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Title: DISPARITIES IN WORK, RISK AND HEALTH BETWEEN IMMIGRANTS AND NATIVE-BORN SPANIARDS.

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Abstract: We analyse the impact of working and contractual conditions, particularly exposure to job risks, on the probability of acquiring a permanent disability, controlling for other personal and firm characteristics. We postulate a model in which this impact is mediated by the choice of occupation, with a level of risk associated with it. We assume this choice is endogenous, and that it depends on preferences and opportunities in the labour market, both of which may differ between immigrants and natives. To test this hypothesis we apply a bivariate probit model to data for 2006 from the Continuous Sample of Working Lives provided by the Spanish Social Security system, containing records for over a million workers. We find that risk exposure increases the probability of permanent disability - arising from any cause - by almost 5%. Temporary employment and low-skilled jobs also have a positive impact. Increases in education reduce the likelihood of disability, even after controlling for the impact of education on the choice of (lower) risk. Females have a greater probability of becoming disabled. Migrant status - with differences among regions of origin - significantly affects both disability and the probability of being employed in a high-risk occupation. In spite of immigrants' working conditions being objectively worse, they exhibit a lower probability of becoming disabled than natives because the impact of such conditions on disability is much smaller in their case. Time elapsed since first enrolment in the Social Security system increases the probability of disability in a proportion similar to that of natives, which is consistent with the immigrant assimilation hypothesis. We finally conclude that our theoretical hypothesis that disability and risk are jointly determined is only valid for natives and not valid for immigrants, in the sense that, for them, working conditions are not a matter of choice in terms of health.

**Title: DISPARITIES IN WORK, RISK AND HEALTH BETWEEN
IMMIGRANTS AND NATIVE-BORN SPANIARDS.**

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There is no conflict of interest.

Research highlights

- Risk exposure, temporary employment and low-skill jobs have a substantial positive effect on the probability of disability.
- The presence of immigrants in the three unhealthy working conditions is relatively higher than that of natives.
- Immigrants are less likely to become disabled; in part because the impact of the work variables is smaller in their case.
- There are some differences among immigrants by region of origin, calling for caution to avoid over generalisation.

1 **Keywords:** Health, disability, working conditions, immigration, socioeconomic inequalities,
2 Spain.
3

4 5 6 **Abstract**

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9 We analyse the impact of working and contractual conditions, particularly exposure to job
10 risks, on the probability of acquiring a permanent disability, controlling for other personal and
11 firm characteristics. We postulate a model in which this impact is mediated by the choice of
12 occupation, with a level of risk associated with it. We assume this choice is endogenous, and
13 that it depends on preferences and opportunities in the labour market, both of which may
14 differ between immigrants and natives. To test this hypothesis we apply a bivariate probit
15 model to data for 2006 from the Continuous Sample of Working Lives provided by the
16 Spanish Social Security system, containing records for over a million workers. We find that
17 risk exposure increases the probability of permanent disability – arising from any cause – by
18 almost 5%. Temporary employment and low-skilled jobs also have a positive impact.
19 Increases in education reduce the likelihood of disability, even after controlling for the impact
20 of education on the choice of (lower) risk. Females have a greater probability of becoming
21 disabled. Migrant status – with differences among regions of origin – significantly affects
22 both disability and the probability of being employed in a high-risk occupation. In spite of
23 immigrants' working conditions being objectively worse, they exhibit a lower probability of
24 becoming disabled than natives because the impact of such conditions on disability is much
25 smaller in their case. Time elapsed since first enrolment in the Social Security system
26 increases the probability of disability in a proportion similar to that of natives, which is
27 consistent with the immigrant assimilation hypothesis. We finally conclude that our
28 theoretical hypothesis that disability and risk are jointly determined is only valid for natives
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1 and not valid for immigrants, in the sense that, for them, working conditions are not a matter
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3 of choice in terms of health.
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1 **Introduction**
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6 Numerous investigations have demonstrated that working conditions, and in particular
7 exposure to the risk of work-related injury and illness, have an impact on health (Llena-Nozal
8 et al, 2004; Robone et al, 2010; Bartley et al, 2004; Benach et al, 2004; Monden, 2005, Berger
9 and Leigh, 1989). Due to the increase of “flexible” employment and other forms of non-
10 standard contractual conditions, a growing body of literature has emerged that shows that
11 unstable employment is associated with bad health too (Gash et al, 2007; Rodriguez, 2002;
12 Virtanen et al, 2005). Also, psychological factors related to lack of autonomy at work and job
13 dissatisfaction have appeared in several studies as strong determinants of general health or
14 specific diseases (Datta Gupta and Kristensen, 2007; Marmot, 2004; Plaisier et al, 2007).
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30 As Kerkhofs and Lindeboom (1997) stress, working conditions and the working environment
31 affect both gradual changes in health and the occurrence of events that have a sudden impact
32 on an individual’s health, like work-related accidents. These authors assume that health status
33 and work history may be jointly determined (that is, they may be endogenous). The idea that
34 individuals invest in their own health has had a prominent place in the health economics
35 literature since the publication of Grossman’s seminal work in 1972, and the treatment of
36 occupational choice as an investment in health can be found, for example, in Cropper (1977).
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50 Following this line of thought, our central notion is that the relationship between working
51 conditions and health is mediated by occupational choice in terms of risk. It is plausible to
52 assume that upon choosing a job – with its inherent level of risk – workers do not ignore the
53 effects of working in a risky job on their health status. Nevertheless, the choice of work-
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1 related risk level is partially determined by preferences and partially determined by social and
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3 economic circumstances. Among such circumstances, migrant status is thought to strongly
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5 affect occupational choice.
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10 According to the hedonic equilibrium wage model, which relates wages to job characteristics
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12 including the relative attractiveness of a particular job, jobs with higher workplace risk
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14 receive a compensating wage premium. Nevertheless, wage-risk tradeoffs need not be equal.
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16 For instance, inequalities in lifetime levels of wealth – supposedly lower for immigrants –
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18 may explain differences in willingness to bear risk, i.e., immigrants or ethnic minorities
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20 would be more likely to accept and to be employed in high-risk jobs (Robinson, 1984;
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22 Viscusi, 2003; Leeth and Ruser, 2006). Immigrants and non-immigrants might also differ in
23
24 terms of market opportunities. In several studies, it has been observed that the wages paid to
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26 compensate fatality risk differ among countries of origin, and that these variations may arise
27
28 from discrimination, from unmeasured productivity differences (Akhavan, 2006; Leeth and
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30 Ruser, 2006) or from lower safety-related productivity arising from language barriers (Hersch
31
32 and Viscusi 2010).
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42 The compensating wage premium represents, in fact, any type of compensation that labour
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44 markets offer that is different for immigrants and natives. In an economy with a large
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46 underground sector the compensation could be, for instance, a legal contract giving rise to
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48 legal resident status and Social Security benefits. Additionally, informational disadvantages or
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50 occupational crowding – high competition for the same job, exacerbated by high
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52 unemployment rates – probably force immigrants to choose higher levels of risk than those
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1 arising from their preferences. From a health investment perspective, we can thus assume that
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3 there will be differences in health investments owing to migrant status.
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8 This research uses a dataset containing ample information about working lives and disability
9 status to explore two sets of issues: Firstly, how do working and contractual conditions, and
10 particularly exposure to health risks, contribute to the probability of acquiring a disability,
11 taking into account the endogeneity of risk level choices? Secondly, are there socioeconomic
12 inequalities between immigrants and natives in terms of risk choices and in terms of the effect
13 of these choices on their health status? Moreover, are all immigrants the same?
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25 The existence of socioeconomic health inequalities due to differences in working conditions
26 constitutes, in itself, a point of interest for public policies and they have been highlighted by
27 several authors, for example, Artazcoz et al, 2005; Warren et al, 2004, Borg and Kristensen,
28 2000; Power et al, 1998; Lundberg, 1991. Possible differences in market opportunities
29 depending on migrants' country of origin, resulting in higher risk exposure or more precarious
30 employment constitute an additional source of inequality and are at the core of the debate on
31 the conditions in which a society integrates new arrivals.
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45 Due to the recent dramatic growth in the immigrant population in Spain (in 2009, 13.8% of
46 the population had been born abroad, whereas the percentage was only 3.13% in 1999), the
47 above-mentioned issues stand out as a very important topic of public debate. However,
48 evidence regarding health status and workplace conditions of immigrant populations in Spain
49 and other developed countries is still scarce. Furthermore, the existing evidence is based on
50 subjective perceptions of both working conditions and health status, or restricted to
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1 differences in workplace illness and injury rates (Ahonen and Benavides, 2006; Parra et al,
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3 2006). We seek to contribute to the quality of the discussion by applying a behavioural model
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5 using objective measures of working conditions and disability status obtained from the Social
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7 Security census of working lives. Moreover, we focus on disability arising from any cause,
8
9 not just injuries or professional illnesses.
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15 After this introduction, in the next section we discuss our conceptual and empirical
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17 frameworks. In section three we describe the institutional context and the data, and we present
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19 the variables and their descriptive statistics. Section four contains the results, and section five
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21 concludes with a discussion of the main results and some limitations.
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26 27 **2. Methodological framework**

