

Decomposing wage penalties of overeducated workers

Evidence from the Cedefop European Skills and Jobs survey

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Abstract

This paper uses data from the Cedefop European Skills and Jobs (ESJ) survey, a new international dataset on skill mismatch of adult workers in 28 EU countries, to decompose the wage penalty of overeducated workers. The ESJ survey allows for integration of a rich set of variables in the estimation of the effect of overeducation on earnings, such as individuals' job motives and the skill needs of their jobs. Oaxaca decomposition techniques are employed to uncover the extent to which the earnings penalties of overeducated workers can be attributed to either (i) individual human capital attributes, (ii) job characteristics, (iii) information asymmetries, (iv) compensating job attributes or (iv) skill needs content of jobs. It is found that asymmetry of information accounts for a significant part of the overeducation wage penalty of tertiary education graduates, whereas job characteristics and the low skill content of their jobs can explain most of the wage gap for medium-qualified employees. Little evidence is found in favour of equilibrium theories of skills matching and compensating wage differentials. The paper thus highlights the strong need for customised policy responses to tackle overeducation (e.g. career guidance, extended unemployment insurance, improvement of job quality), which depend on the target group of interest.

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1. Introduction

The literature on *skill mismatch* has grown significantly over the years, where skills mismatch is usually defined either in terms of excess or deficient qualifications and skills possessed by individuals relative to job-skill requirements.³ Evidence from several advanced economies has shown that skill mismatch is a widespread phenomenon, typically affecting about one third of the employed population. Several research studies have also cautioned in recent years that as a result of the 2008 economic crisis, there has been a tendency towards higher overqualification rates across Europe (Pouliakas, 2012; IPPR, 2014; ILO, 2014). Studies of skill mismatch tend to focus on one of two central measures (a) overskilling which describes the phenomena whereby workers are unable to use a range of their skills and abilities in their current job and (b) overeducation, which describes the phenomena whereby workers have acquired a level of schooling in excess of what is required to either get or do the job. The literature to date suggests that there is a less than perfect correlation between overeducation and overskilling and that both phenomena tend to have quite distinct implications for workers. Overeducation tends to be associated with a large penalty on pay but a lower impact on job satisfaction, whereas overskilling tends to effect pay less but is associated with much lower levels of job satisfaction (McGuinness & Sloane, 2012; Mavromaras et al., 2013). In this study we are interested in decomposing the impacts of skill mismatch on worker pay and, consequently, our focus is exclusively on overeducation which has consistently been associated with a substantial pay penalty.

A number of studies have attempted to uncover the potential determinants of skill mismatch, by assessing the degree to which the wage penalties associated with overeducation or overskilling adjust when various controls for job/individual worker characteristics are added to model specifications (McGuinness and Sloane, 2011). Other studies have measured the degree to which any measured disadvantage declines in models that control for unobserved ability (Bauer, 2003). However, to date, no studies have applied decomposition techniques to assess the extent to which observed differentials, in either wage or job satisfaction premiums, between matched and mismatched workers relate to (a)

³ Cedefop (2010) provides clear-cut definitions and discusses the differences between the terms “over- (under)education” and “over- (under-)skilling”.

differences in the endowments of human capital and job related variables (b) differences in the returns to given characteristics and (c) unobserved effects.

The aim of this study is to decouple the influence of the aforementioned factors on the wage penalty of overeducated workers in the 28 EU member states. To do so, it explores new data from the *Cedefop European survey on skills and jobs (ESJ)*, carried out in 2014 by the European Centre for the Development of Vocational Training (Cedefop). The value added of the new dataset is that it contains novel information on many important correlates of interest for skill mismatch at European level, including the information, motives and constraints that individuals had at the time of job search and a battery of questions on the nature of tasks and skills required by individuals' jobs. Section 2 of the paper provides a review of the literature on the magnitude of wage penalties related to overeducation and factors that may account for the differences in pay between workers with matched and excess qualifications. Section 3 describes the new dataset and key variables used for the purposes of the empirical analysis. Section 4 explains the empirical methodology employed while section 5 provides an extensive discussion of the empirical findings. Section 6 concludes.

2. Literature review

The overeducation literature has mushroomed in recent times and has become a key issue of policy importance (Quintini, 2011; Pouliakas, 2012). As the focus of this paper relates to the degree to which the wage penalty associated with overeducation can be explained by observable differences between matched and overeducated workers, we will focus on the literature related to both the robustness of the overeducation pay penalty and the potential explanatory variables that should be included in any decomposition.

2.1 The magnitude and robustness of wage penalty estimates

Comprehensive surveys and meta-analyses of the wealth of empirical estimates have highlighted that there are important negative wage and welfare consequences of overeducation on individual employees (Hartog, 2000; Rubb, 2003; Sloane, 2003; McGuinness, 2006; Cedefop, 2010; Leuven and Oosterbeek, 2011; Pouliakas, 2012).

The majority of the studies have confirmed two stylized facts in relation to the impact of overeducation on pay, as suggested initially by Sicherman (1991). First, overeducated

workers suffer from a wage penalty in relation to matched individuals with the same level of education, whereas they earn a premium over their matched colleagues in the same job. Relative to matched workers with similar levels of schooling, the average wage penalty associated with overeducation has been estimated, on the basis of a dummy variable in a standard wage regression, at around 15% (McGuinness, 2006). Another approach (known as the ORU approach) breaks down the educational level into three constituent components (Over-, Required- and Under-education) (Duncan and Hoffman, 1981). Based on this methodology, Groot and Maasen van der Brink (2000) produce meta-analytical estimates of an average rate of return of 5.6% for attained years of education. Importantly, the return to surplus (3%) or deficient (-1.5%) years of education is significantly lower compared to the comparable return for required years of education (7.8%). The evidence thus suggests that although the overeducated work below their potential due to some productivity ceiling (related to inferior skills and abilities or to particular firm and institutional characteristics), there is still some benefit to be enjoyed from the extra education (Rumberger, 1987). Similarly, there is scope for upskilling of the undereducated, as their productivity is found to lag behind that of matched colleagues (although they enjoy wage premiums relative to individuals with the same level of education).

A key issue in the mismatch literature is that the above determinants and consequences of mismatch have been identified mostly in cross-sectional datasets or short time-series of graduate cohorts. Thus, it has been argued that perceived mismatches on the basis of the above data are partly a statistical artefact that reflects unobserved labour market sorting due to differences in individual abilities/skills within educational categories (Bauer, 2002; McGuinness, 2003; Frenette, 2004). The plausibility of this statement has been heightened in recent years, given the rapid expansion in tertiary education graduate rates across many developed countries. Overeducation may therefore not be genuinely related to an underutilisation of skills or abilities, since the additional investment in education may simply compensate for the lack of ability of individuals who appear to be mismatched (Green et al., 1999; Chevalier, 2003). For instance, Mavromaras et al. (2010) and Sloane (2014) argue, on the basis of estimates from an Australian longitudinal dataset (HILDA), that the magnitude of many coefficients based on cross-sectional data appear to be questionable. Using panel data methods that control for unobserved individual heterogeneity identifies unbiased estimates

of the effect of skill mismatch, although concerns about the limited within-group variance in the incidence of mismatch also raises some doubts (Mavromaras et al, 2013). Thus, the evidence on the reliability of cross-sectional estimates of the overeducation pay penalty remains somewhat mixed. While the wage impacts fall substantially when estimated within a panel framework that controls for unobserved time-invariant influences, such models may themselves generate biased estimates of the coefficients of variables, such as overeducation, that move slowly over time (ibid., 2013).

2.2 What are the potential determinants of overeducation?

It is important that any attempt to decompose the wage effects associated with overeducation includes a choice of covariates consistent with both economic theory and existing empirical studies. A number of theoretical frameworks have been used to conceptualise overeducation including (a) Human Capital Theory, (b) the Job Competition Model, (c) Assignment theory and (d) Occupational mobility theory and models of job search. Human Capital Theory (HCT) (Becker, 1964; Mincer, 1974) predicts that workers will always earn their marginal product, implying that there should be no under-utilization of human capital in the labour market and that overeducation will not exist in equilibrium. However, overeducation may still be observed in a world where the predictions of HCT hold, if earnings and human capital accumulation are imperfectly measured i.e. overeducation may simply be a statistical artefact arising as a consequence of an omitted variables problem (McGuinness, 2006). Specifically, the overeducation pay penalty may simply reflect lower levels of total human capital among workers who, despite having higher than average levels of formally acquired human capital (schooling), have lower levels of non-formal/informal human capital acquired in the workplace (training), the latter imperfectly measured within the data. Therefore, on the basis of the HCT model, any attempt to decompose the overeducation pay penalty should include sufficient controls and measures for human capital acquired through both formal schooling and workplace learning/experience.

Thurow's Job Competition Model (Thurow, 1975) emphasizes the importance of job availability and argues that workers are allocated to a fixed distribution of jobs with individuals investing in education in order to preserve their place in the jobs queue. Once an

individual reaches the top of the queue they are allocated a job, so their wage will be predetermined solely by the productivity characteristics of the job in question, with overeducation occurring where the skill requirements of the allocated position are below those acquired by the worker. Assignment models (Sattinger, 1993) also stress the importance of job distribution; however, the job allocation process is no longer a lottery as utility maximization guides workers to choose certain jobs over others and wages are determined by a hedonic price equation that accounts for both job and worker characteristics. Therefore, both the job competition and assignment interpretations of the labour market point to the importance of taking into account controls for productivity-relevant job characteristics and other vacancy externalities (e.g. the availability of suitable job opportunities in the labour market) when decomposing the overeducation pay penalty.

