Introduction Conceptual framework

ework Data O Empirical strategy

Main results 000 Mechanisms 00 Conclusions

Accumulating valuable work experience: the importance of large firms and big cities

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1 / 33

(a)

Background: size discussed to promote human capital accumulation

Urban economics

- Wages significantly higher in urban than in rural labour markets
- Duranton and Puga (2004): matching, sharing, learning
- Glaeser and Maré (2001), De La Roca and Puga (2017), and Peters (2020):
 - Labour market size promotes individual wage growth
 - > Value of work experience increases with labour market size ('Learning by working in big cities')

Labour economics

- Mincer (1962), Becker (1964), and Acemoglu and Pischke (1998): role of firms for skill acquisition, training and on-the-job learning takes place inside firms
- Mion et al. (2020), Arellano-Bover and Saltiel (2021), and Jarosch et al. (2021): firm level effects on learning
- Oi and Idson (1999): firm size impacts human capital accumulation

Introduction	Conceptual framework	Data	Empirical strategy	Main results	Mechanisms	Conclusions	Appendix
000	00	0	000	000	00	00	0000000000000

Background II: positive correlation of labour market size and firm size



(a) Share of large establishments (>250 emp.) (b) Share of employment in large establishments

Figure: Correlation of establishment size and labor market size

Introduction. Conceptual framework

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This paper

- Distinguishes between learning effects related to firm size and labor market size •
 - To what extent dynamic agglomeration advantages related to large firms?
- Data: administrative linked employer-employee data for Germany 1975–2011
- Identification: Exploit variation in wages and experience w.r.t. establishment size and labor market ٠ size within groups of workers with similar ability level
- Main results: •
 - Almost same wage elasticity w.r.t size of previous labor markets like De La Roca and Puga (2017): 0 029
 - Effect of labor market size $\approx 28\%$ smaller (0.021), conditional on size of previous employers
 - Wage elasticity w.r.t. size of previous employers: 0.0259
 - Effect of labor market size decreases with firm size (for high ability workers)
- Descriptive evidence on potential mechanisms •
 - Higher propensity of formal training in large labor markets due to spatial sorting of firms
 - Higher frequency of firm-to-firm mobility within big cities



Extension of Mincer's (1974) accounting-identity model

• Human capital of worker *i* at time *t*:

$$H_{i,t} = (1-\theta)H_{i,t-1} + v_{i,t-1}k_{i,t-1} = (1-\theta)^t \eta_{edu(i)} + \sum_{\tau=1}^{t-1} (1-\theta)^{t-1-\tau} v_{i,\tau}k_{i,\tau}$$

• Decreasing learning effort to acquire new skills over time: $k_{i,t} = \kappa \left(1 - \frac{t}{T_i}\right) I(O_{i,t} = 1)$

• Return on learning effort of worker *i* at day *t*:

 $v_{i,t} = \gamma + \delta \ln(emp_{f(i,t),t}) + \rho \ln(emp_{r(i,t)-f(i,t),t}) + \omega \ln(emp_{f(i,t),t}) \times \ln(emp_{r(i,t)-f(i,t),t})$

- Potential earnings: $E_{i,t} = Wexp(H_{i,t})$
- Wage at day t: $\ln w_{i,\tau} \approx \ln E_{i,t} k_{i,t}$

Introduction Conceptual framework Data Empirical strategy Main results Mechanisms Conclusions Appendix 000 0● 0 000 000 00 00 00 000000000

Extension of Mincer's (1974) accounting-identity model

• Wage at day *t*:

