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Chiswick, Barry R.; Wang, Zhiling

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Social Contacts, Dutch Language Proficiency and Immigrant Economic Performance in the Netherlands*

Barry R. Chiswick¹ and Zhiling Wang^{2,3}

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 $^{^{\}rm 1}{\rm Department}$ of Economics, the George Washington University, the United States

 $^{^2}$ Erasmus School of Economics, Erasmus University Rotterdam, the Netherlands 3 Tinbergen Institute, the Netherlands

^{*}Corresponding author: Zhiling Wang. Email: z.wang.vu@gmail.com. This paper has benefited greatly from comments and suggestions made by Thomas de Graaff, Peter Nijkamp and participants at the 55th ERSA conference, Lisbon, and the 30th ESPE conference, Berlin.

Abstract

Using longitudinal data on immigrants in the Netherlands from the survey 'Social Position

and Use of Public Facilities by Immigrants' (SPVA) for the years 1991, 1994, 1998, 2002,

we examined the impacts of social contacts and Dutch language proficiency on adult

foreign-born men's earnings, employment and occupational status. On average, social

contacts and a good mastery of the Dutch language enhance immigrants'economic perfor-

mances. The effects are much stronger for immigrants with low-skill-transferability than

for immigrants with high-skill-transferability, are stronger for economic migrants than for

non-economic migrants, and are stronger for white-collar workers than for blue-collar

workers. Contact with Dutch people and Dutch organisations unambiguously enhances

all aspects of immigrants' economic performance, however, no evidence is found for a

positive effect of co-ethnic contact on employment status. To deal with the endogene-

ity between Dutch language ability and earnings, an interaction term between age at

migration and a dichotomous variable for a non-Dutch-speaking origin is used as the

identifying instrument. The selectivity issue of survey respondents was tackled as well

to validate the main findings. The study has a strong policy implication for integration

policies in the Netherlands, or more broadly in the immigrant receiving countries.

Keywords: immigrants, social capital, Dutch language proficiency, labour market perfor-

mance, skill transferability, the Netherlands.

JEL codes: J15, J61, Z13.

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1 Introduction

Turks, Moroccans, Surinamese and Antilleans are the four largest immigrant ethnic minority groups in the Netherlands. They all arrived in the Netherlands from less developed areas, although only the latter two had exposure to the Dutch language and culture in their origin. These immigrants earn around 20% less than the native-born in the Dutch labour market, ceteris paribus (Van Ours and Veenman, 1999). The Turks and Moroccans came in response to the 'guest workers' program by the Dutch government, and migrated to the Netherlands in large numbers in the 1960s. Subsequent family-reunification and second-generation children born in the Netherlands have then substantially increased the proportion of ethnic Turks and Moroccans in the Netherlands. The mass inflow of Surinamese took place after the decolonisation of Surinam in 1975, while large migrant groups from the Netherlands Antilles (still an autonomous area within the Kingdom of the Netherlands) have been arriving since the 1990s.

The economic integration of the four ethnic minorities requires a comprehensive understanding of immigrant economic success in Dutch society (Zorlu and Hartog, 2001). In this paper, we are particularly interested in how social contacts and Dutch language proficiency affect immigrant economic success in the Netherlands. To what extent does the ethnic composition of contacts affect immigrant economic success? How do these effects vary across Dutch colonial heritage, ethnicity, education level, age at migration, duration in the destination, and occupation? How does Dutch language proficiency contribute to the economic performances of these four groups?

Many empirical studies on social contacts and economic performance analysed cross-sectional data, where the causal effect of social contacts is hard to infer (see, e.g., Kanas and Van Tubergen, 2006; Lancee, 2010; Lin et al., 1981). There is a paucity of studies of significant adjustment

in a dynamic setting. Xue (2008) looks at the role of social networks using a longitudinal survey of immigrants to Canada, and finds that social capital facilitates employment, possibly through a more ethnically diverse network. Kanas et al. (2012) uses data from the German Socio-Economic Panel, and find that inter-ethnic ties with Germans lead to higher occupational status but not to increased income. Piracha et al. (2014) uses the Households Income and Labour Dynamics in Australia longitudinal data, and find a positive effect of social capital on migrants' employment outcomes and wages, especially for women. Moreover, social capital raises the probability of obtaining a white-collar job rather than a blue-collar one.

This paper contributes to the literature in several ways. First, we enrich the social network and labour market performance literature by distinguishing co-ethnic (or intra-ethnic) contact and inter-ethnic contact. Second, previous literature is heavily focused on English-speaking destinations, with studies for the US, Canada, Australia, New Zealand, and the UK. We add to the literature on the labour market effects of destination language proficiency among immigrants in a non-English labour market through a study of Dutch language proficiency in the Netherlands. Third, we investigate the heterogeneous impacts of social contacts and Dutch language proficiency depending on immigrants' pre-migration exposure to Dutch, migration motives and types of occupations. Fourth, we study labour market outcomes more comprehensively than the previous literature by using three measures: labour market earnings, employment probability, and occupational status. Moreover, unlike most studies in this literature, we use longitudinal data to control for unmeasured characteristics (such as ability) that do not vary across time.

¹This classification of the two types of social contacts, co-ethnic and inter-ethnic, is frequently referred to as bonding and bridging by sociologists, according to the definitions in Putnam (2000) and Woolcock and Narayan (2000).

²Yao and Van Ours (2015) have an important study of the labour market effects of Dutch language skills among immigrants in the Netherlands. They study the probability of being employed, hours of work, and the hourly wage. Their analyses are limited by the relatively smaller sample sizes than are available for this study. Moreover, they do not consider the effects of social contacts with either co-ethnics or with others on labour market outcomes.

The remainder of the paper is organised as follows. Section 2 proposes the theory and our hypotheses. Section 3 describes the data and variables. Section 4 presents the empirical analysis. Robustness checks are performed in Section 5, confirming our main results. The final section provides concluding remarks.

2 Theory and Hypotheses

Our first three hypotheses (H_1 , H_2 and H_3) relate to the average impacts of social contacts and language proficiency.

The literature both in labour economics and sociology is replete with references to the importance of social networks for labour market performance (mainly earnings and employment) (see, e.g., Granovetter, 1974; Ioannides and Loury, 2004; Montgomery, 1991). Social contacts facilitate economic opportunities by providing access to job information (Lin, 1999; Mouw, 2003). Equally important is the linguistic skill as a host-country specific human capital. The positive effect of destination language proficiency for immigrants' economic well-being has been widely acknowledged in English-speaking countries such as the US, Canada, Australia and the UK (Carliner, 1981; Chiswick and Miller, 1995; 2002; Dustmann and Fabbri, 2003; McManus et al., 1983), as well as in a few non-English speaking countries such as Germany, Spain and Israel (Budria and Swedberg, 2012; Chiswick, 1998; Dustmann and Van Soest, 2001). Destination language proficiency directly enhances earnings and enhances the partial effect of other forms of human capital. Above all, we generalise to the Dutch society and hypothesize that

³Unlike in English-dominant destinations which have been the focus of most studies of immigrant language proficiency, Dutch is not an international language. Few outside of the Netherlands, Belgium, and the few former Dutch colonies can speak or read the language.

• *H*₁: Social contacts and Dutch language proficiency increase the likelihood of employment and earnings of non-western immigrants in the Netherlands.

The type of social contacts matters a lot to immigrants as well. Upon arrival at the destination country, an immigrant faces choices of developing social capital with different types of people, among which ethnicity might be the most important dimension (Wang, 2019). Contact with the natives yields unambiguously positive returns because it provides immigrants with information on higher quality job offers and assistance in assimilation (Iosifides et al., 2007; Kazemipur, 2006; Lancee, 2012). However, the economic returns of co-ethnic contacts are less clear-cut. Lancee (2010) found that co-ethnic networks do not affect economic outcomes. On the one hand, socializing with co-ethnics provides assistance in job information and initial settlement (Chiswick and Miller, 2005; Clark and Drinkwater, 1998). Yet, while embedding into co-ethnic networks enhances ethnic solidarity, it retards contact with the host society. This may hamper upward economic mobility. Therefore we hypothesise that

- *H*₂: Immigrant's contact with Dutch people (inter-ethnic contact) leads to better economic performance.
- H_3 : Co-ethnic contact has an ambiguous effect on immigrant's economic performance.

Our next three hypotheses (H_4 , H_5 and H_6) relate to the heterogeneity in the impacts of social contacts and language proficiency.

Immigrants' labour market performance is closely associated with skill transferability (Chiswick and Miller, 2012; Duleep and Regets, 1999), since low-skill-transferability immigrants will be making greater human-capital investment in the Netherlands. Skill transferability can be proxied empirically by age at migration, linguistic distance between origin and destination languages, and host-country specific education. High-skill-transferability immigrants are

able to quickly adapt to the new environment by themselves. The degree of transferability of skills to the Netherlands matters to a great extent. High-transferability of skills from the former Dutch colonies are acquired by merely living in and receiving schooling in the Dutch colonies (Surinam and Antilles), while immigrants from Mediterranean origin countries (Morocco and Turkey) experience no pre-migration exposure to the Dutch language and culture. Therefore, social contacts and Dutch language proficiency would be more beneficial to low-skill-transferability immigrants due to their initial lack of host-country specific human capital. It is then hypothesised that

 H₄: Social contacts and Dutch language proficiency have a greater impact on the likelihood of employment and earnings for low-skill-transferability immigrants than for high-skill-transferability immigrants in the Netherlands.

In addition, the effect of social contacts and Dutch language proficiency varies with migration motives. Economic migrants are those who move primarily because of their own economic opportunities, and are mostly described as ambitious and hard-working (Chiswick, 1999). Compared to non-economic migrants, such as tied movers (family based migrants), they are likely to make greater use of social contacts and Dutch language skills to enhance their labour market performance. This leads to the hypothesis that

 H₅: Social contacts and Dutch language proficiency have a greater impact on the likelihood of employment and earnings for economic migrants than for non-economic migrants.

Last but not the least, occupational attainment is an important but frequently neglected indicator of labour market performance in immigrant literature. Apart from years of schooling, training, qualifications, and language skills (Chiswick and Miller, 2007; Evans, 1987; Nickell, 1982), social network have also been found to increase occupational status (Kanas et al.,

2012; Lin et al., 1981; Mullan, 1989). Certain occupations require social skills and effective communication for success. Blue-collar jobs, such as agricultural workers and machine operators, require technical skills more than the worker's social network. For white-collar jobs, however, such as clerks and service workers, the work performance is closely related to how well they communicate with people. Therefore we hypothesise that

*H*₆: Social contacts and Dutch language proficiency have a greater impact on occupational status for white-collar jobs than for blue-collar jobs.

