# **Educational Homogamy** How Much is Opportunities?

# Helena Skyt Nielsen Michael Svarer

#### ABSTRACT

Individuals match on length and type of education. We find that around half of the systematic sorting on education is explained by the tendency of individuals to marry someone who went to the same educational institution or to an institution near them. This may be due to low search frictions or selection of people with the same preferences into the same institutions. The residual half of the systematic sorting on education is a direct effect of partners' education, which is potentially explained by complementarities in household production in couples with same education.

## I. Introduction

The decision of who to marry is for many people one of the most important choices they make during their entire life. In addition, the sorting of marriage partners greatly influences a number of important economic outcomes such as income inequality (Aiyagari et al. 2000; Fernandez and Rogerson 2001; Fernandez et al. 2005); values, preferences, and skills of couples' children (Becker and Murphy 2000); marital stability and female labor supply (Dalmia and Lawrence 2001); and fertility (Boulier and Rosenzweig 1984). Taking a closer look at marital sorting patterns reveals that couples typically match positively on individuals' traits. This is, in

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particular, the case for age and level of education, but also for income, height, weight, I. Q., and parents' characteristics (see, for example, Epstein and Guttman 1984 and Schafer and Keith 1990). Next to age, education is the trait that has the highest bivariate correlation. In a recent study by Fernandez et al. (2005), the mean correlation is 0.6 based on information from household surveys from 34 countries. As education is an important determinant of most of the economic outcomes mentioned above, it is of great interest to investigate the origins behind educational homogamy. This is the purpose of this study.

A sizeable part of this literature uses cross-country and time-series variation in the correlation to describe the trends and patterns in the correlation while only hinting at some reasons for the strong relationship. It is recognized that educational homogamy may result from a preference for partners with similar education as well as from opportunities to meet partners with a similar education. These opportunities are driven by educational structures and institutions (see, for example, Mare 1991; Halpin and Chan 2003). The purpose of this study is to investigate how much of the systematic relationship between the educations of the partners is explained by opportunities and how much by preferences, while exploiting the fact that we know the geographical proximity of all partners and their educational institutions at the time when they enrolled at education. We document that around half of the systematic sorting goes through the tendency to marry people from the same educational institution or a nearby institution, and this means that up to half of the systematic sorting is a result of lower search frictions.

In relation to the opportunities explanation, educational institutions are presumably very efficient marriage markets. The density of potential partners is rather high (see, for example, Goldin 1992; Lewis and Oppenheimer 2000), and search frictions are therefore smaller than in other local marriage markets (see, for example, Gautier et al. 2005 for a model that analyzes the effect of search frictions on marriage market outcomes). That educational institutions function as marriage markets is also rooted in sociology. Scott (1965) and Blau and Duncan (1967) argue that parents place their children in good colleges in order to secure the social position of the family. There is also ample evidence that partnerships form in schools. Laumann et al. (1994) report-based on a U.S. survey conducted in 1992-that 23 percent of married couples met their current partner in school. In a Dutch survey from 1995, 15 percent reported having met their current partner in school (Kalmijn and Flap 2001). In fact, among the different sets of shared settings (neighborhood, family overlap, workplace, etc.) the most common place for couples to meet before a partnership is in school. In the present analysis, which is based on Danish register-based data, we find that in 20 percent of the couples the two partners attended the same educational institution.

It could also be the case that educational homogamy is the outcome of a decision problem solved by rational agents. That is, an individual with a similar level, and perhaps same type, of education might be preferred to an individual with a different level of education. In the following, we focus on two mechanisms for preferencebased partnership choice.

First, it might be the case that the mating of different educational groupings occurs as a result of rational behavior of risk-averse agents who seek to optimize discounted utility in an environment where future income is uncertain. A number of papers highlight the interdependence between risk sharing and marriage. In their seminal paper, Kotlikof and Spivak (1981) showed that the expected gain a risk-averse agent can expect from the risk sharing elements of marriage formation amounts to 10-20 percent of his wealth. Since then, Rosenzweig and Stark (1989), Micevska (2002), Chen, Chiang and Leung (2003), and Hess (2004), among others, have investigated related aspects of partnership formation and dissolution in association with the presence of idiosyncratic income risk. The idea is that risk-averse agents can benefit from forming marriage with others to insure against unforeseen changes in income. Along the lines of Hess (2004), a good economic match has a high mean income, a lowincome volatility, and an income process that negatively correlates with ones own income process, much like a financial asset portfolio. In the present analysis, we consider matching between individuals with different educations. The income variables are generated as time-series means for different educational groupings. As a consequence, the income processes are exogenous to the specific partnership, and we implicitly assume that the agents are able to predict the future income components for different educational groups.

