

# Work Meaning and the *Flexibility Puzzle*

Thimo De Schouwer (KU Leuven)

Iris Kesternich (Hamburg University)

Belgian Day for Labour Economics

# Introduction

- ▶ The roles of men and women have **converged**:
  - in the labor market & in the household
  - but substantial **differences** prevail
- ▶ These differences suggest disparities in the **demand for flexibility**:
  - facilitates combining market and household labor
  - women **value** flexibility more than men
  - ↗ but do not **sort** into more flexible jobs

## This paper

- (1) We document the **prevalence** of this **flexibility puzzle**
- (2) What **explains** the puzzle? The role of work **meaning**  
= *impact on your community or society through work*

# Related Literature

- ▶ Literature on workplace **flexibility**
  - women value working from home and flexible hours more:
    - [Mas and Pallais \(2017\)](#), [Wiswall and Zafar \(2018\)](#) & [Maestas et al. \(2023\)](#)
  - but no evidence on sorting ([Golden 2001](#), [Mas and Pallais 2020](#))
  - highlight widespread flexibility puzzle & introduce **explanation**
- ▶ Behavioral literature on **work meaning**
  - many workers value meaning and are willing to sacrifice wages
    - [Dur and van Lent \(2019\)](#), [Kesternich et al. \(2021\)](#) & [Maestas et al. \(2023\)](#)
  - gender gap in meaning: [Burbano et al. \(2023b\)](#) & [Burbano et al. \(2023a\)](#)
  - negative equilibrium **relation** with **flexibility**
- ▶ Child **penalties** in the labor market
  - small flexibility adjustment ([Felfe 2012](#))
  - large adjustments in labor supply ([Kleven et al. 2019](#))
  - show a substantial **preference** shift for meaning and flexibility

# Results (1): Documenting The Flexibility Puzzle

- ▶ **Women** have stronger **preferences** for flexibility:
  - we estimate their **willingness to pay** in the Netherlands (LISS)
    - $\approx 9\%$  for flexible schedules compared to  $\approx 6\%$
    - $\approx 9\%$  for working from home compared to  $\approx 6\%$
  - document similar patterns internationally (ISSP)
- ▶ **Men** work more **flexible jobs** than women in the Netherlands:
  - $\approx 33\%$  of women can adapt their schedules compared to  $\approx 40\%$
  - $\approx 25\%$  of women can work from home compared to  $\approx 33\%$
  - document similar patterns internationally
- ▶ Robust to full-time & part-time samples

## Results (2): Explaining The Flexibility Puzzle

- ▶ **Women** prefer – and sort into – more **meaningful work**
  - willing to pay  $\approx 8\%$  compared to  $\approx 5\%$
  - $\approx 50\%$  works a highly meaningful job compared to  $\approx 33\%$
- ▶ But meaningful jobs are 20 to 70% **less flexible**
  - we highlight **personal contact** as an important mechanism
  - more meaningful work is associated with:
    - less computer usage & more personal contact
  - but interpersonal interactions hinder workplace flexibility
- ▶ What if **meaningful jobs** were **more flexible**?
  - gender gap in total compensation reduces by 25%
  - motherhood gap remains same

# Outline

1 The Compensating Differentials Model

2 Survey and Choice Experiment

3 Results

4 The Flexibility Price and Mechanism

5 Conclusion

# The Compensating Differentials Model

# The Rosen (1986) Model

- ▶ Consider Rosen (1986) model w/ heterogeneous ability (Bell 2024)
- ▶ Workers' **utility** is:

$$u_i(w_i, m_i, f_i | \theta_i, \eta_i) \quad (1)$$

- value wages  $w_i$ , meaning  $m_i$  and flexibility  $f_i$
- weights depend on preferences  $\theta_i$  and ability  $\eta_i$  is heterogeneous

- ▶ Firms' **profits** are:

$$\pi_j(w_i, m_i, f_i | \Omega_j) \quad (2)$$

- pay wages  $w_i$  and provide meaning  $m_i$  and flexibility  $f_i$
- the cost of providing these amenities is firm-specific through  $\Omega_j$
- yet assume total productivity is the same for all firms

# The Hedonic Equilibrium

- ▶ Competitive hedonic **equilibrium**
  - workers are matched to firms
  - matches characterized by compensation *bundle*
    - consisting of wages, flexibility & meaning
- ▶ Solve for equilibrium separately at each ability level
  - remember that ability is *exogenous*
  - workers cannot choose bundles outside their ability level
- ▶ The matching will be perfectly **assortative within ability** levels
  - workers with highest valuation of a bundle..
  - match with firms that have the lowest cost of providing it