Theories of career mobility (Rosen, 1972; Sicherman and Galor, 1990) suggest that some workers choose an initially mismatched post that enables them to acquire the necessary skills, through on-the-job training and learning, which will enable them to achieve more rapid career progression in the future. Alternatively, proponents of matching theories of job search (Jovanovic, 1970) suggest that overeducation is largely a consequence of poor information and, over time, workers will realize their error and achieve improved matches through repeated job search. Therefore, both frameworks suggest that overeducation is a temporary phenomenon, driven by either strategic behaviour or imperfect information, suggesting that worker preferences and beliefs should also be included within the decomposition framework. In support of this view, McGuinness and Sloane (2011) report that overeducated workers may be willing to forgo higher earnings in return for other positive job attributes, such as security and an improved work-life balance.

3. Data and descriptive statistics

3.1 The Cedefop European Skills and Jobs (ESJ) survey

The Cedefop ESJ survey is a state-of-the-art survey of adult employees (aged 24-65) carried out in the 28 member states of the European Union, collecting information on the match of their skills with the skill needs of their jobs. It was financed and developed by the European Centre for the Development of Vocational Training (Cedefop), in collaboration with a network of experts on skills, the OECD and Eurofound (Cedefop, 2015). The aim of the

survey is to help inform the development of European policies on initial and continuing education and training and employment policies. To do so, it seeks to understand how individuals' qualifications and skills are matched (or not) to the changing skill demands and complexities of their jobs. The survey also looks at the extent to which employees' skills are developed and used in their workplaces over time.

The survey was carried out using quota sampling by the survey company Ipsos MORI and network partners in the EU28 member states between 7 March and 26 June 2014. In total, 48,676 respondents from different demographic groups took part either by telephone (9,154 employees) or online interviewing (39,522 employees). A mixed methodology approach ensured that data collected provided a representative sample of the adult working age population in each of the 28 countries.⁴ In most EU countries about 1000-1500 employees were effectively interviewed, although the sample varies between the countries. The sample was augmented to 4000 observations in the case of five large EU labour markets, such as Germany, France, Poland, UK, Spain, 3000 cases for Italy, and 2000 cases in Greece and Finland, while 500 individuals were surveyed by telephone in each of the three smallest countries (Malta, Cyprus and Luxembourg).⁵

The survey asked respondents a series of questions designed to assess the extent to which their qualifications and skills are at the level needed to be hired for and to do their job. The key contribution of the new survey is that it takes a longitudinal perspective, with some of these questions asked several times, referring to different time periods, enabling the dynamic analysis of skill mismatch of EU employees. The survey thus offers the first comparable evidence of the dynamic evolution of skill mismatch of employees across all 28 EU countries. It also allows researchers to take into account the persistency or initial state of skill mismatch affecting individuals over time.

Given that the new survey focused on the issue of skill mismatch, it contains contextual information that was not readily available in previous datasets. For example, in addition to a

⁴ The questionnaire was translated into the national languages of the EU countries using a strict translation protocol, managed by Ipsos MORI. Prior to administering the survey, extensive cognitive and pilot tests took place to validate the content and validity of the survey instrument. For details, see Cedefop (2015).

⁵ To control for any erratic variance in the mode of sampling, the empirical analysis has included as an additional explanatory variable a dummy variable that identifies whether a given observation was approached via online or telephone interviewing.

standard set of control variables (e.g. age, gender, level of education, firm size, type of contract, economic sector, industry, occupation) the survey collected data on the micro/macro-economic motives and constraints that influence individuals' job choice; determinants of skill accumulation in their jobs, focusing on both non-formal and informal continuing vocational training; experience of work-based learning as part of initial education and training; whether individuals embarked on occupation and/or geographic mobility prior to accepting their current job; and the changing complexity of workers' tasks in their jobs. In addition, the survey permits the definition and measurement of several types of skill mismatch, including educational mismatch and mismatch in terms of employees' skill levels. Furthermore, the survey collected data on the gross monthly earnings of adult workers in the 28 countries.

The inclusion of this rich set of variables and the availability of an international sample for the analysis of overeducation is a marked improvement relative to previous empirical studies, which have either used rich databases albeit from single countries, or have relied on relatively unsuitable panel data estimation techniques.

3.2 Key variables and summary statistics

The study utilises the full sample of adult employees, aged between 24 and 65, in all 28 European member states, corresponding to 48,676 cases. To analyse the wage consequences of overeducation among European workers, two separate measures of educational mismatch were derived as a first step in the analysis.

In the ESJ survey respondents were asked about the qualifications and skills needed for their jobs. Specifically, the survey asked respondents to assess both the level of qualifications needed to get their job if someone would apply for their job today, in addition to the level of skills needed to do their job. This was done to investigate whether there is a discrepancy between the qualifications needed for recruitment purposes and the level of education that constitutes a genuine prerequisite for performing the necessary tasks in a job. Particularly in weak labour markets with high unemployment rates employers may inflate recruitment criteria to filter the best candidates, or they may afford to deliberately hire individuals with higher education as a means of hedging against greater economic uncertainty (Bulmahn and Krakel, 2002). In either case individuals are induced to acquire higher qualifications to be

hired in a more competitive labour market, fostering credentialism, even though the jobs for which they are recruited for may eventually require lower qualifications and skills than they possess.

The measure of overeducation derived, and used as the main dependent variable in the wage regressions of the paper, is based on a direct comparison of the highest qualification of individuals (translated to conventional ISCED levels) with the qualification level reported by themselves as necessary to actually do their current job.⁶ We feel that this variable represents a more reliable measure of mismatch between acquired schooling and job content, whereas the alternative measure based on education necessary to get the job is more reflective of credentialism and somewhat independent of actual job content.

In 2014, about 33% of adult job holders in the EU believed that a tertiary education degree is required so that they can perform their job, the majority (40%) responded that their jobs could be performed with a medium-level qualification while 21% stated that a low level or no qualifications at all suffice for doing their jobs. Comparing the educational requirement with the own qualification of employees, the survey confirms that a substantial share of the European workforce is employed in jobs that need a different (higher or lower) level of qualifications than their own for performing them. In 2014, total qualification mismatch affected, on average, 29% of the European adult working population, comprising of 17% who were overqualified and 12% underqualified. About 1 in 4 (24%) tertiary educated workers (and 16% of medium-qualified employees) in Europe are found to be overeducated for their jobs.

Figure 1 shows that, on average, overeducation in the EU is more prevalent among younger-aged employees, females and individuals who were outside of the labour market (unemployed or inactive) prior to accepting their current employment. It is also higher among tertiary education graduates, particularly those from certain fields of study, such as *humanities, languages and arts* and *other social sciences*. Rates of overeducation are also significantly different depending on the characteristics of jobs. In particular, they are higher

⁶ However, for the sake of robustness, the empirical analysis in section 5 has also taken into account the measure of qualification mismatch based on the level of education needed so that people can be hired in their current jobs. No significant changes to the main findings are observed, given the very high correlation (Pearson correlation coefficient = 0.8) of the two variables.

for individuals employed in smaller-sized firms and in less skill-intensive occupations (e.g. elementary jobs, service and market sales workers) and for those in non-standard contract jobs (part time, informal, temporary agency contracts).

[INSERT FIGURE 1 ABOUT HERE]

To breakdown the differences in earnings between overeducated and matched workers, a measure of hourly earnings of adult employees has been derived as follows. Individuals were initially asked to report how much is their gross monthly earnings from their job (before deductions or credits of tax and national insurance). While about 70% of the whole sample provided an earnings figure, the remaining 30% either refused (24.5%) to disclose their earnings or did not know (5.5%). For the latter two groups the survey included a follow-up question, which allowed respondents to identify in which of four national-specific income bands their own monthly earnings belong to.⁷ In case of a valid response, the mid-point of the respective income band has been used as a proxy of a respondent's monthly earnings. In this manner, the sample used for the analysis contains positive wage values for about 83% of the original sample of adult employees. Nevertheless, around 17% of the sample either refused to provide their earnings data in both income questions of the ESJ survey, or did not know or answer altogether.

Following the aforementioned procedure, it was observed that the wage variable was distorted by the existence of a number of outliers in the sample (potentially because several respondents provided an estimate of their annual rather than monthly earnings). To correct for the observed skewness, the variable was therefore capped both at the bottom and at the top of the distribution. In particular, the bottom 1% and the top 5% of the distribution were dropped completely from the sample. Following the exclusion of outliers from the analysis, the distribution of the wage variable and its summary moments were observed to be compatible to those identified from other reliable European data sources containing information on salary income of EU employees (e.g. EU SILC). For instance, the mean monthly earnings of employees in the EU28 block are equal to approximately 2300 EUR,

⁷ For each country four respective income bands were defined, namely {below lowest quartile, between lowest quartile and median, between median and highest quartile, above highest quartile}, based on reliable country-specific data (e.g. latest waves of EU-SILC survey or national LFS datasets). More details are available at Cedefop (2015).

ranging from above 4000 EUR in Denmark or 3000 EUR in Luxembourg, Finland and Sweden to 430 euros in Bulgaria. As a final step the monthly earnings of adult workers were converted to hourly earnings by dividing by the average weekly hours worked (multiplied by 4.33 since the variable on hours included paid and unpaid overtime hours).