28 29 30 31 *2.1. Conceptual framework*

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37 We aim to model the two hypothesis that form the basis of our analysis: health depends on
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39 working and contractual conditions, mainly through the exposure to work-related health risks;
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41 and the occupational choice that determines the level of risk depends on preferences and
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43 opportunities in the labour market that may differ between immigrants and natives.
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49 Worker's i health stock (H_i) is governed by a health production function where the health
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51 stock depreciates at rate δ , and L represents a stochastic and permanent shock (an example of
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53 a health production function with a stochastic shock can be found in Vaness, 2003):
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$$H_i = \bar{H}_i - \delta H_i - L_i \quad (1.1)$$

$$L_i = f(R_i, C, A_i, X_i) \quad (1.2)$$

L_i depends on R_i = the level of risk (injury and illness rate) associated with the job chosen, C = other working conditions, A_i = the individual's ability to work safely, and X_i = other individual variables shaping the acceptance of health risks. Permanent disability occurs when H_i falls below a critical level. Transitions to permanent disability are observed, by definition, once in an individual's lifetime.

According to the arguments presented in the introduction, immigrants and natives face different levels of risk and, likely, the determinants of risk level choices have a differential incidence between these two groups:

$$R_{1i} = \beta X_i + \varepsilon_i \quad (2.1)$$

$$R_{2i} = \alpha X_i + \mu_i \quad (2.2)$$

where 1=immigrant and 2=native and the vector X_i covers all personal characteristics affecting the choice of risk level. R_{1i} and R_{2i} , the risk level choices, are not only the result of individuals' acceptance of risk but are also related to supply conditions, that is, the compensation (wage premium or other, if existing) offered in exchange of risk. The formulation presented in equation (2.1) and (2.2) is appropriate to empirically account for the sorting of workers into levels of risk underlying personal characteristics.

2.2. Empirical framework

1 The model consists of a recursive system of equations for disability and risk exposure, where
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 3 the random component of the disability equation is allowed to be freely correlated with the
 4
 5 random component of the risk equation. This specification is able to take endogeneity into
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 7 account, which may arise from simultaneity and unobservable heterogeneity influencing both
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 9 disability and risk exposure. Simultaneity (joint determination) issues may emerge from the
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 11 fact that individuals do not ignore the health consequences of their risk level choices. This
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 13 consideration is consistent with our conceptual framework, where risk choice is inserted into a
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 15 health production function.
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23 To properly account for endogeneity, and considering that both disability and risk are
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 25 dichotomous variables, we specify the following bivariate probit model (Greene, 1998):
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$$\begin{aligned}
 D_i^* &= \beta_1 X_i + \lambda R_i + \varepsilon_i \\
 D_i &= 1 \quad \text{if} \quad D_i^* > 0
 \end{aligned}
 \tag{3.1}$$

$$\begin{aligned}
 R_i^* &= \beta_2 X_i + \gamma Z_i + \mu_i \\
 R_i &= 1 \quad \text{if} \quad R_i^* > 0
 \end{aligned}
 \tag{3.2}$$

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 42 For individual i , D_i^* and R_i^* are unobserved latent variables indicating the individual's
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 44 probability of acquiring a disability and the individual's propensity for choosing a high-risk
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 46 job respectively. We observe D_i , a binary variable that takes the value 1 if the person moves
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 48 to a permanent disability status and 0 otherwise. Similarly, the binary indicator R_i takes a
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 50 value 1 if the individual is employed in a high-risk job and 0 otherwise. The vector X_i
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 52 contains the explanatory variables of disability. Z_i is a vector of variables that influence
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 54 current risk level choice but are uncorrelated with ε_i ; the remaining terms in equations (3.1)
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1 and (3.2) are the unknown parameters of interest that we wish to estimate, β_1 , β_2 , λ and γ ,
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4 and the random error terms, ε_i and μ_i . The correlation between ε_i and μ_i - ρ - will be
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6 estimated, too, assuming that it follows a bivariate normal distribution.
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11 The unobserved propensities D_i^* and R_i^* will be estimated first for the whole sample, with
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13 immigrants' region of origin as a dummy variable and interactions of these variables with
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15 risk. We then go on to estimate the bivariate probit separately for native-born Spaniards and
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17 immigrants, again distinguishing among immigrants' regions of origin with a set of dummy
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19 variables.
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26 **3. Institutional context, data and descriptive statistics**

