



2023 UK STATA CONFERENCE

# USE OF STATA IN MODELING THE DETERMINANTS OF WORK ENGAGEMENT

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# What will I talk about?

## Work engagement in the existing research

At the **beginning of XXI** → the increase of interest in the WE

William Kahn (1990)

Practitioners & Academics (psychology of work and organisation, management science, economy – not so much)

Metaanalysis (frequency of concept using in the scientific articles, models' review etc.)

Searching for a term in google: 2010 – 0,5 million results (Shuck, Wollard). Today – 223 million

## Work engagement – definition & measurement

**Positive state of mind connected with WORK which is characterised by:**  
VIGOR (energy), DEDICATION (enthusiasm) and ABSORPTION

**Measurement:** UTRECHT WORK ENGAGEMENT SCALE

. tabulate q00a

Q00a - At my work I   feel full of energy   [Please tell me how   often you feel this			
	Freq.	Percent	Cum.
Always	8,154	18.60	18.60
Most of the time	22,679	51.72	70.31
Sometimes	9,882	22.54	92.85
Rarely	2,278	5.19	98.05
Never	653	1.49	99.53
DK (spontaneous)	139	0.32	99.85
Refusal (spontaneous)	65	0.15	100.00
Total	43,850	100.00	



## Research question

In what way do working conditions, occupational characteristics, the level of human capital and some macroeconomic and macrosocial factors influence or are correlated with the level of work engagement in EU countries?

## Sources of data - data combining & cleaning

### Final database

115 608 observations/101 variables/36 European countries

Eurofound – EWCS\* 2015

Eurofound –  
EWCS\* 2021

The World Bank  
(The World Governance  
Indicator/Doing Business)

Eurostat/Office for National  
Statistics  
(GDP per capita  
unemployment/employment rate)

European Social Survey  
(social trust)

\*EWCS – European Working Conditions Survey

## Modeling Work Engagement

Dependent (explained) variable  
**WORK ENGAGEMENT**

3 variables into **Index**  
replace **engagement\_index\*** =  
(eng\_energy + eng\_enthusiastic +  
eng\_timeflies) / 3 if eng\_energy > 0 |  
eng\_enthusiastic > 0 | eng\_timeflies > 0

\*EWCS concept

Explanatory variables (predictors)

Clustering similar into groups according  
theory and existing models:

1. Working conditions
2. Working forms
3. Professional characteristics
4. Demographic and macro data
5. Human capital

# Work engagement in the existing research

At the **beginning of XXI** → the increase of interest in the WE

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graph TD; A[William Kahn (1990)] --> B[Practitioners & Academics (psychology of work and organisation, management science, economy – not so much)]; B --> C[Metaanalysis (frequency of concept using in the scientific articles, models' review etc.)];
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Most of the time	22,679	51.72	70.31
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# Sources of data - data combining & cleaning

## Obstacles

Due to change in the interviewing mode in EWCS (telephone interview) databases were more different than similar (many questions removed or reformulated)



Only some variables: the same questions, scales, cafeteria style/response options → simple *merge* or *append* sometimes impossible



Recoding, re-labeling, generating, replacing if...

# Modeling Work Engagement

Dependent (explained) variable

**WORK ENGAGEMENT**



3 variables into **index**

replace **engagement\_index\*** =

$$\frac{(\text{eng\_energy} + \text{eng\_enthusiastic} + \text{eng\_timeflies})}{3} \text{ if } \text{eng\_energy} > 0 \mid \text{eng\_enthusiastic} > 0 \mid \text{eng\_timeflies} > 0$$