Table 1 displays differences in average hourly wages between overeducated and matched EU adult employees. The mean monthly earnings of the overeducated is equal to 2141 EUR whereas the respective figure for matched employees is 2360 EUR, a wage penalty of 219 EUR per month for the former group. However, the latter are employed for an extra 1.5 hours per week (38.2 as opposed to 36.8 hours), which explains why there is a smaller difference in mean hourly earnings between the two groups. There is greater skewness in the earnings distribution of matched employees, resulting in a 2 EUR per hour premium in median hourly wages. The table also indicates that the wage difference between the two groups is mostly driven by tertiary education and recent graduates, males, individuals returning back to the labour market after a period of inactivity, recipients of on-the-job training and those in jobs with non-indefinite contracts and low skill content.

[INSERT TABLE 1 ABOUT HERE]

4. Empirical methodology

The associations shown in **Figure 1** and **Table 1** highlight the importance of taking into account a number of factors that are correlated with the incidence of overeducation, when estimating the *ceteris paribus* effect of the latter on individual earnings. A multivariate regression analysis has therefore been employed in the paper that controls for the effect of several key characteristics, consistent with theory, in the estimation of earnings functions that contain the overeducation dummy as the main explanatory variable of interest.

In particular, the empirical analysis follows a standard decomposition framework as outlined by Oaxaca (1973) and Blinder (1973).⁸ The procedure requires first the estimation of separate earnings functions for individuals in paid employment who are either overeducated or have a qualification level matched to the requirement of their job. The

⁸ The analysis was replicated using the amended methodologies proposed by Neumark (1988) and Oaxaca and Ransom (1994), showing very similar results to the ones discussed in the paper.

wage gap between the two groups is then deconstructed into a part that is attributable to differences in the mean productive characteristics (the explained part) and a part that is due to different returns to such characteristics (the unexplained part). In this manner it becomes possible to detect the extent to which several observable characteristics contribute to wage differences between the overeducated and matched and how much of the wedge can be attributed to discriminatory practices or other unobserved influences.

Mincer-type earnings functions are first fitted for each group (overeducated and matched) as follows:

$$\ln W_i = \mathbf{H}_i\boldsymbol{\beta} + \mathbf{Z}_i\boldsymbol{\gamma} + \mathbf{C}_i\boldsymbol{\delta} + \varepsilon_i \quad (1)$$

where $\ln W_i$ are the log hourly earnings of individual i ($i = 1, \dots, N$), \mathbf{H}_i is a vector of individual human capital attributes which affect earnings, \mathbf{Z}_i is a vector of characteristics describing the jobs of employees, \mathbf{C} are country dummies and ε_i is a Gaussian random error term. The terms $\boldsymbol{\beta}$, $\boldsymbol{\gamma}$, $\boldsymbol{\delta}$ are regression parameters that capture the marginal returns of the characteristics contained in the vectors \mathbf{H} , \mathbf{Z} , \mathbf{C} and will be estimated on the basis of the ESJ sample. Robust standard errors of the regression coefficients clustered at the country level are calculated for statistical inference purposes.

The total difference in the mean wages of the two groups can then be decomposed in the conventional Oaxaca manner as follows:

$$\bar{W}_m - \bar{W}_{mis} = (\bar{H}_m - \bar{H}_{mis})\hat{\boldsymbol{\beta}}_m + (\bar{Z}_m - \bar{Z}_{mis})\hat{\boldsymbol{\gamma}}_m + (\hat{\boldsymbol{\gamma}}_m - \hat{\boldsymbol{\gamma}}_{mis})\bar{Z}_{mis} + (\hat{\boldsymbol{\beta}}_m - \hat{\boldsymbol{\beta}}_{mis})\bar{X}_{mis} \quad (2)$$

where the first part of equation (2) (i.e. the ‘explained’ or ‘endowment’ part) reflects the component of the average wage difference between the two groups attributed to differences in the means of the explanatory variables, which are in turn weighed by the estimated coefficients of the matched equation. It measures the relative importance of observable differences in human capital and job characteristics between the two sets of workers. The second term (i.e. the ‘unexplained’ part) refers to the part of the wage gap that arises because of the differential manner with which the labour market rewards the characteristics of overeducated and matched employees. In this respect, it provides an indication of the extent to which mismatched

employment imposes productivity related constraints on the return to observable characteristics.

The models are estimated first for the whole sample and then separately for individuals with a different level of education (i.e. ISCED category), given that tertiary education graduates are more likely to be overeducated (24%) as opposed to those with a medium-level qualification (12%). Furthermore, a stepwise approach has been followed, which first allows for an empirical specification that only incorporates standard demographic and human capital characteristics (e.g. age, gender, education attainment level, previous labour market status, years of employer tenure, non-formal and informal training in job) and subsequently takes into account standard job characteristics (e.g. private sector, size of workplace, type of contract, tasks required in job, promotion prospects) and other important factors (e.g. job search motives of workers, skill needs of job). In terms of the theoretical perspectives, the variables on education and training capture the impact of Human Capital theory, while the information on job characteristics and skill requirements relate closely to the predictions of both the Job Competition Model and Assignment Theory.

The novel information provided in the survey with regards to the motives for job choice among individuals permits this study to put the different theories of overeducation under scrutiny. These questions were asked retrospectively and rank the importance of a series of factors for individuals choosing their current job. As these responses should, theoretically, pre-date the point before they commenced their current job, reverse causality becomes less of a concern. These retrospective variables enable us to assess the relative importance of compensating wage effects and, specifically, the extent to which individuals valued aspects of the job such as reputation, work-life balance and intrinsic benefits. The importance of Job Mobility Theory is captured by variables which measure the extent to which the job was chosen on the basis of its value for career progression or as a channel for gaining work experience. Finally, the relative importance of prior information and, therefore, the quality of the job signal, is captured by a range of prior response variables that reflect the level of information that the respondent had with respect to the jobs' benefits and skill requirements.

5. Empirical results

5.1 Estimation of earnings regressions

Tables 2-4 display ordinary least squares coefficients following estimation of the main earnings function, shown in equation (1), based on a sample of adult employees from all 28 EU member states. **Table 2** displays the estimated coefficients for the whole sample, whereas **Tables 3 and 4** show the effects broken down by level of education attainment, first for those with tertiary level qualifications and subsequently for individuals with an upper secondary/non-tertiary degree. The estimated coefficients describe the mean conditional (proportional) effect of the explanatory variables on individuals' hourly earnings, *ceteris paribus*.

[INSERT TABLES 2-4 ABOUT HERE]

As shown in **Table 2**, overeducated workers suffer from a 22% wage penalty relative to matched employees, when controlling for age, gender, level of education and their labour market status prior to job entry. The figure falls to 19% when an augmented Mincer earnings function is estimated. In this case the estimation takes into account that the overeducated have lower average levels of job-specific skills relative to the matched, due to fewer years of seniority and less participation in non-formal and informal training.

The size of the penalty is robust to the inclusion of variables that act as proxies for the match between employees' skills and the skill needs of their job, namely whether their skills exceed current job requirements (overskilled) or are deficient relative to the optimal productivity threshold (skill gap).⁹ This implies that the lower wages of overeducated workers are independent of the fact that some of them may have inferior or superior skills than needed by their jobs. It is thus important to consider explanations other than those that focus on skills matching for understanding the source of the overeducation wage gap.

Job characteristics, such as whether an employee's workplace is in the private sector or of larger size, or the nature of complexity and autonomy of the job tasks, are important predictors of adult workers' wages. However, the overeducation wage penalty, at 18%, is quite robust to the inclusion of such variables.

⁹ The equation and decomposition analysis has included as explanatory variables both the quality of the skill match at the time of entry into an individual's job and at the time of the survey. Either of the variables acting as proxies of skills matching is statistically insignificant in earnings equations, once other characteristics of individuals and jobs are taken into account.

Another part of the lower earnings of overqualified workers can be attributed to their placement in jobs with lower skill content, namely jobs that place a low degree of importance on cognitive, digital and soft skills. Accounting for different levels of skill needs by jobs leads to a marked reduction in the size of the regression coefficient on the overeducation dummy. Even among individuals with the same human capital features, employed in jobs of similar characteristics and skill intensity, it is observed that the overeducated still earn 13.8% lower wages than those with matched qualifications.

The full specification of the estimated equations reveals that part of the significant wage penalty of overqualified workers also reflects the quality and relevance of the information available to them (e.g. via career guidance and counselling or other forms of labour market intelligence) as part of the job search process. It is evident that overeducated individuals who do not select their jobs on the basis of their suitability with their own skills and qualifications, or because of imperfect knowledge of their pay and benefits, are more likely to have lower mean wages. By contrast, placing a higher premium on job security, an employer's reputation or because of a job's proximity to the household exerts a negative pull on wages.

