via Internet still before printing criticism shall be stimulated and quality shall be ensured.

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## Abstract

Recently, there has been a renewed interest in the agglomeration wage differential. One of the open research question is whether wage differences between large cities and the rural country are due to unobserved differences in regional price levels. In this paper information on regional price levels for western German regions is used to assess this wage differential. Since for many regions price information is not available Multiple Imputation is used to generate completed data sets. It can be shown that this strategy is more reliable than simply using predictions of regression analysis.

The results obtained show that the agglomeration wage differential in Germany is smaller than in the US, and that only a minor part of it can be explained by differences in prices.

**JEL classification:** R12, J31, C11

**Keywords:** Agglomeration wage differential, regional prices, Multiple Imputation, regional disparities

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## 1 Introduction

Information on regional price levels is fundamental for many research questions in regional science. For example, empirical analyses show a marked agglomeration wage premium in many countries. But this premium might be an illusion if it only reflects price differences.

Though the value of information on regional prices is obvious, there is a lack of empirical data in many countries. In some cases official statistics provide information about relatively large regional units, but this is not of much help since large regions include agglomerations and stretches of rural areas as well. Furthermore, price indexes for regions are often not comparable (see Appendix 1); they show the development in the time dimension (regional inflation) but not in the spatial dimension.

In this paper one of the very few surveys showing regional price levels for 32 small regional units is used to estimate regional price differences for the whole area of western Germany. This is done by Multiple Imputation, which is a method that takes care of the uncertainty included in this estimation by dealing correctly with the variance of estimates accomplished using imputed data.

The completed data is used to estimate the agglomeration wage differential, which has received considerable attention recently. Most of the explanations are based on the idea that the concentration of production increases productivity, which is at least partly reflected by wages. However, there is an older debate concerning whether regional wage differences simply balance out observed or unobserved (dis-)amenities of regions (early representatives are Goldfarb, Yezer 1976, Roback 1982), for example disadvantages of congestion in cities, or whether they are due to unobserved price differences. In more recent research the relation of the wage differential to cost-of-living differences is also discussed (Glaeser, Maré 2001: 319f., Yankow 2006).

The outline of the paper is as follows: In section 2 we give a brief overview over the current state of research. Section 3 provides background regarding Multiple Imputation. The application of the imputation procedure is shown in section 4. In section 5 we present the estimation results

on the agglomeration wage differential. Section 6 provides some concluding remarks.

## 2 Current state of research

From many empirical studies it is known that prices and wages are higher in metropolitan areas. It should be noted, however, that the existence of high prices in city centres is contrary to the predictions of most New Economic Geography (NEG) approaches. An interesting theoretical model that avoids the inconsistency is given by Suedekum (2006). He adds a home goods sector to Krugman's (1991) standard approach. It is then possible for a price index to be higher in the core than in the periphery.

As regards empirical research on the agglomeration wage differential, Glaeser and Maré (2001) showed in their seminal article that the raw differential is 33 % in the US. If the heterogeneity of the labour force is controlled for and experience, education and race of workers are taken into account it falls by 6.5 %. The authors (2001: 340) concluded "that there is a substantial urban wage premium, which is not simply the result of omitted ability factors". In the case of Germany, Möller and Haas (2003) presented evidence for the existence of such a premium using quantile regression. In Germany the raw differential is smaller, it comes up to 20 % (see also Möller, Lehmer 2006). Generally, empirical studies show that individuals with identical characteristics receive higher wages in agglomerations than in rural areas.

To see to what extent the wage differential is due to a variation of price levels we will have to extend the scope of the analyses. However, for many countries information on regional price levels is scarce. In the case of the US, cost-of-living information is available for metropolitan areas but not for the rural country. Consequently, Yankow (2006) includes the price level when he studies the wage premium for large compared to smaller cities.

In general, empirical information is scarce because collecting data on prices is a very expensive process. For a span of over thirty-five years only four surveys on regional price levels have been published by the German Federal Statistical Office. Each of them covers only a subset of regions (see Appendix 1). The survey conducted in 1993 for fifty towns

and cities of reunified Germany is the most recent one (see Ströhl 1994). The data is representative for goods and services consumed by private households, but does not include rents. This survey could be used to estimate the regional price variation in the whole country. Even though some time has passed since this survey was conducted, it would be valuable to assess the structure and extent of regional price differences. The results could be used to derive information about the situation of more recent years.

