

Worker autonomy and wage divergence: Evidence from European survey data

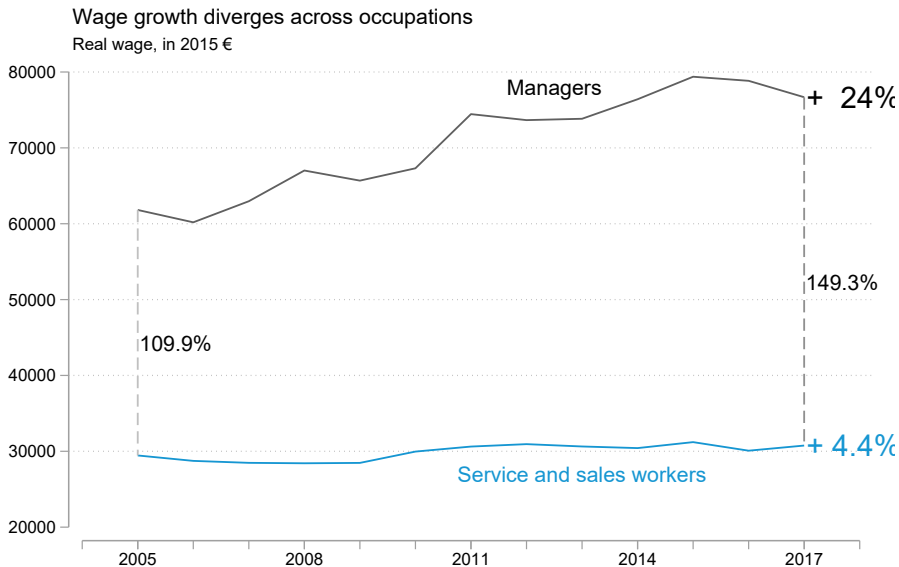
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PEGFA and University of Greenwich

May 13, 2022



Wage growth diverges across occupations



Research question

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1. Does worker autonomy explain wage growth differences in Western Europe?

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1. Does worker autonomy explain wage growth differences in Western Europe?
2. What are the technological and institutional determinants of changes in the autonomy wage premium?

Contribution

First cross-country analysis of the relationship between worker autonomy and occupational wage growth

Institutional determinants: Collective bargaining

Related literature

Occupations matter (Autor et al. 2003)

Focus on routinisation and offshoring (Acemoglu and Autor 2011, Firpo et al. 2011)

Increasing importance of worker autonomy for labour market outcomes (Blundell et al., 2022; Deming, 2021)

Collective bargaining as important determinant of the wage distribution (Farber et al., 2021)

Worker autonomy

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Control and influence a worker has over her work process

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Decision-making, planning, strategising, supervising other workers

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Worker autonomy and wage growth

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Technological change complements particular skills and tasks

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Deming (2021): Increasing demand for decision-making

Worker autonomy index

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Main assumption: Autonomy as inherent feature of an occupation

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O*NET (Bureau of Labour Statistics)

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Five index elements

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- Making Decisions and Solving Problems

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- Making Decisions and Solving Problems
- Thinking Creatively

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- Making Decisions and Solving Problems
- Thinking Creatively
- Developing Objectives and Strategies

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- Making Decisions and Solving Problems
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- Frequency of Decision Making

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Firpo et al. (2011) use index to measure decision-making

Wage data

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European Union Survey of Income and Living Conditions (EU SILC)

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Repeated cross-section, 800k observations