When examining determinants of earnings for adult workers with different levels of education attainment, as shown in **Tables 3 and 4**, it is found that the overeducation wage penalty is somewhat higher (ranging between 15-24%, depending on the specification) for highly educated graduates and lower (between 8-18%) for medium-qualified graduates. The overeducation wage penalty is robust to differences between higher education graduates in their subject of study, given that specific fields such as economics, engineering and medicine are associated with higher average earnings. Tertiary graduates employed in jobs where their skills are not fully utilised (overskilled) suffer from a 2% wage deficit relative to those with matched skills; however, the regression coefficient of the overeducation variable is not affected, which confirms that it is independent of the variation in the match of worker's skills with the skill needs of their jobs. By contrast, it is clear that part of the wage difference between overeducated and matched workers is driven by the skill needs of their jobs and individual job search motives.

Interestingly, the factors that weigh more heavily in explaining the lower wages of overeducated graduates with medium-level qualifications are their lower stock of job-specific human capital (measured in both years of employer tenure and participation in non-formal and informal training) and the fact that they are employed in jobs with a lower skill content. Nevertheless, the OLS estimates show the combined impact of both endowment and coefficient effects related to specific groups of variables on the overeducation pay premium. In order to separate out the relative importance of variations in the amount of each attribute held by overeducated and matched workers, we must adopt a decomposition approach as discussed in the next section.

5.2 Decomposition analysis

5.2.1 Endowments differences between matched-overeducated workers

In terms of the decomposition analysis, the base case is individuals who are matched, so the decomposition algorithm explains the pay premium to being matched relative to the overeducated group. The full specification, as shown in the final columns of **Tables 2-4**, is used when estimating the respective wage equations for the subsamples of matched and mismatch employees, namely one that takes into account human capital and job characteristics, as well as the skill content of jobs and individuals' job search motives.

As is evident in **Table 5**, differences in endowments can explain about 28% of the raw overeducation gap in a sample of employees who hold at least an upper secondary qualification¹⁰. In a similar spirit, the difference in observable characteristics is found to account for about 31% of the raw wage premium in the medium-educated model, whereas they account for 43% in the model focused on tertiary education graduates.

[INSERT TABLE 5 ABOUT HERE]

Dealing firstly with the results of the total sample, **Table 6** shows that differences in job characteristics and job skill requirements are the most important factors in explaining the wage advantage of matched workers, however, motivation variables and country level fixed

¹⁰ When undertaking the Oaxaca decomposition analysis we have excluded individuals with a low level education from the sample due to the fact that, by definition, they cannot be classified as overeducated workers. If they are not excluded, the wage regression restricted only to overeducated workers is run on a sample of medium- and high educated individuals, whereas the respective regression on the matched sample also includes those with low education.

effects also play a marked role. Turning specifically to the human capital results, the data shows that individuals with matched qualifications (the reference group) are found to have higher mean wages mainly because of their higher average age and seniority. Exactly why age is important, in addition to job tenure, is unclear, but the result suggests that part of the pay gap may relate to cohort effects whereby the relative availability of quality positions within firms has fallen as educational attainment has risen. Furthermore, the observed raw pay premium is reduced by the higher tertiary education attainment of the overeducated, but widens due to their lower on-the-job training and their greater incidence of past unemployment episodes. With respect to job requirements, the lower wages of the overeducated can be attributed to the fact that they are more frequently employed under a temporary contract and in very small-sized workplaces than the matched. Furthermore they are also less likely to have been promoted in their jobs. Finally, the overeducated are, on average, employed in less skill intensive jobs, in particular jobs that do not require an advanced literacy or ICT skill level to be performed, which depresses their wages by acting as a productivity threshold. The absence of high literacy requirements within the job has the most substantial impact on the overeducation pay penalty.

The empirical wage decompositions further highlight the critical role of information and, to a lesser extent, of career concerns, in sorting individuals into well-matched jobs or not. In particular, overeducated adult employees are less likely to have selected their jobs because they are a suitable match for their qualifications and skills, or because of knowledge of their pay and benefits, and this negatively impacts the wedge between their wages and those of matched workers. The latter were instead more inclined to select their job because of their career development opportunities, or for the promise of gaining some work experience. Some, though limited, evidence is found to suggest that individuals may be willing to accept jobs below their qualification level as a trade-off for them being closer to their home.

Overall, in the model containing the whole sample of individuals holding at least upper secondary qualifications, human capital differences account for around 5% of the observed pay gap and standard job characteristics explain 9% of the gap. Two blocks of explanatory variables, previously unaccounted for in most empirical analyses, account for the largest share of the overeducation wage penalty. In particular, the skill intensity of jobs explain 18% of the observed wage gap, while individuals' job search motives account for a further 11%.

In terms of the high educated sample, overall, it is observed that human capital endowments weigh more heavily relative to the whole sample, explaining 16% of the raw wage differential. Job motives follow in significance, accounting for 9% of the overeducation pay gap, although the combination of job characteristics and of the importance of skills in jobs explains 14% of the total raw wage difference. This highlights the critical role of landing a skill-intensive job as a safeguard for graduates' earnings, especially if they enter into jobs demanding lower qualifications than their own.

In terms of the specific human capital effects, the impact of age and employer tenure still represents the largest single impacts, however, they are less pronounced for tertiary education graduates relative to the average, as is the impact of a previous unemployment spell. Importantly, overeducated employees with a tertiary level qualification are found to be more likely to have graduated from an Economics degree as part of their studies, which tends to lower the pay gap. However, they also have a greater tendency to be graduates from Humanities subjects and are less prone to Engineering and Education science courses, which contribute to their lower wages relative to those of matched employees.

Turning to job characteristics, as in the total sample, overeducated tertiary graduates are recipients of lower mean hourly wages due to the fact that they are more frequently employed in smaller-sized workplaces and in less skill-intensive jobs, associated with fewer opportunities for promotion. They are also found to be less likely to select jobs on the basis that they are a suitable match for their skills and qualifications. Moreover, overeducated tertiary workers tend to put greater emphasis on the proximity of their job to their home, which impacts negatively on hourly wages.

Finally, we decompose the earnings of medium skilled workers. A crucial difference between the high- and medium-educated models is the large role played by country level fixed effects in the latter decomposition. The results indicate that the pay premium enjoyed by matched medium skill workers is substantially reduced as a consequence of their higher relative concentration in lower wage economies. Such a large negative fixed effect makes the interpretation of the results in the medium skill decomposition more complicated. Nevertheless, they suggest that job characteristics and skill requirements generally outweigh differences in human capital endowments or other important factors, in terms of

explaining wage differences between the overeducated and those with matched qualifications.

Ignoring the size of the endowment effects and concentrating on their relative impact, it is clear from the decomposition results that overeducated medium-qualified workers tend to be in jobs that do not require high levels of literacy or ICT skills and this can account for a substantial amount of their raw pay gap. They are also more likely to have temporary contracts and to be in jobs in which they fail to get a promotion. Among human capital endowments it is evident that seniority plays a dominant role, given that the higher earnings of matched workers is attributed to their additional years of employer tenure and to the lower incidence of past unemployment spells. The matched are also found to have higher wages because of greater participation in training courses during their work hours. Those among them that selected their jobs on the basis of the pay and benefits offered, or because of their favourable career prospects, also benefit from higher hourly wages relative to their overeducated counterparts.

[INSERT TABLE 6 ABOUT HERE]

5.2.2 Unexplained wage differences between matched and overeducated workers

Table 7 focuses on the part of the difference in wages between matched and overeducated workers that is unexplained, attributed either to a discrepancy in the shift coefficients or to differential market valuations of the average characteristics of the two groups of employees. In particular, the table shows differences in the estimated regression coefficients of the matched and overeducated groups, weighted by the average characteristics of the overeducated workers, a component that could reflect labour market discrimination against those who enter into jobs requiring lower qualifications than their own.

Overall, around 70% of the raw wage difference in the total sample and in the sample of medium-qualified employees remains unexplained, while a smaller share (57%) is unaccounted for in the high-educated model. On the whole overeducated workers are found to benefit from higher wage returns to their productive characteristics, although this is not true for overeducated tertiary education graduates and is driven by the significant

wage returns enjoyed by those with medium-level education. Matched workers are also found to have higher absolute mean wages than the overeducated across all education levels, as indicated by the positive intercept terms.

Having a higher level of education is valued more for individuals that enter into jobs that are a good match for their qualifications. The higher mean wages of matched tertiary educated workers relative to the overeducated are amplified due to the higher returns to age and training participation of the former. Being in a multi-site workplace environment, or selecting the job because it suits one's credentials or yields higher pay and benefits, disproportionately benefits those in jobs with matched qualifications. By contrast, overeducated tertiary graduates who were driven, when selecting their job, by career progression possibilities, enjoy a higher wage increment in comparison to the matched.

Furthermore, individuals in overeducated posts receive higher financial returns for each extra year of employer seniority, regardless of level of education. Each additional year of age is also rewarded more highly for medium-qualified overeducated employees. The male-female wage gap for those with a medium-level education is also smaller among individuals with matched qualifications relative to the overeducated.