In fact, Roos (2006) has done an estimation for regional price levels of all districts in Germany (NUTS-3) on the basis of the data provided by Ströhl (1994). He used a standard regression approach with the population, the GDP per capita, the average annual wage, the rental rate of retail outlets, the population density, a tourism dummy and a dummy for the eastern part of Germany as independent variables (Roos 2006: 1557f.). Applying this model to the fifty regional units for which price information is available, he obtained regression coefficients, which he used in a second step to calculate expected values for all of the 390 remaining districts. Furthermore, he calculated price levels of federal states by population weighted averages. Using the latter and the inflation rates at state level, the price levels of federal states (Bundesländer) are extrapolated up to the year 2002.

One limitation of Roos' (2006) approach concerns the method he used. The imputation of missing values by a standard regression model ignores the fact that the estimated values are known only with some uncertainty. If the estimated values are used in a second step, e. g. for estimating the agglomeration wage differential, the standard formula for calculating the standard errors leads to biased results. Therefore, we use Multiple Imputation to obtain estimates of the missing regional price levels.

### **3 Multiple Imputation**

The Multiple Imputation (MI) approach is standard for missing data problems in statistics and is being used more and more in applied research (see Rubin 1996). Following Little and Rubin (1987) there are three categories of missing data – missing completely at random, missing at random and missing not at random. MI is based on data missing at random (MAR). In this case the probability for a missing value may depend on the ob-

served values but does not depend on the missing values. Schafer (1997) shows that even when the MAR assumption does not hold, estimations by MI are generally less biased than estimations using the complete cases only.

The principles of Multiple Imputation were developed by Rubin (1978). To obtain a complete data set, the missing values are drawn from a conditional random distribution. The correlation of the imputed values with the covariates is based on the correlation between the observed values. The completed data can be used for econometric analyses with standard techniques. But standard tests assume that the true data is used – whereas we are actually using imputed data. This causes additional uncertainty. By running the imputation procedure several times we can take this additional uncertainty into account.

Therefore Multiple Imputation consists of three steps: in the first one, we generate  $m$  imputed data sets. In the second step, in following our research question we run estimations separately for each of the  $m$  completed data sets using standard econometric methods. In the third one, we combine the results by the rules for MI estimates.

The origin of Multiple Imputation lies in Bayesian Statistics. To obtain proper MI results, the imputations must be drawn randomly from a posterior predictive distribution of the missing data given the observed data. This can be done by a Bayesian Markov-Chain-Monte-Carlo (MCMC) procedure. For variables that are jointly normally distributed Josef Schafer's program NORM can be used (see <http://www.stat.psu.edu/~jls/misoftwa.html>). Details on the algorithm are discussed in Schafer (1997).

To start a formal description, we need some definitions: the vector of the regional price levels  $Y$  (in logs) includes observed values  $Y_{obs}$  and missing values  $Y_{mis}$ , so that  $Y = (Y_{obs}, Y_{mis})$ . The matrix  $X$  contains further completely observed variables. We assume that the log of the regional price levels  $Y = (Y_{obs}, Y_{mis})$  can be described by a normal distribution with the given parameters  $\xi$  and covariates  $X$ . In contrast to the parameters of an econometric model, the parameters  $\xi$  of the imputation model are of no further interest for the researcher. They are only needed for the imputation.



From a Bayesian point of view the parameters  $\xi$  are random variables. To impute the missing price levels given the observed levels and the covariates  $X$ , we need the distribution

$$P(Y_{mis}, \xi | Y_{obs}, X).$$

This distribution can be obtained by a Markov chain with an imputation step and a probability step. The imputation step is:

$$Y_{mis}^{(t+1)} \sim P(Y_{mis} | Y_{obs}, X, \xi^{(t)}).$$

In this step the missing values are drawn from a normal distribution, given the observed values and  $\xi^{(t)}$ . The starting value  $\xi^{(0)}$  is adopted from an expectation-maximizing algorithm. The probability step simulates new parameters  $\xi$ , given the observed values and the imputed values:

$$\xi^{(t+1)} \sim P(\xi | Y_{mis}^{(t+1)}, Y_{obs}, X),$$

where  $\xi$  is drawn from an inverted Wishard distribution. These new values of  $\xi$  are used in the next imputation step where we draw new  $Y_{mis}$ . The iteration between the imputation and probability steps results in a Markov chain. The distribution of the Markov chain  $(Y_{mis}^{(t)}, \xi^{(t)})$  converges to the posterior distribution  $P(Y_{mis}, \xi | Y_{obs}, X)$ .