\*EWCS concept

**Explanatory variables** (predictors)

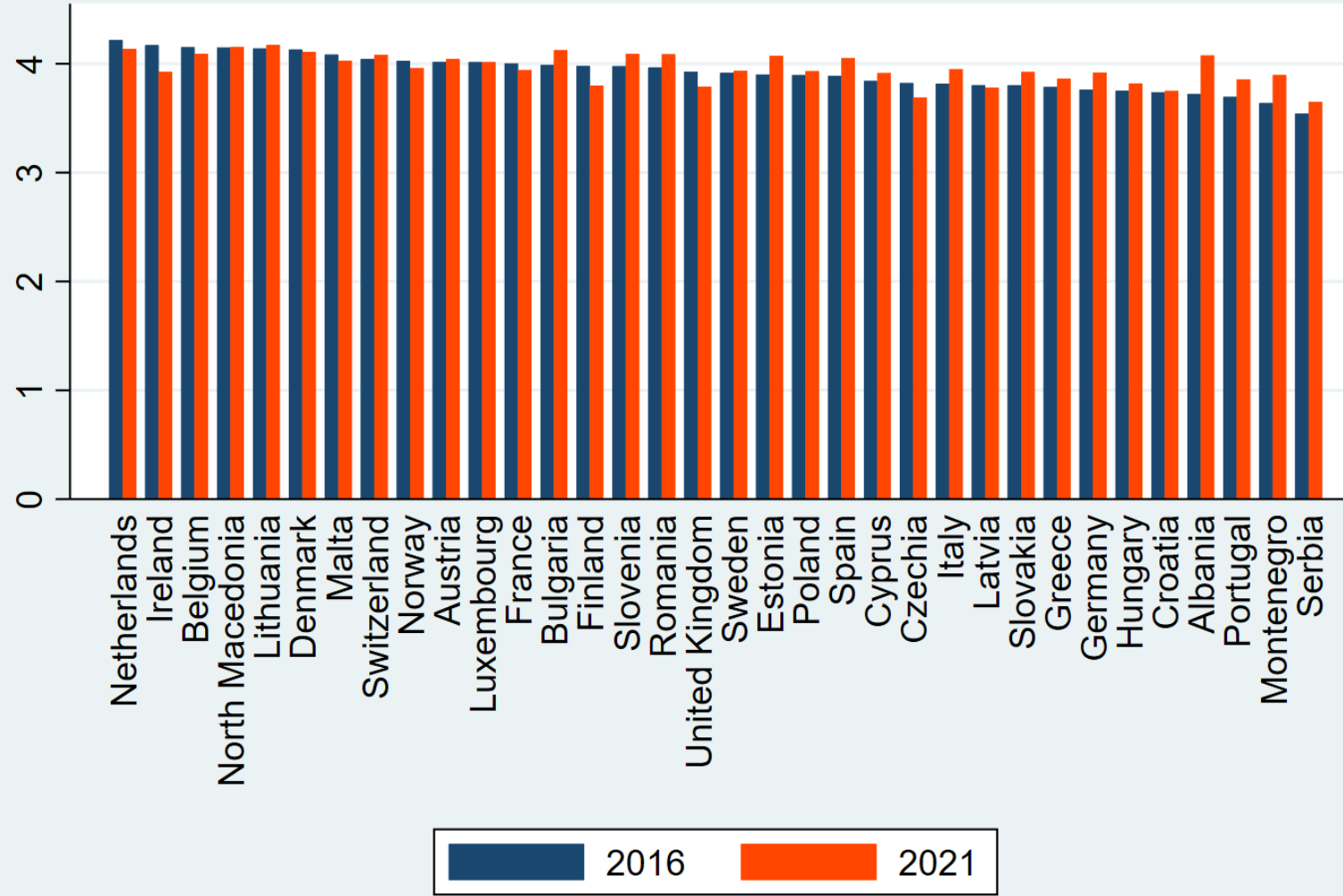


Clustering similar into groups according theory and existing models:

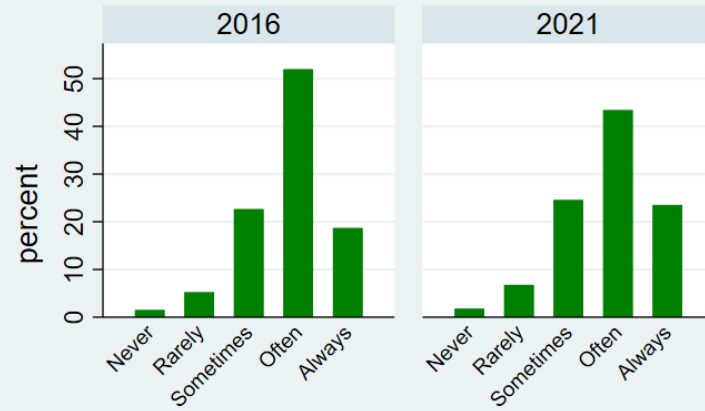
1. Working conditions
2. Working forms
3. Professional characteristics
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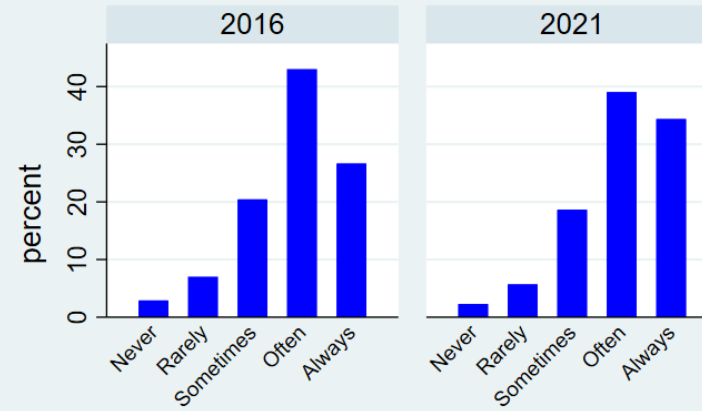
## Engagement index