[INSERT TABLE 7 ABOUT HERE]

6. Conclusions

Following a conventional Oaxaca decomposition analysis, the empirical findings in this paper reveals that about one third of the observed wage premium to being matched relative to being overeducated can be explained by differences in the endowments of the two groups. Among graduates, a larger part (43%) of the pay gap is explained, with human capital differences as well as informational constraints affecting workers at the time of job search accounting for the largest part of the explained gap. These results confirm that while individual and job characteristics are important in explaining the overeducation pay penalty among graduates, the job selection process and, in particular, taking time to ensure that the job matches your skill set has a big pay-off. The reduction of information asymmetries among graduates with regards to available job opportunities therefore appears to be a key policy response to overcoming the problem of overeducation among graduates (McGuiness, 2015). From a theoretical perspective, graduate overeducation appears consistent with

aspects of human capital theory, assignment theory and the signalling model, so important lessons can be learnt from each perspective in terms of reducing the incidence of overeducation. The finding that overeducation is consistent with a signalling problem is more novel. From a policy perspective the signalling result highlights the importance of effective guidance and counselling, provision of incentives for job mobility and perhaps of prolonged job search to facilitate the better matching of the skills of tertiary graduates with their jobs.

Among medium-educated workers, the largest explained effects relate to job characteristics, such as the fact that the overeducated are more likely to be in temporary contracts and are located in smaller firms and in jobs without promotion prospects. Differences in job skill requirements are also an important factor, with overeducated workers being paid less as they tend to be in jobs that only require a basic level of skills. Raising job quality would therefore appear to constitute a more effective policy response for mitigating overeducation experienced by individuals with a medium-level education. As overeducation among the medium educated appears to be related to job specific productivity ceilings which limit wage growth, the observed outcomes appear more consistent with both the job competition and assignment interpretations of the labour market.

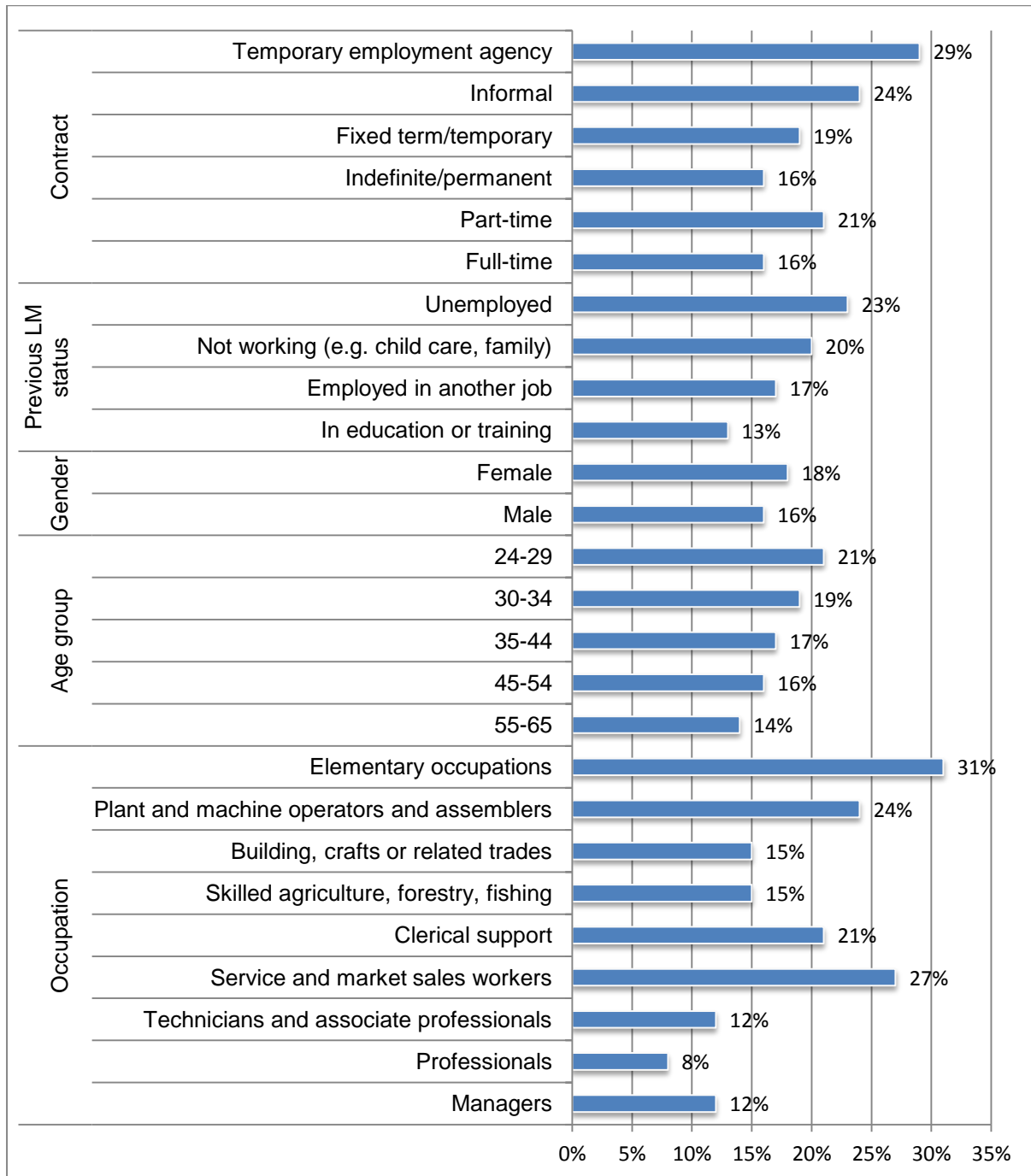
Finally, it is important to note that despite the use of a highly detailed data set, the majority of the overeducation pay penalty could not be explained in terms of endowment effects. While a certain proportion of the overeducation pay premium may relate to a better pay off to given characteristics having gained a better quality job, it is not likely that this would account for up to two-thirds of the wage advantage. More research is certainly required if we are to fully understand both the determinants and consequences of overeducation in the labour market.

References

- Bauer T. (2002), "Educational Mismatch and Wages: A Panel Analysis", *Economics of Education Review*, 21, 221-229.
- Becker, G.S. (1964). *Human Capital*. New York: Columbia University Press.
- Battu, H., Seaman, P. and Sloane P. (1999). 'Overeducation, undereducation and the British labour market'. *Applied Economics*, 31: 1437-1453.
- Büchel, F. (2002). 'The effects of overeducation on productivity in Germany: The firms' viewpoint'. *Economics of Education Review*, 21: 263-275.
- Cedefop (2010). *The skill matching challenge: analysing skill mismatch and policy implications*. Luxembourg: Publications Office.
http://www.cedefop.europa.eu/EN/Files/3056_en.pdf
- Cedefop (2015), *Skills, qualifications and jobs in the EU: the making of a perfect match?*, Cedefop reference series. See <http://www.cedefop.europa.eu/en/publications-and-resources/publications/8088> for first insights of the Cedefop European skills and jobs survey.
- Duncan, G. and Hoffman, S. (1981). 'The incidence and wage effects of overeducation'. *Economics of Education Review*, 1: 75-86.
- European Union (2012). *Employment and Social Developments in Europe 2012*. Luxembourg: Publications Office of the European Union.
- Freeman, R. (1976). *The Overeducated American*. New York: Academic Press.
- Galasi, Péter (2008). 'The effect of educational mismatch on wages for 25 countries'. *Budapest Working Papers on the Labour Market BWP 2008/8*.
- Green, F. and Zhu, Y. (2010). 'Overqualification, job dissatisfaction, and increasing dispersion in the returns to graduate education'. *Oxford Economic Papers*, 62: 740-763.
- Grugulis, I. and Stoyanova, D. (2011). 'Skill and performance'. *British Journal of Industrial Relations*, 49: 515-536.
- Hartog, J. (2000). 'Over-education and earnings: Where are we, where should we go?'. *Economics of Education Review*, 19: 131-147.
- Hersch, J. (1991). 'Education match and job match'. *Review of Economics and Statistics*, 73: 140-144.
- Jovanovic, B. (1970). Job Matching and the Theory of Turnover, *Journal of Political Economy*, **87**, 972-990
- Krueger, D. and Kumar, K. (2004). 'Skill-specific rather than general education: A reason for US-Europe growth differences?'. *Journal of Economic Growth*, 9: 167-207.
- Leuven, E. and Oosterbeek, H. (2011). 'Overeducation and mismatch in the labor market'. IZA Discussion Paper 5523.
- Mavromaras, K., McGuinness, S., O'Leary, N., Sloane, P. and Fok, Y. (2010), 'The problem of overskilling in Australian and Britain'. *The Manchester School*, 78: 219-241.
- Mavromaras, K., Mahuteau, S., Sloane, P. and Wei, Z. (2013). 'The effect of overskilling dynamics on wages'. *Education Economics*, 21: 281-303.
- Mavromaras, K. and McGuinness, S. (2012), 'Overskilling dynamics and education pathways'. *Economics of Education Review*, 31: 619-628.
- McGuinness, S., Whelan, A. & Bergin, A. (2015). "Recruitment Methods and Educational Provision Effects on Graduate Overeducation and Overskilling", STYLE working paper D5.4.