3 Data and Variables

3.1 Data

The data are from the Dutch survey 'Social Position and Use of Public Facilities by Immigrants' (SPVA). The aim of the survey is to collect information for the analysis of the socio-economic and socio-cultural position of the four largest non-Western immigrant ethnic minorities in the Netherlands: Turks, Moroccans, Surinamese, and Antilleans. The data were collected using a stratified random sampling method to target municipalities with a high percentage of immigrants. The empirical analysis is restricted to adult foreign-born men, with the age ranging from 25 to 64 years. The individuals included are those who were reported as the household head. The sample frame consists of 10 to 13 cities (depending on survey year), where immigrants are relatively overrepresented. It was conducted in year 1991, 1994, 1998 and 2002, with 1981, 1762, 3228, and 1949 households, respectively.

⁴Respondents who reported to be housewives, incapacitated, students, retired or in other unspecified situations are not included in the sample.

In this study, we employ both the cross-sectional and the longitudinal features of the data. We follow the approach in Martinovic et al. (2009) to create a sample of panel respondents. A number of immigrants participated more than once in the survey. There are in total 718 two-waves participants, 118 three-waves participants, and 18 four-waves participants. Those who participated more than twice (for example a 1991-1994-1998 participant), are registered both as belonging to the 1991-1994 and 1994-1998 panel groups. As a result, a pooled data set of 1450 cases is obtained, with responses on two occasions that are separated by a time distance of 3 to 4 years.⁵

This survey was not originally set up as a longitudinal study and hence the level of attrition is rather high. Around 80% agree to take part in the next wave, but only 20% actually realise the re-interview. The interviewers did not trace the respondents who move in the period between the two surveys. The descriptive statistics for the pooled panel data, both at the first and the second time of measurement, do not differ by much from each other. (The descriptives for pooled panel data are available on request.) Later in section 5, we further apply the Heckman selection model to justify our results for the panel data.

3.2 Dependent and independent variables

In the Appendix, Table A1 shows a list of the dependent and independent (explanatory) variables, with their detailed definitions and coding.

Three different variables jointly measure immigrant labour market performances. *Monthly earnings*: respondents report their monthly labour market earnings from all jobs. *Employment*: dichotomous variable equals 1 if the respondent is working regularly and 0 if the respondent is without a job. *Occupational status*: it is measured in terms of the International Socio-

⁵A household which has changed its head across waves is excluded from the analysis.

Economic Index (ISEI) (Ganzeboom et al., 1992). It refers to the primary occupation reported in the survey year.

There are several explanatory variables:

Only employed respondents were asked about their working hours, occupations, and sectors. *Contract working hours*: the respondents were asked how many hours they work per week according to the employment contract. *Occupations*: occupations are categorised into two types. Blue-collar workers perform manual labour (e.g. agricultural workers and machine operators), and white-collar workers perform professional, managerial, or administrative work (e.g. service workers, clerks and legislators). *Sectors*: three types are distinguished. Primary sector involves activities of raw materials extraction (e.g. agriculture, horticulture, and forestry), secondary sector involves manufacturing activities (e.g. food processing and construction), and the tertiary sector involves services (e.g. telecommunication and accountants).

Human capital variables for both the origin-country and host-country are included. Education is measured by five dichotomous variables: No education, primary education, lower secondary education, intermediate education, and higher education. *Education in OC*: the highest degree obtained in the country of origin, among the five levels. *Education in NL*: the highest degree obtained in the Netherlands. *Work experience in OC*: work experience in the country of origin is measured in years. *Work experience in NL*: work experience in the Netherlands is measured in years. *Dutch language proficiency*: it is a categorical variable with (1) do not

⁶Here we make use of the International Standard Classification of Occupation, ISCO-88, 1-digit level. ISCO codes (1) legislators, senior officials and managers, (2) professionals, (3) technicians and associate professionals, (4) clerks, (5) service workers and shop and market sales workers, are defined as white collar. ISCO codes (6) skilled agricultural and fishery workers, (7) craft and related trades workers, (8) plant and machine operators and assemblers, (9) elementary occupations, are defined as blue collar.

⁷According to Oosterbeek (1992), secondary education in the Netherlands is composed of both vocational and general branches, with different years of schooling. Within each branch, students can enter lower secondary education directly after primary education and can only enter intermediate education upon graduation from the previous one. Higher education refers to higher vocational education and university. We distinguish education as primary education (LO), lower secondary education (LBO/MAVO), intermediate education (MBO/HAVO/VWO), and higher education (HBO/WO).

speak Dutch or find it very difficult, (2) Not very well, sometimes find it difficult, (3) Very well, never find it difficult, where (1) is the reference category.

Social capital variables are included for both co-ethnic contact and contact with Dutch people. Contact composition during free time: the respondents were asked about their frequency of Dutch contact and co-ethnic contact during free time. Three categories are, (1) more contacts with co-ethnics, (2) equal contacts with Dutch and co-ethnics, (3) more contacts with the Dutch, where (1) is the reference category. Contact composition at work: the respondents were asked about their frequency of Dutch contact and co-ethnic contact at work. Three categories are, (1) more contacts with co-ethnics, (2) equal contacts with Dutch and co-ethnics, (3) more contacts with the Dutch, where (1) is the reference category. Organisation membership: the respondents were asked whether they belong to any organisation and whether the composition of the organisation is predominantly Dutch or co-ethnic. Two questions are combined and a variable with three categories is constructed, (1) no membership, (2) member of a predominantly ethnic organisation, (3) member of a predominantly Dutch organisation, where (1) is the reference category.

Other background characteristics are included as well. *Ethnicity*: respondents self-report their ethnicity, including Turks, Moroccans, Surinamese, and Antilleans. All respondents were of one of these four groups. The Turks are treated as the reference group. *Municipality*: respondent's place of residence. Amsterdam, Rotterdam, Den Haag, Utrecht, Eindhoven, Enschede, Almere, Alphen aan den Rijn, Bergen op Zoom, Hoogezand-Sappemeer, Delft, Dordrecht, and Tiel are identified in the survey and are included in the analysis. Amsterdam is the reference category. *Ethnic concentration*: is measured by the proportion of the respondent's ethnic group in the population of the city of residence, for Turks, Moroccans, Surinamese, and Antilleans. *Nationality*: dichotomous variable equals 1 if the respondent reported having Dutch nationality (citizenship) and 0 otherwise. *Married*: dichotomous variable equals 1 if the

⁸The ethnic distribution of population within cities is from Statistics Netherlands.

respondent is married (spouse present) and 0 otherwise. *Number of children*: the respondents were asked how many children they have at home in the Netherlands and also outside home. We create a new variable by summing up the numbers. *Years since migration*: Years of stay in the Netherlands. *Migration motives*: migration motives are categorised into four types. Work, study, family (mainly family reunification, marriage or being brought to the Netherlands by parents) and other reasons (political situation in the origin-country, health reasons, etc).

3.3 Descriptive statistics

Table 1 presents descriptive statistics for cross-sectional data. The sample is restricted to adult foreign-born men, whose ages range from 25 to 64. The average monthly earnings of the total sample is 2644 Dutch guilders. 75% of the immigrants are employed. The ISEI scale ranges from 16 (agricultural workers; helpers and cleaners in offices, hotels and other establishments) to 88 (medical doctors). The mean occupational status in the cross-sectional sample is 40 (locomotive-engine drivers). An increase of one standard deviation above the mean in the average ISEI scale would be equivalent to working as production and operations managers in wholesale and retail trade, or in transport, storage and communications. A decrease of one standard deviation below the mean would be equivalent to working as building caretakers, gardeners, or garbage collectors. 56% of the immigrants have a Dutch nationality. The average duration in the Netherlands is 17 years. Up to 65% of the respondents do not have any education in the Netherlands and only 7% completed higher education (university) in the Netherlands. 6% of the respondents work in the primary sector, 33% work in the secondary sector, 36% work in the tertiary sector, and the rest (25%) are unemployed. The ethnic concentration is measured in percentages, with an average level of about 5%.

 $^{^9}$ In the Netherlands, it is possible to hold two nationalities. Some of the immigrants still keep their nationalities in the country of origin. The percentages of Dutch nationality holders in the sample are 34 % for Turks and Moroccans, 95 % for Surinamese, and 100 % for Antilleans.

[TABLE 1 ABOUT HERE]

Table 2 shows that social contacts and Dutch language proficiency vary significantly across the four ethnic groups. In general, Surinamese and Antilleans have more networks developed among Dutch people compared to Turks and Moroccans, either during free time, at work or organisation types. This may be a consequence of Dutch language proficiency. 87% of Surinamese speak Dutch very well, 73% for Antilleans, 34% for Moroccans, while only 22% of Turks reach this level of proficiency.

[TABLE 2 ABOUT HERE]

Figure 1 shows the average monthly earnings of adult foreign-born men across ethnic groups. All groups show a steady increase in earnings over the years. Moroccans are economically worse off than the other three groups. Antilleans reported the highest earnings in 1991 and 1994, but were later surpassed by Surinamese in 1998 and 2002.

[FIGURE 1 ABOUT HERE]

4 Empirics

4.1 Identification of earnings assimilation in panel setting

This subsection discusses the econometric specifications for testing immigrant economic assimilation using longitudinal data, as shown in equation (3). The following notation is

used: LnE_{it} is the natural logarithm of earnings for immigrant $i = 1, 2, \dots, N$, in time period t; YSM_{it} is years since migration of i in time t; X_{it} is the individual characteristics that may vary over time, for example, social contact variables and language variables; θ_i is the individual specific effect for immigrant i, including observed characteristics (such as ethnicity), and unobserved heterogeneity; ε_{it} is the residual error.

We follow convention by assuming that the earnings assimilation curve is quadratic in years since migration (Chiswick, 1978):

$$LnE_{it} = \alpha + \beta \cdot YSM_i + \gamma \cdot YSM_i^2 + \lambda \cdot X_{it} + \theta_i + \varepsilon_{it}. \tag{1}$$

The intercept α could be interpreted as the logarithm of the benchmark for immigrant group evaluated at $X_i = 0$. It is assumed that our coefficients of interest β , γ and λ do not vary over time. For simplicity, it is assumed that the effect on earnings of education acquired in the Netherlands is captured by the years since migration variable.