Second, it could also be the case that the educational attainment of spouses is a complement in the household production function. Becker (1973) argues that positive assortative mating is optimal when traits are complements. According to this argument, a reason why two partners with the same education form a partnership is that they tend to appreciate the same public goods or the same kind of leisure. It is not obvious how to identify to what extent educational traits are complements in the household production function, although it is commonly assumed to be the case (see, for example, Chiappori et al. 2006). In the present analysis, we attribute the part of the realized partnership formation between individuals that cannot be explained by opportunities (that is, proximity of partners) or by portfolio choices to complementarities in household production.<sup>1</sup>

In this paper, we exploit a rich register data set to disentangle the correspondence between education and marriage market behavior. We have detailed information on individuals' educational attainment, including the exact type of education and where the education was taken. After combining with information on individual income, we investigate to which extent educational portfolios of couples are related to proximity of educational institutions, portfolio optimization, and residual explanations that encompass complementarities in household productions. From a more general perspective, the analysis allows us to evaluate whether the systematic relationship between the educations of the partners is explained by opportunities (low search frictions) or preferences (complementarities or portfolio optimization).

We find that around half of the systematic sorting on education is due to the tendency for people to marry someone who went to the same educational institution, or who studied near them. We cautiously interpret this as a sign of low search frictions in marriage markets of the educational institutions, although we are aware that there may also be selection of people with the same preferences into institutions. The income properties of the joint income process show no influence on partner selection,

<sup>1.</sup> There might be more mechanisms that imply systematic matching in education than the ones mentioned here. In the present analysis these will be considered to belong to the residual group and will somewhat crudely be labeled complementarities in household production.

and therefore the other half is attributed to residual explanations of which complementarities in household production are likely important.

The structure of the paper is as follows: In Section II, we describe the data set. In Section III, we take a closer look at partnership formation, and in Section IV, we conclude.

## II. Data

The data we use to test our hypotheses come from IDA (Integrated Database for Labour Market Research) created by Statistics Denmark. The information comes from various administrative registers that are merged in Statistics Denmark. The IDA sample used here contains (among other things) information on marriage market conditions for a randomly drawn subsample of all individuals born between January 1, 1955 and January 1, 1965. The individuals are followed from 1980 to 1995. The data set enables us to identify individual transitions between different states of the marriage market on an annual basis. In addition, we have information on a number of background characteristics for the individuals as well as for their partners. Information on marriage market status is based on a register that collects information on who is living in all housing units in Denmark. This implies that an individual is registered as either cohabiting or married if they have the same residential information as their partner. We are not able to identify relationships between individuals who do not live together.

Below, we describe in detail how the data is organized and present the most important statistics. First, we explain how we treat different educations. Second, we describe how income measures and distance measures are constructed.

#### A. Educational grouping

Throughout the paper, we assume that individuals first decide on where to pursue education after they have finished high school (typical graduation age is 18-19 years), and this is also when they start to search in the marriage market.<sup>2</sup> This assumption implies that educational grouping may be regarded as exogenous in the matching analyses. In order to comply with this assumption, we assign the first education an individual attends after high school to the individual for the rest of the sample period. Individuals who change education or drop out are assumed to belong to the educational group they were first assigned to. We impose this restriction to reduce the presence of endogeneity in choice of education. To the extent that individuals are already in a partnership when they start the education, the assumption would be violated, since the decision regarding education and educational institution might be coordinated with the partner's decision.

<sup>2.</sup> In the Danish educational system, secondary education consists of high school and vocational education. High school qualifies for college whereas vocational education qualifies for the labor market. For the present purpose, we select high school graduates, which constitute less than half of those attending secondary school for the cohorts of this study. Notice that the Barro-Lee Educational Attainment data set lump high school and vocational education together in order to make the figures comparable across countries, see Barro and Lee (2001) and appendices.

The available educational information gives a complete picture of an individual's educational history. Individuals are grouped according to the educational information. In order to focus on colleges as marriage markets and educational homogamy, we restrict attention to high school graduates. Although this implies a substantial reduction in sample size (see below), it enables us to give a very detailed description of partnership formation for individuals in partnerships where both partners have graduated from high school. Generally, the intention is to group individuals into educational groups by the first education they enrolled in after high school, as long as this is not an additional high school education.

All individuals for whom we have educational information are then divided into 13 educational groups,<sup>3</sup> which differ in level and subject of education. Table 1 gives an overview of the sample reduction. The representative gross sample consists of 26,048 individuals of which 6,946 completed at least high school. The individuals are defined as being in a couple when they start their first cohabitation or their first marriage, whatever comes first. In total, about 20,000 couples are formed. When all relevant individuals have been assigned to one of the educational groups, this results in 2,965 couples.

Now we go through the definition of educational groups in detail. The first group consists of those individuals who do not enroll in an education after high school. The remaining 12 groups then consist of individuals who enroll in one of the following educations: vocational education and training, short-cycle higher education, medium-cycle higher education, and long-cycle higher education. Individuals who enroll in vocational education and training are subdivided into two groups where one consists of the mercantile educations, such as sales assistants, and the other consists of both crafts, such as electricians or plumbers, and health or pedagogical educations, for example, orthopedists. The short-cycle higher educations are all grouped together and are subject-wise more diverse than the other groups. Examples of short-cycle higher educations are real estate agents and various forms of technicians.

