# Do Recruiters Select Workers with Different Personality Traits for Different Tasks?

A Discrete Choice Experiment

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IZA Cedefop Eurofound, 20-21 August 2020



#### **Motivation**

 Task approach: Analytical and interactive tasks gain importance and yield employability and wage returns (Autor et al. 2003; Spitz-Oener 2006)

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## Selection employee side:

- Personality traits correlate with occupation and career choice (e.g., Caliendo et al. 2014; Wells et al. 2016)
- But also with selection into (e.g., Deming and Kahn 2017) and performance in tasks (e.g., Mount et al. 1998)

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Selection employer side (our focus):

- Hiring preferences also related to personality (e.g., Moy and Lam 2004; Hoeschler and Backes-Gellner 2018; Piopiunik et al. 2018)
- Heterogeneity in recruiters' hiring preferences for personality traits with regard to tasks is less studies

## **Research Question and Study Design**

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- Representative, crosssectional survey of German firms
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- Assessment of tasks by firm and occupation



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- Representative, crosssectional survey of German firms
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Discrete Choice Experiment:

- Random sub-sample of 1,300 firms
- Recruiters are confronted with two hypothetical applicants
- Efficient choice design: 112 choice sets grouped in 16 blocks
- Each recruiter makes 7 choices

#### **Applicant Profil 1:**

- Has average professional competence
- Shows active imagination and solves tasks in an original way
- Completes tasks thoroughly and efficently
- Seems to be reserved and quiet when dealing with others
- Seems to be considerate and kind
- Seems to be tense and nervous
- Receives a wage that equals the average skilled labor wage in your company

- Has above average professional competence
- Shows little imagination and solves tasks in a conventional way
- Completes tasks carelessly and unorganized
- Seems to be communicative and sociable when dealing with others
- Seems to be cold and sometimes somewhat rude to others
- Seems to be relaxed and to handle stress well
- Receives a wage that is 15% above the average skilled labor wage in your company

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#### **Applicant Profil 2:**

- Has above average professional competence
- Shows little imagination and solves tasks in a conventional way
- Completes tasks carelessly and unorganized
- Seems to be communicative and sociable when dealing with others
- Seems to be cold and sometimes somewhat rude to others
- Seems to be relaxed and to handle stress well



Relaxed (GSOEP, BFI), handle stress well (GSOEP, BFI)



## **Econometrics and Descriptives**

The latent variable (utility) for alternative j in t is:  $Unjt = \beta n \times njt + \epsilon njt$ ;

- Recruiter n chooses j = 1 if Un1t > Un2t
- Mixed logit model using simulated maximum likelihood

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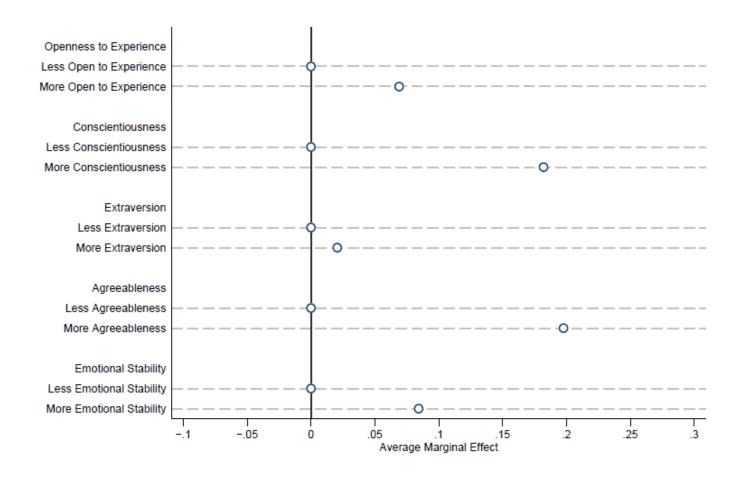
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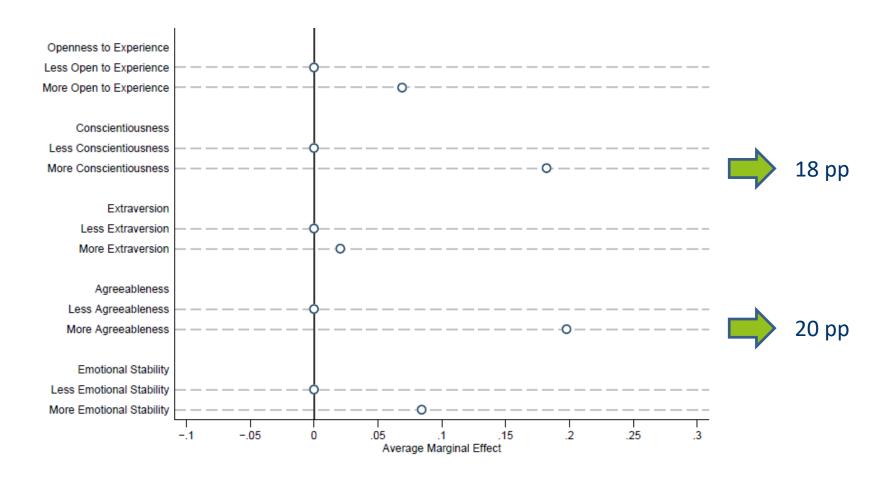
Only respondents directly involved in recruitment:

- 8,342 applicant profiles, 4,171 recruitment decisions, 634 recruiters
- 41% firm owners, 17% CEOs, 10% department heads, 15% HR heads, 8% heads of commerce, 3% heads of training, 7% other DMs
- 62% male; 46% academic degree, 38% higher voc., 16% voc. degree

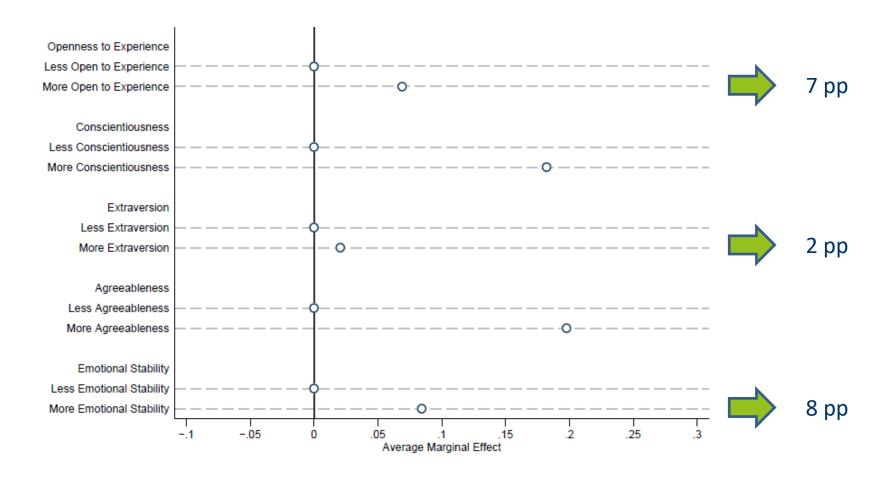
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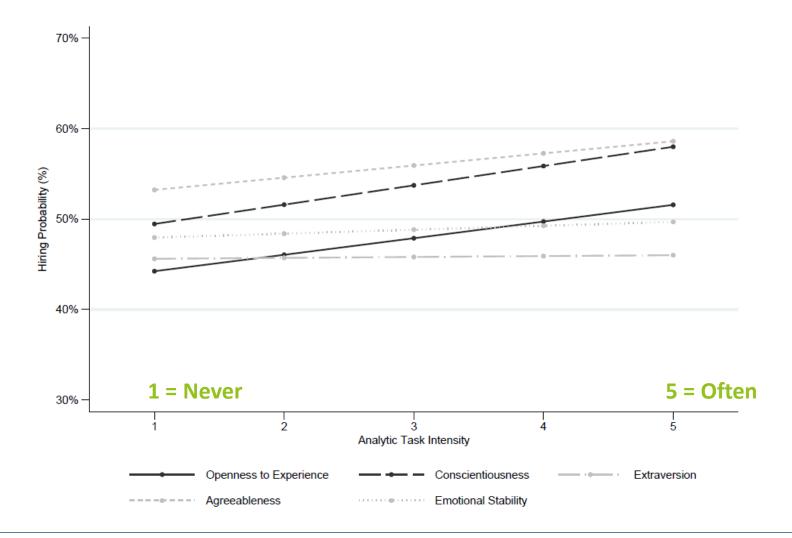