Let $\tau = t + T$ where T > 0 is the time interval between two longitudinal observations. Let Δ_T denote the difference operator over T periods. Equation 1 implies that in time period τ :

$$LnE_{i\tau} = \alpha + \beta \cdot (YSM_i + T) + \gamma \cdot (YSM_i + T)^2 + \lambda \cdot X_{i\tau} + \theta_i + \varepsilon_{i\tau}. \tag{2}$$

Subtracting Equation 2 from Equation 1 differences away the immigrant specific effect:

$$\Delta_T Ln E_i = (\beta T + \gamma T^2) + 2T\gamma \cdot Y S M_i + \lambda \cdot \Delta_T X_i + \Delta_T \varepsilon_i. \tag{3}$$

 β , γ , and λ are exactly identified in Equation 3. Note the sign of γ determines whether the immigrant earnings increase at an increasing or a decreasing rate with duration in the destination.

The panel data sample is created with a time interval of $T \approx 4$ years between the first and the second time of the survey, making it possible for us to estimate Equation 3. The variable X_i include the social capital variables (*Contact composition during free time, contact composition at work*, and *organisation membership*) and the Dutch language proficiency variable discussed in subsection 3.2. The longitudinal (panel data) regression analysis would be concerned with the level changes in social contacts and Dutch language proficiency between two time periods.

4.2 Cross section analyses

The empirics begin with a cross-section regression analysis for adult foreign-born men in the Netherlands. Table 3 presents the regression estimates for earnings, employment and occupational status. Column (1) is the modified OLS earnings regression (Mincer, 1974) incorporated with variables for years of employment pre- and post-migration (Chiswick, 1978). The dependent variable is the natural logarithm of monthly labour market earnings. The sample includes employed men reporting positive or non-zero labour market earnings. Column (2) is a logistic regression model and the dependent variable is a dichotomous variable for being employed or not. The sample includes those who reported 'working regularly' or 'unemployed/search for jobs'. Column (3) is an OLS estimation for occupational status, with ISEI being the dependent variable. The sample includes employed respondents with reported occupations. All the standard errors are clustered on respondent ID, given the fact that some respondents appear more than once in the pooled cross-sectional data.

[TABLE 3 ABOUT HERE]

In column (1) of Table 3 on earnings, the coefficients for all social contact variables are

statistically insignificant. Dutch language proficiency turns out to be an important factor in increasing earnings. ¹⁰ Respondents who speak Dutch very well earn around 6% more than those who have no mastery of the Dutch language. This effect is smaller than the effect of language proficiency found elsewhere in other destination countries (see, for example, Chiswick and Miller, 1995). In addition, higher earnings are associated with more schooling in the Netherlands.

In column (2) of Table 3 on employment, the effects of social contacts and Dutch language proficiency on the probability of employment are interpreted using the odds ratio. The odds ratio is expected to change by $\exp(b_i\delta)$ for a change of δ in variable x_i , ceteris paribus.

$$\frac{Pr(Employed = 1|X = \{x_i + \delta, x_{-i}\})}{Pr(Employed = 1|X = \{x_i, x_{-i}\})} = \exp(b_i \delta), \tag{4}$$

where b_i is the estimated coefficient for variable x_i in the logistic regression model. The odds ratio is 1.31 times greater for a change from 'more contact with co-ethnics' to 'equal contacts with Dutch and co-ethnics' in the ethnic composition. The odds ratio is 2.26 times greater for a change from 'speak no Dutch' to 'speak Dutch very well'. Surinamese and Antilleans have higher employment rates than Turks and Moroccans. 11

In a test, the contact variables were interacted with duration in the Netherlands to determine whether the impact of contact on labour market outcomes increases or decreases the longer the immigrant has been employed in the Netherlands. Among the three dependent variables, the

¹⁰Yao and Van Ours (2015) analyses the effect of Dutch language proficiency on the wages of adult male immigrants in the Netherlands from all countries of origin. Although the sample is relatively small for a microdata analysis of male earnings (407 observations), those who are proficient in Dutch (measured by a dichotomous variable) earn about 14 percent more than those lacking proficiency, which is marginally significant (t=1.91). This magnitude is comparable to what is found in this study and in studies of other countries. Using an IV approach to identify Dutch proficiency, Yao and Van Ours found the coefficient declines to 9.4 percent, but the standard error increases sharply (t=0.49). Presumably because of the difficulty of finding appropriate identifying instruments, other studies using the IV technique to study the relation between earnings and proficiency also found a large increase in the standard error compared to an OLS analysis. For a discussion of this issue, see Chiswick and Miller (1995).

 $^{^{11}}$ This is consistent with the finding in Zorlu and Hartog (2012).

only statistically significant interaction term is in the employment regression: the probability of being employed is enhanced even more by contact with co-ethnics the longer the duration in the country.

In column (3) of Table 3, ethnic organisation membership and Dutch organisation membership are both associated with a higher occupational status. The occupational status is positively associated with education level. The negative coefficient for YSM (although not statistically significant) and the significant positive coefficient for YSM squared suggest that the International Socio-Economic Index rises at an increasing rate with duration in the Netherlands. 12

4.3 Panel data analyses on earnings

Table 4 presents the longitudinal regression analysis of earnings for adult foreign-born men in the Netherlands. The dependent variable is the difference between the natural logarithm of earnings adjusted for inflation in time 2 and time 1. Column (1) 'All' is the estimation for the whole sample. In column (1), contrary to the cross-sectional findings, it is found that the coefficients for social contacts are statistically significant. Earnings are higher, the more co-ethnic contact during free time compared to Dutch contact (16 %), equal contact compared to co-ethnic contact at work (17 %) and Dutch language proficiency compared to not speaking Dutch (15 %). The effect of network differs by the context. If an immigrant allocates more time in co-ethnic contact during free time or some contact at work with Dutch people compared to only co-ethnics, this would yield returns to earnings. These confirm our hypotheses H_1 , H_2 , H_3 about earnings.

¹²Zorlu (2013) shows that the labour market adjustment of immigrants in the Netherlands runs through interoccupational job mobility, rather than intra-occupational mobility, Zorlu includes a linear term for duration (YSM) but not a quadratic term.

[TABLE 4 ABOUT HERE]

Column (2) of Table 4 'T&M' is the estimation for the Mediterranean group (Turks and Moroccans), and column (3) of Table 4 'S&A' is the estimation for the Caribbean group (Surinamese and Antilleans). The Mediterranean group is predominantly of Muslim origin and its linguistic distance from the Dutch is great. The Caribbean group, however, is close to the Dutch society concerning religious, language and cultural characteristics due to a colonial history. Column (2) shows that more co-ethnic contact compared to equal contact (14%), some contact with Dutch people at work (17%), and Dutch language proficiency (15%) all lead to an increase in earnings for the Mediterranean group, while the effect is much lower for the Caribbean group.

The earnings of the Mediterranean group increases at a decreasing rate with duration. As shown in equation 3, solving $\beta T + \gamma T^2 = 0.204, 2T\gamma = -0.011$ yields $\beta = 0.057$ and $\gamma = -0.0014$ (Table 4, column 2). On the other hand, among the Caribbean group, who generally absorbed the Dutch culture prior to immigration, there is no significant effect of duration on longitudinal changes in earnings.

Column (4) of Table 4 'No NL Edu.' is the estimation for immigrants who completed their education in the country of origin, and column (5) of Table 4 'NL Edu.' is the estimation for immigrants who completed education in the Netherlands. Comparing column (4) and column (5), the effects of social contacts (15 % for 'more contact with Dutch at work') and Dutch language proficiency (19 %) on earnings of immigrants who completed their education in the country of origin are stronger than that for immigrants who completed their education in the Netherlands. Solving $\beta T + \gamma T^2 = 0.196, 2T\gamma = -0.009$ yields $\beta = 0.054$ and $\gamma = -0.0011$ (Table 4, column 4), and solving $\beta T + \gamma T^2 = -0.238, 2T\gamma = 0.017$ yields $\beta = -0.068$ and $\gamma = 0.0022$ (Table 4, column 5). The earnings of those without a Dutch diploma increases at a decreasing

rate with duration. However, the earnings of Dutch diploma holders increases with duration only for those who have migrated over 30 years ago. The initial years of duration indirectly contributes to earnings via schooling in the Netherlands.

Table 4 columns (6) and (7) look separately at immigrant earnings by age at arrival. Column (6) 'AAM>18' is the estimation for immigrants whose age at migration (AAM) is older than 18, and column (7) 'AAM≤18' is the estimation for immigrants whose age at migration (AAM) is younger than 18. Comparing column (6) and column (7), co-ethnic contact during free time (22%), Dutch contact at work (23%), and Dutch language proficiency (19%) all increase earnings for immigrants who migrate at an older age, while only the coefficient for Dutch organisation membership is positively significant in column (7). Thus, the effects of social contacts and Dutch language proficiency on earnings of immigrants who migrate at age 18 or older are stronger and statistically significant than that for immigrants who migrate at a younger age.

Above all, we have done regressions for three pairs of (low-skill-transferability versus high-skill-transferability) subgroups: the Mediterranean versus the Caribbean; immigrants' education completed in the country of origin versus education completed in the Netherlands; age at migration equal to or older than 18 versus age at migration younger than 18. We consistently found that low-skill-transferability immigrants benefit more in earnings from social contacts and especially from Dutch language proficiency than high-skill-transferability and Dutch assimilated immigrants, thus confirming hypothesis H_4 about earnings.

Table 4 columns (8) and (9) analyse separately the effect on earnings of self-reported motive for migrating. Column (8) 'Econ' is the estimation for the self-reported economic migrants, and column (9) 'Non-Econ' is the estimation for the non-economic migrants. Column (8) shows that the statistically significant contact with Dutch people at work (31 %) and Dutch language proficiency (24 %) both lead to an increase in earnings of economic migrants. However,

among non-economic migrants, only the coefficient for Dutch organisation membership is statistically significant (16%). This confirms our hypothesis H_5 on the effects on earnings of motives for migrating.