We store  $Y_{mis}$  after  $z \gg 1$  rounds to obtain the first imputed data set. In our case we run  $z = 1000$  rounds. After  $z$  further iterations, we store the next data set, and so on, until we have gained  $m > 1$  imputed data sets. This completes the first step of our analysis, the imputation of missing data and the generation of more than one completed data sets.

This enables us in the second step to calculate the imputed data estimate  $\hat{\theta}^{(n)} = \hat{\theta}(Y^{(n)}, X)$  and its estimated variance  $\hat{var}(\hat{\theta}^{(n)})$ ,  $n = 1, 2, \dots, m$ .  $\hat{\theta}^{(n)}$  might be an estimator for the mean of a variable or the estimated coefficient from an econometric model in our case a wage analysis to check the existence of the agglomeration differential. The econometric analysis is carried out  $m$  times, once for each imputed data set.

In the third step these  $m$  estimates are used to compute the MI estimates and the MI variance. The MI estimate for  $\theta$  is the average estimate

$$\hat{\theta}_{MI} = \frac{1}{m} \sum_{n=1}^m \hat{\theta}^{(n)}.$$

To obtain the variance for the MI estimate  $\hat{\theta}_{MI}$ , we first calculate the 'between-imputation' variance

$$B = \frac{1}{m-1} \sum_{n=1}^m \left( \hat{\theta}^{(n)} - \hat{\theta}_{MI} \right)^2,$$

and then the 'within-imputation' variance

$$W = \frac{1}{m} \sum_{n=1}^m \hat{\text{var}}\left(\hat{\theta}^{(n)}\right).$$

Finally, the estimated total variance  $T$  for the MI estimate is defined by

$$T = W + \frac{m+1}{m} B.$$

For large sample sizes, tests and two-sided  $(1-\alpha)$ -interval estimates can be based on Student's  $t$ -distribution

$$\frac{\hat{\theta}_{MI} - \theta}{\sqrt{T}} \sim t_v \quad \text{and} \quad \hat{\theta}_{MI} \pm t_{v,1-\alpha/2} \sqrt{T}$$

with the degrees of freedom

$$v = (m-1) \left( 1 + \frac{W}{(1+m^{-1})B} \right)^2.$$

Note that the degrees of freedom depend on the number of imputations and the ratio of  $W$  to  $B$ . It can be shown that 3 to 5 imputed data sets are already sufficient if the share of missing values is not too high. More imputations would scarcely improve the efficiency of an estimate.

## 4 Price imputation

The observed price levels  $Y_{obs}$  (included in logs) for a number of regions stem from a publication by Ströhl (1994). He reports results of a cross-section sample collected by the German Federal Statistical Office. The data contains price indexes for 32 western German towns and cities in 1993. The indexes are based on a representative basket of 367 goods and services. In total, nearly 44,000 prices were used. The price information is not the regional cost-of-living index for two reasons. First, housing prices are not included. Second, in constructing the index, national expenditure shares have been used as weights, so local expenditure patterns are not represented.

**Table 1: Region classification and average imputed price levels**

According to Görmar, Irmen (1991), price information following Ströhl (1994)

Region Type	Description	No. of regions ...		Average imputed price levels (Reg.Type 1 = 100)
		in West Germany	with price index information	
1	Core cities in regions with major agglomerations.	39	13	100
2	Very densely populated districts in regions with major agglomerations.	41	2	99.72
3	Densely populated districts in regions with major agglomerations.	29	0	99.71
4	Rurally structured districts in regions with major agglomerations.	10	0	99.83
5	Core cities in regions with conurbational features.	21	7	99.70
6	Densely populated districts in regions with conurbational features.	72	5	99.18
7	Rurally structured districts in regions with conurbational features.	48	1	98.76
8	Densely populated districts in rurally structured regions.	44	3	98.39
9	Rurally structured districts in rurally structured regions.	22	1	95.46
Total		326	32	

Of special interest is the part of the price differential that arises from agglomeration effects, since this should correspond with the wage differential analysed in the next step of our study. Compared to the US, for which the seminal studies (e. g. Glaeser, Maré 2001) were published, Germany is rather small and densely populated. No part of the country is really far away from an agglomeration and therefore the differences in economic conditions should not be as pronounced as they are in the US. To capture different degrees of agglomeration between central core cities and the rural country we introduce a widely used classification developed by the Federal Office for Building and Regional Planning (BBR). This typology for districts, i. e. NUTS-3 regions, uses centrality and population density as criteria as is shown in Table 1. In a strict sense, only the regions of Type 1 represent agglomerations and only those of Type 9 the rural country. The other types are in between.