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$$\begin{split} w_{i,t} &\approx \ln W + \kappa \left(\frac{t}{T_{i}} - 1\right) + \eta_{edu(i)}(1 - \theta)^{t} \\ &+ \gamma \kappa \sum_{\tau=1}^{t-1} (1 - \theta)^{t - \tau - 1} \left(1 - \frac{\tau}{T_{i}}\right) I(O_{i,\tau} = 1) \\ &+ \delta \kappa \sum_{\tau=1}^{t-1} (1 - \theta)^{t - \tau - 1} \left(1 - \frac{\tau}{T_{i}}\right) I(O_{i,\tau} = 1) \ln \left(emp_{f(i,\tau),\tau}\right) \\ &+ \rho \kappa \sum_{\tau=1}^{t-1} (1 - \theta)^{t - \tau - 1} \left(1 - \frac{\tau}{T_{i}}\right) I(O_{i,\tau} = 1) \ln \left(emp_{r(i,\tau)-f(i,\tau),\tau}\right) \\ &+ \omega \kappa \sum_{\tau=1}^{t-1} (1 - \theta)^{t - \tau - 1} \left(1 - \frac{\tau}{T_{i}}\right) I(O_{i,\tau} = 1) \ln \left(emp_{f(i,\tau),\tau}\right) \ln \left(emp_{r(i,\tau)-f(i,\tau),\tau}\right) \end{split}$$

Microdata on labour market biographies back to 1975/1993 from IAB

- \approx 150,000 wages in new employment relationships starting 2005-2011 (full-time, first match of worker and establishment, workers with 'complete' emp. biography, ...)
- Information on all previous employment relationships subject to social security in (West) Germany (start and end dates, establishment and location)
- Merge local labor market size Map and establishment size
- Worker characteristics (sex, educational level, pre-employment status)
- Merge information on hiring establishment (size, workforce composition)
- Merge information on local industry and labor market conditions
- Merge worker and establishment coefficient estimates from AKM-style wage decomposition (Bellmann et al., 2020)

Introduction	Conceptual framework	Data	Empirical strategy	Main results	Mechanisms	Conclusions	Appendix
000	00	0	•00	000	00	00	00000000000000000

Empirical model estimated by non-linear least squares

$$\begin{split} \ln w_{i,t} &= \alpha + \kappa \left(\frac{t}{T_i} - 1 \right) + \eta_{edu(i)} (1 - \theta)^t + \gamma \kappa \sum_{\tau=1}^{t-1} (1 - \theta)^{t-\tau-1} \left(1 - \frac{\tau}{T_i} \right) I(O_{i,\tau} = 1) \\ &+ \delta \kappa \sum_{\tau=1}^{t-1} (1 - \theta)^{t-\tau-1} \left(1 - \frac{\tau}{T_i} \right) I(O_{i,\tau} = 1) \ln (emp_{f(i,\tau),\tau}) \\ &+ \rho \kappa \sum_{\tau=1}^{t-1} (1 - \theta)^{t-\tau-1} \left(1 - \frac{\tau}{T_i} \right) I(O_{i,\tau} = 1) \ln (emp_{r(i,\tau)-f(i,\tau),\tau}) \\ &+ \omega \kappa \sum_{\tau=1}^{t-1} (1 - \theta)^{t-\tau-1} \left(1 - \frac{\tau}{T_i} \right) I(O_{i,\tau} = 1) \ln (emp_{f(i,\tau),\tau}) \ln (emp_{r(i,\tau)-f(i,\tau),\tau}) \\ &+ F E_i \pi + F E_{f(i,t)} \phi + \mu_{r(i,t),y(t)} + x'_{i,t} \beta + \varepsilon_{i,t} \end{split}$$

FE_i and FE_{f(i,t)}: worker and establishment coefficient estimates from AKM-style wage decomposition (Bellmann et al., 2020), $\mu_{r(i,t),y(t)}$: region-year-FE, $x_{i,t}$: characteristics of worker, establishment, local industry and local labor market

 Introduction
 Conceptual framework
 Data
 Empirical strategy
 Main results
 Mechanisms
 Conclusions
 Appendix

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Identification I

Endogeneity concerns

- Unobserved heterogeneity at the worker level: more able workers might have acquired their experience primarily in large firms and urban labor markets (sorting, sorting parents, better schooling).
- Workers, who learn fast, might have acquired their experience primarily in large firms and urban labor markets.
- Workers who gathered experience in large cities often continue to work in a large local labor market (reinforcing positive correlation of entry wage and size of previous labor markets)
- Firms paying higher wages for any reason (e.g., higher productivity, specific wage agreements) might show recruiting strategies which aim at hiring workers who obtained their skills predominantly in large firms and large cities.