4.4 Panel data analyses on employment

Appendix Table A2 presents the random effects logistic regression results of employment for adult foreign-born men in the Netherlands. The random effects logit model is a maximum likelihood solution where the parameters are estimated through a weighted combination of within and between individual covariances. The dependent variable is a dichotomous variable for being employed or not. Column (1) 'All' is the estimation for the whole sample. σ is the estimated random effects' standard deviation. The significance of σ implies that there is random effect. Similar with cross-sectional findings in Table 3, Dutch contact greatly enhances the probability of being employed. In column (1), participating in a Dutch organisation is significantly associated with a higher probability of being employed, and the odds ratio is 4.93 times higher. The odds ratio is 1.76 times greater for a change from 'do not speak Dutch' to 'Dutch: not very well', and is 3.06 times greater for a change from 'do not speak Dutch' to 'Dutch: very well'. Social contacts and Dutch language proficiency turn out to increase the likelihood of employment, especially contact with Dutch people. Co-ethnic contact does not seem to have any positive effect on employment. These confirm the hypotheses H_1 , H_2 , H_3 about employment.

Table A2 column (2) 'T&M' is the estimation for the Mediterranean group (Turks and Moroccans), and column (3) of Table A2 'S&A' is the estimation for the Caribbean group (Surinamese and Antilleans). Only the Mediterranean group has a higher probability of being employed with more Dutch contact, and a higher level of Dutch language proficiency. Social contacts

and Dutch language proficiency do not have these positive effects for the Caribbean group, perhaps because they are, at arrival, highly adjusted to Dutch culture and language.

Table A2 columns (4) and (5) show the equations by where the respondent's education was completed. Column (4) 'No NL Edu.' is the estimation for immigrants who completed their education in the country of origin, and column (5) 'NL Edu.' is the estimation for immigrants who completed education in the Netherlands. In column (4), participating in a Dutch organisation is significantly associated with a higher probability of being employed for immigrants who completed their education in the country of origin, and the odds ratio is 9.97 times higher. The odds ratio is 1.74 times greater for a change from 'do not speak Dutch' to 'Dutch: not very well', and is 2.24 times greater for a change from 'do not speak Dutch' to 'Dutch: very well'. However in column (5), none of the coefficients for social contacts and Dutch language proficiency are significant for immigrants who completed their education in the Netherlands.

Column (6) of Table A2 'AAM>18' is the estimation for immigrants whose age at migration (AAM) is older than 18, and column (7) of Table A2 'AAM≤18' is the estimation for immigrants whose age at migration (AAM) is younger than 18. Comparing these two columns, the coefficients for Dutch organisation membership and Dutch language proficiency are positively significant for immigrants who migrated at older age, while only the coefficient for language variable is positively significant for immigrants who migrated at younger age.

Similarly with Table 4, we have compared the three pairs (low-skill-transferability versus high-skill-transferability) of subgroups: the Mediterranean versus the Caribbean; education completed in the country of origin versus education completed in the Netherlands; age at migration older than 18 versus age at migration younger than 18. We consistently found that low-skill-transferability immigrants benefit more in terms of employment from social contacts and Dutch language proficiency than high-skill-transferability immigrants, thus confirming

hypothesis H_4 about employment.

Columns (8) and (9) of Table A2 report the random effects regression results separately for economic and non-economic migrants. Participating in a Dutch organisation is significantly associated with higher probability of employment for economic migrants, and the odds ratio is 11.99 times higher. The odds ratio is 2.49 times greater for a change from 'do not speak Dutch' to 'Dutch: not very well'. However, the effect of language is much less for non-economic migrants. This confirms our hypothesis H_5 about employment.

4.5 Panel data analyses on occupational status

The fixed effects estimation on occupational status for adult foreign-born men in the Netherlands is reported in Table A3. The dependent variable is the International Socio-Economic Index (ISEI). The model eliminates unobserved heterogeneity by using deviations from the means of the variables, and hence the time-invariant variables, such as ethnicity, are eliminated. Column (1) is the estimation for the whole sample. Column (2) is the estimation for immigrants who are blue-collar workers, and column (3) is the estimation for immigrants who are white-collar workers. In column (1), it is found that both co-ethnic contact and contact with Dutch people are useful for occupational upward mobility. This confirms hypothesis H_2 about occupational status. Comparing column (2) and column (3), we do not find any significant effect of social contacts on occupational status in blue-collar jobs. In white collar-jobs, however, co-ethnic contact and some contact with Dutch people compared to only co-ethnics increases the occupational status. This confirms our hypothesis H_6 .

5 Robustness Checks

In this section, we mainly discuss two issues: endogeneity of Dutch language proficiency and the selectivity of panel respondents in cross-sectional data.

First, the problem of measuring the impact of Dutch language ability on earnings is complicated by the fact that workers fluent in the Dutch language may earn more for reasons other than language skills. Therefore we resort to an instrumental variable strategy using an interaction term between age at migration and a dummy for non-Dutch-speaking (NDS) country as the identifying instrument (Bleakley and Chin, 2004). The idea is that upon arrival in the Netherlands, immigrants originating from Dutch-speaking countries encounter everything that the immigrants from non-Dutch-speaking countries encounter except having to navigate an entirely new language and culture. Any difference in wages between young and old arrivers from non-Dutch-speaking countries that is different from the wage difference for those from Dutch-speaking countries can plausibly be attributed to Dutch language ability. Figure 2 shows the relationship between age at migration and Dutch language ability. Children with early exposure to the Dutch language attain higher levels of Dutch language ability. For early arrivers (before the age of 5), the Dutch language ability of immigrants from non-Dutch-speaking countries is comparable to that of immigrants from Dutch-speaking countries. However, there tends to be a significant difference in Dutch language ability for those who immigrate at older ages.

[FIGURE 2 ABOUT HERE]

Table 5 briefly shows an IV estimation to measure the impact of Dutch language ability on the earnings of foreign-born men who migrated before age 40.¹³ We use the instrument

¹³There are mainly two cases for those who migrated above age 40. Immigrants from Dutch-speaking countries

 $\max(0, AAM-5)*NDS$, that is, it is zero for those from Dutch-speaking areas and those who immigrated under age five from the other countries, and it is age at immigration minus five years for those age five and over at immigration from the non-Dutch speaking countries. This captures the fact that the difference in future language ability starts to appear at around age 5. In the first stage in column (1), the estimate for the instrumental variable is significantly negative, showing a degradation in language-learning ability with age at migration. In the second stage in column (2), the estimate for Dutch language ability is significantly positive, implying the importance of Dutch language ability for labour market performances. 14

[TABLE 5 ABOUT HERE]

Second, as mentioned earlier in section 3, this Dutch survey was not originally set up as a longitudinal study and hence the level of attrition is rather high. We have found no significant difference in the descriptive statistics between the cross-sectional respondents and the panel respondents. To further check whether these respondents are selective, we apply the Heckman selection model. In the first step, a probit regression is run to predict the participation of respondents in the panel sample. Apart from all the control variables, the dichotomous variable for living in a rented house is added. The coefficient is significantly negative, implying that the respondents who live in a rented house are less likely to participate in the next wave compared to those who own a house. The intuition is that respondents renting a house have higher probabilities of changing address by returning to their country of origin or moving elsewhere in the Netherlands. In the second step, the outcome regression is run controlling for the selectivity coefficient obtained in the first step.

are already very fluent in Dutch language; immigrants from non-Dutch-speaking countries cannot speak Dutch at all, and they do not seem to further acquire the local language anymore. The instrument will work the best when there is a linear degradation in language acquisition over years since migration.

¹⁴The two-stage least squares effect of Dutch language proficiency on earnings seems implausibly large (0.46, t=2.9). Yet, a similar pattern is found in comparable analyses for the US and Germany. This apparently arises from similar omitted variables in the first stage and second stage equations (Chiswick and Miller, 1995).

The Heckman selectivity correction models for earnings, employment and occupational status are reported in Appendix Table A4. The inverse Mills' ratio reported in the last row of each column is not significant in any of the specifications, implying that there is no selection bias. This result validates the empirical analysis for the panel data.

6 Main Conclusions and Discussion

This paper studies the effects of social contacts and Dutch language proficiency on the adult foreign-born men's labour market performances in the Netherlands, using four large cross-section samples from year 1991 to 2002, together with a constructed panel dataset. Three measures of labour market performance are considered âÅŞ monthly income from all jobs (earnings), being employed, and socio-economic status of the manâÅŹs occupation. The four origin countries in question are Turkey, Morocco, Surinam, and the Dutch Antilles. It is found that social contacts and Dutch language proficiency have positive impacts on labour market outcomes (mainly employment and earnings). But the strength of the effects varies by the degree of the transferability of their pre-migration skills, their motivation for migration and types of occupations. The effects are much stronger for immigrants with low-skill-transferability than for immigrants with high-skill-transferability, and are stronger for economic migrants than for non-economic migrants, and are stronger for white-collar workers than blue-collar workers. The magnitude of these effects are summarised below.

First, the Mediterranean group (Turks and Moroccans) benefits much more from social contacts and Dutch language proficiency in their economic performance in the Netherlands than the Caribbean group (Surinamese and Antilleans). For example, the Mediterranean immigrants who speak Dutch well earn 15 % more than those who do not speak Dutch at all. For Turks and Moroccans, two economically disadvantaged groups with lower education levels,

contact with Dutch people turns out to be of great use in job-related activity. Surinamese and Antilleans' earnings are quite invariant to changes in social contacts and Dutch language proficiency. Surinamese and Antilleans, as two immigrant groups that are closer to Dutch culture and language due to colonial ties, their pre-migration contacts with Dutch were rather frequent. The marginal effect of contact with Dutch people in the Netherlands is not that important for them.

Second, immigrants who completed their education in the country of origin benefit more from social contacts and Dutch language proficiency in their economic performances than immigrants who had some years of schooling in the Netherlands. In the former group, immigrants who report more contact with Dutch at work earn 15 % more than those who have more co-ethnic contact at work, *ceteris paribus*. Certain qualifications in the Netherlands are useful to get a job or a promotion at work. Immigrants who completed their education in the country of origin are deficient in the destination-specific exposure, and hence social contacts provide more information for them to familiarize with the local labour market.

Third, immigrants who migrated at an older age have a larger partial effect from social contacts and Dutch language proficiency in their economic performances than immigrants who migrated at a younger age. The older age an immigrant migrates, the less transferable is his skill to the destination. Younger migrants have accumulated more destination-specific qualifications and mostly speak fluent Dutch. Therefore they are more competitive in the job market than those who migrated at an older age.

Fourth, social contacts and Dutch language proficiency have larger impacts on the economic outcomes of economic migrants than non-economic migrants. Economic migrants make better use of social contacts and Dutch language proficiency to obtain economic benefits. For example, *ceteris paribus*, contact with Dutch at work and having a good mastery of Dutch yield 31 % and 24 % increases in earnings, respectively, while they do not have any significant effects

on non-economic migrants' earnings.