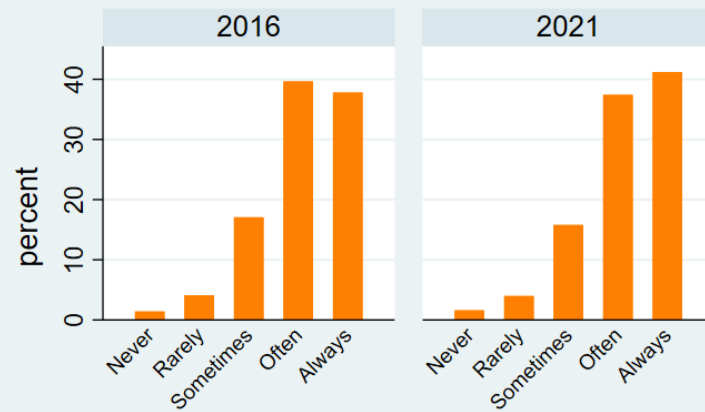
### At my work I feel full of energy



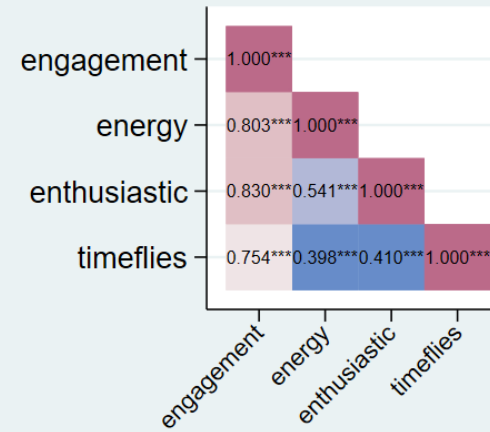
### I am enthusiastic about my job



### Time flies when I am working



### corr



Engagment index values – raw data	Obs	Mean	Std. Dev.	Min	Max
	2016				
energy	43,646	3.81114	0.84912	1	5
enthusiastic	43,608	3.834847	0.992722	1	5
timeflies	43,666	4.083154	0.912188	1	5
engagement	43,513	3.91054	0.743823	1	5
	2021				
energy	35,794	3.801559	0.932941	1	5
enthusiastic	35,778	3.975124	0.980793	1	5
timeflies	35,807	4.126288	0.926062	1	5
engagement	35,689	3.967702	0.738489	1	5
kwallis test by country and year, p<0.001					
Engagment - dummy (1 - Often/always)					
	2016				
energy	43,646	0.706434	0.455401	0	1
enthusiastic	43,608	0.696524	0.459764	0	1
timeflies	43,666	0.774332	0.418026	0	1
engagement	43,513	0.60529	0.488794	0	1
	2021				
energy	35,794	0.669135	0.470531	0	1
enthusiastic	35,778	0.733943	0.441901	0	1
timeflies	35,807	0.786159	0.410022	0	1
engagment_index	35,689	0.627869	0.48338	0	1
kwallis test by country and year, p<0.001					

Variable	Obs	Mean	Std. Dev.	Min	Max
part_time	111,995	1.82357	0.381185	1	2
usual_hours_k	111,290	39.0136	12.97009	1	168
totalhour	111,290	39.7282	13.75106	1	328
usual_days	78,270	5.01069	0.997512	1	7
hours_others_k	5,407	15.0847	14.65248	0	160
telework	62,618	3.1185	1.804509	1	6
night	114,760	1.31	0.462493	1	2
noise	91,233	1.98115	1.211407	1	5
chemicals	115,311	1.68081	1.164316	1	5
infect	115,270	1.51694	1.07451	1	5
tiring_poses	91,169	2.40017	1.299172	1	5
lifting	115,398	1.34891	0.905825	1	5
carrying_lbs	115,452	1.96399	1.223251	1	5
repetitives	91,201	2.69707	1.524617	1	5
dealing_cuts	115,340	3.2904	1.538028	1	5
computer	115,425	3.53158	1.611857	1	5
loc_home	115,056	2.17098	1.496812	1	5
commute_time_s	68,484	42.7448	36.96349	1	480
osh_risk	114,349	1.71805	0.449952	1	2
ISCO_1_08	115,420	5.10121	2.430923	1	10
employee_solid	114,691	1.14986	0.356939	1	2
selfemp_dir	79,895	0.08333	0.276389	0	1
selfemp_busr	79,895	0.02384	0.152563	0	1
selfemp_wof	79,895	0.1114	0.314624	0	1
selfemp_surr	79,895	0.01351	0.115425	0	1
selfemp_frur	79,895	0.0293	0.16865	0	1
selfemp_paly	79,895	0.00344	0.058568	0	1
selfemp_wis	16,927	1.67957	0.466658	1	2
NACE_broad_s	115,315	5.97484	3.11924	1	16
private_seur	114,272	1.49184	0.873256	1	5
wp_size	85,237	4.36867	1.983883	1	8
number_jobur	115,408	1.07552	0.264235	1	2
gender_recid	115,608	1.48459	0.504107	1	9
age	115,316	42.4956	12.49371	15	89
seniority	114,067	9.84273	10.0821	0	75
ISCED_11	115,083	5.47227	1.874073	1	9