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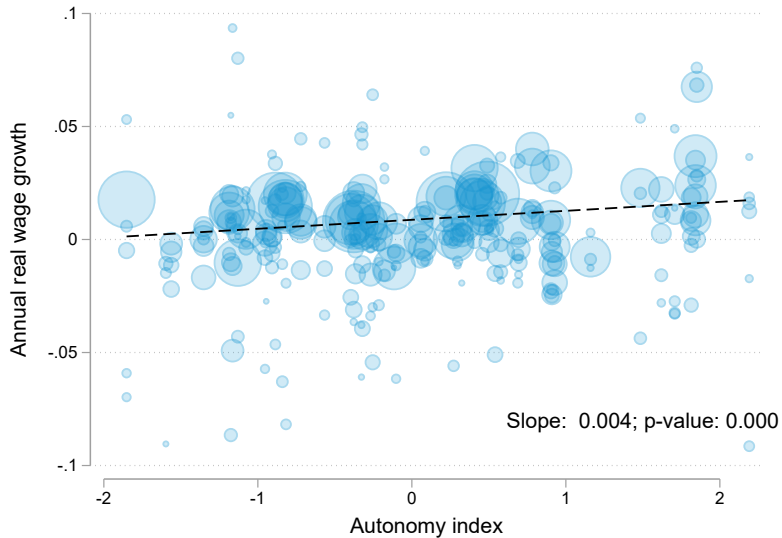
Repeated cross-section, 800k observations

2003-2018, 15 countries; full-time, full-year employees

Empirical analysis

Worker autonomy and wage growth, 2003-2018

Worker autonomy and wage growth, 2003-2018



The linear fit is weighted by employment shares. Circle sizes represent employment shares.

Empirical strategy

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$$\ln(w_{ijkct})$$

$\ln(w_{ijkct})$, Real wage of worker i in occupation j , industry k , country c , year t

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$$\ln(w_{ijkct}) = \beta_1(A_j \times t)$$

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A_j , Worker autonomy index

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$$\ln(w_{ijkct}) = \beta_1(A_j \times t) + \beta_2(X_j \times t)$$

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Main finding

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	In wage
Autonomy	0.0027 (0.0006)
Routinisation	0.0004 (0.0006)
Offshoring	0.0003 (0.0004)
Education	Yes
Age	Yes
Gender	Yes
Migrant	Yes
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Occupation-industry-country	Yes
Industry-country-year	Yes
Number of observations: 808122	
R-squared (adj.): 0.853	
Standard errors in parentheses	

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High vs. mean autonomy
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High vs. mean autonomy
occupation: **0.27 pp**

This effect is statistically
significant at the 1%-level

Economic interpretation

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Wages in mean autonomy occupation grow by 1%

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Wages in a high autonomy occupation grow by 1.27%

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Compounded over 12 years:

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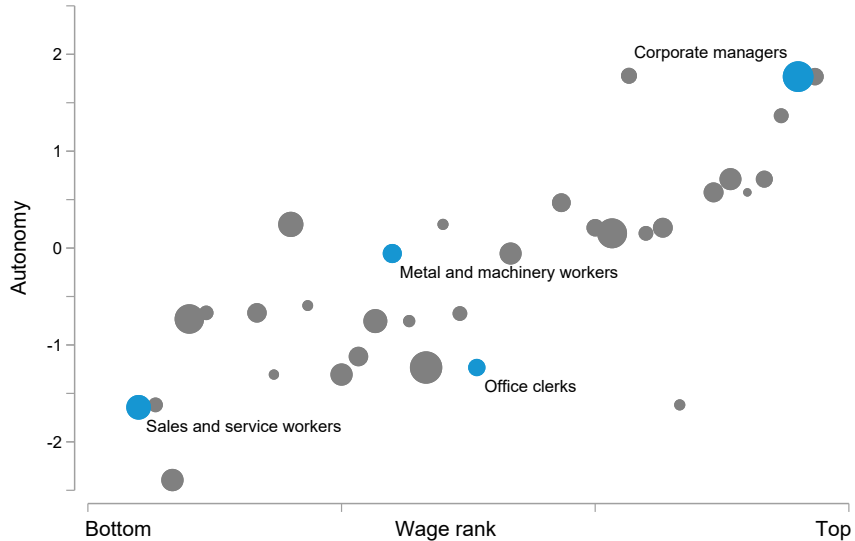
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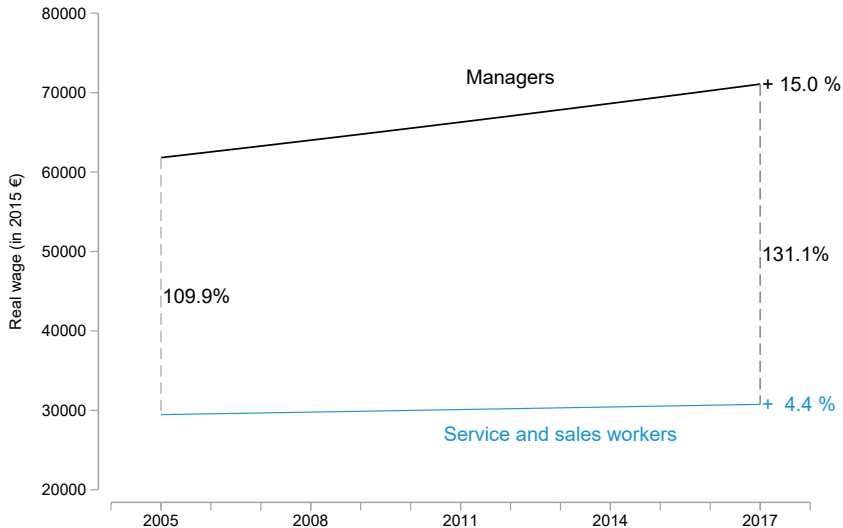
Compounded over 12 years:

Wage level difference of 3.3% (if occupations have same initial wage level)

High autonomy workers are at the top of the wage distribution



Autonomy: Wage gap between *Managers* and *Service workers* 21.2%↑



Worker autonomy explains wage growth patterns in Western Europe from 2003-2018

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Routinisation

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Routinisation

Offshoring

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Routinisation

Offshoring

Increasing returns to education

Worker autonomy explains wage growth patterns in Western Europe from 2003-2018

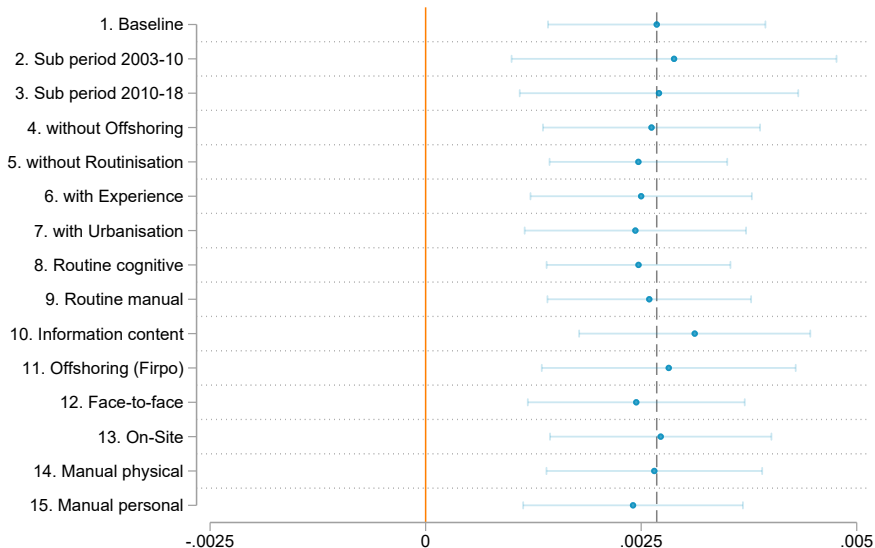
Routinisation

Offshoring

Increasing returns to education

Increasing return to STEM jobs (cognitive analytical)

Robustness checks



Notes: CI = 95%. The vertical dashed grey line shows our baseline autonomy estimate.

Additional robustness checks

Different measures of autonomy

Variations of Mincer variables (experience, urbanisation, ...)