- Mavromaras, K., McGuinness, S., O'Leary, N., Sloane, P., & Wei, Z. (2013). "Job Mismatches and Labour Market Outcomes: Panel Evidence on Australian University Graduates", *Economic Record*, Vo. 89 (286), pp. 382-395.
- McGuinness, S. & Sloane, P. J. (2011). "Labour Market Mismatch Among UK Graduates: An Analysis Using Reflex Data", *Economics of Education Review*, Vol. 30 (1), 130-145.
- Mincer, J.A. (1974). *Schooling, Experience and Earnings*. New York: Columbia University Press.
- Nelson, R. and Phelps, E. (1966). 'Investment in humans, technological diffusion and economic growth'. *American Economic Review*, 56: 69-75.
- OECD (2011). *Employment outlook 2011*. Paris, OECD.
- Pouliakas, K. (2012). 'The skill mismatch challenge in Europe' , CH. 6 in: *Employment and Social Developments in Europe 2012*. Luxembourg: Publications Office of the European Union.
- Pfeffer, J. and Langton, N. (1993). 'The effect of wage dispersion on satisfaction, productivity, and working collaboratively: evidence from college and university faculty'. *Administrative Science Quarterly*, 38: 382-407.
- Quintini, G. (2011). Over-qualified or Under-skilled: A review of the existing literature. OECD Social, Employment and Migration working papers No.121.
- Rumberger, R. (1987). 'The impact of surplus schooling on productivity and earnings'. *Journal of Human Resources*, 22: 24-50.
- Sattinger, M. (2012) *Qualitative Mismatches*. Hanover (Ma.): Now Publishers.
- Sattinger, M. and Hartog, J. (2013). 'Nash bargaining and the wage consequences of educational mismatches'. *Labour Economics*, 23: 50-56.
- Sicherman, N. & Galor, O. (1991). 'Overeducation in the labor market'. *Journal of Labor Economics*, 9: 101-122.
- Tsang, M. (1987). 'The impact of underutilization of education on productivity: A case study of the U.S. Bell companies'. *Economics of Education Review*, 6: 239-254.
- Tsang, M., Rumberger, R. and Levin, H. (1991). 'The impact of surplus schooling on worker productivity'. *Industrial Relations*, 30: 209-228.
- Van der Meer, P. (2006). 'The validity of two education requirement measures'. *Economics of Education Review*, 25: 211-219.
- Verhaest, D. and Omey, E. (2006). 'The impact of overeducation and its measurement'. *Social Indicators Research*, 77: 419-448.
- Verhaest, D. and Omey E. (2009). 'Objective over-education and worker well-being; A shadow price approach'. *Journal of Economic Psychology*, 30: 469-481.

Figure 1 Overeducation by population groups, % of adult employees, 2014, EU28



Source: Cedefop European Skills and Jobs (ESJ) survey

Table 1 Mean (s.d) hourly earnings (EUR) by overeducation status, 2014, EU28

	<i>Overeducated</i>	<i>Matched</i>
<i>Distribution of earnings</i>		
Mean	15.61 (49.87)	15.92 (23.28)
Median	10.39	12.31
1 st quartile	6.06	7.31
3 rd quartile	15.19	18.07
<i>By level of education attainment</i>		
High (ISCED 5-6)	16.62 (64.20)	18.35 (23.26)
Medium (ISCED 3-4)	14.51 (26.54)	14.62 (22.88)
<i>By gender</i>		
Female	16.47 (66.62)	15.61 (24.95)
Male	14.72 (21.46)	16.20 (21.62)
<i>By age groups</i>		
24-39	14.95 (66.89)	15.03 (24.26)
40-54	16.33 (25.65)	16.18 (22.90)
55-65	15.72 (31.62)	17.39 (21.68)
<i>By previous labour market status</i>		
Employed	16.01 (61.20)	15.84 (19.98)
Self-employed	15.44 (26.35)	14.85 (21.02)
Education and training	15.97 (29.26)	16.85 (25.61)
Unemployed	14.04 (23.61)	14.34 (23.42)
Inactive	15.57 (23.51)	18.45 (47.43)
<i>By training incidence</i>		
Training mostly or only during work hours: Yes	16.11 (26.22)	16.69 (22.12)
Training mostly or only during work hours: No	15.27 (60.84)	15.29 (24.15)
<i>By type of contract</i>		
Indefinite	16.25 (53.73)	16.11 (22.78)
Fixed term	11.00 (18.67)	13.73 (19.24)
Temporary agency	12.79 (18.95)	23.08 (64.63)
No formal contract	17.77 (41.20)	14.14 (20.05)
Other	16.07 (36.28)	18.82 (36.71)
<i>By skill content of job</i>		
Advanced literacy skills needed in job	16.68 (23.95)	17.44 (24.06)
Advanced ICT skills needed in job	17.55 (27.03)	18.33 (23.66)
Advanced soft skills (e.g. problem solving, communication skills) needed in job	15.32 (23.03)	16.28 (23.17)

Source: Cedefop European skills and jobs (ESJ) survey

Table 2: Wage Equation for All Adult Workers, 2014, EU28

VARIABLES	(1) <i>Basic HC</i>	(2) <i>Augmented HC</i>	(3) <i>Skill mismatch</i>	(4) <i>Job</i>	(5) <i>Skill needs</i>	(6) <i>Preferences</i>
overeducated	-0.22*** (0.012)	-0.19*** (0.010)	-0.19*** (0.010)	-0.18*** (0.010)	-0.14*** (0.011)	-0.12*** (0.011)
age	0.03*** (0.006)	0.02*** (0.005)	0.02*** (0.005)	0.02*** (0.005)	0.02*** (0.005)	0.02*** (0.005)
agesq	-0.00*** (0.000)	-0.00*** (0.000)	-0.00*** (0.000)	-0.00*** (0.000)	-0.00*** (0.000)	-0.00*** (0.000)
male	0.12*** (0.014)	0.12*** (0.015)	0.12*** (0.015)	0.10*** (0.014)	0.10*** (0.014)	0.09*** (0.014)
mediscd	0.21*** (0.032)	0.20*** (0.029)	0.20*** (0.029)	0.19*** (0.028)	0.14*** (0.026)	0.15*** (0.027)
highiscd	0.47*** (0.042)	0.45*** (0.038)	0.45*** (0.038)	0.42*** (0.036)	0.34*** (0.034)	0.34*** (0.035)
preveduc	0.03** (0.014)	-0.03*** (0.010)	-0.03*** (0.010)	-0.03*** (0.010)	-0.03*** (0.010)	-0.02** (0.011)
prevunemp	-0.14*** (0.018)	-0.12*** (0.015)	-0.12*** (0.015)	-0.11*** (0.015)	-0.10*** (0.015)	-0.09*** (0.014)
prevoth	-0.07*** (0.015)	-0.08*** (0.015)	-0.08*** (0.015)	-0.07*** (0.015)	-0.06*** (0.014)	-0.06*** (0.017)
emptenure		0.01*** (0.002)	0.01*** (0.002)	0.01*** (0.002)	0.01*** (0.002)	0.01*** (0.002)
emptenuresq		-0.00*** (0.000)	-0.00*** (0.000)	-0.00* (0.000)	-0.00* (0.000)	-0.00* (0.000)
train_courses_in		0.07*** (0.009)	0.07*** (0.009)	0.05*** (0.008)	0.04*** (0.008)	0.03*** (0.007)
train_courses_out		0.04*** (0.011)	0.04*** (0.011)	0.04*** (0.010)	0.03*** (0.010)	0.03*** (0.010)
train_ojt		0.02** (0.008)	0.02** (0.009)	0.01 (0.008)	0.00 (0.008)	0.01 (0.007)
overskilled			-0.00 (0.006)	-0.01 (0.006)	-0.01 (0.005)	-0.00 (0.005)
skilldef			-0.00 (0.000)	-0.00 (0.000)	-0.00 (0.000)	0.00 (0.000)
temporary				-0.05*** (0.013)	-0.05*** (0.012)	-0.06*** (0.012)
informal				-0.03 (0.023)	-0.02 (0.024)	-0.01 (0.027)
multisite				0.02*** (0.007)	0.02*** (0.007)	0.02** (0.007)
private				0.03** (0.011)	0.02* (0.011)	0.02* (0.010)
size10to49				0.06*** (0.011)	0.06*** (0.011)	0.05*** (0.012)
size50to99				0.07*** (0.013)	0.07*** (0.013)	0.06*** (0.011)
size100to249				0.12*** (0.013)	0.11*** (0.012)	0.10*** (0.013)

size250to499				0.14*** (0.015)	0.14*** (0.016)	0.13*** (0.017)
size500				0.16*** (0.018)	0.16*** (0.017)	0.15*** (0.017)
jobnrout				-0.00 (0.010)	-0.01 (0.010)	-0.00 (0.009)
joblearn				-0.01* (0.008)	-0.03*** (0.008)	-0.03*** (0.010)
jobaut				0.03*** (0.008)	0.03*** (0.008)	0.02** (0.007)
jobteam				-0.02*** (0.008)	-0.02** (0.008)	-0.02** (0.008)
role_promoted				0.09*** (0.014)	0.07*** (0.014)	0.07*** (0.014)
advlit					0.06*** (0.008)	0.06*** (0.008)
advnum					0.02** (0.008)	0.01* (0.008)
modict					0.08*** (0.009)	0.07*** (0.008)
advict					0.10*** (0.017)	0.10*** (0.018)
highskill					0.03*** (0.007)	0.02** (0.007)
factor_suitskills						0.01*** (0.001)
factor_experience						-0.01*** (0.001)
factor_security						-0.01*** (0.002)
factor_career						0.01*** (0.002)
factor_reputation						-0.00*** (0.001)
factor_benefits						0.02*** (0.002)
factor_closehome						-0.01*** (0.001)
factor_intrinsic						0.00 (0.002)
factor_worklife						0.01*** (0.002)