Introduction Conceptual framework Data Empirical strategy Main results Mechanisms Conclusions 000 00 00 00 00 00 00 00 10 / 33

Identification II

Addressing endogeneity concerns

- Observable characteristics of the worker, the hiring establishment and its location
- Region-time fixed effects, proxy for individual unobserved ability and wage level of hiring establishment
- Socus on wages in new employment relationships (promotion unobservable)
- Estimate wage equation separately for ten distinct subsamples defined based on proxy for individual unobserved ability
 - Account for heterogeneous benefits from size
 - Account for heterogeneous learning effort
 - ▶ No significant correlation between ability level and previous firm and labor market size within groups

Correlation

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nework D

Empirical strategy

Main results ●○○ Mechanisms 00 Conclusions

Table: Baseline regression results for full sample

	(1)	(2)	(3)	(4)
$\tilde{\gamma}$ (baseline exp. effect)	0.0442***	0.0432***	0.0431***	0.0430***
	(0.00196)	(0.00172)	(0.00163)	(0.00164)
$ ilde{\delta}$ (firm effect)		0.00550***	0.00501***	0.00493***
		(0.000206)	(0.000213)	(0.000200)
ilde ho (labor market effect)	0.00556***		0.00401***	0.00403***
	(0.000404)		(0.000402)	(0.000410)
$ ilde{\omega}$ (firm x labor market)				0.000330**
				(0.000153)
κ (learning effort)	0.458***	0.438***	0.437***	0.437***
	(0.0117)	(0.0112)	(0.0112)	(0.0112)
$ heta^{y}$ (annual depreciation rate)	0.206***	0.201***	0.200***	0.201***
	(0.00944)	(0.00713)	(0.00762)	(0.00768)
R ² _{adj.}	0.705	0.707	0.708	0.708

Note: N=47,614. Estimates refer to the value of the previous year of work experience as reflected in the entry wage about 14 years (5,185 days) after labor market entry for a worker who entered the labor market 45 years (16,266 days) prior to retirement age. Depreciation rate θ is expressed in years. ***, ** and * indicate significance at the 1, 5 and 10 percent level. Robust standard errors given in parentheses are clustered at the level of 141 labor market regions. All regressions include control variables, AKM-worker and AKM-establishment fixed effects estimated by Bellmann et al. (2020) as well as industry, occupation, and region-year fixed effects. Source: IEB, own calculations.

Conceptual framework

work Data

Empirical strategy

Main results ○●○ Mechanisms

Conclusions



Figure: Heterogeneous effects across ability levels

12 / 33



Figure: Relative wage after 14 years of work experience depending on where experience was acquired

Conceptual framework

mework Data O Empirical strategy

Main results 000 Mechanisms ●○

Conclusions

Table: Correlation between training provision, establishment size and local labor market size- results from a logistic regression (odds ratios) and IAB Establishment Panel data

	(1)	(2)	(3)
n(employment density)	1.067***	1.043***	0.989
	(0.008)	(0.008)	(0.008)
Establishment size – reference: less than 5 workers			
5 - 9 workers		2.292***	2.234***
10 - 19 workers		3.489***	3.356***
20 - 49 workers		6.077***	5.325***
50 - 99 workers		10.727***	7.940***
100 - 199 workers		19.011***	12.199^{***}
200 - 499 workers		34.041***	18.485***
500 - 999 workers		76.765***	34.944***
1000 - 4999 workers		143.461***	56.839***
Constant	1.761***	0.341***	0.327***
Establishment-year observations	192,371	192,371	192,371
Industry fixed effects	No	No	Yes
Indicator variables for legal form and work council	No	No	Yes
Indicator variables for the type of establishment	No	No	Yes
Information on workforce composition	No	No	Yes
•			

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Conclusions

Table: Correlation between the probability of job change and local labor market size, marginal effects

	(1)	(2)	(3)	(4)	(5)	(6)	
		all workers		high-skilled workers			
n(labor market size)	0.00487***	0.00420***	0.00452***	0.00487***	0.00307***	0.00371***	
	(0.0000903)	(0.000100)	(0.000107)	(0.000280)	(0.000317)	(0.000347)	
N	5,803,239	5,145,370	4,458,873	750,565	674,433	602,952	
pseudo R2	0.001	0.097	0.091	0.001	0.063	0.062	