Individuals who enroll in medium-cycle higher educations are subdivided into five groups. The first group consists of pedagogical educations, such as nursery teachers and social workers. The second group comprises school teachers at the basic and lower secondary level. The third group consists of educations that lead to jobs in the public health system, for example, nurses and physical therapists. The fourth group consists of educational subjects within the range of humanities and business, for example, journalists, librarians, and graduate diplomas in business administration. The final group comprises technical, veterinary, agricultural, and military educations, for example, engineers.

Finally, individuals who enroll in long-cycle higher educations are divided into four groups: the humanities, the natural and technical sciences, the social sciences, and the medical sciences. These are university educations. In Table 2, the distribution of males and females across educational groups are presented together with information on mean income levels.

<sup>3.</sup> The number of educational groups is restricted by the number of individuals in each group. We have tried to form groups that are as homogenous as possible while still having a sufficient number of observations to calculate the desired statistics. For a similar analysis, Hess (2004) divides individuals into ten occupational groups.

Table 1	
Sample	selection

	Number of observations
Sample of individuals born 1955–65	26,048
Who completed at least high school	6,946
Relationships formed between 1980–95	19,938
Where both partners completed high school	3,144
Relationships where information on institution and municipality of education is available for both partners	2,965

From Table 2, we see that women are overrepresented in educational groups that contain social and pedagogical and health care elements, whereas men are more inclined to take an education in natural sciences, technical, veterinary, and agricultural sciences, and social sciences. Table 2 also reveals that the mean level of income varies greatly across the 13 different age groups.

Table 3 reports the ratio of actual to expected frequency of a given educational combination to show the educational combinations of couples. The expected frequency is the number of couples in a given cell had the matching been random by education.<sup>4</sup> For instance, for couples in medical sciences (Combination 13-13, see Table 2), the expected frequency would be 8.58 (147\*173/2,965), whereas the actual frequency is 33 couples; this makes up a ratio of 3.85 (33/8.58). Ratios above one are highlighted, and they represent educational combinations that are more common than would be the case under random matching by education.

A pattern of positive assortative matching on education shows up. All couples with the same education (that is, at the diagonal) are systematically more common.<sup>5</sup> However, there are large differences between the tendency toward homogamous marriage. In Appendix A, Table A1, we show the ranking of couples by ratio. The top three couples are social and pedagogical couples, teacher couples, and medical science couples. The first ten places on the ranking are occupied by couples with the same educations. Among the couples that do not consist of people with similar educational attainment, the more popular are, as expected—female nurses who hook up with male medical doctors (Rank 19).

The empirical analysis that follows is going to shed more light on the reasons for positive assortative matching and other systematic matching patterns on education. The next two subsections present the variables needed to test whether partnership formation happens due to preferences or opportunities or both. First, we define

<sup>4.</sup> Note that the expected frequencies are calculated based on the numbers in Table 2 and not on the marginal distributions for all of Denmark.

<sup>5.</sup> Couples on the diagonal make up 22 percent of all couples, whereas couples with the same length of education amount to 43 percent of all couples in our sample.

		Men		Wome	n
	Mean length	Observations	Mean income	Observations	Mean income
Education group					
(1) No further education beyond high school	12	208	109,569	181	72,001
(2) Vocational—mercantile	14	206	99,736	262	67,444
(3) Vocational—health and crafts	14	152	83,148	136	56,562
(4) Short-cycle further education	14	142	93,435	280	72,629
Medium-cycle further					
education					
(5) Social and pedagogical	16	44	71,890	199	61,586
(6) School teacher	16	218	88,574	262	68,080
(7) Health care	16	39	80,629	440	69,499
(8) Humanities and social sciences	16	51	87,771	64	66,043
(9) Technical, veterinary and agricultural sciences	16	377	105,576	81	66,122
Long-cycle further education					
(10) Humanities	18	218	78,308	332	54,890
(11) Natural and technical sciences	18	590	97,111	250	61,806
(12) Social sciences	18	547	102,643	331	62,855
(13) Medical sciences	18	173	109,784	147	78,667
Total number of observations		2,965		2,965	

## Table 2

Summary statistics for Educational groups

Note: Mean length of education is measured in years and mean income is annual net income measured in 1980 DKK prices.

variables that describe the couples' income processes. Second, we present variables that measure the search costs for matching with a specific educational type.

## 1. Income measures

To assess whether a given portfolio of two educations fulfills the requirement of being a good economic match, we calculate a number of simple income measures based on the time-series variation in incomes between different educational groups. We base the income measures on income information for all individuals sampled over educational groupings instead of just using data from observed partnerships. The latter suffers from potential endogeneity bias (see, for example, Hess 2004). Along the