Time periods

1-digit occupation level

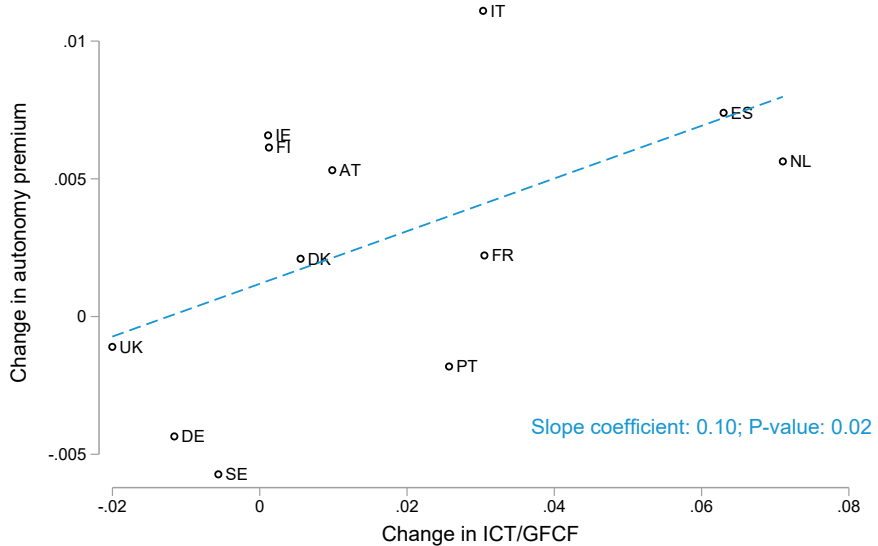
Alternative industry classification

Country exclusion

Industry exclusion

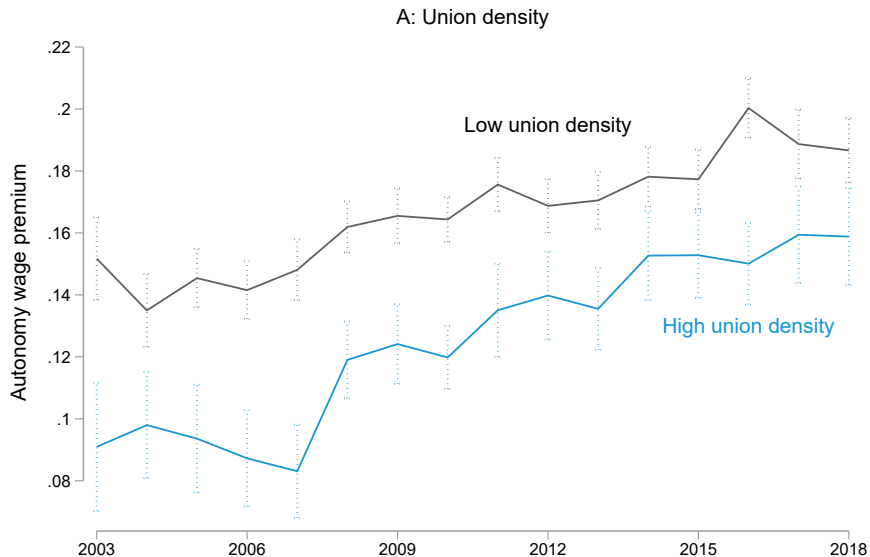
The autonomy premium and technological change

The autonomy premium and technological change



The autonomy wage premium and labour unions

The autonomy wage premium and labour unions



Bottom line

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Worker autonomy explains wage growth divergence

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→ Increase in wage inequality

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Technological change is related to rising autonomy wage premium

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Worker autonomy explains wage growth divergence

→ Increase in wage inequality

Technological change is related to rising autonomy wage premium

Collective bargaining is related to lower autonomy wage premium

Conclusion

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Policy

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Technology: Educational measures to re- and upskill workers

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Collective bargaining: Strengthen bargaining institutions that span across occupations

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Other dimensions of autonomy

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Employment patterns

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Gender dimension

Get in touch

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