27 28 29 30 ***3.1 Institutional context***

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36 The employment-based Social Security (SS) system is mandatory for workers in Spain.
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38 Contributions are scaled according to occupational category. The SS funds the largest welfare
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40 programme: public benefits, allowances and pensions. Regarding permanent disability
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42 benefits, the law identifies four levels of disability, in increasing order of severity (the first
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44 two are compatible with employment): 1) *partial-permanent disability for the usual*
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46 *profession*, which refers to disability cases where a worker's ability to perform his/her usual
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48 tasks is decreased by 33% or more; 2) *total permanent disability for the usual profession*; 3)
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50 *absolute permanent disability*, which applies to cases where the individual is unable to
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52 undertake work of any kind; and 4) *severe disability*, where the person requires continued
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54 assistance from others in order to carry out basic daily activities (Jiménez-Martín et al, 2006).
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1 To be eligible, the beneficiary must have contributed to the Social Security system for a
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3 minimum of five years if the disability is caused by an ordinary illness. There is no such
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5 requirement when the disability is caused by a work-related accident or a professional illness.
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10 ***3.2. Data and Variables***

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15 We use the Continuous Sample of Working Lives, known as the MCVL in Spanish (from
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17 *Muestra Continua de Vidas Laborales*), 2006, an administrative dataset provided by the
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19 Social Security administration with information on individuals who had an active record at
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21 any time during 2006. The sample is a 4% non-stratified random draw from a reference
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23 population that includes employed workers (wage earners and self-employed) and those on
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25 unemployment and other benefits. It consists of nearly 1.1 million individuals. The MCVL
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27 contains information on the employment and SS contribution history of the selected
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29 individuals dating back to 1967, although for reliability reasons we have limited the period to
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31 1980 onwards..
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40 Individual variables include sex, date and place of birth, family status, benefits, degree of
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42 disability and the year of its commencement. Corporate characteristics comprise the number
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44 of employees, foundation date and geographical location. Job characteristics cover type of
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46 contract, the firm's sector of activity and the beginning and end dates of each contract. For
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48 each contractual relationship into which the worker enters, the characteristics of the job and
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50 the company are registered.
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1 The MCVL has two features that are particularly relevant to our analysis: it contains a large
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3 and representative subsample of immigrants, and information regarding disabilities and the
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5 levels thereof. An immigrant is defined as someone who was born abroad. We work with
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7 cross section data: for active non-disabled population, the relationship with the Social
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9 Security prevailing in 2006 and, in the case of disabled people, data refer to the relationship
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11 applicable when the disability appeared. Since every contractual relation generates a new
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13 record, we can observe the actual working conditions prevailing when the disability occurred.
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15 From the original dataset, we have restricted our sample to working-age individuals (21 to 64
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17 years old) who have contributed to the SS system for at least five years, making a total of
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19 718,958 observations. A detailed description of the variables follows.
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27 ***Disability***

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32 “Disability” takes the value 1 if the person moves to a permanent disability status (any of the
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34 four categories mentioned above) at any time of his/her active working life between 1980 and
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36 2006 and 0 otherwise. For disabled individuals, we consider the working conditions
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38 applicable at the time of the transition to disability, and subsequent working relations are
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40 discarded.
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47 ***Risk***

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52 We have constructed the risk measure using narrowly defined injury and illness rates by
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54 industry-occupation: i.e., the number of individuals receiving an allowance for non-fatal
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56 work-related injuries or professional illness in a certain industry-occupation divided by the
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1 total number of individuals working in that industry-occupation. There are 44 industries and
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3 10 occupations, which makes a total of 440 job-industry cells. The risk variable takes the
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5 value 1 if the individual's job-industry cell is in the top quartile in the illness/injury rate
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7 ranking, and 0 otherwise. We find our binary variable to be more suitable than the continuous
8
9 one. The latter would imply that individuals have full information of the level of risk
10
11 throughout its whole distribution by industry-occupation cells. Taking into account that we
12
13 are modelling a choice, it seems more reasonable to think that individuals broadly know about
14
15 the existence of "good" and "bad" jobs in terms of risk. Indeed, below the upper quartile of
16
17 the ranking, illness/injury rates are low and quite similar across industry-occupation cells.
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19 The interested reader can check Table 4 in the supplementary material where we present the
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21 non-fatal injury and illness rates aggregating by major industry-occupation cells.
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32 *Explanatory variables*

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37 In the disability equation we include both individual characteristics – age, sex, education,
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39 number of family members, and marital status – and working conditions: risk exposure, days
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41 since first enrolment in the Social Security system, type of contract, and a dummy variable for
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43 low-skilled jobs. The "type of contract" variable takes the value 1 for temporary and fixed-
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45 term contracts, and 0 for the civil service and other kinds of open-ended employment.
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47 Following the classification of the Spanish Ministry of Labour, we consider "low-skilled"
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49 workers those employed in the subordinate and unskilled labourers occupations. This variable
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51 is used as a proxy for lack of autonomy on the job. Age is expected to have a positive effect
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53 on disability, while education is expected to have a negative one. It seems likely that the
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1 greater the number of family members the more reluctant the worker will be to apply for
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3 disability benefits if that means losing income.
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8 A relevant variable in our analysis is education. One might expect the impact of education on
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10 the probability of disability to be reduced since some of its effect is mediated by the role of
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12 education in relation to risk: i.e. increases in education lessen the probability of accepting
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14 riskier jobs, which in turn, reduces the chance of disability (Warren et al, 2004).
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20 The risk equation contains mostly the same variables plus a dummy that takes the value 1 for
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22 workers whose previous working status was “unemployed”. Crowded occupations or lack of
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24 employee bargaining power are natural correlates of unemployment status and constrain the
25
26 worker’s range of opportunities in the job market. Therefore, it is reasonable to expect that
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28 shifts from unemployment to high-risk jobs are more likely than transitions from other jobs to
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30 high-risk occupations, everything else being equal.
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37 Number of family members and marital status have been used in some studies as proxies for
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39 risk preferences (Leeth and Ruser, 2006; DeLeire and Levy, 2004). Size of the family and risk
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41 are expected to be negatively correlated. In the case of unmarried persons the expected sign is
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43 less clear but we tend to think that it is also negative because these individuals don’t need so
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45 much the (possible) wage compensation for risk and they cannot count so much on others to
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47 look after them in case of injury. Consistently with other literature which shows that women
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49 are more risk averse than men in their financial decisions (Jianakoplos and Bernasek, 1998)
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51 and gambling (Hershey and Schoemaker, 1980), we expect women to engage in less risky
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53 jobs.
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3 Control variables for corporate characteristics are also considered in the risk equation: number
4 of employees and number of years since foundation. Findings from industrial safety literature
5 indicate that firm size and accident rates are strongly correlated (Oi, 1974). The number of
6 employees appears positively related to safety practices in Thomason (2002).
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16 *3.3 Descriptive statistics*

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20 Table 1 shows that the proportion of immigrants that have made the transition to a permanent
21 disability (1.6%) is lower than that of natives (4.86%). Figure 1 (see supplementary material)
22 depicts the non adjusted odd-ratios of disability associated with each of the three working and
23 contractual conditions by country/region of origin. The odds-ratios are always higher for
24 natives than for immigrants when these are taken altogether, but it is evident that the nature of
25 the association varies widely among immigrants themselves.
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37 We also observe that on average, immigrants exhibit a higher educational attainment than
38 natives. The percentages of immigrants with secondary (33.8%) or university (8.4%) studies
39 are larger than those for natives (29.3% and 5.9%). The same result has also been found in
40 Fernández and Ortega (2008) and Díaz-Serrano (2012).
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50 *INSERT TABLE 1*