Country dummies	YES	YES	YES	YES	YES	YES
Constant	1.62*** (0.133)	1.80*** (0.118)	1.80*** (0.122)	1.73*** (0.110)	1.69*** (0.106)	1.66*** (0.114)
Observations	35,522	35,423	35,315	35,315	35,315	31,277
R-squared	0.59	0.59	0.59	0.60	0.60	0.61

NB: Robust standard errors in parentheses, clustered for country; *** p<0.01, ** p<0.05, * p<0.1

Source: Cedefop European skills and job (ESJ) survey

Table 3: Wage Equation for Highly Educated Adult Workers, 2014, EU28

VARIABLES	(1) <i>Basic HC</i>	(2) <i>Augmented HC</i>	(3) <i>Skill mismatch</i>	(4) <i>Job</i>	(5) <i>Skill needs</i>	(6) <i>Preferences</i>
overeducated	-0.24*** (0.014)	-0.22*** (0.012)	-0.22*** (0.012)	-0.21*** (0.013)	-0.17*** (0.014)	-0.15*** (0.015)
age	0.04*** (0.007)	0.03*** (0.006)	0.03*** (0.006)	0.03*** (0.006)	0.03*** (0.006)	0.03*** (0.006)
agesq	-0.00*** (0.000)	-0.00*** (0.000)	-0.00*** (0.000)	-0.00*** (0.000)	-0.00*** (0.000)	-0.00*** (0.000)
male	0.10*** (0.013)	0.10*** (0.013)	0.10*** (0.014)	0.08*** (0.013)	0.08*** (0.013)	0.07*** (0.013)
preveduc	0.03* (0.013)	-0.02 (0.010)	-0.02 (0.010)	-0.01 (0.011)	-0.01 (0.011)	-0.00 (0.013)
prevunemp	-0.14*** (0.025)	-0.13*** (0.022)	-0.13*** (0.022)	-0.11*** (0.020)	-0.11*** (0.020)	-0.08*** (0.020)
prevoth	-0.05* (0.025)	-0.06** (0.025)	-0.06** (0.025)	-0.04 (0.026)	-0.04 (0.025)	-0.03 (0.027)
teacher	0.02 (0.029)	0.01 (0.029)	0.01 (0.029)	0.04 (0.027)	0.04 (0.027)	0.04* (0.023)
humanities	-0.02 (0.013)	-0.01 (0.013)	-0.01 (0.014)	-0.02 (0.012)	-0.02* (0.013)	-0.03** (0.013)
econ	0.07*** (0.014)	0.07*** (0.014)	0.07*** (0.014)	0.06*** (0.012)	0.05*** (0.011)	0.05*** (0.014)
othersocial	-0.02 (0.012)	-0.02 (0.013)	-0.02 (0.013)	-0.02* (0.012)	-0.03** (0.012)	-0.02** (0.011)
natural	0.01 (0.016)	0.01 (0.017)	0.01 (0.017)	0.00 (0.016)	-0.00 (0.016)	-0.02 (0.016)
maths	0.04 (0.027)	0.04 (0.026)	0.04 (0.026)	0.03 (0.024)	0.03 (0.024)	0.03 (0.019)
ictf	0.07*** (0.017)	0.07*** (0.017)	0.07*** (0.018)	0.05*** (0.016)	0.04** (0.016)	0.04** (0.014)
engineering	0.07*** (0.017)	0.08*** (0.018)	0.08*** (0.018)	0.06*** (0.017)	0.05** (0.017)	0.04** (0.016)
agri	-0.05 (0.037)	-0.05 (0.038)	-0.05 (0.038)	-0.05 (0.040)	-0.05 (0.038)	-0.06* (0.034)
medicine	0.02 (0.018)	0.01 (0.020)	0.01 (0.020)	0.01 (0.018)	0.02 (0.018)	0.03 (0.019)
service	-0.05*** (0.015)	-0.06*** (0.016)	-0.07*** (0.016)	-0.07*** (0.015)	-0.06*** (0.015)	-0.07*** (0.017)
emptenure		0.01*** (0.003)	0.01*** (0.003)	0.01** (0.003)	0.01** (0.003)	0.01** (0.003)
emptenuresq		-0.00** (0.000)	-0.00** (0.000)	-0.00 (0.000)	-0.00 (0.000)	-0.00 (0.000)
train_courses_in		0.05*** (0.012)	0.04*** (0.012)	0.03** (0.012)	0.02* (0.012)	0.02 (0.013)
train_courses_out		0.02* (0.013)	0.02* (0.013)	0.02* (0.012)	0.02 (0.012)	0.01 (0.012)
train_ojt		0.00 (0.010)	0.00 (0.010)	-0.00 (0.009)	-0.01 (0.008)	-0.00 (0.009)

overskilled	-0.02*	-0.02**	-0.02*	-0.00
	(0.009)	(0.009)	(0.008)	(0.007)
skilldef	-0.00	-0.00	-0.00	-0.00
	(0.001)	(0.001)	(0.001)	(0.001)
temporary		-0.04***	-0.04***	-0.04**
		(0.016)	(0.016)	(0.018)
informal		-0.05**	-0.05**	-0.05*
		(0.021)	(0.022)	(0.026)
multisite		0.03***	0.03***	0.03***
		(0.008)	(0.008)	(0.007)
private		0.02	0.02	0.02
		(0.015)	(0.015)	(0.013)
size10to49		0.07***	0.07***	0.07***
		(0.017)	(0.017)	(0.017)
size50to99		0.08***	0.08***	0.07***
		(0.019)	(0.019)	(0.018)
size100to249		0.15***	0.14***	0.13***
		(0.019)	(0.019)	(0.020)
size250to499		0.16***	0.15***	0.15***
		(0.015)	(0.015)	(0.017)
size500		0.18***	0.18***	0.16***
		(0.022)	(0.022)	(0.022)
jobnrou		-0.01	-0.01	-0.01
		(0.016)	(0.015)	(0.014)
joblearn		-0.03**	-0.03***	-0.04***
		(0.010)	(0.010)	(0.012)
jobaut		0.04***	0.04***	0.02**
		(0.008)	(0.008)	(0.009)
jobteam		-0.03***	-0.03***	-0.03***
		(0.007)	(0.007)	(0.007)
role_promoted		0.07***	0.07***	0.07***
		(0.014)	(0.014)	(0.014)
advlit			0.07***	0.07***
			(0.012)	(0.010)
advnum			0.02	0.01
			(0.010)	(0.011)
modict			0.04**	0.03
			(0.015)	(0.016)
advict			0.05**	0.03
			(0.019)	(0.021)
highskill			0.03***	0.02*
			(0.008)	(0.008)
factor_suitskills				0.01***
				(0.003)
factor_experience				-0.01***
				(0.003)
factor_security				-0.01***
				(0.003)
factor_career				0.01
				(0.003)

factor_reputation						-0.01** (0.002)
factor_benefits						0.02*** (0.002)
factor_closehome						-0.01*** (0.002)
factor_intrinsic						0.01* (0.003)
factor_worklife						0.01*** (0.002)
Country dummies	YES	YES	YES	YES	YES	YES
Constant	1.75*** (0.158)	1.92*** (0.139)	1.94*** (0.147)	1.86*** (0.138)	1.79*** (0.138)	1.74*** (0.145)
Observations	16,880	16,845	16,811	16,811	16,811	14,868
R-squared	0.58	0.59	0.58	0.59	0.60	0.61

NB: Robust standard errors in parentheses, clustered for country; *** p<0.01, ** p<0.05, * p<0.1