# Preferences and Tradeoffs

- ▶ An individual worker takes all agents' choices as given and solves:

$$\max u_i(w_i, m_i, f_i | \theta_i, \eta_i) \quad \text{s.t.} \quad \mathcal{M}(w, f, m | \eta) \quad (3)$$

- where  $\mathcal{M}(\cdot)$  defines the equilibrium relation between  $(w, f, m)$
- ▶ We are interested in the following objects:
  - workers' **preferences** over meaning and flexibility:  $\theta$
  - equilibrium **relation** between these amenities:  $\mathcal{M}(w, f, m | \eta)$
- ▶ But: challenging to find a good **ability** measure
  - crucial as it defines compensation levels (*offer sets*)
  - amenities ( $\approx$  normal goods) increase with ability ([Hamermesh 1999](#))
  - bad measures  $\rightarrow$  biased correlations ([Hwang et al. 1992](#))

# Estimating Preferences and Tradeoffs

(1) To estimate workers' **preferences** we rely on a **choice experiment**:

- simple to control for offer sets as we observe jobs not chosen
- specify a linear utility function:

$$u_{ij} = \nu + \theta_w \log w_{ij} + \mathbf{a}_{ij} \boldsymbol{\theta}_a + [\mathbf{a}_{ij} \times c_i] \boldsymbol{\theta}_{ac} + \epsilon_{ij} \quad (4)$$

- assume logit errors → estimate parameters with maximum likelihood
- derive the WTP for amenity  $a$  by gender ( $g$ ) and parental status ( $c$ )

(2) Bell (2024) to estimate equilibrium **flexibility price** for meaning

- higher ability workers obtain more meaning *and* more flexibility
- yet ability is noisily measured → two step approach
  - 1 regress wages and amenities on an imprecise ability proxy
  - 2 use predicted values as offer set controls purged of noise
  - inference using Anderson-Rubin bounds (Andrews *et al.* 2019)

# Survey and Choice Experiment

# The Netherlands: Survey & Choice Experiment

- ▶ We designed and fielded a **survey** with LISS (2021):
  - representative household panel from the Netherlands
  - lots of demographic and labor market information
  - final **sample** of 1,800 respondents that (recently) worked
- ▶ Ask both: *levels* and *valuations* of flexibility and meaning

## (1) Questions about respondents' current (/ last) jobs:

- *how are your hours scheduled?*
- *how often can you work from home?*
- *how often do you positively influence your community/society?*
- assess the **levels** of meaning and flexibility

# Discrete Choice Experiments

(2) Ask workers to **choose** between two hypothetical jobs:

	<i>Job A</i>	<i>Job B</i>
Weekly working hours	38	38
Possibility to change work schedule	No Possibilities	No Possibilities
<b>Possibility to telecommute</b>	<b>Yes</b>	<b>No</b>
Positive impact on society or community	Regularly	Regularly
<b>Monthly gross wage (in €)</b>	<b>€2,300</b>	<b>€2,500</b>
<i>Preferred Job</i>	<input type="checkbox"/>	<input type="checkbox"/>

- ▶ Each respondent makes eight choices
  - jobs constructed based on their current amenities
  - and instructed that both jobs are identical otherwise
- Estimate **preferences** for meaning and flexibility

# International Comparison: ISSP

- ▶ Study whether levels and preferences are similar *internationally*
  - 4<sup>th</sup> *Work Orientations* Supplement of the ISSP (2015)
  - final *sample* of more than 13,000 workers across 35 countries
- ▶ Question both **levels** and **preferences** for amenities:
  - amenities in respondent's current job
    - *how are your hours decided on?*
    - *how often can you work from home?*
    - *agree/disagree that job is useful to society?*
  - importance of amenities in a job:
    - *how important is freedom over scheduling?*
    - *how important is a job that is useful to society?*
- ▶ Also additional questions about hours, wages, and demographics