Ratio	s of actua	il to expec	ted freque	ncy									
			Ma	ales						Females			
	1	2	3	4	5	9	7	8	6	10	11	12	13
1	2.49	1.47	1.96	0.88	1.08	0.72	1.00	0.50	0.93	0.65	0.39	0.53	0.59
0	1.69	3.06	0.82	1.12	0.79	0.67	0.60	0.35	0.42	0.51	0.45	0.79	0.61
m	1.92	1.07	1.32	1.36	1.42	0.83	0.94	1.56	0.25	1.16	0.40	0.43	0.55
4	1.54	1.13	1.39	2.72	0.96	0.71	0.90	0.00	1.05	0.51	0.51	0.58	0.43
Ś	0.32	0.66	0.51	0.50	69.9	1.30	1.09	0.00	0.00	1.27	0.00	0.00	0.00
9	0.38	0.26	0.52	0.70	1.85	4.53	0.91	1.31	0.52	0.55	0.28	0.56	0.58
٢	0.00	0.49	1.73	0.28	0.00	0.88	2.98	1.22	0.97	0.72	0.63	1.44	0.00
×	0.55	0.38	0.44	0.43	2.13	0.23	2.28	2.80	0.74	1.28	0.96	0.74	0.00
6	0.83	1.34	0.93	0.93	0.80	0.74	1.30	0.74	3.61	0.79	0.82	0.65	0.76
10	0.63	0.17	1.02	0.55	0.98	1.04	0.68	2.37	0.17	2.69	1.00	1.02	1.14
11	0.49	0.64	0.98	1.06	0.60	0.77	0.90	0.88	1.14	1.03	2.32	1.04	1.26
12	0.96	0.74	0.93	0.93	0.81	0.72	0.80	1.20	0.27	1.12	0.91	2.06	1.02
13	0.24	0.44	0.26	0.82	0.71	0.33	1.73	1.10	0.65	0.91	1.20	0.97	3.85

Note: Bold indicates that the actual frequency is higher than the expected frequency.

lines of Hess (2004), we present three narrowly defined income measures: income correlation, relative volatilities, and mean difference to describe the income processes in relationships within different educational groupings. In addition, we summarize the characteristics of the income processes of two partners given educations by the standardized return.

To construct the income measures we use data for all years (1980-95) for all individuals with at least a high school degree. We base the income measures on residuals from two gender-specific Mincer wage regressions of log net income on experience and experience squared.<sup>6</sup>

Based on the residuals for men and women, we compute the correlation between partners' income residuals as a pooled time-series correlation. More specifically, for a man in educational group *i* and a woman in educational group *j*, the correlation is defined as the correlation over time between the mean income residuals of men in educational group *i* and women in educational group *j*. All income measures are per definition the same for any couple with the same educational combination. Similarly, the income gap is defined as  $|\overline{Y}_i - \overline{Y}_j|$  and the variance gap is defined as  $\max\left(\frac{\sigma_i}{\sigma_i}, \frac{\sigma_i}{\sigma_j}\right)$ , where  $\overline{Y}_i/\overline{Y}_j$  are the mean income residuals for groups *i* and *j*, and  $\sigma_i$ ,  $\sigma_i$  are the standard deviation of the mean income residuals for groups *i* and *j*.

The standardized return is computed as the sum of the mean residuals for a couple divided by the standard deviation on the sum of residuals. Due to the similarity with the return to a financial portfolio, we denote the standardized return the "Sharpe" ratio. That is, for a man in educational group i and a woman in educational group j, the Sharpe ratio is the sum of the mean income residual for groups i and j divided by the standard deviation of the sum of the two mean income residuals. This ratio measures the mean income residual per unit of variability, meaning that this measure indicates how good the partnership between two individuals is in terms of generating a certain income level.

In terms of defining a good portfolio of educations in marriage, individuals should seek to form partnership with individuals who have education that gives a high mean, low variance, and a negative correlation. Focusing on the summary measure, individuals should seek partners with a high Sharpe ratio. In Table 4, we report the estimated correlation and Sharpe ratios for the 13\*13 educational mating possibilities. Looking across the diagonal elements, we see positive correlations for 11 out of 13 educational groupings. Also, the Sharpe ratios are relatively modest (except for couples where both studied medical science after high school and couples where both have mercantile vocational training). This pattern tentatively suggests that finding a good economic match is not the main determinant for observed partnership formation.

#### 2. Distance Measures

To investigate how search costs affect marriage market behavior, we include a variety of distance measures between educational groups in the analysis. The basic

<sup>6.</sup> The results (not shown to save space) show that experience and experience squared explain around 30 percent of the variation in log-income and that the familiar pattern with a positive (negative) coefficient to experience (experience squared) emerges for both men and women.

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Correlation (top figure) and Sharpe ratios (bottom figure) for pairs of educational groups