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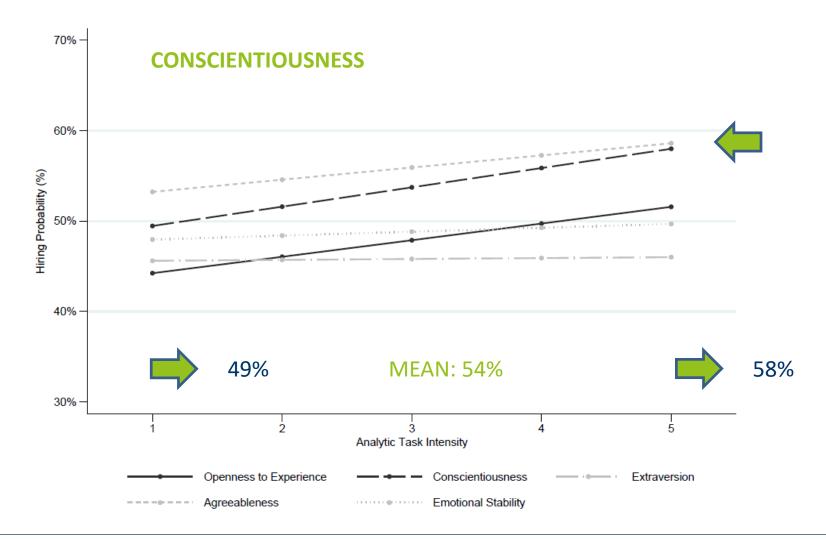




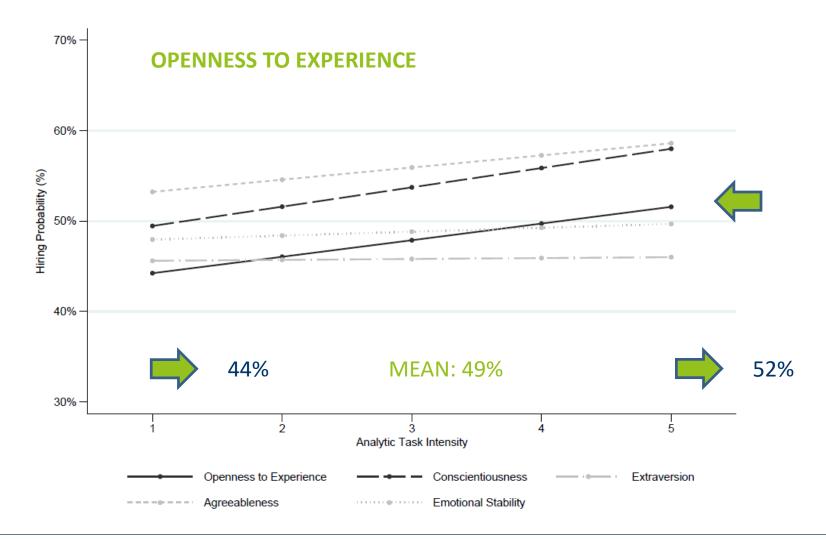
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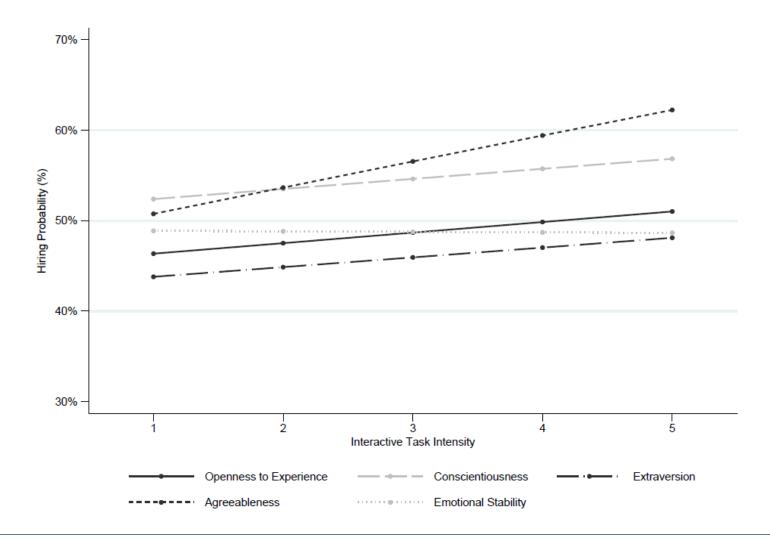