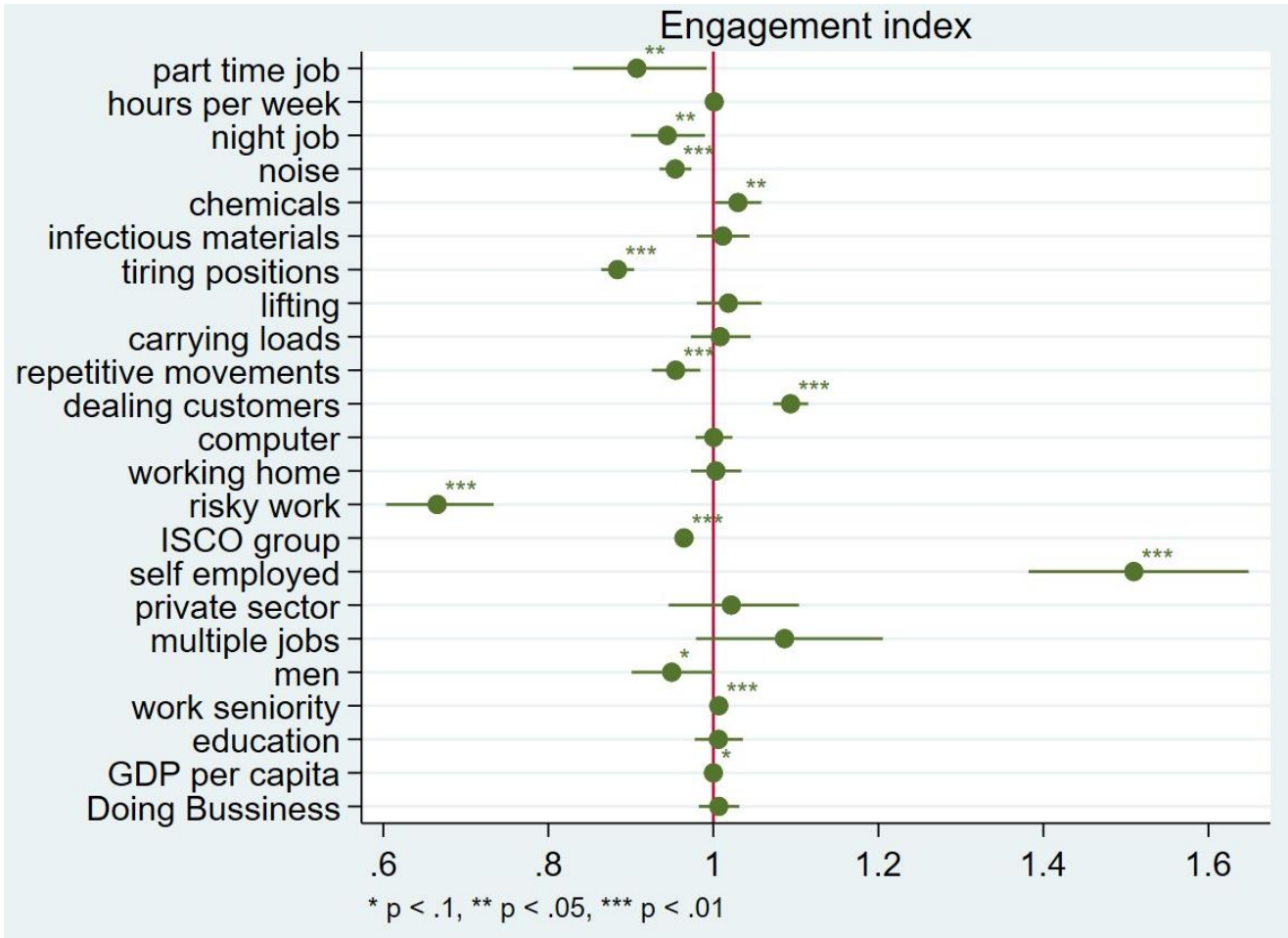
Explanatory variables

PLUS MACRO VARIABLES:

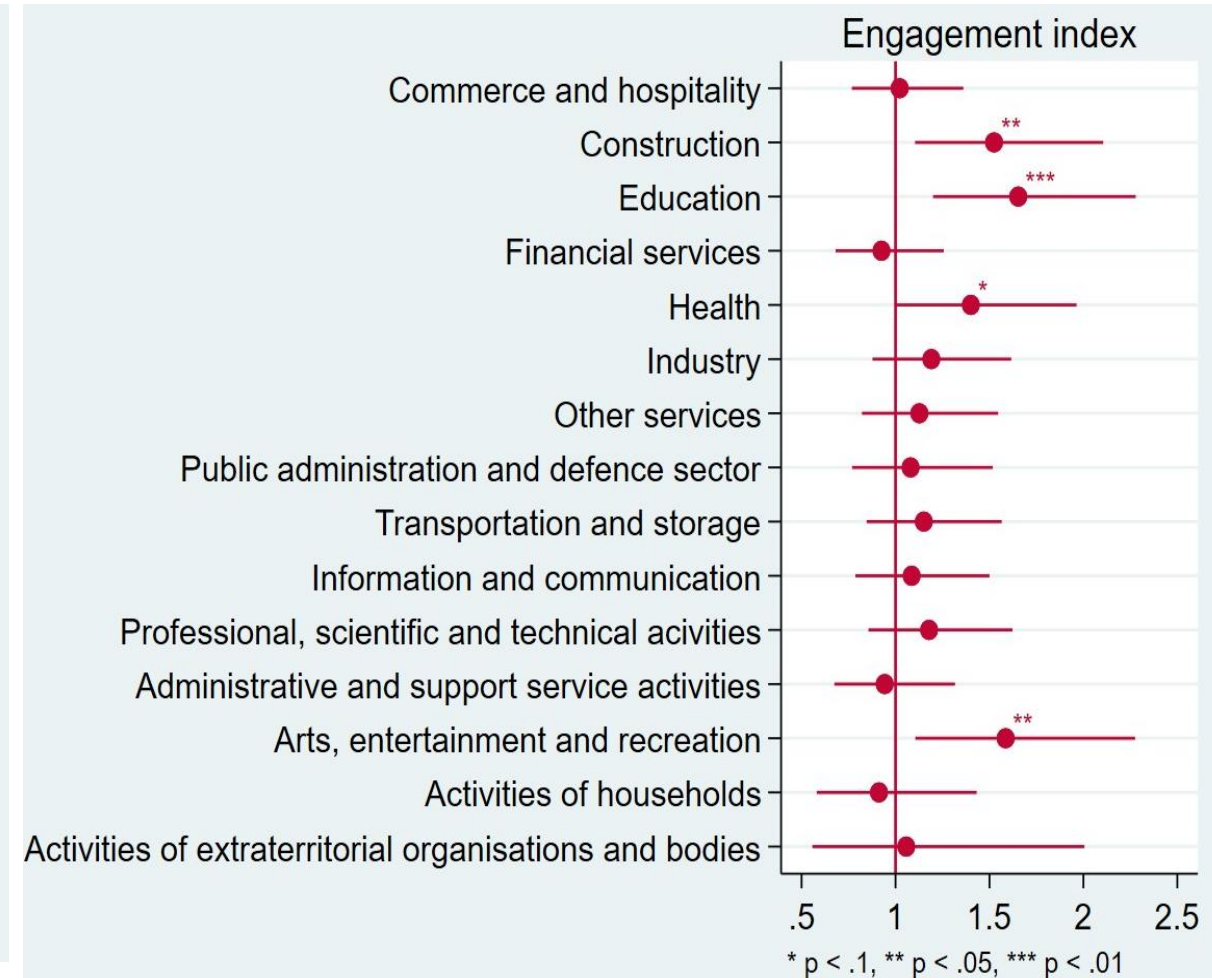
GDP per capita


Doing Business

# Continue



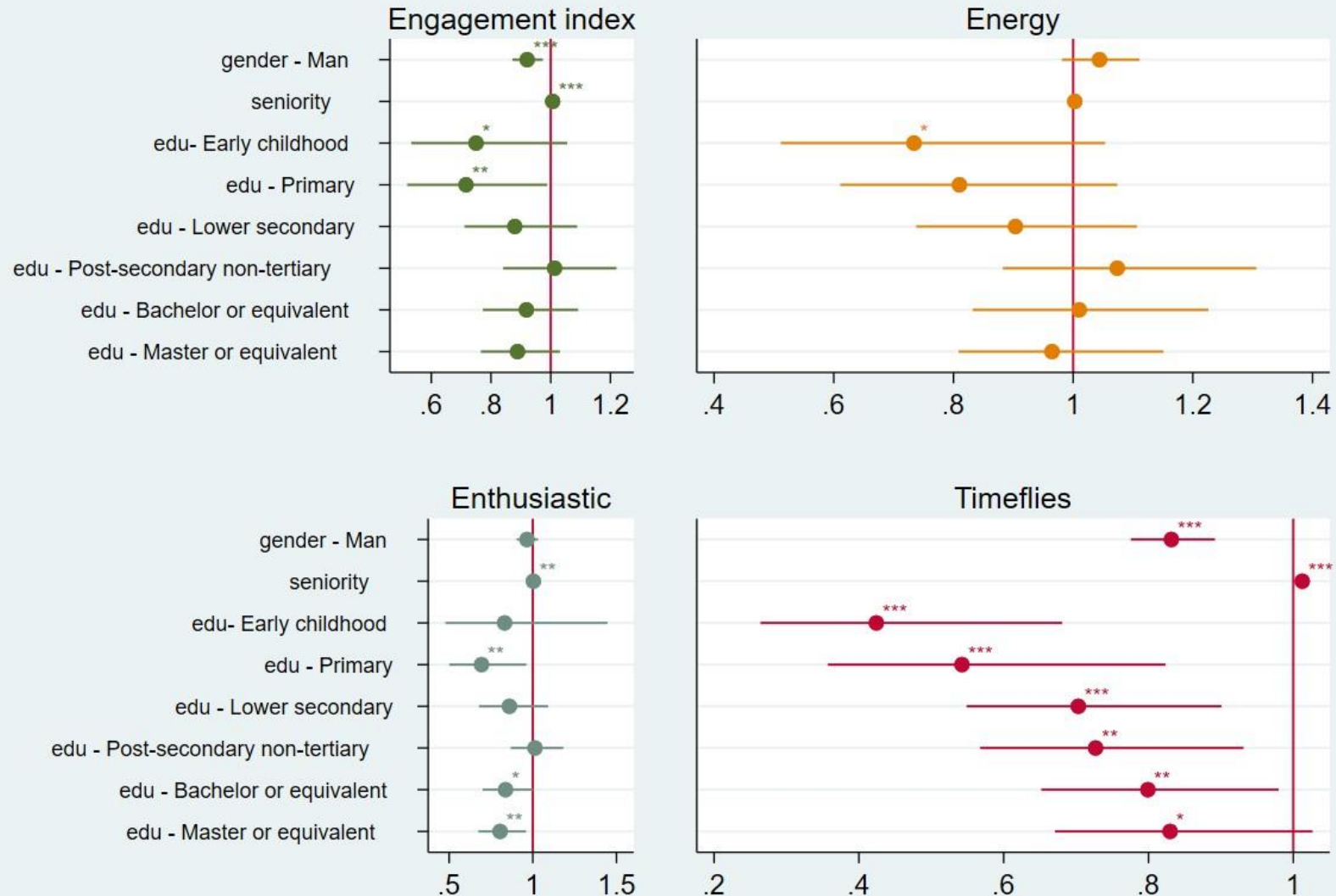
# Non-continue variables



VARIABLES	index	energy	enthusiastic	timeflies
part time job	0.907**	0.933	0.842***	0.969
usual hours week	1.001	0.999	1.000	1.004**
night job	0.944**	0.946**	0.964	0.917***
noise	0.954***	0.957***	0.963***	0.973**
chemicals	1.030**	1.009	1.027*	1.020
infectious materials	1.011	1.000	1.016	0.994
tiring positions	0.884***	0.875***	0.890***	0.922***
lifting	1.018	1.041*	1.043**	0.944***
carrying loads	1.008	1.021	1.006	1.040**
repetitive movements	0.954***	0.933***	0.937***	0.955***
dealing customers	1.093***	1.084***	1.098***	1.044***
computer	1.001	0.966***	1.008	0.997
working home	1.003	0.967**	1.016	1.041**
risk work	0.665***	0.575***	0.620***	0.815***
ISCO (professional group)	0.964***	0.981***	0.948***	0.966***
selfemployed	1.510***	1.335***	1.620***	1.312***
private sector	1.022	1.096**	0.985	0.988
multiple jobs	1.086	1.094	1.020	1.103*
men	0.950*	1.075**	1.010	0.865***
seniority	1.007***	1.003	1.004**	1.013***
ISCED (edu)	1.006	1.012	1.016	1.034**
GDP per capita	1.000*	1.000*	1.000**	1.000
NACE				
Doing Bus	1.007	0.990	1.027*	1.005
Constant	0.922	5.891**	0.292	2.155
Observations	55,024	55,137	55,114	55,154
*** p<0.01, ** p<0.05, * p<0.1				