			Ma	les						Females			
	-	2	3	4	5	9	7	8	6	10	11	12	13
-	0.851	0.740	0.683	0.679	0.344	-0.557	0.753	0.663	-0.515	-0.219	0.661	-0.767	-0.278
	0.126	0.430	-0.279	-0.107	0.158	-0.212	0.267	0.048	-0.302	-0.571	0.085	0.077	0.576
7	0.928	0.886	0.616	0.811	0.213	-0.230	0.834	0.708	-0.495	-0.169	0.784	-0.415	-0.304
	0.345	0.676	069	0.190	0.589	0.287	0.527	0.312	0.104	-0.009	0.391	0.584	1.181
Э	0.665	0.665	0.419	0.462	-0.028	-0.248	0.716	0.366	-0.461	-0.152	0.704	-0.130	-0.135
	-0.418	-0.181	-0.858	-0.937	-0.981	-1.281	-0.363	-0.649	-1.163	-2.151	-0.690	-1.030	-0.763
4	0.973	0.935	0.652	0.850	0.257	-0.351	0.882	0.756	-0.480	-0.095	0.742	-0.460	-0.214
	-0.084	0.159	-0.477	-0.370	-0.223	-0.629	0.008	-0.197	-0.672	-0.998	-0.209	-0.468	0.023
5	0.142	0.153	0.205	0.008	0.160	-0.005	0.250	0.298	-0.007	0.659	0.315	0.198	0.491
	-0.148	0.050	-0.462	-0.383	-0.214	-0.386	-0.070	-0.222	-0.426	-0.498	-0.223	-0.268	-0.074
9	0.267	0.265	0.001	0.147	0.276	0.461	0.155	0.282	0.161	-0.350	0.396	0.218	-0.562
	0.173	0.588	-0.366	-0.147	0.214	-0.135	0.382	0.068	-0.227	-0.853	0.119	0.047	1.021
٢	-0.135	-0.069	0.148	-0.070	-0.348	-0.079	0.048	-0.023	-0.103	0.733	-0.077	0.336	0.737
	-0.651	-0.439	-0.875	-0.923	-0.857	-0.929	-0.550	-0.739	-0.933	-0.971	-0.787	-0.717	-0.529
8	-0.328	-0.258	-0.491	-0.389	-0.024	0.316	-0.406	-0.081	0.637	0.491	-0.370	0.245	0.354
	-0.115	0.246	-0.741	-0.551	-0.200	-0.380	0.030	-0.233	-0.359	-0.670	-0.285	-0.259	0.030
6	-0.006	-0.022	-0.060	-0.006	0.212	0.754	-0.163	0.197	0.280	-0.029	0.225	0.414	-0.401
	0.160	0.577	-0.375	-0.164	0.160	-0.126	0.380	0.045	-0.219	-0.593	0.089	0.018	0.664
10	-0.277	-0.190	-0.530	-0.234	0.165	0.860	-0.428	-0.023	0.680	-0.087	-0.209	0.589	-0.296
	-0.315	0.042	-0.974	-0.839	-0.474	-0.542	-0.230	-0.454	-0.538	-1.348	-0.572	-0.458	-0.288
11	0.205	0.275	0.066	0.325	0.035	0.681	0.155	0.507	0.214	0.284	0.215	0.578	0.067
	0.167	0.575	-0.367	-0.150	0.221	-0.137	0.371	0.055	-0.232	-0.623	0.114	0.031	0.635
12	0.498	0.513	0.180	0.555	0.514	0.387	0.332	0.725	0.243	0.161	0.335	0.145	-0.205
	0.047	0.419	-0.467	-0.298	-0.001	-0.317	0.218	-0.069	-0.356	-0.960	-0.058	-0.145	0.475
13	0.259	0.452	-0.017	0.094	0.440	0.136	0.173	0.296	0.375	0.473	-0.139	0.130	0.031
	0.380	0.754	-0.147	0.175	0.507	0.169	0.622	0.310	0.012	-0.111	0.506	0.366	0.998

Note: Bold indicates that the actual frequency is higher than the expected frequency.

idea is that educations that are closer to each other, as measured by the physical distance between the institutions at which the particular education is started, should generate more intra-educational matching since it is cheaper to locate a suitable partner.

Two different measures of distance between the partners are used. The first measure is the density (*density*) of women in educational group j in the man's municipality of education in the year he enrolls in the education. The second is an indicator of whether or not the spouses have attained their education at the same educational institution (*same institution*).

In calculating the first distance measure, we use all educational information available, not only on the individuals in the 2,965 couples, but on all high school graduates in the sample. On the basis of this educational information, we determine the density as a measure of the concentration of different educational groups in the municipalities. It measures the density of individuals from a specific educational group in a specific municipality. For a man who has taken his education in municipality mand who enrolled in year t, and whose partner belongs to educational group i, the density is defined as the proportion of women in municipality m from educational group i in year t.

Descriptive statistics for the distance measures are presented in Table 5 for the partnership formation analysis. The distance measures are proxies for search cost of finding a partner with a given level of education since we do not know if a given partnership is formed because the couple met in school. It could also be the case that the reason we find substantial homogamy in terms of education is that people with similar types of education have the same workplaces after graduation. After school, the workplace is the most likely place to meet a marriage partner according to both Laumann et al. (1994) and Kalmijn and Flap (2001). We address the latter issue in the following section where we perform a multivariate analysis of partnership formation.

## **III. Empirical Analysis**

Below, we investigate how economic conditions and accessibility of partners are associated with partnership formation. The question we try to answer is: Do positive assortative matching in education persist when we control for proximity of partners and economic factors?

To answer this, we follow the empirical strategy of Dalmia and Lawrence (2001) and Jepsen and Jepsen (2002). They both use conditional logit models to compare actual couples with randomly created couples to see if actual couples are more similar or more different than the random pairings.