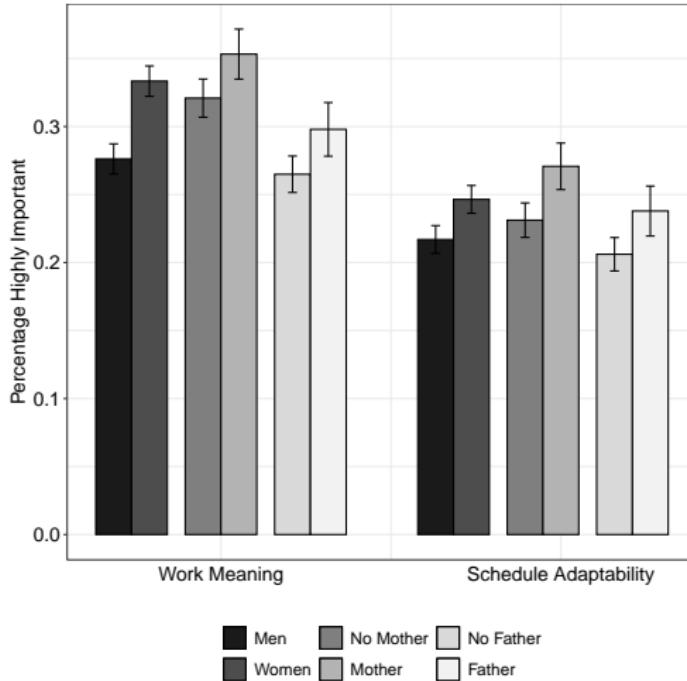
# Results

# Preferences: WTP in the Netherlands (LISS)

	WtP in % wage		P-value
	Men	Women	
<i>Workplace Flexibility</i>			
Schedule Adaptability	<b>0.056</b> (0.007)	<b>0.085</b> (0.010)	0.020
Telecommuting	<b>0.049</b> (0.006)	<b>0.075</b> (0.009)	0.023
<i>Work Meaning</i>			
	<b>0.048</b> (0.006)	<b>0.090</b> (0.009)	0.000
<i>Part-Time Work</i>			
Long Part-Time (32h)	<b>-0.051</b> (0.009)	-0.013 (0.013)	0.021
Short Part-Time (20h)	<b>-0.167</b> (0.016)	<b>-0.044</b> (0.015)	0.000

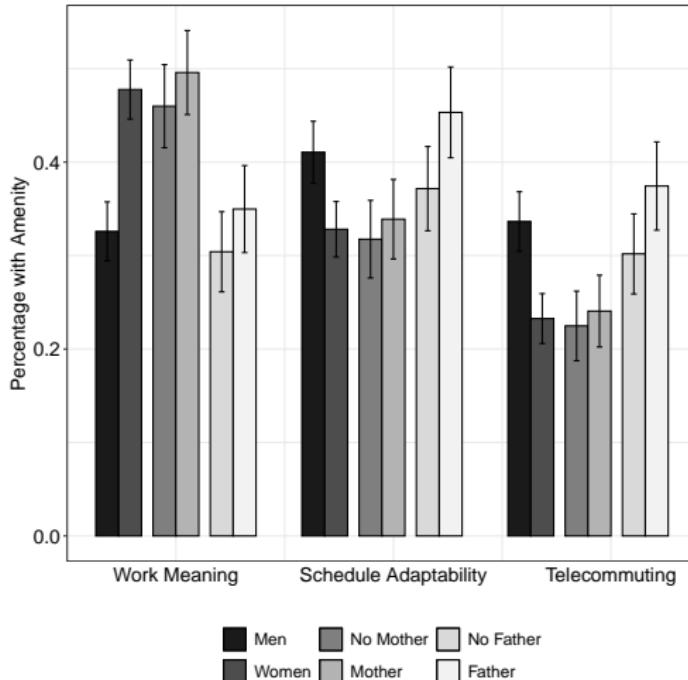
*Notes.* Willingness to Pay for work meaning, workplace flexibility, and part-time work computed using parameters estimated through the discrete choice experiment.