(1) + (4) without control variables

(2) + (5) conditional on individual and establishment characteristics and fixed effects for year, industry, occupation, gender and educational level

(3) + (6) like (2) + indicator variables for AKM-firm fixed effects estimated for the period 1998-2004 and the establishment's share of high- and low-skilled labor

Distance

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Introduction Conceptual framework

Main results 000 Mechanisms 00

Conclusions

- Value of work experience increases with size of labor markets and firms
 - Learning affected by size at both spatial scales
- On average, about 28% dynamic agglomeration benefits related to firm size
- Particular high ability workers benefit from size (higher learning effort)
- High ability workers: Learning opportunities in large establishments apparently compensate for lacking labor market size in smaller labor markets
 - Large firms more likely to offer formal training
 - Particularly high ability workers participate in employer-provided training
 - Access to larger establishments in smaller labor markets is difficult
- Higher frequency of firm-to-firm mobility within big cities potential mechanism underlying the benefit from gathering experience in big cities (net of firm effect)

Conceptual framework

Empirical strategy

Data

Main results 000 Mechanisms

Conclusions ○●

Thank you for your attention!

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n Conceptual framework

work

Data

Empirical strategy

Main results 000 Mechanisms 00 Conclusions

18 / 33





employment density 2011, municipality level
0.00 - 0.92 (5% of the municipalities)
0.93 - 2.53 (10%)
2.54 - 7.34 (20%)
- 7.35 - 24.26 (30%)
24.27 - 72.76 (20%)
🛑 72.77 - 193.14 (10%)
193.15 - 2492.76 (5%)

e	mployment density 2011, 0 to 10 k
C	0.60 - 7.31 (5% of the municipalities
6	7.32 - 13.73 (10%)
0	13.74 - 24.37 (20%)
	24.38 - 49.91 (30%)
0	49.92 - 98.67 (20%)
C	98.68 - 213.41 (10%)
C	213.42 - 1828.30 (5%)

Note: Black lines are borders of NUTS 1-regions (*Federal States*). The maps use the delineation of 11,444 municipalities at December 31, 2012. Their median size is 18 km^2 , the third quartile is 38 km^2 , and the maximum is 894 km^2 (Berlin) which corresponds to a radius of 2.4 km, 3.5 km, and 16.9 km respectively if the municipalities were circular. Source: BeH V09.03.00, own calculations.

Back

Figure: Employees per km² at municipality level and 0-10 km (0-6.2 mi) around the geographic center of the municipality

Introduction	Conceptual framework	Data	Em
000	00	0	00

npirical strategy Main results

ts Mechanisms 00

ms Conclusions 00

Identification III

Table: Correlation between AKM-worker fixed effects and the average size of firms and local labor markets in which experience was acquired

			Deciles of AKM-worker fixed effects								
	All workers	1	2	3	4	5	6	7	8	9	10
	1	Correlation	with indivi	idual AKN	1-worker fi	xed effect:	Spearman	's rank cor	relation co	efficient	
Firm size	0.2173	0.0324	0.0202	0.0061	0.0179	-0.0108	0.0202	0.0177	0.0275	0.0680	0.0743
LM size	0.1686	-0.0308	0.0080	-0.0070	0.0100	-0.0085	0.0189	0.0306	0.0571	0.0616	0.0625
		Re	gression re	sults, dep	endent va	riable: indiv	idual AKN	/l-worker fi	xed effect		
Firm size	0.114*	0.0053	0.0017*	0.0005	0.0004	-0.0000	0.0006*	0.0001	0.0007	0.0054*	0.0027
LM size	0.0879*	-0.0351*	0.0003	-0.0006	0.0003	-0.0004	0.0006	0.0015*	0.0041*	0.0071*	0.0174*
Constant	-0.843*	-1.491*	-0.677*	-0.402*	-0.227*	-0.0627*	0.0893*	0.275*	0.515*	0.902*	1.716*
N	147,614	14,762	14,761	14,763	14,761	14,761	14,762	14,761	14,761	14,761	14,761
R ²	0.0621	0.0023	0.0006	0.0002	0.0002	0.0001	0.0007	0.0009	0.0032	0.0069	0.0022

 * indicates significance at the 1 percent level. Average firm and labor market (LM) size considered in logs.