The matrix of covariates  $X$ , which is used to simulate the missing price levels contains: size of regions, price of building land, squared price of building land, a variable for tourism, unemployment rate (all in logs), composition corrected regional wage, a dummy for cities which are a district of their own and nine region dummy variables indicating the type of district (Table 1). Because of a lack of observations in two regional groups, region Type 4 is subsumed to 7 and Type 3 to 6 only in the MI step. Detailed information on the other covariates is given in Appendix 2.

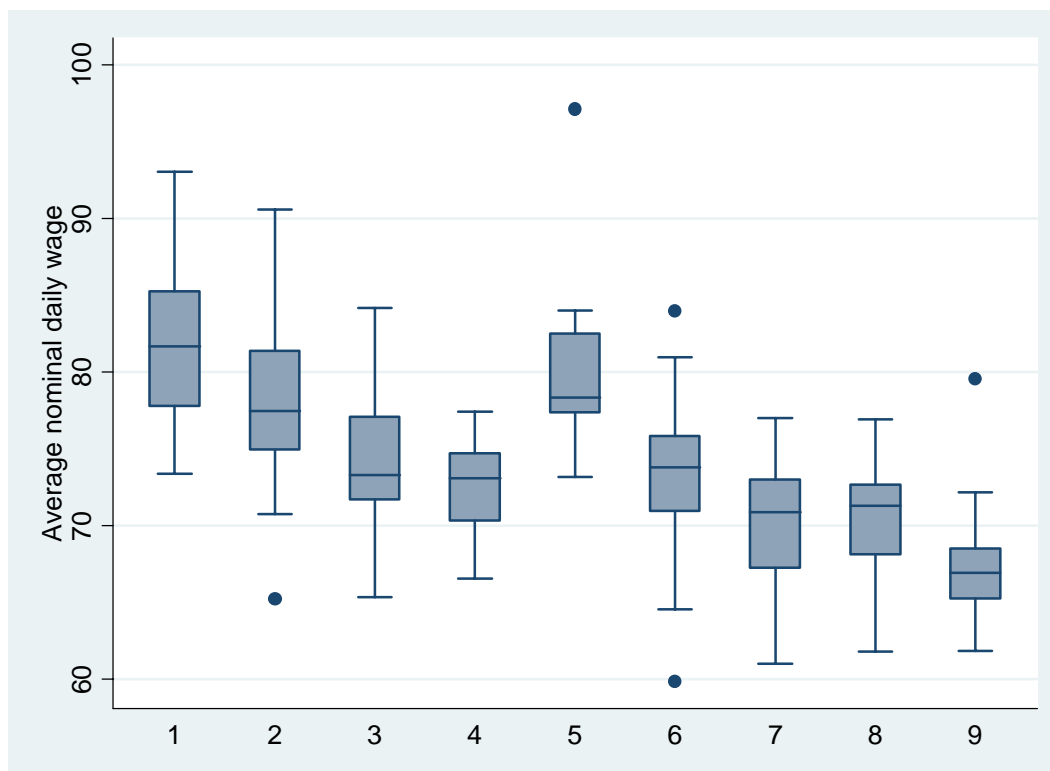
Following the method outlined in the previous section, these variables are used to generate regional levels for those districts where the information is missing. In our case we generated  $m=5$  data sets. This completes the first step of our analysis.

To obtain a rough indicator for the quality of the information used for imputation a regression is carried out for the 32 regions with complete information. The price level is the response variable and the variables employed for imputation are included as predictors. The regression gives an  $R^2$  of 0.90. Therefore, we feel confident about the precision of the imputed data.

## 5 Estimation of agglomeration wage differentials

Before continuing with the wage regressions, we provide in Figure 1 a first impression of the regional disparities in nominal wages. As expected, the average wages are lower in rural areas (Types 8 and 9) than in core cities (Types 1 and 5). The data set underlying this figure and also the wage equations is the IAB Employment Sample (IABS-R01, for details see Hamann et al. 2004 and for an older version of the data Bender, Haas, Klose 2000). This is a two percent random sample of the Employment Statistics of the Federal Employment Services, which includes all employees covered by social security and represents about 80 percent of total employment in Germany. The Employment Statistics are generated from the administrative data used to calculate the contributions to the social security system. It is therefore highly reliable. The data includes information on employment spells, job and personal characteristics as well as earnings. The wage variable is measured for calendar days. Only workers, who were employed on 30<sup>th</sup> June, 1993 are included. Part-time workers and apprentices are not taken into account. The remaining sample contains 171,366 individuals covering the districts of western Germany.