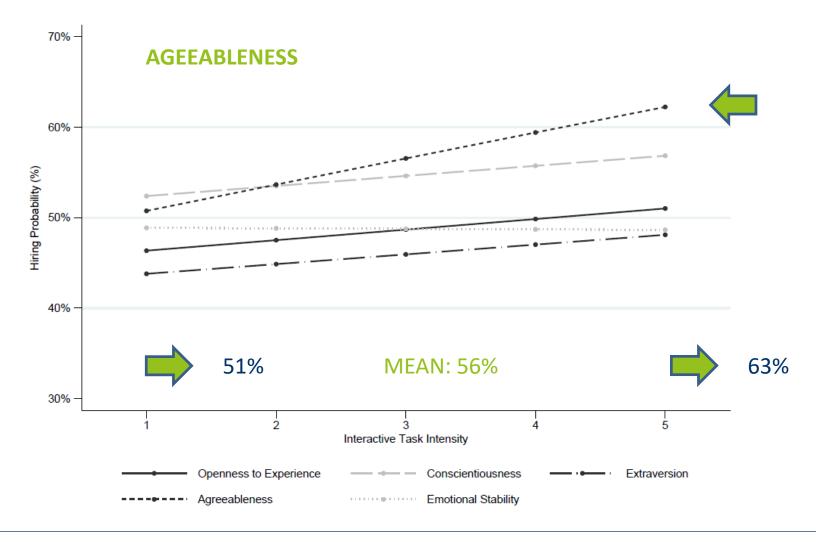
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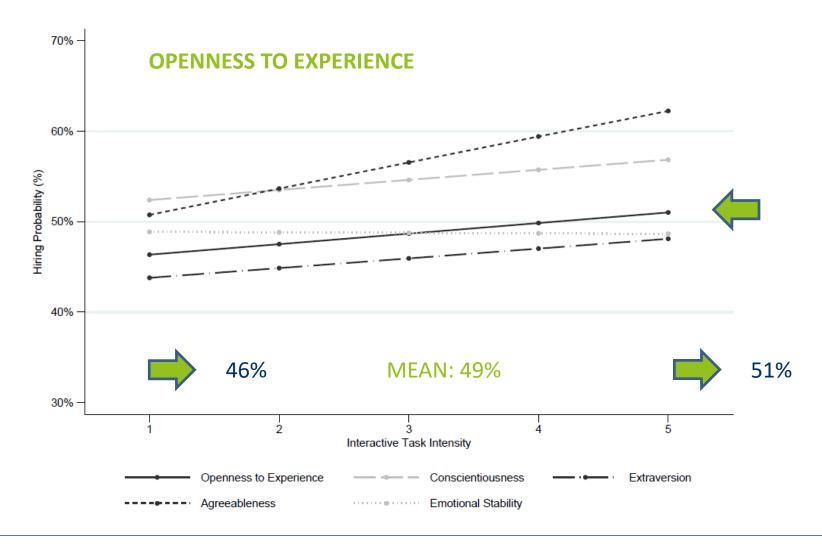
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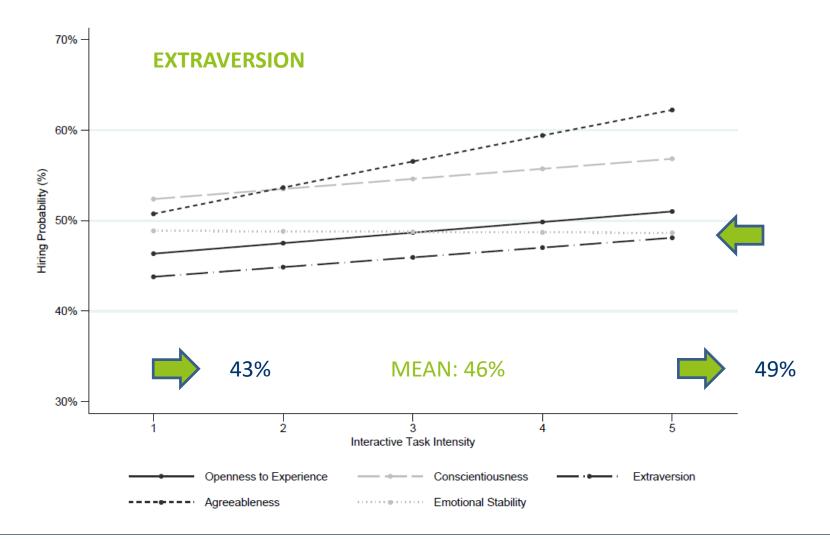