Empirical strategy

Data

Main results 000 Mechanisms 00 Conclusions

Table: Distance between the former and the new workplace by size of hiring establishment

		Distance in km at municipality level							
	ê	all worke	rs	high	-skilled w	orkers			
Category of firm size	p50	p75	p90	p50	p75	p90			
1 (lowest)	10.3	28.9	122.9	16.7	72.0	284.5			
2	11.2	31.0	128.9	17.2	71.5	254.5			
3	12.2	35.3	157.5	20.5	90.0	304.7			
4	13.3	39.6	181.0	21.6	103.7	311.4			
5	13.7	43.5	192.5	21.7	111.2	304.3			
6	13.8	47.6	199.0	22.5	112.4	316.3			
7	14.3	52.8	225.4	23.9	130.0	327.0			
8	13.9	54.7	233.4	23.3	130.5	321.8			
9	13.4	57.3	247.5	23.3	123.0	318.3			
10 (highest)	10.2	56.9	254.5	17.6	128.5	328.1			
Total	12.4	42.2	194.7	20.6	112.6	312.7			

Note: Based on 489,377 workers who changed the establishment from one to another year in the period 2005-2011.

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20 / 33



Figure: Elasticity of entry wage w.r.t. the size of the establishment and of the local labor market in which experience was acquired in the course of working life, full sample < _ > < >



21 / 33



Empirical strategy

Data

Main results

Mechanisms

Conclusions

ъ

22 / 33

Introduction

Conceptual framework

Figure: Elasticity of entry wage w.r.t. the size of the establishment and of the local labor market in which experience was acquired in the course of working life, by ability level

Conceptual framework

Data

Empirical strategy

Main results

Mechanisms

Conclusions

Appendix

	(1)	(2)	(3)	(4)	(5)
Ŷ	0.0430***	0.0433***	0.0466***	0.0442***	0.0455***
	(0.00164)	(0.000927)	(0.00135)	(0.00131)	(0.00165)
$\tilde{\delta}$	0.00493***	0.00442***	0.00425***	0.00384***	0.00550***
	(0.000200)	(0.000134)	(0.000166)	(0.000152)	(0.000207)
õ	0.00403***	0.00395***	0.00380***	0.00373***	0.00414***
	(0.000410)	(0.000220)	(0.000341)	(0.000328)	(0.000436)
õ	0.000330**	0.000341***	0.000289**	0.000262**	0.000361**
	(0.000153)	(0.0000785)	(0.000133)	(0.000122)	(0.000175)
ĸ	0.437***	0.420***	0.540***	0.529***	0.446***
	(0.0112)	(0.0151)	(0.0196)	(0.0188)	(0.0118)
θ^{y}	0.201***	0.103***	0.118***	0.118***	0.200***
	(0.00768)	(0.00289)	(0.00399)	(0.00408)	(0.00711)
N	147,614	347,894	147,614	147,614	147,614
R_{adi}^2	0.708	0.644	0.650	0.672	0.688
R^2	0.710	0.645	0.654	0.675	0.691
RSS	10767.957	27974.272	12882.796	12088.330	11479.643
Only obs. for which AKM-FE available	Yes	No	Yes	Yes	Yes
AKM-establishments fixed effects	Yes	No	No	Yes	No
AKM-worker fixed effects	Yes	No	No	No	Yes

Note: $\tilde{\gamma}, \tilde{\delta}, \tilde{\rho}$ and $\tilde{\omega}$ have been computed according to Equations (10) to (13) based on the results for Equation (9). Depreciation rate θ is expressed in years. ***, ** and * indicate significance at the 1, 5 and 10 percent level. Robust standard errors given in narentheses are clustered at the level of 141 local labor markets. Specification (1) is identical to Model (4) in Table 2. See Table 2 for additional notes. Source: IEB and Bellmann et al. (2020), own calculations.