**Figure 1: Boxplots of average nominal daily wages over region types according to Table 1**



Source: Own calculations based on the IABS-R01

In the next step, the regressions with the 5 data sets completed by MI are carried out. To test for the existence of an agglomeration wage premium, we estimate equations with the log of wages as response variable. For the first one we use individual nominal wages, for the second one we calculate real wages using the imputed regional price levels. In order to quantify the agglomeration wage differentials we use again the classification scheme of the BBR (see Section 3). Because contributions to the social security system have to be paid only up to a contribution limit, the wages are right-censored. For this reason we estimate the wages by means of a Tobit regression. Because of the multilevel framework – employees are located within regions – we adjust the standard errors of each single regression for intragroup correlation (Moulton 1990).

Table 2 contains the results of the Tobit estimates for the regression model where only the region types are used as explanatory variables to quantify the raw urban wage premium. The reference category is Type 9 “Rurally structured districts in rurally structured regions”. The estimations from the five imputed data sets are combined according to the principles of Multiple Imputation to obtain the results for the real wage model.

The nominal wages at individual level differ considerably between the region types. Employees working in rurally structured districts of Type 9 earn about 25 % less than those working in a core city of Type 1. This is less than the 33 % found by Glaeser and Maré (2001) for the US. The wage differentials decrease somewhat when using the real wage instead of the nominal wage. The value for Type 1 is now 19 %. All coefficients decrease in absolute values. Thus, about one quarter of the raw urban wage premium can be explained by regional price differences.

The results of Table 2 do not account for internal heterogeneity of regions. To control for variations in the distribution of jobs and employees, we estimate a Mincer wage equation at individual level. As is standard in the literature we assume a linear relationship between log wages and the explanatory variables. To obtain results comparable to those in the literature (say Glaeser, Maré 2001) we include education, gender, age and age squared.

**Table 1: Agglomeration effects on nominal and real wages (Model 1)**

Variable	log Nominal Wage				log Real Wage			
	Coef.	Std. Err.	95 % Conf. Interval		Coef.	Std. Err.	95 % Conf. Interval	
Constant	4.152	0.013	4.126	4.177	4.200	0.014	4.172	4.229
Region Type 1	0.250	0.019	0.214	0.286	0.194	0.017	0.160	0.228
Region Type 2	0.181	0.018	0.146	0.217	0.136	0.018	0.101	0.171
Region Type 3	0.107	0.017	0.074	0.139	0.065	0.018	0.029	0.102
Region Type 4	0.068	0.021	0.028	0.109	0.026	0.022	-0.018	0.070
Region Type 5	0.186	0.021	0.145	0.227	0.142	0.022	0.099	0.184
Region Type 6	0.099	0.014	0.071	0.127	0.060	0.016	0.028	0.092
Region Type 7	0.048	0.016	0.017	0.079	0.014	0.017	-0.021	0.049
Region Type 8	0.051	0.016	0.020	0.082	0.023	0.019	-0.017	0.062

Notes: Estimation method is Tobit; reference category is Region Type 9; all standard errors are robust; n = 171,366.

**Table 2: Agglomeration effects on nominal and real wages with control variables (Model 2)**

Variable	log Nominal Wage				log Real Wage			
	Coef.	Std. Err.	95 % Conf. Interval		Coef.	Std. Err.	95 % Conf. Interval	
Constant	3.240	0.026	3.190	3.290	3.286	0.026	3.235	3.337
Region Type 1	0.196	0.016	0.164	0.227	0.140	0.015	0.111	0.169
Region Type 2	0.146	0.015	0.117	0.175	0.101	0.015	0.072	0.130
Region Type 3	0.084	0.015	0.056	0.113	0.043	0.016	0.011	0.076
Region Type 4	0.049	0.017	0.015	0.083	0.007	0.019	-0.031	0.045
Region Type 5	0.140	0.018	0.105	0.176	0.096	0.019	0.059	0.133
Region Type 6	0.079	0.012	0.055	0.102	0.040	0.014	0.011	0.068
Region Type 7	0.039	0.014	0.011	0.066	0.005	0.016	-0.027	0.036
Region Type 8	0.037	0.013	0.012	0.062	0.009	0.017	-0.027	0.044
Vocational Qualification	0.205	0.004	0.198	0.212	0.205	0.004	0.198	0.212
University Degree	0.660	0.007	0.646	0.674	0.657	0.007	0.643	0.671
Women	-0.315	0.007	-0.329	-0.302	-0.316	0.007	-0.330	-0.302
Age	0.039	0.001	0.037	0.041	0.039	0.001	0.037	0.041
Age squared	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000

Notes: Estimation method is Tobit; reference variables are Region Type 9, No Formal Education and Men; all standard errors are robust; n = 171,366.