Last but not the least, social contacts and Dutch language proficiency also enhance occupational status, but only for white-collar jobs. Contact with Dutch people is found to be consistently positive in increasing all labour market outcomes (earnings, employment and occupational status), but co-ethnic contact does not increase the likelihood of employment among immigrants.

This study demonstrates the importance of social contacts and the distinction between contacts among co-ethnics and with the host population, and Dutch language proficiency on immigrant economic outcomes. While the study of the economics of the destination language proficiency among immigrants has focused on English, an international language, and English-speaking destinations, this study shows that the implications or hypotheses are equally applicable for the Netherlands, a small non-English speaking host country, whose language (Dutch) is unique to that country. Moreover, it points to important systematic differences between immigrants who come from a country where there is pre-immigration exposure to the destination's primary labor market language (Surinam and Netherlands Antillies) and immigrants from countries where there is no such exposure (Morocco and Turkey).

Networks and language both play an important but complex role in immigrants' integration in the host society, and influence future migration inflows (Wang et al., 2016; 2018). As a result, the study provides insights for the Netherlands, and the European Union more broadly, on programs to enhance the integration of immigrants by the government, immigrant ethnic communities and the immigrants themselves. The marginal return of providing integration measures to immigrants is potentially high, especially among immigrants whose pre-immigration experience (exposure) provide them with few skills that are transferable to the Dutch labour market. A greater emphasis on Dutch language proficiency would enhance their earnings directly and enhance their earnings and employment indirectly by facilitating

contact with Dutch people during their free time, at work and through participating in Dutch organisations.

References

- Bleakley, H. and A. Chin (2004). 'Language skills and earnings: evidence from childhood immigrants'. *The Review of Economics and Statistics* 86.2, pp. 481–496.
- Budria, S. and P. Swedberg (2012). 'The impact of language proficiency on immigrants' earnings'. *IZA Discussion Paper* 6957.
- Carliner, G. (1981). 'Wage differences by language group and the market for language skills in Canada'. *The Journal of Human Resources* 16.3, pp. 384–399.
- Chiswick, B. R. (1978). 'The effect of Americanization on the earnings of foreign-born men'. *Journal of Political Economy* 86.5, pp. 897–921.
- (1998). 'Hebrew language usage: determinants and effects on earnings among immigrants in Israel.' *Journal of Population Economics* 11.2, pp. 253–271.
- (1999). 'Are immigrants favorably self-selected?' *The American Economic Review* 89.2, pp. 181–185.
- Chiswick, B. R. and P. W. Miller (1995). 'The endogeneity between language and earnings: international analyses'. *Journal of Labor Economics* 13.2, pp. 246–88.
- (2002). 'Immigrant earnings: language skills, linguistic concentrations and the business cycle'. *Journal of Population Economics* 15.1, pp. 31–57.
- (2005). 'Do enclaves matter in immigrant adjustment?' *City & Community* 4.March, pp. 5–35.
- Chiswick, B. R. and P. W. Miller (2007). 'Earnings and occupational attainment: immigrants and the native born'. *IZA Discussion Paper* 2676.
- (2012). 'Negative and positive assimilation, skill transferability, and linguistic distance'. *Journal of Human Capital* 6.1, pp. 35–55.
- Clark, K. and S. Drinkwater (1998). 'Ethnicity and self-employment in Britain'. *Oxford Bulletin of Economics and Statistics* 60.3, pp. 383–407.
- Duleep, H. O. and M. C. Regets (1999). 'Immigrants and human-capital investment'. *The American Economic Review* 89.2, pp. 186–191.
- Dustmann, C. and F. Fabbri (2003). 'Language proficiency and labour market performance of immigrants in the UK'. *Economic Journal* 113.489, pp. 695–717.

- Dustmann, C. and A. Van Soest (2001). 'Language fluency and earnings: estimations with misspecified indicators'. *The Review of Economics and Statistics* 83.4, pp. 663–674.
- Evans, M. (1987). 'Language skill, language usage and opportunity: immigrants in the Australian labour market'. *Sociology* 21.2, pp. 253–274.
- Ganzeboom, H. B. G., P. M. De Graaf, D. J. Treiman, and J. De Leeuw (1992). 'A standard international socio-economic occupational status index of occupational status'. *Social Science Research* 21, pp. 1–56.
- Granovetter, M. (1974). *Getting a job: a study of contacts and careers*. first edit. Harvard University Press, Cambridge, MA.
- Ioannides, Y. M. and L. D. Loury (2004). 'Job information networks, neighborhood effects, and inequality'. *Journal of Economic Literature* XLII.December, pp. 1056–1093.
- Iosifides, T., M. Lavrentiadou, E. Petracou, and A. Kontis (2007). 'Forms of social capital and the incorporation of Albanian Immigrants in Greece'. *Journal of Ethnic and Migration Studies* 33.8, pp. 1343–1361.
- Kanas, A. and F. Van Tubergen (2006). 'The impact of human and social capital on immigrants' employment and occupational status'. *Working paper*.
- Kanas, A., B. R. Chiswick, T. Van der Lippe, and F. Van Tubergen (2012). 'Social contacts and the economic performance of immigrants: a panel study of immigrants in Germany'. *International Migration Review* 46.3, pp. 680–709.
- Kazemipur, A. (2006). 'The market value of friendship: social networks of immigrants'. *Canadian Ethnic Studies Journal* 38.2, pp. 47–71.
- Lancee, B. (2010). 'The economic returns of immigrants' bonding and bridging social capital: the case of the Netherlands'. *International Migration Review* 44.1, pp. 202–226.
- (2012). 'Immigrant performance in the labour market'. PhD thesis. University of Amsterdam.
- Lin, N. (1999). 'Social networks and status attainment'. *Annual Review of Sociology* 25, pp. 467–487.
- Lin, N., J. C. Vaughn, and W. M. Ensel (1981). 'Social resources and occupational status attainment'. *Social Forces* 59.4, pp. 1163–1181.
- Martinovic, B., F. Van Tubergen, and I. Maas (2009). 'Dynamics of interethnic contact: a panel study of immigrants in the Netherlands'. *European Sociological Review* 25.3, pp. 303–318.
- McManus, W., W. Gould, and F. Welch (1983). 'Earnings of Hispanic men: the role of English language proficiency'. *Journal of Labor Economics* 1.2, pp. 101–130.
- Mincer, J. (1974). *Schooling, experience and earnings*. New York, NY: National Bureau of Economic Research.
- Montgomery, J. D. (1991). 'Social networks and labor-market: toward an economic analysis'. *American Economic Review* 81.5, pp. 1408–1418.

- Mouw, T. (2003). 'Social capital and finding a job: do contacts matter?' *American Sociological Review* 68.6, pp. 868–898.
- Mullan, B. P. (1989). 'The impact of social networks on the occupational status of migrants'. *International Migration* 27.1, pp. 69–86.
- Nickell, S. (1982). 'The determinants of occupational success in Britain'. *The Review of Economic Studies* 49.1, pp. 43–53.
- Oosterbeek, H. (1992). 'Essays on human capital theory'. PhD thesis. University of Amsterdam.
- Piracha, M., M. Tani, and M. Vaira-Lucero (2014). 'Social capital and immigrants' labour market performance'. *Papers in Regional Science*.
- Putnam, R. D. (2000). *Bowling Alone: the Collapse and Revival of American Community*. Simon and Schuster, p. 544.
- Van Ours, J. C. and J. Veenman (1999). 'The Netherlands: old emigrants-young immigrant country'. *IZA Discussion Paper* 80.
- Wang, Z. (2019). 'The incompatibility of local economic prosperity and migrants' social integration: evidence from the Netherlands'. *Annals of Regional Science* forthcoming.
- Wang, Z., T. De Graaff, and P. Nijkamp (2016). 'Cultural diversity and cultural distance as choice determinants of migration destination'. *Spatial Economic Analysis* 11.2, pp. 176–200.
- (2018). 'Barriers of culture, networks, and language in international migration: a review'.
 REGION 5.1, pp. 73–89.
- Woolcock, M. and D. Narayan (2000). 'Social capital: implications for development theory, research, and policy'. *The World Bank Research Observer* 15.2, pp. 225–249.
- Xue, L. (2008). 'Social capital and employment entry of recent immigrants to Canada: evidence from the longitudinal survey of immigrants to Canada (LSIC)'. *Citizenship and Immigration Canada* March.
- Yao, Y. and J. C. Van Ours (2015). 'Language skills and labor market performance of immigrants in the Netherlands'. *Labour Economics* 34, pp. 76–85.
- Zorlu, A. (2013). 'Occupational adjustment of immigrants in the Netherlands'. *Journal of International Migration and Integration* 14.4, pp. 711–731.
- Zorlu, A. and J. Hartog (2001). 'Migration and immigrants: the case of the Netherlands'. *Tinbergen Institute Discussion Paper* 042/3.
- (2012). 'Employment assimilation of immigrants in the Netherlands: catching up and the irrelevance of education'. *International Journal of Population Research* Article ID 634276.

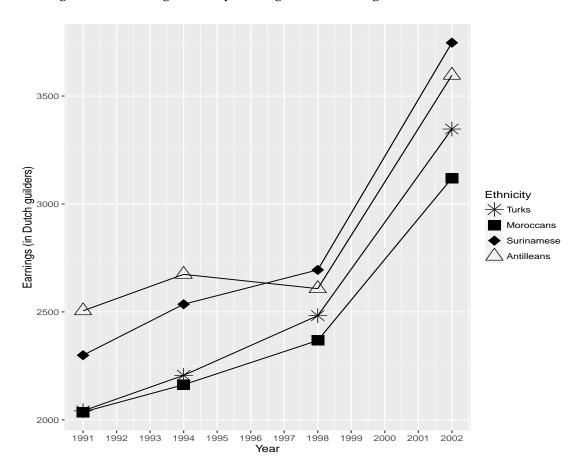


Figure 1: The Average Monthly Earnings of Adult Foreign-Born Men in Each Wave

Source: 'Social Position and Use of Public Facilities by Immigrants' (SPVA), 1991, 1994, 1998, 2002. *Note*: In 2002, the currency changed from Dutch guilders to Euros. The exchange ratio 2.2:1 is used to unify the monetary unit across the four waves. Earnings shown in this figure are not adjusted for inflation.