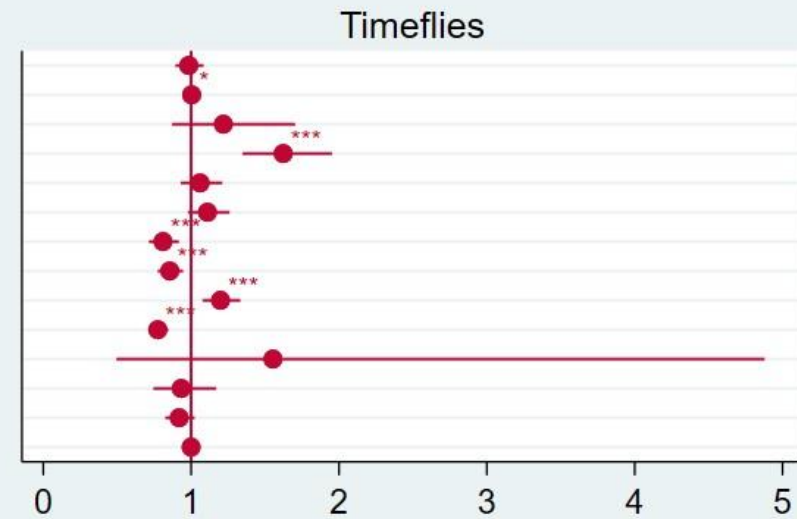
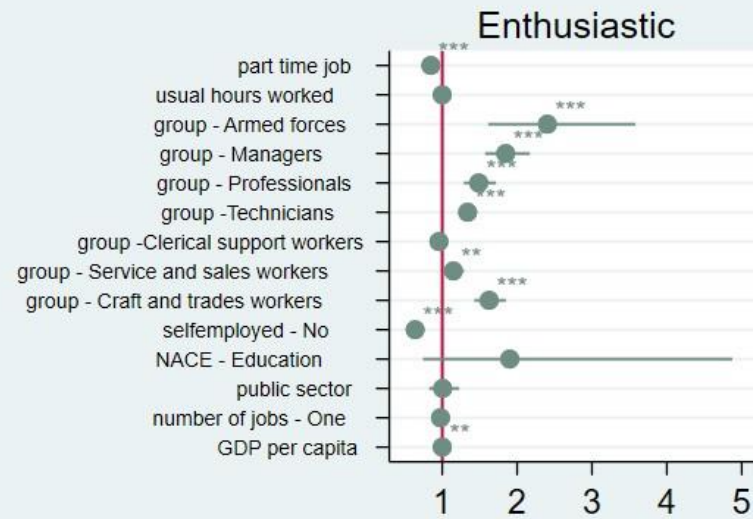
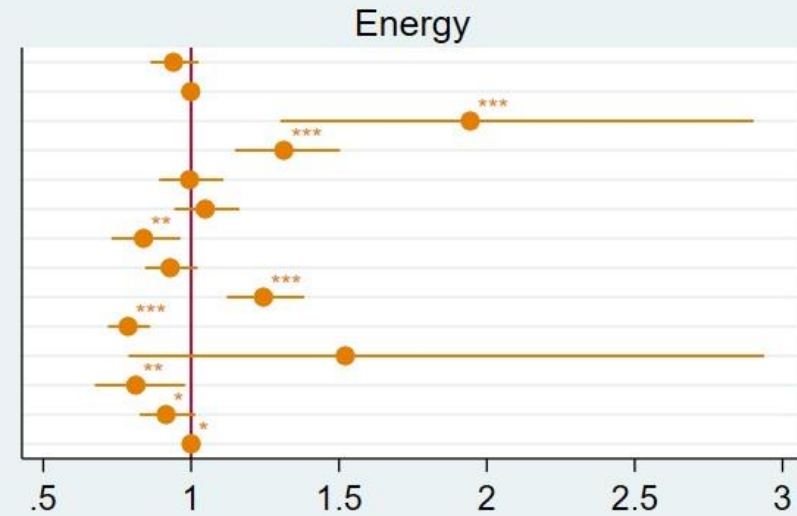
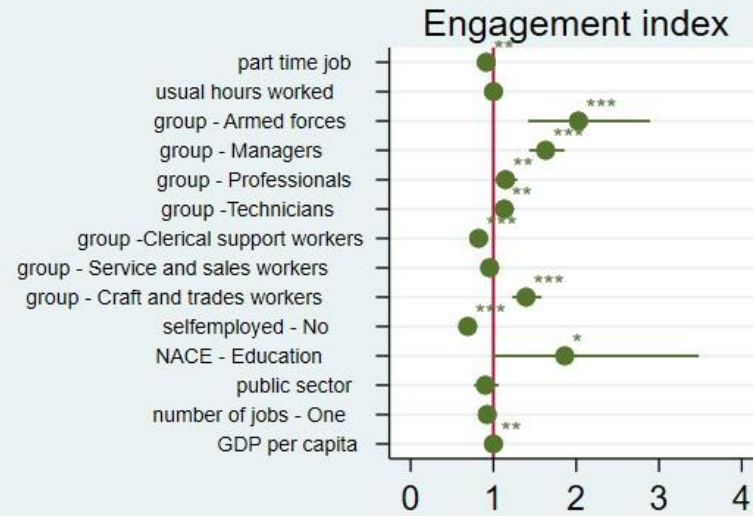
VARIABLES	index	energy	enthusiastic	timeflies
Commerce and hospitality	1.022	1.080	1.054	0.906
Construction	1.524**	1.425**	1.624***	1.373***
Education	1.653***	1.597***	1.969***	1.337**
Financial services	0.925	0.966	0.914	1.043
Health	1.401*	1.376**	1.586***	1.305**
Industry	1.191	1.155	1.248	1.092
Other services	1.127	1.102	1.293*	0.979
Public administration and defence sector	1.080	1.213	1.102	0.954
Transportation and storage	1.151	1.113	1.170	1.059
Information and communication	1.086	1.255*	1.220	0.948
Professional, scientific and technical acivities	1.178	1.165	1.283	1.048
Administrative and support service activities	0.942	1.022	0.961	0.968
Arts, entertainment and recreation	1.586**	1.555**	2.072***	1.092
Activities of households	0.912	1.043	0.800	0.935
Activities of extraterritorial organisations	1.057	1.286	1.132	0.941