#### **Conclusion**

- Different tasks need different cognitive (e.g. Geel et al. 2011), but also different personality traits:
  - Analytical tasks = Conscientiousness, Openness
  - Interactive tasks = Agreeableness, Openness, Extraversion

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  - Analytical tasks = Conscientiousness, Openness
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- Applicants who lack these personality traits are likely to face a labor market disadvantage even they wish to work in promising task jobs.

#### Conclusion

- Different tasks need different cognitive (e.g. Geel et al. 2011), but also different personality traits:
  - Analytical tasks = Conscientiousness, Openness
  - Interactive tasks = Agreeableness, Openness, Extraversion
- Applicants who lack these personality traits are likely to face a labor market disadvantage even they wish to work in promising task jobs.
- Curricula in education and training programms should include targeted support for personal development on the personality traits that are important for the profession.

#### Thanks for Your Attention and Feedback!

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## **Example of Discrete Choice Experiment on Recruitment**

The following is a question on the recruitment of skilled workers. Please imagine the following situation, regardless of whether your company is currently looking for professionals or not:

In your company there is an urgent need to occupy a full-time position in the profession (Prog.: Show selected profession). After reviewing the application documents there are only two people to choose from, of which you will in any case be hiring one.

- Both are 28 years old with German as their mother tongue.
- · Both have a good educational degree and have five years of relevant professional experience in the initial training firm.
- All other unspecified decision criteria for recruitment, such as gender or additional qualifications, are the same for both professionals.

On the basis of the personal interview and a trial working day, you have received an impression of the professional competences as well as the personality of the two professionals. This information is presented below. Please indicate if you would hire skilled worker 1 or 2.

Please enter the appropriate number 1 or 2 and then click Return.

#### 1: Profile Job Applicant 1

- ... has average professional competence.
- ... shows active imagination and solves tasks in an original way.
- ... completes tasks thoroughly and efficiently.
- ... seems to be reserved and quiet when dealing with others.
- ... seems to be considerate and kind to others.
- ... seems to be tense and nervous.
- ... receives a wage that equals the average skilled labor wage in your company.

#### 2: Profile Job Applicant 2

- ... has above average professional competence.
- ... shows little imagination and solves tasks in a conventional way.
- ... completes tasks carelessly and unorganized.
- ... seems to be communicative and sociable when dealing with others.
- ... seems to be sometimes somewhat rude to others.
- ... seems to be relaxed and to handle stress well.
- ... receives a wage that is 15% above the average skilled labor wage in your company.



## **Overview of the Applicants' BIG-5 Personality Attributes**

#### Openness to Experience:

- (1) Applicant shows little imagination and solves tasks in a conventional way.
- (2) ... shows active imagination and solves tasks in an original way.

#### Conscientiousness:

- (1) ... completes tasks carelessly and unorganized.
- (2) ... completes tasks thoroughly and efficiently.

#### **Extraversion:**

- (1) ... seems to be reserved and quiet when dealing with others.
- (2) ... seems to be communicative and sociable when dealing with others.

#### Agreeabless:

- (1) ... seems to be cold and sometimes somewhat rude to others.
- (2) ... seems to be considerate and kind to others.

#### **Emotional Stability:**

- (1) ... seems to be tense and nervous.
- (2) ... seems to be relaxed and to handle stress well.



#### **Measurement of Tasks**

"How often does it occur in a working situation that the last hired skilled worker in the selected profession (show selected profession) …"

- ... must face new challenges which require intense up-front thinking
   Analytical tasks
- ... must convince others or negotiate compromises with customers and colleagues → Interactive tasks
- ... must repeat work steps that are characterized by the exact procedure → Routine tasks
- ... must react to and solve problems → Non-routine tasks

Answer categories: 1 "Never" to 5 "Often"