Figure: Specifications with and without AKM-fixed effect

э. 23 / 33

Conceptual framework

Empirical strategy

Main results

Mechanisms

Conclusions

Appendix

	(1)	(2)	(3)	(4)	(5)
Ŷ	0.0430***	0.0408***	0.0375***	0.0347***	0.0440***
	(0.00164)	(0.00157)	(0.00181)	(0.00204)	(0.00167)
$\tilde{\delta}$	0.00493***	0.00484***	0.00490***	0.00500***	0.00511***
	(0.000200)	(0.000191)	(0.000208)	(0.000235)	(0.000197)
ρ̈́	0.00403***	0.00385***	0.00373***	0.00386***	0.00412***
	(0.000410)	(0.000428)	(0.000430)	(0.000400)	(0.000475)
Ō	0.000330**	0.000138	-0.0000274	-0.000109	0.000315*
	(0.000153)	(0.000161)	(0.000167)	(0.000174)	(0.000169)
κ	0.437***	0.428***	0.425***	0.430***	0.448***
	(0.0112)	(0.0117)	(0.0144)	(0.0183)	(0.0108)
θ^{y}	0.201***	0.197***	0.191***	0.185***	0.202***
	(0.00768)	(0.00754)	(0.00863)	(0.0101)	(0.00824)
N	147,614	126,624	100,678	78,412	128,468
R_{adi}^2	0.708	0.716	0.723	0.728	0.700
R^2	0.710	0.719	0.727	0.733	0.703
RSS	10767.957	9237.808	7496.838	5977.956	9755.868
Reference (cf. Table 2)	x				
Hiring establishments ≥ 10 workers only		x			
Hiring establishments ≥ 25 workers only			x		
Hiring establishments \geq 50 workers only				x	
Grouped-FE instead of establishment-FE					х

Note: $\tilde{\gamma}, \tilde{\delta}, \tilde{\rho}$ and $\tilde{\phi}$ have been computed according to Equations (10) to (13) based on the results for Equation (9). Depreciation rate θ is expressed in years. *** and * indicate significance at the 1.5 and 10 percent level. Robust standard errors given in parentheses are clustered at the level of 141 local labor markets. See Table 2 for additional notes. Specification (1) is the reference and identical to Model (4) in Table 2. In specifications (2)-(4), we exclude small establishments based on different thresholds and in specification (5), we use fixed effects estimates for 100 clusters of establishments with similar wage structure as controll variable instead of estimates of AKM-establishment effects to address the limited mobilit bias in AKM models (see Section A1.3 in this Appendix). Source: IEB and Bellmann et al. (2020), own calculations.

Figure: Specifications addressing the limited mobility bias of AKM-establishment effects estimates



24 / 33

э

Conceptual framework

lework

Empirical strategy

Main results

Mechanisms

Conclusions

	(1)	(2)	(3)
	all workers	AKM09	AKM10
γ̈́	0.0361***	0.0927***	0.0916***
	(0.00194)	(0.00870)	(0.0108)
$\tilde{\delta}_{lin}$	0.000361***	0.000293***	0.000155***
	(0.0000363)	(0.000102)	(0.0000482)
$\tilde{\delta}_{sq}$	-0.00000687***	-0.00000365	-0.00000296**
	(0.00000103)	(0.00000332)	(0.00000117)
P _{lin}	0.00298***	0.00356***	0.00368***
	(0.000764)	(0.000956)	(0.000899)
$\tilde{\rho}_{sq}$	-0.0000983	-0.000146**	-0.000142***
	(0.0000626)	(0.0000710)	(0.0000540)
κ	0.456***	0.681***	0.883***
	(0.0110)	(0.0446)	(0.0489)
θ^{y}	0.212***	0.247***	0.207***
	(0.00860)	(0.0176)	(0.0205)
N	147,614	14,761	14,761
R_{adi}^2	0.706	0.536	0.482
R^2	0.709	0.576	0.526
RSS	10837.810	1369.841	2103.871

Note: The table contains results for an alternative specification of Equation (9). Specifically, the regression is based on an alternative learning function which includes – instead of the *logarithm* of establishment and labor market size – establishment and labor market size – stabilishment and labor market size as well as the (1) of (1) o

Source: IEB and Bellmann et al. (2020), own calculations.