The empirical procedure works as follows: In the first step, the relevant explanatory variables are defined. In this application we include: age difference between partners, an indicator for whether they attend the same education, characteristics of the income residuals for the educational grouping of partners, distance measures between partners' educational institutions, an indicator variable for whether the partner attended the same educational institution, and a density measure of the partners' educational group in the local area. In the second step, the randomly created couples are generated. These are created by randomly assigning an individual from the pool

	n vanabie	s used in matering t	unai ysis	
	]	Real couples	Cons	tructed couples
	Mean	Standard deviation	Mean	Standard deviation
Correlation	0.7619	0.2301	0.7409	0.2484
Sharpe ratio	-0.0647	0.3923	-0.0474	0.3647
Age difference (years)	2.8169	2.5666	5.2152	3.9045
Income gap	0.0951	0.0704	0.0985	0.0743
Variance gap	0.4964	0.2414	0.5060	0.2527
Same institution	0.2037	0.4028	0.0331	0.1788
Density	0.1382	0.1711	0.0966	0.1259
Number of observation	18	2,965		2,965

#### Table 5

Descriptive statistics for variables used in matching analysis

of available partners to a given person (we do not construct same sex couples).<sup>7</sup> The final step is to predict the sign of the coefficients based on the level of positive or negative assortative matching. The conditional logit model is:

(1) 
$$P(Y_i = j) = \frac{e^{x_{ij}\beta}}{\sum e^{x_{ij}\beta}},$$

where *i* is an individual, *j* is an alternative, and  $x_{ij}$  is the vector of characteristics of the couple created by matching person *i* with an alternative *j*. Letting the dependent variable take the value one for a natural couple and 0 for an artificial couple, we expect to find a negative coefficient to the age difference, since positive assortative matching means that the age difference should be smaller for actual couples than for artificial couples. Likewise, if a couple is more likely to form if the partners attend the same educational institution, the coefficient to *same institution* should be positive. We assume in the following that the explanatory variables are exogenous to the partnership formation process.<sup>8</sup>

In Table 5, we present descriptive statistics for the information used in the matching analysis.

<sup>7.</sup> We only construct one artificial match for each couple. Jepsen and Jepsen (2002) also used 1, but state that sensitivity analysis where three artificial partners were constructed did not alter their results. In addition, McFadden (1973) shows that the conditional logit model produces consistent parameter estimates when a random subset of nonchosen alternatives is used.

<sup>8.</sup> Our empirical strategy has the advantage that it allows us to include a range of explanatory variables in the description of the matching pattern in the marriage market. The downside is that we basically treat a two-sided matching situation as one-sided. That is, the model we use characterizes the rational behavior of an agent that chooses between different options. In the marriage market context the preferred option has the possibility to reject. Preferably, the empirical model should compare the chosen partner to every possible partner available in the market. Since we have no data on all possible partners in the marriage market and no clear model of the value of marriage conditional on each possible choice, we choose to follow the outlined strategy, although we acknowledge that it simplifies the analysis and hence that the results we find must be interpreted accordingly.

The first columns show the mean and standard deviation for the explanatory variables for the 2,965 couples in the sample. Around 20 percent of the couples attended the same educational institution. This does not necessarily imply that they met at the time of education, but it strongly suggests that educational institutions do provide facilities for partnership search.<sup>9</sup>

Table 6 presents the results from the conditional logit model for partnership formation. In all specifications, we find that a lower age difference between two individuals is associated with a higher probability that they form a partnership. This pattern is as expected and in accordance with the marriage formation literature that finds strong positive assortative mating in age.

In the first specification, we add to the age difference an indicator for whether the partners have the same education. We find that when choosing among two otherwise identical partners, the probability of choosing the one with the same education as ones own is 29 percentage points higher. This conforms to the patterns of positive assortative matching on education, which we saw in the previous subsection and which is well known in the literature. The estimated marginal effect is unaffected by including income-related variables (Specifications 2 and 3). However, it is approximately halved when proximity of partners is controlled for in particular through the dummy variable for same institution (Specifications 4 to 6). Hence, roughly half of the educational sorting is a *direct effect* of the partners' education that is unrelated to educational institutions.

We interpret the half of educational sorting that is unrelated to educational institutions as potentially related to complementarities in household production. It may be viewed as a lower bound on the effect because one could imagine some complementarities in household production that are related to the educational institution (for example, preferences for the same sporting events, shared value systems, or identical preferences for certain pedagogical approaches) or the geographical areas around the educational institution (for example, family attachment or preferences for the local area). Using data from Denmark, we are confident that these examples are of minor importance. In contrast to the United States, sporting events and sports activities are not an integrated part of college life in Denmark, and they play no role whatsoever in the recruiting of students. Therefore, preferences for such activities do not flaw the interpretation as it would have done for the United States. Although traveling time between the major cities rarely exceeds three hours, the population is sometimes regarded as immobile. This could be a potential obstacle to our interpretation of "same institution" as an indication of low search frictions. However, statistics from, for example, University of Aarhus (Aarhus University 2000) reveals that less than half of the applicants came from the two neighbor counties, and only a quarter of the applicants report that geographical placement was important for their application to the university. We cautiously conclude that issues of complementarities in household production are of minor importance in the interpretation of the proximity variables.