# **Descriptive Statistics**

Variable Names	N	mean	sd	min	max
Analytical Tasks	634	3.41	1.08	1	5
Interactive Tasks	634	2.82	1.23	1	5
Routine Tasks	634	3.08	1.33	1	5
Non-Routine Tasks	634	3.71	1.07	1	5
Recruitment: Alone	634	0.27	0.45	0	1
Recruitment: Together	634	0.73	0.45	0	1
Owner	634	0.41	0.49	0	1
CEO	634	0.17	0.37	0	1
Department Head	634	0.10	0.30	0	1
Head HR	634	0.15	0.35	0	1
Head Commerce	634	0.08	0.27	0	1
Head of Training	634	0.03	0.17	0	1
Other Position	634	0.07	0.25	0	1
Male	634	0.62	0.49	0	1
Tenure in Years	634	13.91	10.46	1	50
No Vocational Degree	634	0.00	0.04	0	1
Vocational Degree	634	0.16	0.37	0	1
Higher Voc. Degree	634	0.38	0.49	0	1
Academic Degree	634	0.46	0.50	0	1

Source: BIBB-CBS 2017/2018, own calculations.



# **Proportional Frequencies and Choices Made**

Variable Names	N	mean	N	mean
Average Competencies	8342	0.50	4171	0.50
Above Average Competencies	8342	0.50	4171	0.50
Less Open to Experience	8342	0.50	4171	0.43
More Open to Experience	8342	0.50	4171	0.57
Less Conscientiousness	8342	0.50	4171	0.30
More Conscientiousness	8342	0.50	4171	0.70
Less Extraversion	8342	0.50	4171	0.47
More Extraversion	8342	0.50	4171	0.53
Less Agreeableness	8342	0.50	4171	0.28
More Agreeableness	8342	0.50	4171	0.72
Less Emotional Stability	8342	0.50	4171	0.43
More Emotional Stability	8342	0.50	4171	0.57
P 15 Percent Above Average Wage	8342	0.15	4171	0.13
P 10 Percent Above Average Wage	8342	0.14	4171	0.14
P 5 Percent Above Average Wage	8342	0.14	4171	0.14
Average Wage	8342	0.14	4171	0.16
P 5 Percent Below Average Wage	8342	0.14	4171	0.14
P 10 Percent Below Average Wage	8342	0.15	4171	0.15
P 15 Percent Below Average Wage	8342	0.14	4171	0.14

Source: BIBB-CBS 2017/2018, own calculations.



## **Basic Specification for Recruitment Decisions**

	Conditional Logit	Mixed Logit MEAN	SD	
Personal Attributes				
Above Average Competence	0.253***	0.341***	-0.387**	
(Ref. Average Competence)	(0.043)	(0.059)	(0.141)	
More Open to Experience	0.447***	0.625***	0.509***	
(Ref. Less Open to Experience)	(0.046)	(0.067)	(0.132)	
More Conscientiousness	1.114***	1.569***	0.844***	
(Ref. Less Conscientiousness)	(0.054)	(0.100)	(0.100)	
More Extraversion	0.133***	0.196***	-0.187	
(Ref. Less Extraversion)	(0.040)	(0.055)	(0.193)	
More Agreeableness	1.109***	1.581***	1.100***	
(Ref. Less Agreeableness)	(0.055)	(0.100)	(0.098)	
More Emotional Stability	0.538***	0.764***	0.644***	
(Ref. Less Emotional Stability)	(0.047)	(0.072)	(0.107)	
Wage Attributes: Ref. Average Wage				
15 Percent above Average Wage	-0.600***	-0.777***		
	(0.104)	(0.145)		
10 Percent above Average Wage	-0.309**	-0.319*		
	(0.110)	(0.151)		
5 Percent above Average Wage	-0.200*	-0.252		
	(0.096)	(0.134)		
5 Percent below Average Wage	-0.252**	-0.269*		
	(0.097)	(0.131)		
10 Percent below Average Wage	-0.186	-0.195		
0	(0.110)	(0.149)		
15 Percent below Average Wage	-0.314**	-0.419**		
0	(0.110)	(0.149)		
Observations; N	8342; 634	8342; 634		
Log-likelihood	-1960	-1877		

Source: BIBB-CBS 2017/2018, own calculations.

Note: Standard errors in parentheses; \* p < 0.05, \*\*\* p < 0.01, \*\*\* p < 0.001. ML with clustered standard errors in parentheses; \* p < 0.05, \*\*\* p < 0.001, \*\*\*\* p < 0.001.

errors based on 300 Halton draws.