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55 The proportion of immigrants on temporary contracts or low-skilled jobs is much higher than
56 that of natives. Immigrants are also more likely to be employed in high-risk jobs. The
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1 difference is not large (27.4% versus 26.8%), but it is statistically significant. However,
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3 disaggregation of immigrants by region/country of origin shows this general assertion to be
4
5 over-simplistic. Only foreigners born in Africa and European non-EU15 countries are found
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7 in risky occupations in proportions higher than natives. Individuals born in Asia, the US,
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9 Canada, the EU15 and Latin America are actually less likely to engage in high-risk
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11 occupations. All groups, though (except EU15, USA and Canada), have more unstable
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13 contracts than natives. When the three potentially “unhealthy” working conditions are jointly
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15 considered, the proportion of immigrants employed in temporary, low-skilled or high-risk
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17 positions is nearly twice that of native-born Spaniards. This finding contradicts the expected
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19 positive relation between high academic attainment and good working conditions.
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28 As a summary, and as far as the comparison between immigrants and native-born Spaniards is
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30 concerned, three insights can be obtained from our preliminary analysis: immigrants are better
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32 educated, work in worse risk and contractual conditions which, in general, seem to be
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34 associated with higher disability rates, but are, in fact, less likely to become disabled. In the
35
36 econometric analysis we will try to unscramble this apparent puzzle by controlling for all the
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38 determinants of occupational choice and disability and their differential effects.
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45 **4. Results**