Figure: Specification considering the square of establishment size and city size



25 / 33

Conceptual framework

vork Data

Empirical strategy

Main results 000 Mechanisms

Conclusions



(c) By size of the labor market in which the hiring establishment is located, AKM09 tablishment is located, AKM10

Figure: Effects across different types of hiring establishments

26 / 33

Conceptual framework

k Data O Empirical strategy

Main results 000 Mechanisms

Conclusions



Figure: Estimates for learning effort κ depending on the average size of the firms in which experience was acquired

Conceptual framework

Data

Empirical strategy

Main results

Mechanisms

Conclusions



Figure: Estimates for learning effort κ depending on the average size of the labour markets in which experience was acquired

Back < □ > < 클 > < 클 > < 클 > > = - 의 < 관 28 / 33



Main results 000 Mechanisms

Conclusions



Figure: Effect of previous city and firm size on the return on experience along the job ladder.



29 / 33

Data

Empirical strategy

Main results

Mechanisms

Conclusions

	(1)	(2)	(3)	(4)	(5)	(6)
Total experience	0.0161***	0.0141***	0.0133***	0.0148***	0.0108***	0.00938***
	(0.000655)	(0.000623)	(0.000620)	(0.000678)	(0.000702)	(0.000788)
Total experience ²	-0.000356***	-0.000398***	-0.000401***	-0.000290***	-0.000224***	-0.000199**
	(0.0000220)	(0.0000235)	(0.0000228)	(0.0000261)	(0.0000334)	(0.0000386)
Experience by labor marke	et size categories	, reference: exp	rience acquired	in small labor ma	arkets (<75 work	ers/km ²)
75-199 workers/km ²	0.00110***		0.000615**	0.00134*		0.000548
	(0.000276)		(0.000268)	(0.000709)		(0.000684)
200-499 workers/km ²	0.00150***		0.000818**	0.00273***		0.00145*
	(0.000325)		(0.000318)	(0.000906)		(0.000860)
\geq 500 workers/km ²	0.00436***		0.00317***	0.00765***		0.00550***
	(0.000444)		(0.000428)	(0.000930)		(0.000917)
Experience by establishme	nt size categorie	s, reference: exp	perience acquired	l in small establis	ihments (<10 wo	rkers)
10-49 workers		0.00318***	0.00313***		0.00468***	0.00445***
		(0.000310)	(0.000311)		(0.000886)	(0.000877)
50-249 workers		0.00529***	0.00509***		0.00767***	0.00719***
		(0.000266)	(0.000271)		(0.000836)	(0.000829)
≥ 250 workers		0.00821***	0.00759***		0.0155***	0.0145***
		(0.000387)	(0.000378)		(0.00102)	(0.000989)
Experience by labor marke	t size categories	× total experies	ice			
75-199 workers/km ²				-0.0000121		0.00000572
				(0.0000350)		(0.0000336)
200-499 workers/km ²				-0.0000619		-0.0000288
				(0.0000431)		(0.0000403)
\geq 500 workers/km ²				-0.000169***		-0.000117***
				(0.0000354)		(0.0000334)
Experience by establishme	nt size categorie	s × total experie	ence			
10-49 workers					-0.0000880*	-0.0000787*
10-49 Workers					(0.0000452)	(0.0000446)
50-249 workers					-0.000133***	-0.000119***
					(0.0000446)	(0.0000442)
> 250 workers					-0.000383***	-0.000363***
					(0.0000506)	(0.0000483)
N	147614	147614	147614	147614	147614	147614
R ²	0.703	0.704	0.705	0.703	0.704	0.705
R ²	0.706	0.707	0.708	0.706	0.707	0.708
RSS	10945.528	10892.951	10874.005	10942.973	10884.059	10863.332

Notes: "**, ** and ** indicate significance at the 1.5 and 10 percent level. Robust standard errors given in purentheses are clustered at the level of 141 labs market regions. If Indice are instructional transfer variables (esc robuster and AKM-establishment fixed effects estimated by Bellmann et al. (2020) as well as industry, occupation, and region-year fixed effects.