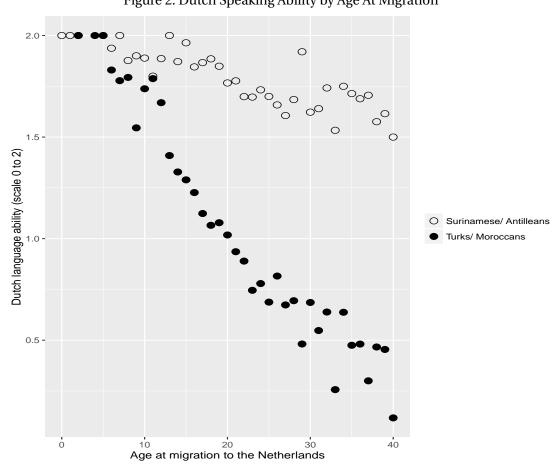


Figure 2: Dutch Speaking Ability by Age At Migration

Source: 'Social Position and Use of Public Facilities by Immigrants' (SPVA), 1991, 1994, 1998, 2002. *Note*: Data are for mean Dutch language proficiency at each age at migration. 0 means Dutch very difficult or do not speak Dutch at all. 2 means never have difficulty speaking Dutch.

Table 1: Descriptive Statistics for Cross-Sectional Data, Adult Foreign-Born Men

Statistic	N	Mean	St. Dev.	Min	Max
Earnings (in Dutch guilders)	4,536	2,644.10	1,133.87	9.00	21,989.00
Employed now	6,785	0.75	0.43	0	1
Unemployed/search for jobs	6,785	0.25	0.43	0	1
Occupational status	3,264	40.36	17.62	16	88
Age	6,790	38.72	9.22	25	64
Turks	6,790	0.34	0.48	0	1
Moroccans	6,790	0.31	0.46	0	1
Surinamese	6,790	0.21	0.41	0	1
Antilleans	6,790	0.13	0.34	0	1
Dutch nationality	6,790	0.56	0.50	0	1
YSM (in years)	6,693	16.72	8.50	0.00	52.50
Married	6,790	0.81	0.39	0	1
Number of children	6,790	2.33	2.09	0	16
Motive: study	6,790	0.12	0.33	0	1
Motive: family	6,790	0.36	0.48	0	1
Motive: work	6,790	0.36	0.48	0	1
Motive: others	6,790	0.16	0.36	0	1
No edu. in OC	6,613	0.29	0.45	0	1
Primary edu. in OC	6,613	0.36	0.48	0	1
Lower edu. in OC	6,613	0.18	0.38	0	1
Intermed. edu. in OC	6,613	0.14	0.35	0	1
Higher edu. in OC	6,613	0.03	0.17	0	1
No edu. in NL	6,522	0.65	0.48	0	1
Primary edu. in NL	6,522	0.11	0.31	0	1
Lower edu. in NL	6,522	0.10	0.29	0	1
Intermed. edu. in NL	6,522	80.0	0.28	0	1
Higher edu. in NL	6,522	0.07	0.25	0	1
Exp. in OC (in years)	6,528	4.38	3.08	0.00	21.02
Exp. in NL (in years)	6,749	11.74	8.40	0.00	44.00
Work in primary sector	6,790	0.06	0.24	0	1
Work in secondary sector	6,790	0.33	0.47	0	1
Work in tertiary sector	6,790	0.36	0.48	0	1
Contract working hours	4,963	38.29	6.46	2	96
Ethnic concentration	5,222	4.73	2.59	0.26	9.73

Respondents are those reported as the household head by the household members.

Earnings are measured as monthly labour market income.

Earnings are not adjusted for inflation.

Occupational status is measured in terms of the International Socio-Economic Index (ISEI).

The means of working sector variables do not sum up to 1 because of 'N.A.' option.

Contract working hours are measured per week.

Ethnic concentration is measured in percentages.

Source: 'Social Position and Use of Public Facilities by Immigrants' (SPVA), 1991, 1994, 1998, 2002.

Table 2: Descriptive Statistics of Social Contacts and Dutch Language Proficiency across Ethnicity for Cross-Sectional Data, Adult Foreign-Born Men

	Turks	Moroccans	Surinamese	Antilleans
During free time: more contact with co-ethnics	0.49	0.29	0.29	0.19
During free time: equal contacts	0.19	0.31	0.41	0.33
During free time: more contact with Dutch	0.07	0.08	0.17	0.38
At work: more contact with co-ethnics	0.10	0.08	0.04	0.03
At work: equal contacts	0.30	0.30	0.22	0.11
At work: more contact with Dutch	0.28	0.27	0.57	0.66
No membership	0.76	0.81	0.64	0.62
Ethnic org. membership	0.16	0.11	0.17	0.08
Dutch org. membership	0.09	0.08	0.19	0.30
Do not speak Dutch	0.35	0.24	0.02	0.04
Dutch: not very well	0.43	0.42	0.11	0.23
Dutch: very well	0.22	0.34	0.87	0.73

The social contacts and language variables are dichotomous with a value of either 0 or 1. The figures in the table are the percentage of respondents in the sample for each ethnic group.

Sample size: 6790.

Source: 'Social Position and Use of Public Facilities by Immigrants' (SPVA), 1991, 1994, 1998, 2002.

Table 3: Cross-Section Regression Analysis of Earnings, Employment and Occupational Status, Adult Foreign-Born Men

	(1)	(2)	(3)
	Earnings	Employment	ISEI
Constant	5.178 (0.182)***	-0.068 (0.348)	57.151 (2.373)***
Social Contacts			
Free time: equal contact	-0.020(0.025)	0.273 (0.123)**	0.631 (0.680)
Free time: more with Dutch	-0.045 (0.036)	0.187 (0.180)	-1.423(0.952)
At work: equal contact	0.008 (0.023)		-1.082(1.055)
At work: more with Dutch	0.015 (0.023)		1.072 (1.071)
Ethnic org. membership	0.019 (0.023)	0.107 (0.122)	1.653 (0.685)**
Dutch org. membership	0.039 (0.036)	0.263 (0.172)	2.505 (0.804)***
Human Capital			
Dutch: not very well	-0.015(0.020)	0.277 (0.112)**	-0.171 (0.678)
Dutch: very well	$0.060(0.019)^*$	0.815 (0.139)***	1.044 (0.792)
Primary edu. in OC	-0.007 (0.023)	-0.048(0.106)	$-1.270 (0.588)^*$
Lower edu. in OC	-0.010(0.034)	-0.039(0.154)	0.097 (0.757)
Intermed. edu. in OC	0.055 (0.039)	-0.003(0.155)	1.933 (0.867)**
Higher edu. in OC	0.099 (0.085)*	0.139 (0.270)	9.547 (2.025)***
Primary edu. in NL	-0.002(0.030)	0.053 (0.138)	2.395 (0.862)***
Lower edu. in NL	0.065 (0.026)*	0.477 (0.193)***	0.177 (0.826)
Intermed. edu. in NL	0.088 (0.037)**	0.979 (0.245)***	4.890 (1.059)***
Higher edu. in NL	0.168 (0.062)***	2.145 (0.370)***	18.946 (1.335)***
Exp. in NL	0.007 (0.005)	0.282 (0.023)***	0.224 (0.136)*
Exp. in OC	-0.002(0.008)	-0.229 (0.042)***	$-0.452 (0.265)^*$
Exp. in NL squared/100	-0.006(0.018)	-0.283 (0.069)***	-0.889 (0.398)**
Exp. in OC squared/100	0.021 (0.051)	0.599 (0.291)**	3.100 (2.166)*
Control Variables			
Moroccans	-0.026(0.019)	-0.218 (0.108)**	-1.719 (0.617)**
Surinamese	-0.023(0.038)	1.007 (0.181)***	0.603 (0.898)
Antilleans	0.048 (0.045)	0.984 (0.230)***	0.527 (1.120)
Dutch nationality	-0.004 (0.018)	0.101 (0.107)	0.275 (0.560)
YSM	0.006 (0.010)	-0.158 (0.024)***	-0.236(0.144)
YSM squared/100	-0.012 (0.030)	-0.048(0.061)	0.979 (0.367)***
Married	0.060 (0.030)**	0.786 (0.128)***	-0.499(0.743)
Number of children	0.007 (0.008)	-0.062 (0.026)**	0.202 (0.170)
Inflation factor	1.495 (0.093)***		
Contract working hours	0.014 (0.002)***		
Ethnic concentration	0.010 (0.006)*	0.035 (0.030)	0.184 (0.151)
\mathbb{R}^2	0.144	<u> </u>	0.480
Adj. R ²	0.131		0.471
Num. obs.	3160	4715	2990
Log Likelihood		-1773.689	

^{****} *p* < 0.01, ** *p* < 0.05, * *p* < 0.1

The dependent variable of column (1) is the natural logarithm of earnings. Column (2) is estimated using a logistic regression model. The dependent variable of column (3) is the International Socio-Economic Index.

The reference for each categorical variable is as follows. Contact composition during free time: more contact with co-ethnics. Contact composition at work: more contact with co-ethnics. Organisation membership: no membership. Dutch proficiency: do not speak Dutch or find it very difficult. Education in OC35 education. Education in NL: no education. Ethnicity: Turks. The inflation factor is the Consumer Price Index (CPI) in year 1991, 1994, 1998 and 2002.

Standard errors in the parentheses are clustered on respondent ID.

Year effect, municipality fixed effect and sector effect are controlled in the regressions.

The variance inflation factors for social contact variables and language proficiency variable are all smaller than 4, implying no multicollinearity problem.

Source: 'Social Position and Use of Public Facilities by Immigrants' (SPVA), 1991, 1994, 1998, 2002.