# Preferences: Internationally (ISSP)



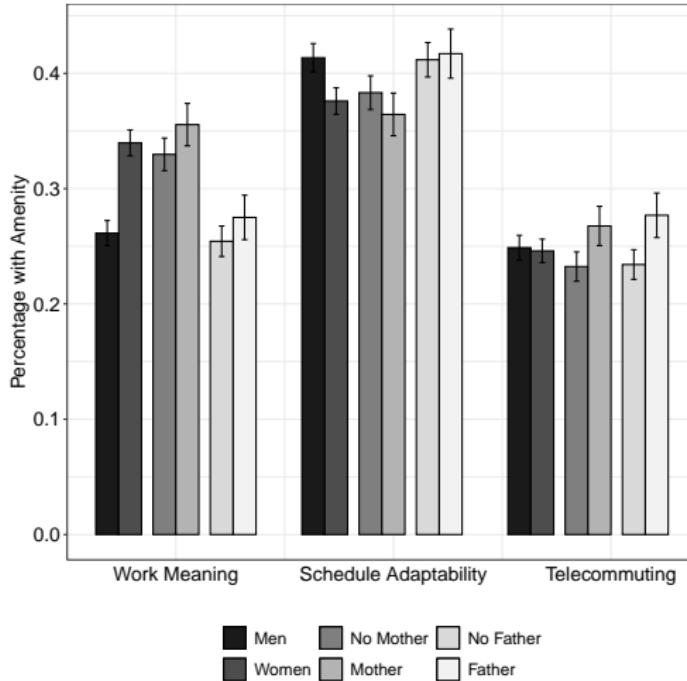
Notes. Heterogeneity in preferences for work meaning and schedule adaptability (telecommuting not questioned). Percentage that considers the amenity highly important.

# Levels: The Netherlands (LISS)



Notes. Heterogeneity in levels of work meaning and schedule adaptability, shows. Percentage that has the amenity in their job.

# Levels: Internationally (ISSP)



*Notes.* Heterogeneity in levels of work meaning and schedule adaptability. Percentage that has the amenity in their job.

# Recap: Preferences and Prevalence

- ▶ Both samples show **disparity** between preferences & outcomes:
  - women value flexibility more than men
  - but men work more flexible jobs
  - flexibility puzzle
- ▶ Both samples also show that:
  - women value work meaning more than men
  - *and* work more meaningful jobs than men
- ▶ Preference differences **robust** to:
  - specification
  - sample selection
  - full-time\*
  - unobserved preference heterogeneity\*

# The Flexibility Price and Mechanism

# The Flexibility Price of Meaningful Work

(a) The Netherlands (LISS)

	Base	Productivity Controls	Bell Proxy
Telecommuting	0.005	-0.020	-0.191
Conf. Int.	(-0.052, 0.063)	(-0.078, 0.037)	(-0.408, 0.017)
Schedule Adaptability	0.056	0.039	<b>-0.715</b>
Conf. Int.	(0.003, 0.110)	(-0.015, 0.093)	(-0.965, -0.506)
Partial F			161.366

(b) The International Sample (ISSP)

	Base	Productivity Controls	Bell Proxy
Telecommuting	<b>0.059</b>	<b>0.041</b>	<b>-0.662</b>
Conf. Int.	(0.040, 0.078)	(0.023, 0.060)	(-0.813, -0.528)
Schedule Adaptability	<b>-0.039</b>	<b>-0.052</b>	<b>-0.653</b>
Conf. Int.	(-0.056, -0.023)	(-0.068, -0.035)	(-0.787, -0.533)
Partial F			355.577

Notes. Regressions of workplace flexibility on work meaning. 'Base' specification has no controls, 'Productivity' specification adds years of education, 'Bell Proxy' specification shows method by [Bell \(2024\)](#). Brackets highlight 95% confidence intervals.

# Mechanism: Explaining the Flexibility Price

- ▶ We ask additional questions about **personal contact**:
  - *how much personal contact with colleagues / clients?*
  - *how much time is spent working from your computer?*
- ▶ These have interesting **correlations** with meaning and flexibility:

	High Contact	High Computer
High Contact	1.00	<b>-0.30</b>
High Computer	<b>-0.30</b>	1.00
High Meaning	<b>0.11</b>	<b>-0.09</b>
Schedule Adaptability	<b>-0.23</b>	<b>0.25</b>
Telecommuting	<b>-0.25</b>	<b>0.37</b>

Notes. Pairwise correlations between amenities and mechanisms in the Netherlands (LISS). Bold faced correlations are significant at the 95% level (Bonferroni-Adjusted).

# Total Compensation

- We define **total compensation** as:

$$\log \text{TC}_i = \log (w_i + \mathbf{WTP}_g^{a,c} \times \mathbf{a}_i) \quad (5)$$

- Counterfactual: what if **meaningful jobs** were **flexible**?
  - work from home in meaningful job ( $\tilde{\text{TC}}_{tc'}$ )
  - schedule adaptability in meaningful job ( $\tilde{\text{TC}}_{sa'}$ )
- Counterfactual: what if **flexible jobs** were **meaningful**?
  - meaning in job with work from home or adaptable schedule ( $\tilde{\text{TC}}_{mw'}$ )