By and large the estimated coefficients of the control variables show the magnitude and sign which is expected (see Table 3). For instance, women earn *ceteris paribus* less than men, highly qualified workers more than less qualified ones and age shows a positive but decreasing marginal effect. Concerning the region types, the estimated agglomeration wage differentials are smaller than in the model with no additional explanatory variables. The difference between region Types 1 and 9 is reduced to 20 percent in nominal terms. This is about the same result as in Möller, Haas (2003). In real terms the coefficients are reduced by about the same amount as before in Table 2. Therefore, the differential for Type 1 shrinks to 14 %.

Our data set provides us with the opportunity to control for even more variables. These include nine establishment-size categories, 30 industry categories and thirteen occupational categories. See Appendix 2 for a detailed description of the variables. These variables map attributes of employees (occupational category) and of establishments (industry category and establishment size). Glaeser, Maré (2001) and Yankow (2006) use models with fixed effects to control for unobserved worker heterogeneity within regions and to trace the origin of the agglomeration wage differential even further. This approach is not feasible for us, because our price level data is available for only one year. Models with an extended number of control variables, however, allow additional insights into the sources of the agglomeration wage differential. Results are shown in Table 4, but the coefficients for the additional variables are omitted for lack of space. The complete results can be obtained from the authors upon request.

Now we obtain the surprising result that the agglomeration wage premium is only half of its previous size when nominal wages are chosen, and it is even smaller with real wages. The interpretation is simple: A large part of the agglomeration wage differential is due to the structure of jobs of regional economies. Better paying industries with larger establishments are concentrated in metropolitan areas.



**Table 4: Agglomeration effects on nominal and real wages with extended number of control variables (Model 3)**

Variable	log Nominal Wage				log Real Wage			
	Coef.	Std. Err.	95 % Conf. Interval		Coef.	Std. Err.	95 % Conf. Interval	
Constant	3.044	0.026	2.993	3.095	3.090	0.027	3.038	3.143
Region Type 1	0.093	0.010	0.072	0.113	0.039	0.011	0.017	0.060
Region Type 2	0.090	0.010	0.070	0.110	0.045	0.012	0.021	0.068
Region Type 3	0.056	0.011	0.034	0.077	0.015	0.014	-0.014	0.043
Region Type 4	0.038	0.012	0.014	0.062	-0.004	0.015	-0.035	0.027
Region Type 5	0.052	0.011	0.030	0.073	0.009	0.013	-0.018	0.035
Region Type 6	0.041	0.009	0.025	0.058	0.003	0.012	-0.022	0.028
Region Type 7	0.019	0.010	-0.001	0.039	-0.015	0.013	-0.042	0.012
Region Type 8	0.015	0.010	-0.004	0.034	-0.013	0.015	-0.047	0.020
Vocational Qualification	0.106	0.002	0.102	0.110	0.107	0.002	0.103	0.112
University Degree	0.300	0.006	0.288	0.312	0.299	0.006	0.287	0.311
Women	-0.317	0.006	-0.329	-0.305	-0.318	0.006	-0.330	-0.305
Age	0.030	0.001	0.029	0.032	0.031	0.001	0.029	0.032
Age squared	0.000	0.000	0.000	0.000	0.000	0.000	0.000	0.000

Notes: Estimation method is Tobit; reference variables are Region Type 9, No Formal Education and Men; all standard errors are robust; n = 171,366.

Variables for establishment sizes, industries and occupations are included but results not shown.

The differences between coefficients of the regression in real and in nominal terms are in most cases significant as they have been in the previous regressions. This is an important result since the analysis with real wages now leads to different conclusions. In models with fewer variables, the core cities of Region Type 5 are similar to the core cities of Region Type 1. Now, with real wages, the coefficient of Type 5 vanishes. The agglomeration differential revealed for this type can be completely explained by the composition of the work force. The differential for Type 1 is less than half of what it was in the analysis with nominal wages.

Finally, if only the control variables are included which are related to establishments (industries and size groups), the Type 1 dummy has coefficients of 0.160 (nominal) and 0.105 (real). If only variables relating to employees are included (Model 2 plus occupation groups) the coefficients are 0.141 and 0.086.