Table 4: Panel Data Regression Analysis of Earnings, Adult Foreign-Born Men, All Sample Estimation, and Groups by Ethnicity, Education, Age At Migration and Migration Motives

	(1)	(2)	(3)	(4)	(2)	(9)	(2)	(8)	(6)
	All	T&M	S&A	No NL Edu.	NL Edu.	AAM>18	AAM≤18	Econ	Non-Econ
Constant	0.091	0.204***	-0.035	0.196***	-0.238	0.152*	-0.063	0.213	-0.045
	(0.076)	(0.069)	(0.157)	(0.058)	(0.199)	(0.089)	(0.162)	(0.144)	(0.072)
YSM	-0.001	-0.011^{***}	0.008	***600.0-	0.017*	-0.006	0.010	-0.009	0.009
	(0.004)	(0.004)	(0.007)	(0.003)	(0.000)	(0.005)	(0.008)	(0.007)	(0.004)
Free time: equal contact	-0.086	-0.137**	-0.101	-0.071	-0.255	-0.131	-0.003	-0.109	-0.053
	(0.071)	(0.063)	(0.137)	(0.054)	(0.169)	(0.088)	(0.116)	(0.130)	(0.065)
Free time: more with Dutch	-0.159^{*}	0.107	-0.376**	0.094	-0.416**	-0.220^{**}	-0.061	-0.224	-0.056
	(0.000)	(0.086)	(0.166)	(0.073)	(0.206)	(0.110)	(0.164)	(0.154)	(0.091)
At work: equal contact	0.167**	0.165^{**}	0.091	0.171 ***	0.164	0.228**	-0.030	0.310^{**}	0.008
	(0.085)	(0.068)	(0.195)	(0.066)	(0.210)	(0.107)	(0.137)	(0.144)	(0.085)
At work: more with Dutch	0.115	0.113	0.030	0.153**	0.011	0.155	-0.006	0.188	0.007
	(0.083)	(0.073)	(0.168)	(0.068)	(0.183)	(0.105)	(0.132)	(0.143)	(0.081)
Ethnic org. membership	-0.036	-0.049	0.038	-0.035	0.056	-0.063	0.012	-0.136	0.058
	(0.085)	(0.068)	(0.185)	(0.060)	(0.270)	(960.0)	(0.210)	(0.159)	(0.078)
Dutch org. membership	0.055	-0.001	0.075	0.065	0.114	-0.063	0.269**	-0.091	0.159**
	(0.070)	(0.092)	(0.124)	(0.064)	(0.165)	(0.103)	(0.123)	(0.145)	(0.073)
Dutch: not very well	-0.059	-0.019	-0.063	-0.026	-0.019	-0.064	-0.027	-0.096	-0.010
	(0.041)	(0.040)	(0.101)	(0.031)	(0.118)	(0.050)	(0.073)	(0.070)	(0.040)
Dutch: very well	0.155**	0.147^{**}	0.116	0.190^{***}	0.100	0.194^{**}	0.145	0.240^{*}	0.100
	(0.072)	(0.063)	(0.139)	(0.056)	(0.161)	(0.092)	(0.1111)	(0.127)	(690.0)
\mathbb{R}^2	0.030	0.133	0.041	0.113	0.064	0.046	0.068	0.057	0.064
$Adj. R^2$	900.0	0.091	-0.009	0.078	-0.010	0.014	-0.017	0.011	0.017
Num. obs.	468	244	224	296	152	335	133	238	230
*** 2/001 ** 2/001									

Standard errors are in the parentheses. *** p < 0.01, ** p < 0.05, * p < 0.1

The dependent variable is the difference between the natural logarithm of earnings adjusted for inflation in time 2 and time 1.

for the Caribbean group (Surinamese and Antilleans). Column (4) "No NL Edu." is the estimation for immigrants who completed their education in the country of origin, and column (5) 'NL Edu.' is the estimation for immigrants who completed education in the Netherlands. Column (6) 'AAM>18' is the estimation for immigrants whose age at migration (AAM) is older than 18, and column (7) 'AAM≤18' is the estimation for immigrants whose age at migration (AAM) is younger than 18. Column (8) 'Econ' is the estimation for the economic migrants, Column (1) 'All' is the estimation for the whole sample. Column (2) 'T&M' is the estimation for the Mediterranean group (Turks and Moroccans), and column (3) 'S&A' is the estimation and column (9) 'Non-Econ' is the estimation for the non-economic migrants.

ethnics. Organisation membership: no membership. Dutch proficiency: do not speak Dutch or find it very difficult. Education in OC: no education. Education in NL: no education. The reference for each categorical variable is as follows. Contact composition during free time: more contact with co-ethnics. Contact composition at work: more contact with co-Ethnicity: Turks.

Table 5: Two Stage Least Squares Estimation of Dutch Language Ability on Earnings, Adult Foreign-Born Men Who Migrated before Age 40

	1st Stage	2nd Stage
Dependent Var.	Dutch language ability	Log(Earnings)
$\max(0, AAM - 5) * NDS$	-0.022***	
	(0.003)	
Dutch language ability (0-2)		0.459**
		(0.164)
Individuals	3530	3216
F-statistics	68.89	
Wald test		10.42
Weak instrument		Reject
Wu-Hausman test		Reject

^{***} *p* < 0.01, ** *p* < 0.05, * *p* < 0.1

Standard errors are in the parentheses.

Dutch language ability is measured in a scale of 0 to 2.

 $\max(0, AAM-5)*NDS$ is defined in the text. It measures age at migration for immigrants from Turkey and Morocco (minus five years) who immigrated at age five and older, and is zero for all other immigrants.

Source: 'Social Position and Use of Public Facilities by Immigrants' (SPVA), 1991, 1994, 1998, 2002.

Appendix

Table A1: The Definitions and Coding of the Variables in 'Social Position and Use of Public Facilities by Immigrants' (SPVA)

Variables	Questions asked in the survey and coding
Earnings	'What is your net monthly income from employment?'
	In year 2002, the currency changed from Dutch guilders
	to Euros. The exchange ratio 2.2:1 is used to unify
	the monetary unit across four waves.
Employed now	'Do you have a paid job at the moment?'
	0-No;
	1-Yes.
Occupations	'What kind of work are you doing at the moment?'
	The answers are coded either as International Standard
	Classification of Occupations (ISCO-88) or Standard
	Beroepenclassificatie 1992 (SBC 1992) in Dutch code.
Contract working hours	'How many hours do you work according to your employment
	contract?'
Education in OC	'What is the highest degree you have completed in your
	country of origin?'
	0-No degree;
	1-Degree in primary education (LO);
	2-Degree in secondary education (LBO/MAVO);
	3-Degree in intermediate education (MBO/HAVO/VWO);
	4-Degree in higher education (HBO/WO).
	This question was originally asked in the survey as the
	Continued on next page

Table A1 – continued from previous page

Variables	Questions asked in the survey and coding
	degree completed outside Netherlands. Since pre-migration
	human capital is not the main focus of this paper, we
	assume most of the schooling is completed in the country
	of origin.
Education in NL	'What is the highest degree you have completed in
	the Netherlands?'
	0-No degree;
	1-Degree in primary education (LO);
	2-Degree in secondary education (LBO/MAVO);
	3-Degree in intermediate education (MBO/HAVO/VWO);
	4-Degree in higher education (HBO/WO).
Work experience in OC	'How long have you been in paid work in total in
	country of origin?'
	This question was asked only in the 1991
	questionnaires. To supplement this variable in
	the other three waves, we regress reported 1991
	work experience in OC on individual background
	characteristics (gender, age, years since migration,
	total education, etc) and predict values for the other
	three waves.
Work experience in NL	'How long have you worked in total in the Netherlands?'
Dutch language	'When you are in a conversation, do you have any
proficiency	difficulty in using Dutch language?'
	0-Yes, very difficult/ do not speak Dutch at all;
	Continued on next page

Table A1 – continued from previous page

Variables	Questions asked in the survey and coding
	1-Yes, sometimes;
	2-No, never.
Contact composition	'In your spare time, do you have more contact with
during free time	Dutch people or do you have more contact with people
	from your own ethnic group?'
	1-More co-ethnic contact;
	2-Both equally;
	3-More contact with Dutch people.
Contact composition	'At work, do you have more contact with
at work	Dutch people or do you have more contact with people
	from your own ethnic group?'
	1-More co-ethnic contact;
	2-Both equally;
	3-More contact with Dutch people.
	This variable is not recorded in 2002. Similar with
	what has been done for work experience in OC, we use
	the regression technique to predict this variable in 2002.
Organisation membership	Q1: 'Are you a member of an association or club?'
	0-No;
	1-Yes.
	Q2: 'Are there many, few or almost no co-ethnic
	members of these associations?'
	0-Almost no;
	1-Few;
	Continued on next page

Table A1 – continued from previous page

Variables	Questions asked in the survey and coding
	2-Many.
Ethnicity	'What is your ethnic group?'
	1-Turks;
	2-Moroccans;
	3-Surinamese;
	4-Antilleans.
Municipality	Registered residence municipality
	1-Amsterdam; 2-Rotterdam; 3-Den Haag; 4-Utrecht;
	5-Eindhoven; 6-Enschede; 7-Almere; 8-Alphen aan den Rijn;
	9-Bergen op Zoom; 10-Hoogezand-Sappemeer; 11-Delft;
	12-Dordrecht; 13-Tiel.
	Leeuwarden, Spijkenisse, Zwijndrecht and Gornichem are
	recoded in SPVA 1991, but not in other waves. And hence
	we drop the observations in these municipalities.
Nationality	'What is your nationality?'
	1-Origin country's nationality;
	2-Dutch nationality;
	3-Both the origin country's and Dutch nationalities;
	4-Others.
	The answers are recoded to a dichotomous variable
	which equals 1 if the respondent reported having
	Dutch nationality, and 0 otherwise.
Married	'What is your marital status?'
	1-Married; 2-Divorced; 3-Widow/widower;
	Continued on next page

Table A1 – continued from previous page

Variables	Questions asked in the survey and coding
	4-Never been married.
Number of children	'How many children are there living at home?'
	'How many children are not living at home?'
	These two answers are summed up.
Years since migration	'What is your length of stay in the Netherlands?'
Migration motives	'You are not born in the Netherlands. What was the main
	reason for coming to the Netherlands?'
	1-Work; 2-Study; 3-Social safety;
	4-Political situation in origin country; 5-Family reunion;
	6-Marriage, family formation; 7-Come along with parents;
	8-Others.
	The answers are recoded to four main categories: work,
	study, family and other reasons.

Source: 'Social Position and Use of Public Facilities by Immigrants' (SPVA), 1991, 1994, 1998, 2002.