If, however, the proximity variables reflect household complementarities as well as search costs, the inclusion of proximity indicators should be viewed as a selection correction for selection into same education assuming linear selection on

<sup>9.</sup> Unfortunately, our register-based data set does not allow identification of where the couples actually met.

## Table 6

			Specifi	cation		
	1	2	3	4	5	6
Age difference (years) -	-0.2480*	-0.2479*	-0.2487*	-0.2473*	-0.2426*	-0.2421*
C C	0.0113	0.0114	0.0114	0.0114	0.0117	0.0117
	-0.0526	-0.0526	-0.0577	-0.0585	-0.0547	-0.0555
Same educational group	1.2198*	1.2159*	1.1803*	1.0579*	0.6573*	0.5719*
6 1	0.0989	0.0992	0.1022	0.1051	0.1148	0.1172
	0.2856	0.2852	0.2857	0.2578	0.1518	0.1369
Income measures						
Correlation			0.4661*	0.3774*	0.1518	0.0866
			0.1899	0.1925	0.2001	0.2021
			0.1081	0.0892	0.0342	0.0198
Income gap			-0.0168	0.0706	-0.8231 -	-0.7152
			0.4787	0.4821	0.4997	0.5022
			-0.0039	0.0116	-0.1855	-0.1641
Variance gap			-0.1381	-0.1598	-0.0441	-0.0594
			0.1777	0.1785	0.1841	0.1847
			-0.0320	-0.0377	-0.0099	-0.0136
Sharpe		-0.0471				
		0.1124				
		0.0100				
Distance measures						
Density				1.3053*		1.0209*
				0.2389		0.2446
				0.3084		0.2342
Same institution					1.8467*	1.8026*
					0.1496	0.2446
					0.4312	0.4216
Number of couples			2,9	65		

Results for partnership formation analysis

Note: For each variable we present the estimated coefficients, the standard errors (in italics), and the marginal effects (in bold). \* indicates significance at (at least) the 5 percent level.

observables. In this case it would be inappropriate to interpret the coefficients to the proximity variables as indicative of search frictions. On the other hand, there may also be lower search frictions for partners with same education in other marriage markets, for instance, at the workplace since there is an increased probability of employment in the same company if the partners have the same education. We return to this situation in Table 7, where we present results for two different samples. One where we discard couples who had the same workplace prior to relationship start and one where we discard couples who attended the same high school.

In the second and third specifications (in Table 6), we include only income-related variables. The more correlated the income residuals for the educational groups are, the more likely is it that a match is made, which most likely indicates omitted variable bias. Also, the possibility of forming a partnership with a person with whom it is possible to construct a high yield return corrected for variability does not seem to drive partnership formation either. These findings could suggest that either individuals do not pay attention to these considerations when they form partnerships, or that they simply do not have sufficient information to judge whether a potential partner offers a good hedge and a high variance-corrected return. Alternatively, it may be a consequence of the generous welfare state that equalizes incomes over time and over individuals.<sup>10</sup>

In Specifications 4 to 6, we include variables capturing the proximity of partners. We find that the effect from income correlation becomes insignificant at conventional levels of significance.<sup>11</sup>

So the finding that individuals with higher positively correlated income processes are more likely to marry seems to follow from their closer proximity while undertaking education. This conjecture is consistent with the finding that the included proximity variables all have a significant influence on partnership formation and that the effects are working in the expected direction. That is, an individual is more likely to form partnership with a person who, after high school, attends the same educational institution (for example, the same university or the same business school). The marginal effect of the indicator variable is rather high, indicating that the probability for a match is raised by 43 percentage points if two persons share educational institution.<sup>12</sup> Also, we find that a higher density of partners with a given education is associated with an increased propensity that an individual forms partnership with a person with this educational attainment.

Table 7 presents results for three slightly adjusted samples as robustness checks. In the first set of columns we exclude couples who meet before college. In this specification, the effect of the income gap becomes significant. This may be interpreted as evidence that the marriages that are formed before college are more for "love," while for the later ones income play a more important role.<sup>13</sup> In the second set of columns we exclude couples that worked at the same workplace the year before marriage (about 5 percent of the couples), and we find that the marginal effect of same education is reduced from 26.6 to 8.5 percentage points when we include proximity variables. Hence, a small part of assortative matching on education is related to the fact that people with the same educations are more likely to share workplace than others. In the third set of columns we exclude couples that attended the same high school (about 20 percent of the couples), and we find that the marginal effect of same education is reduced from 28.3 to 12.3 percentage points when we include proximity

<sup>10.</sup> We also tried to include the difference in mean unemployment degrees in the partners' educational groups. This variable is not significant either, which is consistent with the generous welfare state hypothesis.

As a robustness check, we have computed the income variables based on the five-year periods following partnership formation (for example, for couples formed in 1981, we use 1981-86). This may be a better reflection of what couples expect at the time of marriage. This refinement leaves the results unchanged.
 Strictly speaking, they do not have to meet each other at the institution since there are no time limitations to when they enrolled and graduated.