Our analyses show the important role of regional prices in explaining and understanding the agglomeration wage premium. In a descriptive dimension, regional prices influence the structure and magnitude of regional disparities in an economy. In an analytical dimension, regional prices are relevant for empirical tests of economic theories, because they are generally formulated in real and not in nominal terms. This is true not only for theories of regional science but for many other approaches. An empirical analysis of labour demand, for example, is affected to the extent that differences in wage levels are due to variations in regional price levels for which no information is available. As another example, a region's response to an external shock cannot be measured adequately if the price information is missing. Therefore, approaches describing regional business cycles have no direct empirical counterpart.

Though, obviously, regional prices are important, little has been done to supply the data required and to fill the gaps in empirical research (Hayes 2005). The analysis presented here is one step in this direction.

## 6 Conclusions

In this paper it has been demonstrated that Multiple Imputation is an important tool for generating completed data sets. One of the special properties of this approach is that it takes into account the additional uncertainty associated with the fact that some of the data are not observed. The estimation of a regional price index for western Germany has interesting consequences for the structure of regional wage disparities. It is obvious that the larger cities are places which are relatively expensive to live in. The rural country is cheaper. That is an expected result. It is important, however, that the "raw" wage differential does not vanish, it is "real". Without additional controls in the regression the wage differential is 25 % with nominal and 19 % with real wages.

When the composition of the labour force and the distribution and quality of jobs is taken into account, the wage differential is greatly reduced. In nominal terms it is now only 9 %. In real terms it is reduced to about 4 %.

## Literature

- Angermann, O. (1989): Vergleich des Verbraucherpreisniveaus in Bonn, Karlsruhe, München und Berlin (West); in: *Wirtschaft und Statistik* 4: 258-261.
- Baltagi, B.H.; Blien, U.; Wolf, K. (2007): Phillips Curve or Wage Curve? Evidence from West Germany: 1980-2004. IAB Discussion Paper No. 14/2007. Nuremberg.
- Bender, S.; Haas, A.; Klose, C. (2000): The IAB Employment Subsample 1975-1995; in: *Schmollers Jahrbuch* 120/4: 649-662.
- Glaeser, E. L.; Maré, D. C. (2001): Cities and skills; in: *Journal of Labor Economics* 19/1: 316-342.
- Goldfarb, R. S.; Yezer, A. M. J. (1976): Evaluating alternative theories of intercity and interregional wage differentials; in: *Journal of Regional Science* 16/3: 345-363.
- Görmar, W.; Irmen, E. (1991): Nichtadministrative Gebietsgliederungen und -kategorien für die Regionalstatistik. Die siedlungsstrukturelle Gebietstypisierung der BfLR; in: *Raumforschung und Raumordnung* 49/6: 387-394.
- Hamann, S. et al. (2004): Die IAB-Regionalstichprobe 1975-2001: IABS-R01; in: *ZA-Information* 55: 34-59.
- Hayes, P. (2005): Estimating UK Regional Price Indices, 1974-96; in: *Regional Studies* 39/3: 333-344.
- Krugman, P. (1991): *Geography and Trade*, Cambridge (Mass.) etc.: MIT Press.
- Little, R.J.A.; Rubin, D.B. (1987): *Statistical analysis with missing data*, New York: John Wiley.
- Möller, J.; Lehmer, F. (2006): The Rural/ Urban Wage Premium, Backwater- and Firm-Size Effects. Working Paper. University of Regensburg.
- Möller, J.; Haas, A. (2003): The Agglomeration Wage Differential Reconsidered: An Investigation Using German Micro Data 1984-1997; in: Bröcker, J. et al. (ed.), *Innovation Clusters and Interregional Competition*, Berlin etc.: Springer: 182-217.
- Moulton, B.R. (1990): An illustration of a pitfall in estimating the effects of aggregate variables on micro units; in: *The Review of Economics and Statistics* 72: 334-338.
- Roback, J. (1982): Wages, Rents, and the Quality of Life; in: *Journal of Political Economy* 90/6: 1257-1277.
- Roos, M. W. M. (2006): Regional price levels in Germany; in: *Applied Economics* 38/13: 1553-1566.