# Ordinal variables



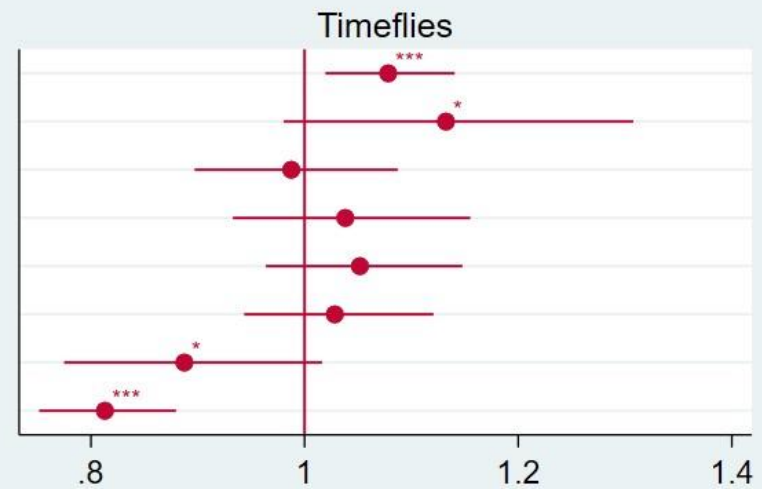
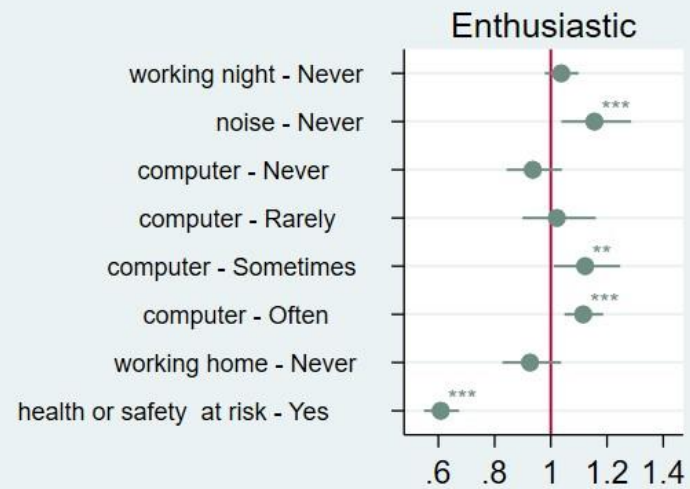
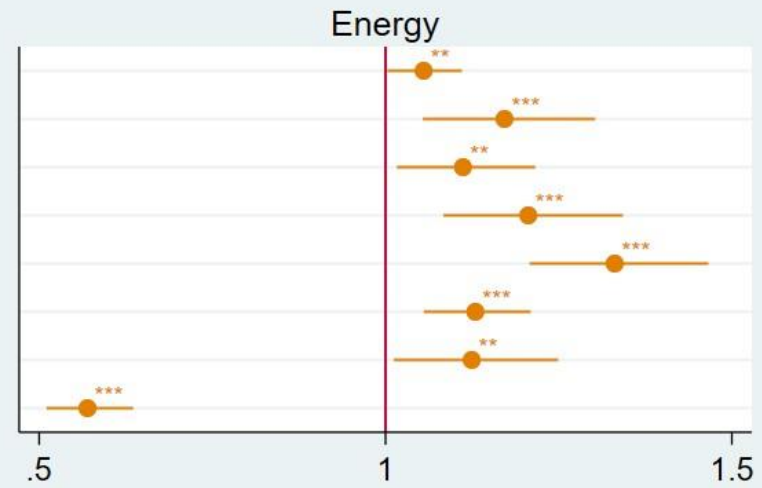
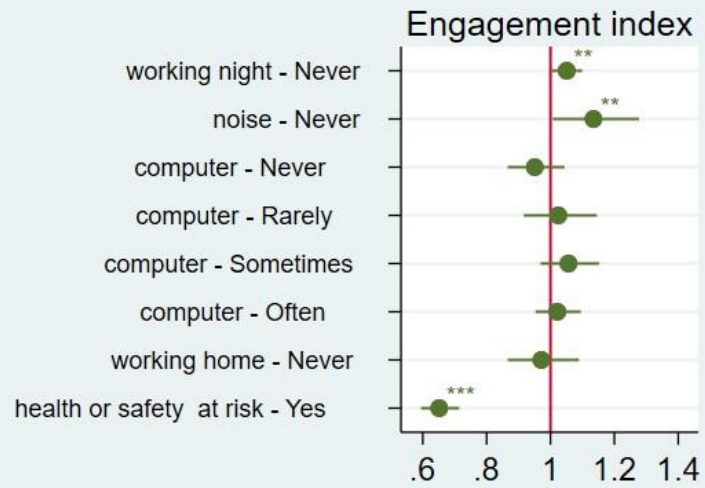
\* p < .1, \*\* p < .05, \*\*\* p < .01