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50 Table 2 summarises the estimation results using the full sample. The first four columns
51
52 present the variables and estimated coefficients of the bivariate probit model . In order to
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54 assess the magnitude of the bias due to the endogeneity of risk choices, we also report the
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56 results of the univariate probit estimation of the probability of disability. These two models
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1 include several regional dummies and their interactions with the risk variable. These
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3 interactions allow us to test for the potential existence of a differential effect of the level of
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5 risk on the probability of disability by birthplace. Selected results of the model in which
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7 immigrant status is captured by a single dummy variable are also included in two separate
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9 rows (model 3).
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15 In order to facilitate comparisons, we report the marginal effects instead of the estimated
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17 coefficients. For variables appearing in both the disability and the risk equations we report the
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19 total marginal effects. These are the sum of the direct effect of the variable (column 2) on the
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21 probability of disability plus the indirect effect. The indirect marginal effects capture the
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23 effect of the variable on the probability of disability coming through its impact on the
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25 probability of choosing a risky job. Marginal effects are computed based on Greene, 1998.
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32 It is interesting to note that the correlation (ρ) between the unobservable factors affecting
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34 the probability of choosing a risky job and the probability of being disabled is negative and
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36 significant (-0.21). This result suggests that such unobservable factors tend to reduce the
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38 choice of risk but to increase the probability of being disabled, and vice versa. To formally
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40 test the null hypothesis of exogenous risk choice, we performed the Hausman-Wu test
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42 (Hausman, 1978). The exogeneity of risk choice was rejected ($p < 0.05$) in all models.
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45 Therefore, our comments are based on the estimates of the bivariate probit model.
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52 The impact of risk exposure on disability is strong and significant when the whole sample is
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54 considered. Workers employed in high-risk jobs increase their probability of becoming
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56 disabled by 4.7%. Moreover, all the marginal effects associated with working conditions are
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1 significant and large. Being employed in a temporary job, as opposed to an open-ended
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3 contract, increases that probability by 2.2%.
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8 Education behaves as expected. The probability of disability decreases by 1.5% and 1.2% for
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10 college graduates and workers with secondary education respectively. Education is significant
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12 even after controlling for the effect of education on risk. . For instance, holding risk constant,
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14 having a university education reduces the chance of a disability by 1.32 percent; but education
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16 also reduces occupational risk so that the total impact of a university education on the chance
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18 of a disability allowing risk to vary is 1.50%. The 17.9% lower likelihood of accepting a
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20 high-risk job (see the risk equation in table 2) reduces the chance of becoming disabled by
21
22 0.18 percentage points, or 13.6 percent. We also estimated the bivariate probit model without
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24 education in the disability equation in order to observe changes in the risk coefficient. The
25
26 results (not shown) indicate that the marginal effect of risk on disability would jump to 0.074,
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28 in contrast with the marginal effect of 0.047 that we obtain when education is included, as in
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30 Table 2. That is, education would pick up part of the effect of risk.
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42 *INSERT TABLE 2*
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47 The interactions of risk with the birthplace dummies are all negative, except for Asians and
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49 citizens from EU15, the US and Canada. Nevertheless, only the coefficient for non-EU15
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51 Europeans is significant, implying no differences with natives for the rest of groups. By
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53 contrast, regional dummies are all significant and negative except precisely for those born in
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55 non-EU15 Europe. These results suggest that differences in disability between natives and
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1 immigrants are related to conditions associated with origin rather than being the result of a
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3 differential effect of risk by birthplace. Only for non-EU15 Europeans (Romanians, Poles,
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5 Ukrainians, etc.) differences in disability actually originate from a differential (lower) impact
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7 of risk on disability.
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13 When we do not distinguish by region of origin and estimate the bivariate model including a
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15 single variable for immigrants, the results show that being an immigrant reduces the
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17 probability of disability by nearly 0.9% (model 3), but the effect of this variable when
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19 interacted with risk is not significant. This reinforces the idea that differences in disability are
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21 more associated with region of origin itself than with a differential impact of risk by
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23 birthplace.
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30 The case of females is interesting. Holding risk constant, the direct marginal effect is to
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32 increase disability by 0.39 per cent, but since being a female actually reduces the acceptance
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34 of risk by 22.5%, the total marginal effect is just 0.16%. That is, the total probability of a
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36 female becoming disabled appears to be only slightly higher than that of men, but that is
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38 mainly due to the indirect effect working through risk, which reduces that probability by
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40 0.23 percentage points, or 59 percent.
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47 Most of the other estimates in the univariate probit do not differ much from those of the
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49 bivariate one, except for risk. Given its endogenous nature, the effect of risk in the univariate
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51 model turns out to have a strong downward bias (marginal effects: 0.021 vs. 0.047).
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1 The estimates regarding the determinants of risk (lower part of Table 2) show that
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3 immigrants, taken as a whole, are more likely to be found in risky jobs (marginal effect equals
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5 0.0388 in model 3). However, there are differences by birthplace. Africans, Latin Americans
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7 and non-EU15 Europeans are the groups most prone to be engaged in risky jobs. People
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9 coming from China and other Asian countries are actually less likely to be exposed to work-
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11 related risks than natives, and those born in the EU15, the US and Canada are not
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13 significantly different from natives.
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20 Table 3 allows for a more thorough analysis of disparities between natives and immigrants.
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22 First of all, we note that most of the estimated marginal effects in the disability equation are
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24 notably larger for natives than for immigrants, particularly so in the case of risk, age,
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26 university education and temporary contract. Moreover, female and primary education are not
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28 significant in the immigrants model. This suggests that in their case there are more
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30 unobserved factors that determine the probability of being disabled that we are not controlling
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32 for.
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40 The results for the regional dummies in the sample of immigrants indicate that differences
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42 among immigrants in terms of disability are not marked. Only Europeans from non-EU15
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44 countries have a greater probability of disability than the base category (Latin America) at
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46 10% significance, which is consistent with their significantly greater tendency to work in
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48 risky jobs (see the risk equation) and with the results of the univariate probit. The interaction
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50 of risk with the regional dummies shows that risk exposure has a differential (positive) impact
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52 on disability only for people born in Asia. Finally, it is noteworthy to mention that again the
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54 univariate probit tends to underestimate the effect of risk on disability. This result holds for
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1 both natives and immigrants, even though for immigrants rho is not statistically different from
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8 *INSERT TABLE 3*
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12 Generally, the variables included in the risk equation are highly significant and have the
13 expected sign for both sociodemographic groups, with less difference between them in the
14 size of the marginal effects than in the disability equation. Yet there are some peculiarities
15 that deserve attention. The effect of age in the case of natives corresponds to a U-shape
16 (negative and increasing), while the effect of years since first enrolment in the Social Security
17 system follows an inverted U-shape (positive and decreasing), just the opposite to the pattern
18 of immigrants. This implies that older immigrants are willing to accept more risk, although at
19 a decreasing rate, whereas the longer immigrants stay in the legal labour market, the less risk
20 they are willing to undertake. The negative effect of being unmarried is not significant for
21 immigrants and the number of family members has a positive effect on risk in their case,
22 while the reverse is true for natives. Finally, as anticipated, the transit from unemployment to
23 high-risk work is more likely than the transit from a safer job to a high-risk one for both
24 groups, the size of the effect being greater for immigrants.
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47 **5. Discussion**
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52 Our study constitutes an effort to assess disparities between immigrants and natives in the role
53 played by working and contractual conditions, particularly risk exposure, in determining the
54 occurrence of disability, an indication of poor health. Our paper differs from previous studies
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1 in one or several of the following ways. First, we focus on disability arising from any cause,
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3 and not just from injuries and professional illness. Secondly, our indicator of health is based
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5 on an objective measure, rather than the commonly used scales of self-perceived health.
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8 Thirdly, we analyse differences by region of origin in order to avoid inappropriate
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10 generalisations to all immigrants. Lastly, but most importantly, we account for possible
11
12 endogeneity of risk exposure on the disability equation. We aim to capture the determinants
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14 of the occupational choice so as to better understand the factors behind discrepancies in health
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16 outcomes.
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23 We explicitly determine that working conditions have an impact on health for natives and
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25 immigrants. Risk exposure is, as expected, a decisive factor in accounting for differences in
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27 disability. The considerable magnitude of its effect is one of our most important results. The
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29 findings regarding the strong impact of temporary employment on disability are also
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31 noteworthy and deserve further comment. The experience of job insecurity has already been
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33 associated with ill health in studies such as Robone et al, 2010 and Rodríguez, 2002.
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35 Nevertheless, previous evidence of this association for Spain is scarce and somewhat
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37 ambiguous (Amuedo-Dorantes, 2002). The present study shows that the negative effect of
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39 temporary employment on health is unambiguous when its impact is measured using an
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41 overall health status indicator, such as permanent disability, rather than considering only work
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43 related injuries and illness rates.
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52 As to disparities between immigrants and natives, we find, first of all, that the probability of
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54 becoming disabled is higher for natives. We must also conclude that our theoretical
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56 hypothesis that disability and risk are jointly determined is only valid for natives and not valid
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1 for immigrants. Such is the interpretation of the non-significance of the rho parameter in the
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3 model for immigrants in Table 3. This is consistent with earlier studies that confirm the weak
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5 role played by risk in occupational choices in the case of immigrants (Díaz-Serrano, 2012).
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10 Our results are in agreement with previous studies of the immigrant assimilation hypothesis in
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12 Spain (Amuedo-Dorantes and de la Rica, 2007), as time elapsed since first enrolment in the
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14 Social Security system increases the probability of disability similarly to natives. The transit
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16 from unemployment increases the probability that risks will be accepted slightly more in the
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18 case of immigrants. These findings can be interpreted as a confirmation that immigrants (at
19
20 least, some of them) are affected more than natives by lack of opportunities in the labour
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22 market. In addition, the significance of most of the regions of origin in the risk equation
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24 suggests a heterogeneous pattern of occupational choice among the various communities of
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26 immigrants.
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35 A principal corollary is that an effective and equitable health policy should incorporate a full
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37 understanding of the role of working conditions on determining health disparities.
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39 Furthermore, a better knowledge of the conditions in which vulnerable groups – like
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41 immigrants – access safe working conditions may help avoid future health inequalities. The
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43 strong effect on disability of risk exposure and other forms of precarious employment – such
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45 as temporary jobs – suggests that the actions involved in these policies probably need to go
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47 beyond traditional occupational health policies.
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54 One important limitation of our analysis is the lack of the individual's baseline health in our
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56 data. This variable is expected to have an influence on both the likelihood of accepting risks
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1 and the advent of disability. Its omission might bias the marginal effect of the other variables.
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3 For example, a better initial health status could explain the smaller impact of working
4 conditions on disability in the case of immigrants, in spite of their working conditions being
5 objectively worse than those of natives. This interpretation is consistent with other studies
6 indicating that healthy people are the more likely ones to migrate; the so-called “healthy
7 migrant effect” (Esteban-Vasallo, 2009; Akhavan, 2006; Swerdlow, 1991). Nevertheless, the
8 fact that we account for some of the determinants of health (age, gender, education) may
9 mitigate the size of the bias. We also do not know what were the economic circumstances in
10 the home country, which could affect the willingness to accept risk.
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25 Another limitation is that our data include only insured workers. This excludes irregular
26 labour practices, which are more likely to occur among foreign workers. Also, institutional
27 and bureaucratic requirements to obtain a disability pension may affect natives and
28 immigrants differently. The latter may be less likely to apply for disability benefits due to lack
29 of information or specific capabilities. Nevertheless, all individuals in our sample – including
30 immigrants – had been working and living in Spain for at least five years, a factor that
31 probably lessens the differences.
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1 **References**
2
3
4
5

6 Ahonen EQ, Benavides FG. (2006). Risk of fatal and non-fatal occupational injury in foreign
7
8 workers in Spain. *Journal of Epidemiology & Community Health* **60**, 424-426.
9

10
11
12
13 Akhavan S. (2006). The health and working conditions of female immigrants in Sweden.