- Rostin, W. (1979): Zwischenörtlicher Vergleich des Verbraucherpreisniveaus in 31 Städten; in: *Wirtschaft und Statistik* 6: 403-410.
- Rubin, D. B. (1978): Multiple imputation in sample surveys – a phenomenological Bayesian approach to nonresponse; in: *Proceedings of the Survey Research Methods Sections of the American Statistica*: 20-40.
- Rubin, D. B. (1996): Multiple imputation after 18+ years; in: *Journal of the American Statistical Association* 91: 473-489.
- Schafer, J. L. (1997): *Analysis of Incomplete Multivariate Data*, Chapman & Hall, London.
- Ströhl, G. (1994): Zwischenörtlicher Vergleich des Verbraucherpreisniveaus in 50 Städten; in: *Wirtschaft und Statistik* 6: 415-434.
- Suedekum, J. (2006): Agglomeration and Regional Costs of Living; in: *Journal of Regional Science* 46/3: 529-543.
- Yankow, J. J. (2006): Why do Cities Pay more? An Empirical Examination of some Competing Theories of the Urban Wage Premium; in: *Journal of Urban Economics* 60/2: 139-161.

## Appendix 1: Regional price information

Surveys for regional price indexes carried out in Germany:

- 1971 for ten West German cities: The survey is mentioned by Rostin (1979: 403, 405). Neither the relevant division of the German Federal Statistical Office nor the European Office of Statistics (EUROSTAT) could provide the original source.
- 1978 for 31 West German cities (Rostin 1979),
- 1987 for the four German cities Bonn, Karlsruhe, Munich and Berlin (West) (Angermann 1989) and
- 1993 for 50 cities of reunified Germany (Ströhl 1994).

The Federal Statistical Office publishes inflation rates for the federal states (Bundesländer) of Germany. However, there is a lack of information in the cross-section. The price levels of federal states cannot be compared with each other since it could not be ruled out that commodities of different quality and therefore cost are used for the calculation of regional price indexes between states.

## Appendix 2: Data description

The main data source is the IABS-R01, i. e. the regionalized version of the IAB Employment Sample of which a 50 % random subsample was used = a 1 % sample of the total employment covered by social security. Only full time employment in western Germany is included. The variables are:

- *Wage*: Gross calendar daily wage of the employee.
- *Age*: Age of the employee.
- *Establishment size*: Size of an establishment measured by the number of employees. This includes 9 categories. 1-4 employees, 5-9 employees, 10-49 employees, 50-99 employees, 100-199 employees, 200-499 employees, 500-999 employees, 1000-4999 employees, and more than 4999.
- *Composition corrected regional wage*: This variable is the estimated regional fixed effect of a Mincer-type equation for western Germany

in 1993. It gives information about the deviance of regional wages from their expected values. For further details see Baltagi, Blien and Wolf (2007).

- *Industry classification*: This variable defines the specific industry to which the employing establishment belongs. These include 30 categories: primary sector, energy & mining, chemistry, plastic products, stones & earth, glass products, quarrying & metals, metal construction, motor vehicles, computers & electronic equipment, jewellery & toys, wood, paper, textiles, food products, construction, trade, transport & telecommunication, banking & insurance, hotels & catering, health care, simple business-related services, qualified business-related services, security services, temporary help services, education, leisure-related services, household-related services, other social services, public administration, and not applicable.
- *Occupational group*: This variable describes the field of an employee's occupational specialization. These include 13 categories: agricultural, unskilled blue collar worker, skilled blue collar worker, technician, engineer, simple services, qualified services, semi-professional, professional, simple administrative, qualified administrative, managers and no classification applicable.

Other variables:

- *Cities and towns which are a district of their own*: 1 = cities that have district status, otherwise 0.
- *Population*: Population of the districts.
- *Price of building land*: Price per square meter of building land.
- *Price index for 1993*: Price index for German regions provided in Ströhl (1994).
- *Qualification level of an employee*: This variable includes 4 categories: No formal education, vocational qualification, university degree, no classification applicable. The qualification level "no classification applicable" is subsumed to "no formal education".

- *Regional unemployment:* The districts are the smallest regions for which unemployment figures can be obtained.
- *Region types:* The nine dummies indicate the type of the districts defined according to a classification of the Federal Office for Building and Regional Planning (BBR; Görmar, Irmen 1991), see Table 1.
- *Gender:* Female = 1, male = 0.
- *Size of the regions:* Size of the regions in square kilometres.
- *Tourism:* Tourism is composed of the number of overnight stays divided by the number of arrivals of visitors multiplied by the population density of the region.

The size of the regions, the population of the regions, the prices of building land and tourism are provided by the BBR. Some missing data was supplemented by the statistical offices of the states Brandenburg, Berlin, Lower Saxony, Baden-Württemberg, the towns Friedrichshafen and Nordhorn and the chamber of commerce and industry Osnabrück-Emsland. The unemployment rates of the districts are supplied by the Federal Employment Services.

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