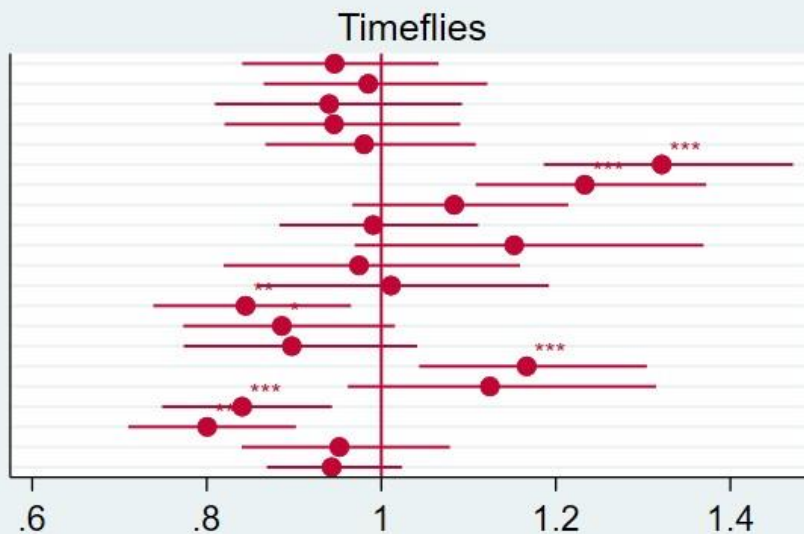
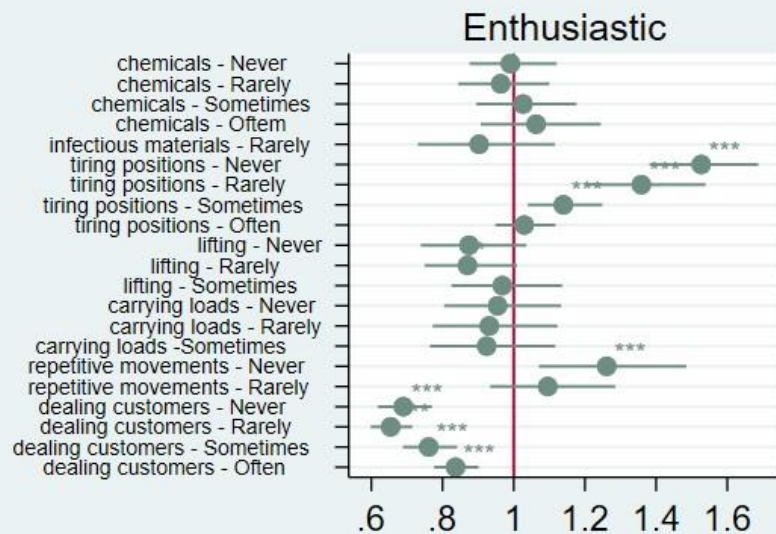
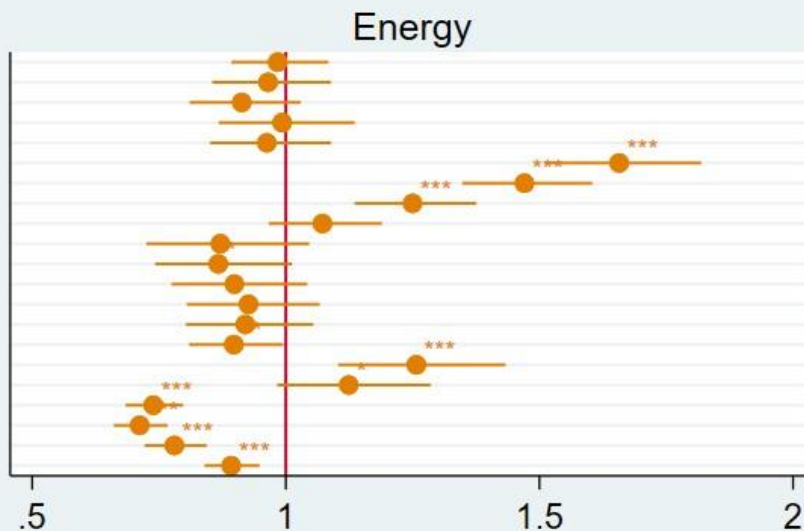
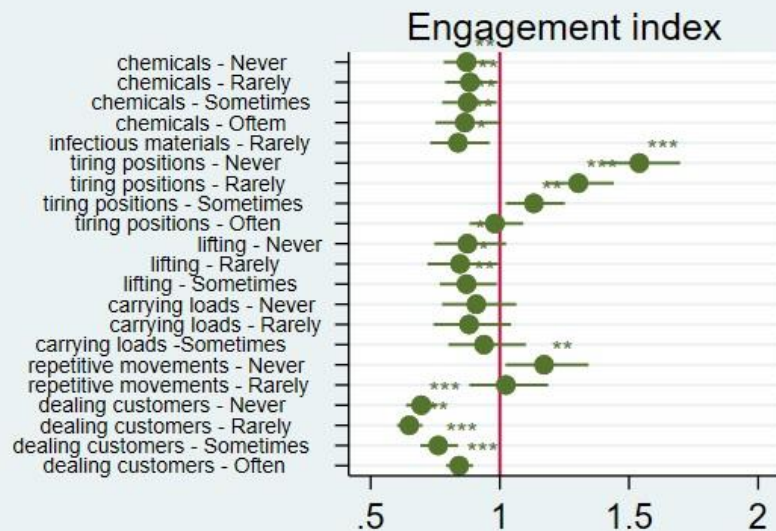


\*  $p < .1$ , \*\*  $p < .05$ , \*\*\*  $p < .01$





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\*  $p < .1$ , \*\*  $p < .05$ , \*\*\*  $p < .01$

# References

Eurofound. (2022). European Working Conditions Telephone Survey, 2021. [data collection]. UK Data Service. SN: 9026, DOI: 10.5255/UKDA-SN-9026-1

European Foundation for the Improvement of Living and Working Conditions. (2017). European Working Conditions Survey, 2015. [data collection]. 4th Edition. UK Data Service. SN: 8098, <http://doi.org/10.5255/UKDA-SN-8098-4>

*Your work is going to fill a large part of your life, and the only way to be truly satisfied is to do what you believe is great work.  
And the only way to do great work is to love what you do.  
If you haven't found it yet, keep looking (Steve Jobs).*

**Thank you for your attention!**