Source: Cedefop European skills and job (ESJ) survey

Table 4: Wage Equation for Medium Educated Adult Workers, 2014, EU28

VARIABLES	(1) <i>Basic HC</i>	(2) <i>Augmented HC</i>	(3) <i>Skill mismatch</i>	(4) <i>Job</i>	(5) <i>Skill needs</i>	(6) <i>Preferences</i>
overeducated	-0.18*** (0.022)	-0.15*** (0.020)	-0.15*** (0.020)	-0.14*** (0.020)	-0.09*** (0.020)	-0.08*** (0.018)
age	0.02*** (0.007)	0.01 (0.007)	0.01 (0.007)	0.01 (0.007)	0.01 (0.007)	0.01** (0.006)
agesq	-0.00* (0.000)	-0.00 (0.000)	-0.00 (0.000)	-0.00 (0.000)	-0.00 (0.000)	-0.00* (0.000)
male	0.13*** (0.018)	0.12*** (0.018)	0.13*** (0.019)	0.11*** (0.018)	0.11*** (0.018)	0.10*** (0.018)
preveduc	0.05** (0.020)	-0.04** (0.016)	-0.04** (0.016)	-0.03** (0.016)	-0.03** (0.016)	-0.03** (0.017)
prevunemp	-0.14*** (0.027)	-0.12*** (0.023)	-0.12*** (0.023)	-0.11*** (0.022)	-0.11*** (0.023)	-0.11*** (0.024)
prevoth	-0.06** (0.027)	-0.07** (0.028)	-0.07** (0.028)	-0.06** (0.028)	-0.05* (0.029)	-0.06* (0.033)
emptenure		0.01*** (0.002)	0.01*** (0.002)	0.01*** (0.002)	0.01*** (0.002)	0.01*** (0.002)
emptenuresq		-0.00*** (0.000)	-0.00*** (0.000)	-0.00** (0.000)	-0.00** (0.000)	-0.00* (0.000)
train_courses_in		0.08*** (0.012)	0.08*** (0.012)	0.06*** (0.012)	0.05*** (0.012)	0.04*** (0.011)
train_courses_out		0.03** (0.014)	0.03** (0.014)	0.03** (0.014)	0.02 (0.015)	0.02 (0.015)
train_ojt		0.04*** (0.010)	0.04*** (0.010)	0.03** (0.010)	0.02** (0.010)	0.03** (0.010)
overskilled			-0.01 (0.010)	-0.02 (0.009)	-0.01 (0.009)	-0.01 (0.010)
skilldef			-0.00 (0.000)	0.00 (0.000)	0.00 (0.000)	0.00 (0.000)
temporary				-0.08*** (0.019)	-0.07*** (0.018)	-0.08*** (0.021)
informal				-0.02 (0.049)	-0.01 (0.049)	0.03 (0.055)
multisite				0.02 (0.011)	0.01 (0.011)	0.01 (0.012)
private				0.03* (0.015)	0.03* (0.015)	0.02 (0.017)
size10to49				0.04** (0.016)	0.04** (0.016)	0.03* (0.017)
size50to99				0.04** (0.018)	0.04** (0.017)	0.03** (0.016)
size100to249				0.08*** (0.023)	0.07*** (0.023)	0.07*** (0.023)
size250to499				0.12*** (0.025)	0.12*** (0.025)	0.11*** (0.025)
size500				0.15*** (0.020)	0.14*** (0.019)	0.13*** (0.016)

jobnrout				-0.00 (0.014)	-0.01 (0.014)	-0.01 (0.015)
joblearn				-0.00 (0.013)	-0.01 (0.013)	-0.01 (0.015)
jobaut				0.03** (0.011)	0.02* (0.012)	0.01 (0.012)
jobteam				0.00 (0.015)	0.01 (0.016)	0.00 (0.016)
role_promoted				0.09*** (0.022)	0.07*** (0.022)	0.07*** (0.022)
advlit					0.05*** (0.012)	0.06*** (0.013)
advnum					0.00 (0.012)	-0.00 (0.012)
modict					0.09*** (0.011)	0.08*** (0.010)
advict					0.12*** (0.023)	0.11*** (0.025)
highskill					0.01 (0.012)	0.01 (0.012)
factor_suitskills						0.00 (0.002)
factor_experience						-0.01*** (0.002)
factor_security						-0.01* (0.003)
factor_career						0.01** (0.003)
factor_reputation						-0.00 (0.002)
factor_benefits						0.02*** (0.003)
factor_closehome						-0.01*** (0.001)
factor_intrinsic						0.00 (0.002)
factor_worklife						0.01*** (0.003)
Country dummies	YES	YES	YES	YES	YES	YES
Constant	2.06*** (0.137)	2.20*** (0.139)	2.20*** (0.138)	2.11*** (0.140)	2.00*** (0.139)	1.98*** (0.133)
Observations	14,500	14,451	14,403	14,403	14,403	12,802
R-squared	0.59	0.60	0.60	0.60	0.61	0.61

NB: Robust standard errors in parentheses, clustered for country; *** p<0.01, ** p<0.05, * p<0.1

Source: Cedefop European skills and job (ESJ) survey

Table 5: Decomposition analysis of wage differences between matched and overeducated employees, adult workers, 2014, EU28

	All sample excl. Low- educated	Medium- educated	High- educated
Amount attributable:	0.8	-21.1	15.2
- due to endowments (E):	4.9	3.6	12.0
- due to coefficients (C):	-4.1	-24.7	3.1
Shift coefficient (U):	16.7	32.7	12.5
Raw differential (R) {E+C+U}:	17.4	11.5	27.7
Adjusted differential (D) {C+U}:	12.5	7.9	15.7
Endowments as % total (E/R):	28.1	31.1	43.4
Discrimination as % total (D/R):	71.9	68.9	56.6

Source: Cedefop European Skills and Jobs (ESJ) survey

Table 6: Contribution of endowments in wage differences between matched and overeducated employees, adult workers, 2014, EU28

	<i>All</i>	<i>High</i>	<i>Medium</i>
<i>% of total raw difference</i>			
HC	5%	16%	27%
Job	9%	7%	15%
Skill needs	18%	7%	36%
Motives	11%	9%	15%
Country FE	-15%	4%	-60%
Total endowment	28%	43%	31%
<i>% total endowment</i>			
HC			
- Quadratic age	20%	13%	8%
- Quadratic employer tenure	29%	4%	47%
- High education	-55%	.	.
- Past unemployment	10%	4%	14%
- Training in work	4%	2%	8%
- Field of study: Education	.	3%	.
- Field of study: Humanities	.	2%	.
- Field of study: Economics	.	-2%	.
- Field of study: Engineering	.	2%	.
- Overskilled	4%	3%	6%
Job			
- Temporary contract	4%	1%	11%
- Size of workplace: 1-9	10%	8%	8%
- Promoted	16%	7%	25%
- Private	-4%	-2%	-3%
- Learning in job	-4%	-3%	0%
Skill needs			
- Advanced literacy	27%	14%	33%
- Advanced numeracy	8%	3%	0%
- Moderate ICT	8%	-1%	44%
- Advanced ICT	14%	-3%	31%

- High level of soft skills	6%	3%	6%
Motives			
<i>Information</i>			
- Suits qualifications&skills	24%	18%	14%
- Pay & benefits	22%	8%	33%
<i>Career concerns</i>			
- Gain work experience	-14%	-5%	-22%
- Career prospects	12%	2%	28%
<i>Job attributes</i>			
- Employer reputation	-4%	-3%	-3%
- Close to home	2%	2%	0%
- Intrinsic satisfaction		1%	-8%
- Work-life balance		1%	14%
- Job security		-3%	-8%

Source: Cedefop European Skills and Jobs (ESJ) survey

Table 7: Unexplained raw wage differences between matched and overeducated employees, adult workers, 2014, EU28

	<i>All</i>	<i>High</i>	<i>Medium</i>
<i>% total raw difference</i>			
HC	71%	96%	-163%
Job	9%	12%	-7%
Skill needs	-22%	-32%	-10%
Motives	-47%	-51%	10%
Country FE	-33%	-12%	-46%
HC			
- Age	82%	194%	-325%
- Age square	-10%	-63%	200%
- Male	-5%	0%	-24%
- High education	39%	.	.
- Previously in education & training	1%	3%	-7%
- Previously in unemployment	-1%	-1%	4%
- Overskilled	-6%	-10%	19%
- Skill deficit	5%	-1%	20%
- Employer tenure	-43%	-44%	-30%
- Employer tenure square	14%	12%	15%
- Training courses during work	2%	5%	-17%
- Training courses out of work	-1%	1%	-8%
- Training as part of work	-4%	-1%	-11%
Job			
- Temporary contract	-1%	1%	-9%
- Informal contract	-2%	-1%	-5%
- Multi site workplace	12%	14%	4%
- Private sector	-6%	-8%	16%
- Size1to9	-3%	-1%	-11%
- Size10to49	-1%	-2%	3%
- Size50to99	0%	1%	-3%

- Size100to249	2%	1%	4%
- Size250to499	-1%	0%	-3%
- Size500	2%	0%	6%
- Non-routine job	3%	1%	5%
- Job with need to learn	3%	-1%	17%
- Job with autonomy	2%	3%	-3%
- Job in teams	-3%	4%	-28%
- Promotion	1%	0%	1%

Skill needs

- Advanced literacy	-7%	-6%	-4%
- Advanced numeracy	5%	4%	5%
- Moderate ICT	-17%	-25%	-12%
- Advanced ICT	-6%	-6%	-3%
- High level of soft skills	3%	0%	5%

Motives

Information

- Suits qualifications & skills	29%	24%	46%
- Pay and benefits	14%	19%	-3%

Career concerns

- Gain work experience	17%	12%	17%
- Career progression	-17%	-26%	17%

Job attributes

- Job security	-26%	-32%	-5%
- Employer reputation	13%	9%	30%
- Close to home	-21%	0%	-91%
- Intrinsic reasons	-50%	-23%	-83%
- Work-life balance	-6%	-33%	82%

Source: Cedefop European Skills and Jobs (ESJ) survey