14
15 Stockholm, Karolinska Institutet, 93 pp. Available at

16
17
18 <http://publications.ki.se/jspui/bitstream/10616/37871/1/thesis.pdf> [Accessed January 2011]
19
20

21
22
23 Amuedo-Dorantes C. (2002). Work safety in the context of temporary employment. The
24
25 Spanish experience. *Industrial and Labour Relations Review* **55** (2), 262-285.
26

27
28
29
30 Amuedo-Dorantes C, De la Rica S. (2007). Labour market assimilation of recent immigrants
31
32 in Spain. *British Journal of Industrial Relations* **45** (2), 257-284.
33
34

35
36
37 Artazcoz L, Benach J, Borrell C, Cortes I. (2005). Social inequalities in the impact of flexible
38
39 employment on different domains of psychological health. *Journal of Epidemiology and*
40
41 *Community Health* **59**, 761-767.
42
43
44

45
46
47 Bartley M, Sacker A, Clarke P. (2004). Employment status, employment conditions, and
48
49 limiting illness: prospective evidence from the British household panel survey 1991–2001
50

51
52 *Journal of Epidemiology and Community Health* **58**, 501-506.
53
54

55
56
57 Benach et al. (2004). Types of employment and health in the European Union. Changes from
58
59

1 1995 to 2000. *The European Journal of Public Health* **14**, 314-321.

2
3
4
5
6 Berger M, Leigh J. (1989). Schooling, self-selection, and health. *The Journal of Human*
7
8 *Resources* **24** (3), 433-455.
9

10
11
12
13
14
15 Borg V, Kristensen TS. (2000). Social class and self-rated health: can the gradient be
16 explained by differences in life style or work environment? *Social Science & Medicine* **51**,
17
18 1010-1030.
19
20
21

22
23
24
25 Cropper M. (1977). Health, investment in health, and occupational choice. *The Journal of*
26
27 *Political Economy* **85** (6), 1273-1294.
28
29

30
31
32 Esteban-Vasallo, María D.; Domínguez-Berjón, M. Felicitas; Astray-Mochales, Jenaro;
33
34 Gènova-Maleras, Ricard; Pérez-Sania, Aurelio; Sánchez-Perruca, Luis *et al.* (2009)
35
36 Prevalencia de enfermedades crónicas diagnosticadas en población inmigrante y autóctona.
37
38 *Gaceta Sanitaria* **23** (6), 548-52.
39
40
41

42
43
44 Datta Gupta N, Kristensen N. (2008). Work environment satisfaction and employee health:
45
46 panel evidence from Denmark, France and Spain, 1994–2001. *European Journal of Health*
47
48 *Economics* **9**, 51-61.
49
50
51

52
53
54 DeLeire T, Levy H. (2004). Worker sorting and the risk of death on the job. *Journal of Labor*
55
56 *Economics* **22** (4), 925-953.
57
58
59
60
61
62
63
64
65

1
2
3 Diaz-Serrano L. (2012). Immigrants, natives and job quality: Evidence from Spain.
4
5
6 *International Journal of Manpower*, forthcoming.
7

8
9
10 Fernández C, Ortega C. (2008). Labor market assimilation of immigrants in Spain:
11
12 employment at the expense of bad job-matches? *Spanish Economic Review* **10 (2)**, 83-107.
13
14
15

16
17 Gash V, Mertens A, Romeu Gordo L. (2007). Are fixed-term jobs bad for your health? A
18
19 comparison of West-Germany and Spain. *European Societies* **9 (3)**, 429-458.
20
21
22

23
24
25 Greene W. (1998). Gender economics courses in liberal arts colleges: Further results. *Journal*
26
27 *of Economic Education* **29 (4)**, 291-300.
28
29

30
31
32 Grossman M. (1972). On the concept of health capital and the demand for health. *Journal of*
33
34 *Political Economy* **80 (2)**, 223-255.
35
36

37
38
39 Hausman JA. (1978). Specification tests in econometrics. *Econometrica* **46**, 1251-1271.
40
41

42
43
44 Hersch J, Viscusi WK. (2010). Immigrant status and the value of statistical life. *Journal of*
45
46 *Human Resources*, **45(3)**, 749-771.
47
48

49
50
51
52 Hershey J, Schoemaker PJH. (1980). Risk taking and problem context in the domain of
53
54 losses: An expected utility analysis. *Journal of Risk and Insurance* **47(1)**, 111-32.
55
56
57

1 Jianakoplos NA, Bernasek A. (1998). Are women more risk averse? *Economic Inquiry* 36(4):
2
3 pp. 620-630.
4
5
6
7

8 Jiménez-Martín S, Labeaga J, Prieto C. (2006). Award errors and permanent disability
9 benefits in Spain. *FEDEA Working Papers*, 2006-18. Available at
10
11 <http://www.fedea.es/pub/Papers/2006/dt2006-18.pdf> [Accessed November 2010]
12
13
14
15
16
17

18 Kerkhofs M, Lindeboom M. (1997). Age related health dynamics and changes in labour
19 market status. *Health Economics* 6, 407-423.
20
21
22
23
24

25 Leeth J, Ruser J. (2006). Safety segregation: The importance of gender, race, and ethnicity on
26 workplace risk. *Journal of Economic Inequality* 4 (2), 123-152.
27
28
29
30
31

32 Llana-Nozal A, Lindeboom M, Portrait F. (2004). The effect of work on mental health: does
33 occupation matter? *Health Economics* 13, 1045-1062.
34
35
36
37
38
39

40 Lundberg O. (1991). Causal explanations for class inequality in health: an empirical analysis.
41 *Social Science & Medicine* 32 (4), 385-393.
42
43
44
45
46

47 Marmot, M. (2004). *The Status Syndrome: How Social Standing Affects Our Health and*
48 *Longevity*. New York: Owl Books.
49
50
51
52

53 Monden C. (2005). Current and lifetime exposure to working conditions. Do they explain
54 educational differences in subjective health? *Social Science & Medicine* 60 (11), 2465-2476.
55
56
57
58
59
60
61
62
63
64
65

1 Oi WY. (1974). On the economics of industrial safety. Law and contemporary problems.
2
3 *Occupational Safety and Health* **38** (4), 669-699.
4
5
6
7

8 Parra A, Fernández Baraibar J, García López V, Ayestarán JR, Extramiana E. (2006).
9
10 Mercado de trabajo, salud laboral e inmigración. [Labour market, occupational health and
11
12 immigration]. *An. Sist. Sanit. Navar.* **29**, Suplemento 1:77-95.
13
14
15
16
17

18 Plaisier I, de Bruijn J, de Graaf R, Have M, Beekman A, Penninx B. (2007). The contribution
19
20 of working conditions and social support to the onset of depressive and anxiety disorders
21
22 among male and female employees. *Social Science & Medicine* **64** (2), 401-410.
23
24
25
26
27

28 Power C, Matthews S, Manor O. (1998). Inequalities in self-rated health: explanations from
29
30 different stages of life. *Lancet* **351** (9108), 1009-1014.
31
32
33
34
35

36 Robinson JC. (1984). Racial inequality and the probability of occupation-related injury or
37
38 illness. *The Milbank Memorial Fund Quarterly. Health and Society* **62** (4), 567-590.
39
40
41
42
43

44 Robone S, Jones AM, Rice N. (2010). Contractual conditions, working conditions and their
45
46 impact on health and well-being. *The European Journal of Health Economics* **12** (5), 429-
47
48 444.
49
50
51
52