Table A2: Random Effects Logistic Estimation of Employment Using Panel Data, Adult Foreign-Born Men, All Sample Estimation, and Groups by Ethnicity, Education, Age At Migration and Migration Motives

	(1)	(2)	(3)	(4)	(5)	(9)	(2)	(8)	(6)
	All	T&M	S&A	No NL Edu.	NL Edu.	AAM>18	AAM≤18	Econ	Non-Econ
Constant	1.187	1.694*	1.892	1.400	2.737	1.420	0.836	0.724	0.917
	(0.745)	(0.908)	(2.754)	(0.858)	(2.227)	(0.903)	(1.729)	(1.164)	(1.100)
Social Contacts									
Free time: equal contact	0.126	0.107	-0.319	-0.011	0.549	0.004	0.306	-0.090	0.392
	(0.339)	(0.382)	(0.802)	(0.381)	(0.828)	(0.405)	(0.723)	(0.526)	(0.491)
Free time: more with Dutch	-0.019	-0.265	-0.100	0.200	-0.162	0.176	-1.019	-0.053	0.193
	(0.480)	(0.589)	(0.923)	(0.577)	(0.945)	(0.581)	(1.036)	(669.0)	(0.731)
Ethnic org. membership	0.063	0.226	-0.410	0.180	0.439	-0.203	0.571	0.319	-0.043
	(0.325)	(0.361)	(0.816)	(0.367)	(0.824)	(0.383)	(0.726)	(0.512)	(0.461)
Dutch org. membership	1.595***	1.664^{**}	1.245	2.300***	0.573	2.454^{***}	0.924	2.484**	1.224^*
	(0.545)	(0.669)	(0.933)	(0.799)	(0.778)	(0.893)	(0.837)	(0.998)	(0.715)
Human Capital									
Dutch: not very well	0.563^*	0.634**	-0.906	0.553*	0.276	0.743**	0.345	0.911^{**}	0.109
	(0.289)	(0.302)	(1.932)	(0.306)	(1.036)	(0.340)	(0.709)	(0.451)	(0.439)
Dutch: very well	1.119^{***}	1.024^{**}	-0.079	0.807*	1.424	0.865^*	2.136**	0.957	0.796
	(0.375)	(0.406)	(1.791)	(0.419)	(1.009)	(0.484)	(9.876)	(0.616)	(0.527)
S.D. of the Model									
σ	-2.241^{***}	-2.363^{***}	-1.322	-2.159***	0.947	-2.318***	-2.017**	2.633***	-2.029^{***}
	(0.412)	(0.458)	(1.315)	(0.478)	(2.338)	(0.510)	(1.010)	(0.718)	(0.725)
Log-likelihood	-431.286	-362.354	-61.823	-340.801	-60.437	-315.755	-97.889	-226.230	-191.787
Num. obs.	1368	894	474	951	343	266	344	727	641
*** 2 / 0 0 1 ** 2 / 0 1									

^{***} p < 0.01, ** p < 0.05, * p < 0.1Standard errors are in the parentheses.

The dependent variable is a dichotomous variable for being employed or not.

Column (1) 'All' is the estimation for the whole sample. Column (2) 'T&M' is the estimation for the Mediterranean group (Turks and Moroccans), and column (3) 'S&A' is the estimation for the Caribbean group (Surinamese and Antilleans). Column (4) 'No NL Edu.' is the estimation for immigrants who completed their education in the country of origin, and column (5) 'NL Edu.' is the estimation for immigrants who completed education in the Netherlands. Column (6) 'AAM>18' is the estimation for immigrants whose age at migration (AAM) is older than 18, and column (7) 'AAM≤18' is the estimation for immigrants whose age at migration (AAM) is younger than 18. Column (8) 'Econ' is the estimation for the economic migrants, and column (9) 'Non-Econ' is the estimation for the non-economic migrants.

The reference for each categorical variable is as follows. Contact composition during free time: more contact with co-ethnics. Organisation membership: no membership. Dutch proficiency: do not speak Dutch or find it very difficult.

 $[\]sigma$ is the estimated random effects' standard deviation. The null hypothesis is no random effect ($\sigma = 0$).

Other human capital variables not shown in the table include highest education level, working experience in the country of origin and working experience in the Netherlands. Other control variables not shown in the table include ethnicity, years since migration, marital status, number of children, and the ethnic concentration level.

The variance inflation factors for social contact variables and language proficiency variable are all smaller than 4, implying no multicollinearity problem. Source: 'Social Position and Use of Public Facilities by Immigrants' (SPVA), 1991, 1994, 1998, 2002.

Table A3: Fixed Effects Estimation of Panel Data on Occupational Status, Adult Foreign-Born Men: All Sample and Groups by Occupation

	(1)	(2)	(3)
	All	Blue-Collar	White-Collar
Constant	0.000	3.942***	-3.499***
	(0.397)	(0.625)	(0.443)
YSM	-1.179***	-1.384***	-0.695***
	(0.176)	(0.289)	(0.194)
Free time: equal contact	1.200	-3.379	4.280^{*}
	(2.051)	(3.103)	(2.373)
Free time: more with Dutch	1.861	-1.399	3.481
	(2.692)	(3.962)	(3.228)
At work: equal contact	6.501**	6.380	5.403
	(3.220)	(5.865)	(3.284)
At work: more with Dutch	6.580**	6.057	5.551
	(3.345)	(5.782)	(3.499)
Dutch visits sometimes	-3.111	-4.873	-2.217
	(2.107)	(3.488)	(2.300)
Dutch visits frequently	3.185	2.295	1.576
	(2.500)	(3.935)	(2.849)
Ethnic org. membership	5.490**	4.573	5.217^*
	(2.509)	(4.137)	(2.709)
Dutch org. membership	1.668	2.283	-0.015
	(2.294)	(3.254)	(2.838)
Dutch: not very well	2.187	4.280	1.154
	(2.487)	(4.416)	(2.577)
Dutch: very well	2.962	3.371	2.270
	(2.841)	(4.805)	(3.019)
\mathbb{R}^2	0.089	0.102	0.069
Adj. R ²	0.070	0.062	0.034
Num. obs.	655	303	352

^{***} *p* < 0.01, ** *p* < 0.05, * *p* < 0.1

Standard errors are in the parentheses.

The dependent variable is ISEI. The fixed effects estimator is obtained by within transformation. Column (1) is the estimation for the whole panel data sample. Column (2) is the estimation for immigrants who are blue-collar workers. Column (3) is the estimation for immigrants who are white-collar workers.

The reference for each categorical variable is as follows. Contact composition during free time: more contact with co-ethnics. Contact composition at work: more contact with co-ethnics. Organisation membership: no membership. Dutch proficiency: do not speak Dutch or find it very difficult.

The variance inflation factors for social contact variables and language proficiency variable are all smaller than 4, implying no multicollinearity problem.

Source: 'Social Position and Use of Public Facilities by Immigrants' (SPVA), 1991, 1994, 1998, 2002.

Table A4: Heckman Selection Model for Earnings, Employment, and Occupational Status, Adult Foreign-Born Men

	(1)	(2)	(3)
	Earnings	Employment	ISEI
Constant	4.884 (0.839)***	0.938 (0.152)***	24.227 (5.853)***
Social Contacts			
Free time: equal contact	-0.018(0.066)	0.030 (0.031)	1.722 (1.606)
Free time: more with Dutch	-0.061(0.078)	-0.024(0.041)	0.595 (2.091)
At work: equal contact	0.030 (0.077)		-0.768(2.754)
At work: more with Dutch	0.016 (0.074)		0.427 (2.162)
Ethnic org. membership	0.074 (0.063)	0.036 (0.031)	3.613 (1.684)**
Dutch org. membership	0.143 (0.062)**	0.010 (0.034)	2.561 (1.652)
Human Capital			
Dutch: not very well	0.037 (0.062)	0.079 (0.029)***	-0.760(1.607)
Dutch: very well	0.115 (0.076)	0.162 (0.037)***	2.393 (1.952)
Primary edu. in OC	$-0.024 \ (0.054)$	-0.012(0.026)	-2.822 (1.339)**
Lower edu. in OC	0.033 (0.067)	0.033 (0.036)	-0.418(1.692)
Intermed. edu. in OC	0.072 (0.075)	-0.011(0.037)	-0.512(1.847)
Higher edu. in OC	-0.142(0.120)	-0.029(0.060)	13.468 (2.919)***
Primary edu. in NL	-0.079(0.070)	0.006 (0.035)	1.759 (2.003)
Lower edu. in NL	0.018 (0.089)	0.080 (0.045)*	-3.201(2.903)
Intermed. edu. in NL	0.160 (0.113)	0.097 (0.055)*	4.164 (3.169)
Higher edu. in NL	-0.139(0.097)	0.191 (0.052)***	16.141 (2.962)***
Exp. in NL	0.004 (0.012)	0.035 (0.005)***	-0.133(0.288)
Exp. in OC	-0.014(0.019)	$-0.040(0.009)^{***}$	-0.737(0.493)
Exp. in NL squared/100	-0.019(0.037)	-0.024(0.016)	-0.398(0.862)
Exp. in OC squared/100	0.129 (0.139)	0.165 (0.068)**	5.378 (3.592)
Control Variables			
Moroccans	-0.005(0.071)	-0.014(0.031)	$-2.837(1.639)^*$
Surinamese	0.017 (0.096)	0.061 (0.045)	2.433 (2.301)
Antilleans	-0.010(0.091)	0.107 (0.048)**	4.388 (2.346)*
Dutch nationality	0.000 (0.052)	0.047 (0.025)*	-1.492(1.298)
YSM	-0.005(0.019)	-0.038 (0.008)***	0.264 (0.437)
YSM squared/100	0.023 (0.046)	0.024 (0.021)	0.106 (1.193)
Married	0.140 (0.063)**	0.056 (0.033)*	0.589 (1.536)
Number of children	0.014 (0.014)	0.001 (0.007)	0.481 (0.368)
Inflation factor	1.764 (0.825)**		
Contract working hours	0.014 (0.003)***		
Ethnic concentration	0.006 (0.016)	0.011 (0.009)	0.462 (0.459)
Selectivity Coefficient			
Inverse Mill's ratio	-0.094(0.361)	-0.232(0.172)	-1.212 (9.379)
R squared	0.070	0.250	0.400
Adj. R squared	0.050	0.240	0.380
Num. obs.	3155	4708	3490

^{***} p < 0.01, ** p < 0.05, * p < 0.1

Standard errors are in the parentheses.

The dependent variable of column (1) is the natural logarithm of earnings. Column (2) is estimated using a linear probability model. The dependent variable of column (3) is ISEI.

The reference for each categorical variable is as follows. Contact composition during free time: more contact with co-ethnics. Contact composition at work: more contact with co-ethnics. Organisation membership: no membership. Dutch proficiency: do not speak Dutch or find it very difficult. Education in OC: no education. Education in NL: no education. Ethnicity: Turks. The inflation factor is the Consumer Price Index (CPI) in year 1991, 1994, 1998 and 2002.

Year effect, municipality fixed effect and sector effect are controlled in the regressions.

For inverse Mill's ratio, the null hypothesis is that there is no selection bias.

Source: 'Social Position and Use of Public Facilities by Immigrants' (SPVA), 1991, 1994, 1998, 2002.