## **Recruitment Decisions and Skilled Workers' Tasks**

	Analy- tical	Inter- active	Routine	Non- Routine
MEAN				
Personal Attributes				
Above Average Competence	0.347	0.484***	0.407**	0.446*
(Ref. Average Competence)	(0.196)	(0.144)	(0.144)	(0.204)
More Open to Experience	0.082	0.348*	0.571***	0.510*
(Ref. Less Open to Experience)	(0.196)	(0.152)	(0.148)	(0.218)
More Conscientiousness	0.994***	1.333***	1.507***	1.258***
(Ref. Less Conscientiousness)	(0.241)	(0.188)	(0.191)	(0.267)
More Extraversion	0.169	-0.060	0.258*	0.017
(Ref. Less Extraversion)	(0.181)	(0.135)	(0.130)	(0.194)
More Agreeableness	1.239***	0.964***	1.400***	1.191***
(Ref. Less Agreeableness)	(0.226)	(0.180)	(0.189)	(0.259)
More Emotional Stability	0.636**	0.777***	0.876***	0.729**
(Ref. Less Emotional Stability)	(0.207)	(0.159)	(0.166)	(0.238)
Interaction between Personal Attribu	ites and Tasks (fo	r each Task see	Column Title)	
Above Average Competence	-0.001	-0.051	-0.022	-0.028
× Task	(0.057)	(0.049)	(0.043)	(0.053)
More Open to Experience	0.163**	0.103*	0.017	0.032
× Task	(0.056)	(0.051)	(0.045)	(0.058)
More Conscientiousness	0.173**	0.089	0.021	0.086
× Task	(0.065)	(0.060)	(0.051)	(0.069)
More Extraversion	0.009	0.097*	-0.020	0.049
$\times$ Task	(0.051)	(0.046)	(0.038)	(0.052)
More Agreeableness	0.104	0.224***	0.058	0.107
× Task	(0.062)	(0.061)	(0.054)	(0.068)
More Emotional Stability	0.038	-0.005	-0.038	0.010
× Task	(0.058)	(0.052)	(0.047)	(0.061)



## **Recruitment Decisions and Skilled Workers' Tasks**

	Analy- tical	Inter- active	Routine	Non- Routine
MEAN				
Wage Attributes: Ref. Average Wage				
15 Percent above Average Wage	-0.766*** (0.145)	-0.767*** (0.144)	-0.776*** (0.146)	-0.771***
	, ,	. ,	, ,	(0.145)
10 Percent above Average Wage	-0.311* (0.150)	-0.313* (0.150)	-0.322* (0.151)	-0.315* (0.151)
5 Percent above Average Wage	-0.240	-0.241	-0.248	-0.249
	(0.134)	(0.133)	(0.134)	(0.134)
5 Percent below Average Wage	-0.269*	-0.266*	-0.268*	-0.266*
	(0.131)	(0.131)	(0.130)	(0.131)
10 Percent below Average Wage	-0.178	-0.194	-0.197	-0.190
	(0.148)	(0.148)	(0.149)	(0.149)
15 Percent below Average Wage	-0.405**	-0.403**	-0.421**	-0.415**
	(0.148)	(0.148)	(0.148)	(0.148)
SD				
Above Average Competence	-0.406**	-0.400**	-0.377**	-0.389**
	(0.137)	(0.130)	(0.144)	(0.136)
More Open to Experience	0.490***	0.495***	0.508***	0.510***
	(0.133)	(0.128)	(0.131)	(0.129)
More Conscientiousness	0.831***	0.833***	0.845***	0.848***
	(0.099)	(0.101)	(0.100)	(0.100)
More Extraversion	-0.182	-0.209	-0.178	-0.180
	(0.196)	(0.165)	(0.211)	(0.186)
More Agreeableness	1.103***	1.063***	1.094***	1.100***
V	(0.099)	(0.100)	(0.098)	(0.098)
More Emotional Stability	0.636***	0.636***	0.640***	0.636***
	(0.108)	(0.105)	(0.107)	(0.108)
Observations; N		8	342; 634	
Log-likelihood	-1869	-1864	-1875	-1874

Source: BIBB-CBS 2017/2018, own calculations.

-Note: Standard errors in parentheses; \* p < 0.05, \*\* p < 0.01, \*\*\* p < 0.001. ML with clustered standard

errors based on 300 Halton draws.





## **Predicted Hiring Probabilities for Personality and Task Interaction**