53 Rodriguez E. (2002). Marginal employment and health in Britain and Germany: does unstable
54
55 employment predict health? *Social Science & Medicine* **55**, 963-979.
56
57
58
59
60
61
62
63
64
65

1 Swerdlow AJ. (1991). Mortality and cancer incidence in Vietnamese refugees in England and
2
3 Wales: a follow-up study. *International Journal of Epidemiology*, **20**, 13-19.
4

5
6
7 Thomason T, Pozzebon S. (2002). Determinants of firm workplace health and safety and
8
9 claims management practices. *Industrial and Labor Relations Review* **55** (2), 286-307 (21).
10

11
12
13
14 Vaness DJ. (2003). A structural econometric model of family valuation and choice of
15
16 employer-sponsored health insurance in the United States. *Health Economics* **12** (9), 771-790.
17
18

19
20
21
22 Virtanen M, Kivimaki M, Elovainio M, Vahtera J, Ferrie JE. (2003). From insecure to secure
23
24 employment: changes in work, health, health related behaviours, and sickness absence.
25
26
27 *Occupation and Environmental Medicine* **60**, 948-953.
28

29
30
31
32 Viscusi WK. (2003). Racial differences in labor market values of a statistical life. *Journal of*
33
34 *Risk and Uncertainty* **27**(3), 239-256.
35

36
37
38
39 Warren JR, Hoonakker P, Carayon P, Brand J. (2004). Job characteristics as mediators in
40
41
42
43
44
45
46
47
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56
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Table 1. Descriptive Statistics

					IMMIGRANTS BY COUNTRY/REGION OF ORIGIN					
VARIABLE		TOTAL	NATIVE-BORN SPANIARDS	IMMIGRANTS (ALL)	TEST OF INDEPENDENCE	AFRICA	LATIN AMERICA	EUROPE NON-EU 15	EU-15 ^{&} , USA AND CANADA	ASIA
		%	%	%	χ^2/t	%	%	%	%	%
N		718,958	681,078	37,880		8,632	12,830	3,281	10,744	2,393
%		100	94.73	5.27		1.20	1.78	0.46	1.49	0.33
DEPENDENT VARIABLES										
Disability		4.69	4.86	1.60	29.20**	1.90	1.02	1.00	2.34	1.10
Risk		26.87	26.84	27.36	4.61**	39.52	24.66	36.18	21.30	13.04
PERSONAL CHARACTERISTICS										
Age (mean)		41.68	41.78	39.83	6.29**	39.92	40.21	37.62	39.81	40.49
Gender: Female		41.50	41.58	39.95	33.65**	21.17	49.66	40.11	44.91	33.14
Education										
Without studies		26.79	26.76	27.57	10.65**	58.29	17.66	22.73	17.42	39.44
Primary		37.75	38.06	30.32		22.59	31.58	33.96	34.89	29.11
Secondary		29.51	29.33	33.75		15.59	40.21	35.35	37.64	25.52
University		5.95	5.85	8.37		3.53	10.55	7.96	10.06	5.93
Family members (mean)		3.16	3.14	3.59	58.45**	4.01	3.74	3.46	2.96	4.32
Unmarried		12.95	12.81	15.52	15.24**	16.93	12.52	14.17	18.17	16.21
WORKING CONDITIONS										
Temporary contract		37.88	37.31	47.73	33.36**	61.14	48.57	43.42	37.81	40.20
Self-employed		16.29	16.31	16.04	1.38	9.97	13.05	13.01	21.06	35.60
Low-skilled job		28.51	28.14	35.19	29.62**	53.71	35.14	33.98	22.65	26.79
Years since 1st enrolment in the SS system		16.88	20.65	12.31	157.56**	12.32	10.71	9.66	15.18	11.25
Previous working status: unemployed		17.04	17.15	14.89	11.44**	16.62	13.86	14.69	16.58	6.81
FIRM CHARACTERISTICS[§]										
Nr. Employees (mean)		314.56	320.9	236.86	1.36	196.08	310.07	193.10	228.77	94.11
Years since foundation (mean)		17.53	17.68	14.75	30.02**	14.02	15.09	13.92	15.76	11.73

& The EU-15 includes the following countries: Austria, Belgium, Denmark, Finland, France, Germany, Greece, Ireland, Italy, Luxemburg, Netherlands, Portugal, Spain, Sweden and UK. Here and throughout the text, reference to EU15 means all previous countries except Spain.

[§] Only includes private sector

** Indicates that the means are significantly different

Table 2. Bivariate probit and univariate probit estimations for the whole sample. Immigrants represented with dummies by region of origin or taken as a whole (model 3). Marginal effects.

	Model 1. Bivariate Probit			Model 2. Univariate Probit	
	Total Mg. Effects	Mg. Effects (direct effect)	z	Mg. Effects	z
Dependent Variable: Permanent disability					
Age	0.0019	0.0019	84.67 **	0.0018	81.9 **
Female	0.0016	0.0039	4.07 **	-0.0027	-8.03 **
Primary education ^s	-0.0055	-0.0046	-16.02 **	-0.0062	-18.84 **
Secondary education ^s	-0.0122	-0.0097	-28.24 **	-0.0139	-36.24 **
University education ^s	-0.0150	-0.0132	-22.38 **	-0.0158	-26.28 **
Unmarried	0.0024	0.0023	4.18 **	0.0022	3.78 **
Family members	-0.0020	-0.0018	-13.96 **	-0.0020	-14.77 **
Years since 1 st enrolment in SS	0.0019	0.0016	19.85 **	0.0018	19.53 **
Years since 1 st enrolment in SS Sq	0.0000	0.0000	-16.31 **	0.0000	-15.32 **
Temporary contract	0.0219		63.58 **	0.0197	59.29 **
Low skilled job	0.0097		24.98 **	0.0104	27.91 **
Risk	0.0470		39.27 **	0.0209	49.28 **
Risk*African	-0.0044		-1.32	-0.0039	-1.23
Risk*Latin American	-0.0056		-1.45	-0.0071	-2.02 **
Risk* Europe non-EU15	-0.0131		-2.54 **	-0.0129	-2.58 **
Risk* EU15, USA, Canada	0.0019		0.56	0.0013	0.42
Risk*Asia	0.0167		1.33	0.0090	0.83
Africa	-0.0097	-0.0092	-5.03 **	-0.0096	-5.24 **
Latin America	-0.0104	-0.0099	-5.67 **	-0.0102	-5.8 **
Europe non-EU15	-0.0036	-0.0050	-0.86	-0.0032	-0.79
EU15, USA, Canada	-0.0042	-0.0039	-2.47 **	-0.0045	-2.79 **
Asia	-0.0134	-0.0121	-3.97 **	-0.0133	-4.3 **
MODEL 3 Immigrant	-0.0088		-8.74 **	-0.0081	-8.31 **
Risk*Immigrant	-0.0021		-1.12	-0.0037	-2.13 **
Dependent Variable: Risk					
Age	-0.0150		-27.71 **		
Age squared	0.0001		22.11 **		
Female			-		
			208.5		
	-0.2251		6		
Primary education ^s	-0.0417		-34.06 **		
Secondary education ^s			-		
			130.0		
	-0.1661		9		
University education ^s			-		
			101.2		
	-0.1794		6		
Unmarried	-0.0093		-5.06 **		
Family members	-0.0013		-3.14 **		
Years since 1 st enrolment in SS	0.0104		26.78 **		
Years since 1 st enrolment in SS Sq	-0.0001		-14.34 **		
Unemployed last relation	0.0370		25.06 **		
Africa	0.0596		11.91 **		
Latin America	0.0656		13.54 **		
Europe non-EU15	0.1659		18.83 **		
EU15, USA, Canada	0.0066		1.51		
Asia	-0.0885		-9.61 **		
Years since firm's foundation			-		
			206.7		
	0.0000		9 **		
Nr. of employees	0.0000		-42.76 **		
MODEL 3 Immigrant	0.0388		14.68 **		
Rho	-0.21			No. Observations	648547
Likelihood-ratio test of rho=0:	chi2(1) = 352.90			Log pseudolikelihood =	-94180.80
No. Observations	629700			Wald chi2(12) =	26657.85
Log pseudolikelihood	-363972.67			Prob > chi2	0.0000