## Total Compensation vs. Counterfactuals

	Observed	TC	$\tilde{TC}_{sa'}$	$\tilde{TC}_{tc'}$	$\tilde{TC}_{mw'}$
Woman	<b>-0.099</b> (0.025)	<b>-0.068</b> (0.026)	<b>-0.053</b> (0.026)	<b>-0.053</b> (0.026)	<b>-0.064</b> (0.026)
Children	<b>0.127</b> (0.025)	<b>0.140</b> (0.027)	<b>0.142</b> (0.027)	<b>0.143</b> (0.027)	<b>0.142</b> (0.027)
Women $\times$ Children	<b>-0.105</b> (0.035)	<b>-0.115</b> (0.037)	<b>-0.113</b> (0.038)	<b>-0.109</b> (0.038)	<b>-0.121</b> (0.038)
Constant	<b>2.978</b> (0.018)	<b>3.026</b> (0.019)	<b>3.034</b> (0.019)	<b>3.034</b> (0.019)	<b>3.038</b> (0.019)
Observations	1813	1813	1813	1813	1813

Notes. Coefficients from regressions of demographic variables (gender and parenthood) on different total compensation measures in the Netherlands (LISS). Standard errors in parentheses. Bold faced estimates are significant at the 95% level.

# Conclusion

# Conclusion

- ▶ We document a **global flexibility puzzle**:
  - women value flexibility higher
  - but men work more flexible jobs
- ▶ We show that this is related to **meaningful work**
  - which women value and sort into
  - but which is significantly less flexible
  - this is partly due to interpersonal contact
- ▶ Reducing the **flexibility price** to meaningful work would:
  - reduce the *gender* gap in total compensation ( $\approx 25\%$ )
  - not change the *motherhood* gap in total compensation

**Thank you for listening!**

## Bibliography I

ANDREWS, I., STOCK, J. H. and SUN, L. (2019). Weak instruments in instrumental variables regression: Theory and practice. *Annual Review of Economics*, **11**, 727–753.

BELL, A. (2024). Job amenities and earnings inequality. Available at SSRN 4173522.

BURBANO, V., PADILLA, N. and MEIER, S. (2023a). Gender differences in preferences for meaning at work.

BURBANO, V. C., FOLKE, O., MEIER, S. and RICKNE, J. (2023b). The gender gap in meaningful work. *Management Science*.

DUR, R. and VAN LENT, M. (2019). Socially useless jobs. *Industrial Relations: A Journal of Economy and Society*, **58** (1), 3–16.

FELFE, C. (2012). The motherhood wage gap: What about job amenities? *Labour Economics*, **19** (1), 59–67.

GOLDEN, L. (2001). Flexible work schedules: Which workers get them? *American Behavioral Scientist*, **44** (7), 1157–1178.

## Bibliography II

HAMERMESH, D. S. (1999). Changing inequality in markets for workplace amenities. *The Quarterly Journal of Economics*, **114** (4), 1085–1123.

HWANG, H.-s., REED, W. R. and HUBBARD, C. (1992). Compensating wage differentials and unobserved productivity. *Journal of Political Economy*, **100** (4), 835–858.

KESTERNICH, I., SCHUMACHER, H., SIFLINGER, B. and SCHWARZ, S. (2021). Money or meaning? Labor supply responses to work meaning of employed and unemployed individuals. *European Economic Review*, **137**, 103786.

KLEVÉN, H., LANDAIS, C. and SØGAARD, J. E. (2019). Children and gender inequality: Evidence from denmark. *American Economic Journal: Applied Economics*, **11** (4), 181–209.

MAESTAS, N., MULLEN, K. J., POWELL, D., VON WACHTER, T. and WENGER, J. B. (2023). The value of working conditions in the united states and implications for the structure of wages. *American Economic Review*, **113** (7), 2007–2047.

## Bibliography III

MAS, A. and PALLAIS, A. (2017). Valuing alternative work arrangements. *American Economic Review*, **107** (12), 3722–3759.

— and — (2020). Alternative work arrangements. *Annual Review of Economics*, **12** (1), 631–658.

ROSEN, S. (1986). The theory of equalizing differences. In *Handbook of Labor Economics*, vol. 1, 12, Elsevier, pp. 641–692.

WISWALL, M. and ZAFAR, B. (2018). Preference for the workplace, investment in human capital, and gender. *The Quarterly Journal of Economics*, **133** (1), 457–507.