Figure: Results based on city size categories and establishment size categories (> (=)

30 / 33

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Conceptual framework

Data

Empirical strategy

Main results

Mechanisms

Conclusions

Appendix 00000000000000000

	(1)	(2)	(3)	(4)
Total experience	0.0170***	0.0172***	0.0161***	0.0133***
	(0.000685)	(0.000694)	(0.000655)	(0.000620)
Total experience ²	-0.000373***	-0.000379***	-0.000356***	-0.000401***
	(0.0000222)	(0.0000235)	(0.0000220)	(0.0000228)
Experience by labor market size categories, reference: exp	erience acquired	l in small labor n	narkets (<75 wor	kers/km ²)
75-199 workers/km ²	0.00103***	0.00107***	0.00110***	0.000615**
	(0.000308)	(0.000293)	(0.000276)	(0.000268)
200-499 workers/km ²	0.00139***	0.00135***	0.00150***	0.000818**
	(0.000373)	(0.000344)	(0.000325)	(0.000318)
\geq 500 workers/km ²	0.00499***	0.00471***	0.00436***	0.00317***
	(0.000514)	(0.000489)	(0.000444)	(0.000428)
Experience by establishment size categories, reference: ex	perience acquire	d in small establ	ishments (<10 w	orkers)
10-49 workers				0.00313***
				(0.000311)
50-249 workers				0.00509***
				(0.000271)
≥ 250 workers				0.00759***
				(0.000378)
N	147614	147614	147614	147614
\mathbf{R}_{adi}^2	0.669	0.677	0.703	0.705
\mathbf{R}^2	0.672	0.680	0.706	0.708
RSS	12191.109	11907.928	10945.528	10874.005
Considered firm characteristics				
Size of current employer	No	Yes	Yes	Yes
Workforce composition of current employer	No	No	Yes	Yes
AKM-establishment fixed effect of current employer	No	No	Yes	Yes
Size of previous employers (by experience categories)	No	No	No	Yes

Notes: ***, ** and * indicate significance at the 1, 5 and 10 percent level. Robust standard errors given in parentheses are clustered at the level of 141 labor market regions. All regressions include control variables referring to the individual worker, the local labor market and the local industry (see Table A8) as well as establishment characteristics as indicated in the Table. Furthermore, all models comprize pre-determined AKM-worker fixed effects estimated by Bellmann et al. (2020) as well as industry, occupation, and region-year fixed effects. Source: IEB, own calculations

Figure: Results conditional on different firm characteristics



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References |

- Acemoglu, D. and J.-S. Pischke (1998). "Why Do Firms Train? Theory and Evidence". In: *The Quarterly Journal of Economics* 113.1, pp. 79–119.
- Arellano-Bover, J. and F. Saltiel (2021). *Differences in On-the-Job Learning across Firms*. IZA Discussion Papers 14473. Institute of Labor Economics (IZA).
- Becker, G. (1964). Human Capital. University of Chicago Press.
- Bellmann, L. et al. (2020). AKM effects for German labour market data. FDZ-Methodenreport 01/2020 (en). Nuremberg: Research Data Centre of the Federal Employment Agency (BA) at the Institute for Employment Research (IAB).
- De La Roca, J. and D. Puga (2017). "Learning by Working in Big Cities". In: The Review of Economic Studies 84.1, pp. 106–142.
- Duranton, G. and D. Puga (2004). "Micro-foundations of urban agglomeration economies". In: Handbook of Regional and Urban Economics. Ed. by J. V. Henderson and J. F. Thisse. Vol. 4. Elsevier. Chap. 48, pp. 2063–2117.

References ||

- Glaeser, E. L. and D. C. Maré (2001). "Cities and skills". In: *Journal of Labor Economics* 19.2, pp. 316–42.
- Jarosch, G. et al. (2021). "Learning From Coworkers". In: *Econometrica* 89.2, pp. 647–676.
- Mincer, J. (1962). "On-the-Job Training: Costs, Returns, and Some Implications". In: Journal of Political Economy 70, pp. 50–79.
- 🔋 (1974). Schooling, experience, and earnings. New York: Natonal Bureau of Economic Research.
- Mion, G. et al. (2020). *Dream Jobs*. CEPR Discussion Paper 15027. Centre for Economic Policy Research.
- Oi, W. Y. and T. L. Idson (1999). "Firm size and wages". In: Handbook of Labor Economics. Vol. 3, Part B. Elsevier. Chap. 33, pp. 2165–2214.
- Peters, J. C. (2020). "Dynamic agglomeration economies and learning by working in specialised regions". In: Journal of Economic Geography 20.3, pp. 629–651.