Prob > chi2

0.0000

Pseudo R2 0.1835

** Significant at 5% level ; * Significant at 10% level

\$ Excluded category: no studies

The marginal effects of the binary variables are calculated as the difference in the average predicted probability of a positive outcome for the variable when:(1) variable values are set to zero; and (2) variable values are set to one
z-statistics refer to the estimated coefficients

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Table 3. Bivariate probit and univariate probit for native-born Spaniards and for immigrants (Marginal Effects)

	Native-born Spaniards					Immigrants, with regional dummies and interactions				
	Bivariate Probit		Univariate Probit			Bivariate Probit		Univariate Probit		
Dependent Variable: Permanent disability										
	Total Mg. Effects	Mg. Effects (direct effect)	z	Total Mg. Effects	z	Total Mg. Effects	Mg. Effects (direct effect)	z	Total Mg. Effects	z
Age	0.0021	0.0021	85.22 **	0.0019	82.72 **	0.0005	0.0004	9.43 **	0.0005	9.23 **
Female	0.0016	0.0040	3.86 **	-0.0031	-8.55 **	-0.0004	0.0010	-0.45	-0.0008	-0.99
Primary education ^s			-		-					
Secondary education ^s	-0.0058	-0.0049	15.84 **	-0.0065	18.77 **	-0.0011	-0.0009	-1.17	-0.0012	-1.26
University education ^s			-		-					
	-0.0127	-0.0101	27.74 **	-0.0147	35.85 **	-0.0047	-0.0036	-4.48 **	-0.0045	-4.64 **
			-		-					
Unmarried	-0.0161	-0.0142	22.37 **	-0.0169	26.31 **	-0.0035	-0.0026	-2.46 **	-0.0034	-2.57 **
			-		-					
Family members	0.0031	0.0030	5.06 **	0.0028	4.78 *	-0.0033	-0.0029	-2.94 **	-0.0032	-3.01 **
Years since 1st enrolment in SS			-		-					
Years since 1st enrolment in SS Sq.	-0.0019	-0.0018	12.72 **	-0.0020	13.39 **	-0.0014	-0.0013	-4.99 **	-0.0013	-4.92 **
			-		-					
Temporary contract	0.0017	0.0014	16.87 **	0.0016	16.25 **	0.0017	0.0016	8.67 **	0.0016	8.39 **
			-		-					
Low-skilled job	0.0000	0.0000	14.02 **	0.0000	12.82 **	0.0000	0.0000	-5.25 **	0.0000	-4.88 **
			-		-					
Risk	0.0233		63.58 **	0.0209	59.14 **	0.0050		5.89 **	0.0046	5.76 **
			-		-					
Risk* African	0.0101		24.65 **	0.0109	27.69 **	0.0049		4.76 **	0.0046	4.84 **
			-		-					
Risk* European	0.0502		39.64 **	0.0219	49.2 **	0.0080		2.41 **	0.0050	2.36 **
			-		-					
Risk* EU15, USA, Canada			-		-	0.0015		0.59	0.0022	0.87
			-		-	-0.0032		-1.11	-0.0028	-0.97
Risk* Asia			-		-	0.0014		0.59	0.0021	0.85
			-		-	0.0132		1.87 *	0.0113	1.74 *
Africa ^{&}			-		-	0.0003	0.0002	0.24	0.0004	0.28
Europe non-EU15 ^{&}			-		-	0.0050	0.0036	1.93 *	0.0048	1.94 *
EU15, USA, Canada ^{&}			-		-	0.0020	0.0018	1.53	0.0020	1.64
Asia ^{&}			-		-	-0.0022	-0.0015	-1.05	-0.0018	-0.9

Table 3. Continued
 Dependent Variable: Risk

	Native-born Spaniards		Immigrants				
	Total Mg. Effects	z	Total Mg. Effects	z			
Age	-0.0204	-33.36 **	0.0102	5.4 **			
Age squared	0.0001	27.98 **	-0.0001	-5.87 **			
Female	-0.2223	-200.26 **	-0.2316	-52.41 **			
Primary education	-0.0424	-33.69 **	-0.0188	-3.63 **			
Secondary education	-0.1661	-125.28 **	-0.1071	-20.5 **			
University education	-0.1798	-96.92 **	-0.1363	-20.4 **			
Unmarried	-0.0108	33.38 **	-0.0066	-0.96			
Family members	-0.0025	-21.63 **	0.0053	4.4 **			
Years since 1st enrolment in SS	0.0148	-5.7 **	-0.0103	-8.58 **			
Years since 1st enrolment in SS Sq.	-0.0002	-5.58 **	0.0003	8.53 **			
Unemployed last relation	0.0363	23.98 **	0.0406	6.46 **			
Years since firm's foundation	0.0000	-202.27 **	0.0000	-36.54 **			
Nr. of employees	0.0000	-42.07 **	0.0000	-7.23 **			
Africa			0.0116	1.94 *			
Europe non-EU15			0.0799	9.6 **			
EU15, USA, Canada			-0.0019	-0.34			
Asia			-0.1072	-12.98 **			
Rho	-0.21	No. Observations	614452	Rho	-0.05	No. Observations	33595
Likelihood-ratio test of rho=0: chi2(1) =	370.70	Log pseudolikelihood	-91862.33	Likelihood-ratio test of rho=0: chi2(1) =	0.77	Log pseudolikelihood	-2235.62
No. Observations	598299	Wald chi2(12)	26657.85	No. Observations	31401	Wald chi2(20)	626.27
Log pseudolikelihood	-348258.77	Prob > chi2	0.0000	Log	-15111.97	Prob > chi2	0.0000

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pseudolikelihood

Prob > chi2	0.0000	Pseudo R2	0.1835	Prob > chi2	0.0000	Pseudo R2	0.1578
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** Significant at 5% level

* Significant at 10% level

\$ Excluded category: no studies

&Excluded category: Latin America

Marginal effects calculated as in Table 2

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