## Appendix – Demographics (LISS)

	Total	Men	Women	P-value
<b>Observations</b>				
Number of obs.	1813	849	962	.
<b>Age</b>				
Mean	46.51	47.32	45.79	0.00
Std dev	11.39	11.56	11.56	.
<b>Family</b>				
Married (%)	0.53	0.55	0.52	0.29
Children (%)	0.49	0.48	0.50	0.43
<b>Education</b>				
Years of Schooling (mean)	15.82	15.70	15.93	0.07
Years of Schooling (std dev)	2.57	2.40	2.40	.
<b>Amenities</b>				
Schedule Adaptability (mean)	0.37	0.41	0.33	0.00
Schedule Adaptability (std dev)	0.48	0.47	0.47	.
Telecommuting (mean)	0.28	0.34	0.23	0.00
Telecommuting (std dev)	0.45	0.42	0.42	.
Meaning (mean)	0.41	0.33	0.48	0.00
Meaning (std dev)	0.49	0.50	0.50	.

Back

# Appendix – Demographics (ISSP)

	Total	Men	Women	P-value
<b>Observations</b>				
Number of obs.	13077	6232	6845	.
<b>Age</b>				
Mean	42.54	42.69	43.30	0.00
Std dev	10.63	10.81	10.55	.
<b>Family</b>				
Married (%)	0.55	0.56	0.53	0.00
Children (%)	0.36	0.33	0.38	0.00
<b>Education</b>				
Years of Schooling (mean)	1.93	1.85	1.99	0.00
Years of Schooling (std dev)	0.66	0.67	0.65	.
<b>Amenities</b>				
Schedule Adaptability (mean)	0.39	0.42	0.38	0.00
Schedule Adaptability (std dev)	0.49	0.49	0.49	.
Telecommuting (mean)	0.25	0.25	0.25	0.38
Telecommuting (std dev)	0.43	0.44	0.43	.
Meaning (mean)	0.30	0.26	0.34	0.00
Meaning (std dev)	0.46	0.44	0.47	.

Back

## Appendix – Alternative Utility w/o Interactions

	Men	Women
<i>Workplace Flexibility</i>		
Schedule Adaptability	<b>0.058</b> (0.005)	<b>0.091</b> (0.008)
Telecommuting	<b>0.054</b> (0.004)	<b>0.087</b> (0.007)
<i>Work Meaning</i>		
	<b>0.047</b> (0.004)	<b>0.079</b> (0.007)
<i>Part-Time Work</i>		
Long Part-Time (32h)	<b>-0.063</b> (0.007)	0.013 (0.009)
Short Part-Time (20h)	<b>-0.192</b> (0.013)	<b>-0.027</b> (0.010)

Back

## Appendix – Speeders & Inattentive

	Men	Women
<i>Workplace Flexibility</i>		
Schedule Adaptability	<b>0.067</b> (0.007)	<b>0.098</b> (0.011)
Telecommuting	<b>0.065</b> (0.007)	<b>0.096</b> (0.010)
<i>Work Meaning</i>		
	<b>0.066</b> (0.007)	<b>0.110</b> (0.009)
<i>Part-Time Work</i>		
Long Part-Time (32h)	<b>-0.055</b> (0.011)	-0.018 (0.014)
Short Part-Time (20h)	<b>-0.177</b> (0.019)	<b>-0.060</b> (0.017)

Back

## Appendix – Full Time

	Men	Women
<i>Workplace Flexibility</i>		
Schedule Adaptability	<b>0.051</b> (0.007)	<b>0.057</b> (0.010)
Telecommuting	<b>0.046</b> (0.006)	<b>0.066</b> (0.009)
<i>Work Meaning</i>		
	<b>0.046</b> (0.006)	<b>0.065</b> (0.008)
<i>Part-Time Work</i>		
Long Part-Time (32h)	<b>-0.053</b> (0.010)	<b>-0.030</b> (0.012)
Short Part-Time (20h)	<b>-0.200</b> (0.018)	<b>-0.222</b> (0.029)

Back

## Appendix – Unobserved Heterogeneity

	Men	Women
<i>Workplace Flexibility</i>		
Schedule Adaptability	<b>0.039</b> (0.007)	<b>0.048</b> (0.007)
Telecommuting	<b>0.046</b> (0.006)	<b>0.049</b> (0.008)
<i>Work Meaning</i>		
	<b>0.028</b> (0.006)	<b>0.074</b> (0.007)
<i>Part-Time Work</i>		
Long Part-Time	<b>-0.074</b> (0.014)	-0.022 (0.015)
Short Part-Time	<b>-0.448</b> (0.108)	<b>-0.202</b> (0.041)

Back