<sup>13.</sup> This is consistent with the findings of Hess (2004) and Fernandez, Guner, and Knowles (2005).

Table 7Results for partnership formation	analysis, sensitiv	ity checks				
			Spe	cification		
			Only c	ouples who prior	to the relationship	) were:
	Exclude cc meet befo	uples who re college	not at the sar	ne workplace	not at the same	thigh school
Age difference (years)	-0.267* 0.014	-0.255* 0.014	-0.267* 0.012	-0.264* 0.012	-0.2183* 0.0121	-0.216* 0.012
Same educational group	- <b>0.050</b> 1.234* 0.105			-0.001 0.358* 0.125	-0.0465 1.1972* 0.1071	
Income measures correlation	0.286	<b>0.129</b> 0.227 0.222	0.266	<b>0.085</b> 0.447* 0.216	0.2854	<b>0.123</b> 0.165 0.220
Income gap		<b>0.049</b> -1.695* 0.561		<b>0.104</b> -0.520 0.525		<b>0.039</b> -0.544 0.538
Variance gap		-0.369 -0.321 0.209 -0.069		-0.121 -0.351 0.200 -0.082		-0.129 -0.150 0.205 -0.035
						(continued)

		Specification	
		Only couples who prior	to the relationship were:
	Exclude couples who meet before college	not at the same workplace	not at the same high school
Distance measures			
Density	$0.481^{*}$	0.917*	0.796*
,	0.253	0.254	0.2583
	0.104	0.213	0.1888
Same institution	1.925*	2.486*	2.0683*
	0.169	0.201	0.1819
	0.447	0.534	0.4657
Number of couples	2,392	2,804	2,390

 Table 7 (continued)

Note: For each variable, we present the estimated coefficients, the standard errors (in italics) and the marginal effect (in bold). \* indicates significance at (at least) the 5 percent level.

variables. The robustness checks in Table 7 indicate that workplaces and high schools also are marriage markets that promote matching of individuals with same education and thus are relevant for the analysis of how much of educational homogamy stems from opportunities to meet.<sup>14</sup> To sum up, even less educational homogamy is left unexplained (40 percent instead of 50 percent), when we deduct people who potentially met in high school or at their workplace.

An additional consideration is relevant in relation to the couples who attended the same high school. If they already started to date at this time and subsequently coordinated their choices of where to pursue further education, the distance measures might be endogenous to the partnership formation process (at least for those who continued the relationship after they started further education). If endogeneity were a major concern, we would expect that the coefficients to the distance variables were biased away from zero.

Compared to the results in Table 6, the density and same institution variables show a somewhat smaller effect in Table 7, but the change is very modest. Consequently, we do not think that the inclusion of individuals who attended the same high school is a major problem, and we rely on Table 6 for the main conclusion of this part of the paper.

As an additional robustness check, we have estimated the conditional logit model with indicator variables for educational cross-terms of couples.<sup>15</sup> First, we estimate the conditional logit model with 13\*13 cell indicators, and then we test down. This procedure leaves us with 17 indicators for education cells. As before, we find a clear positive assortative matching on education and, as before, we find that including income-related variables leaves the coefficients literally unaffected. When we control for proximity of partners, we see that more than half of the indicators referring to diagonal cells go down and become insignificant. This analysis allows us to name some couples who seem to appreciate the same public goods—that is, couples with a vocational mercantile education (2-2), couples with further education in the humanities (10-10), couples with further education in medical sciences (13-13), and nurses and medical doctors (7-13).

All in all, the partnership formation analysis suggests that search costs are indeed important for partnership formation and that individuals apparently search in marriage markets that are close to the place where they attend school. A main conclusion from this matching analysis is that we find a clear pattern of assortative matching on education, and half of that stems from low search costs for partners at the educational institutions. Another important conclusion is that we find no evidence suggesting that economic conditions are important.

## **IV. Concluding Remarks**

In this paper, we take a closer look at the observation that individuals tend to match on length and type of education. We investigate whether the systematic relationship between the educations of the partners is explained by opportunities, for

<sup>14.</sup> See, for example, Svarer (2007) for an analysis of workplaces as marriage markets.

<sup>15.</sup> To save space these results are not tabulated in the paper, please consult the working paper version for details, see Nielsen and Svarer (2006).

example, proximity to potential partners, or preferences, for example, complementarities in household production or portfolio optimization. We find that around half of the systematic sorting on education is related to the proximity of partners' educational institutions, whereas the income properties of the joint income process show no influence on partner selection. Thus, around half of the systematic sorting on education represents a residual which may potentially be attributed to complementarities in household production.

For future research it could be fruitful to develop a theoretical justification of the empirical results presented in this paper. Hess (2004) provides a model that is consistent with some of the findings we present, but it does not address the issue of proximity of partners which constitutes one of the main mechanisms for partnership formation. In addition, the current analysis would benefit from some exogenous variation in the sex ratios at the different educational institutions that would affect the probability of finding a suitable partner close by.

#### Table A1

The 20 educational combinations with the highest ratio of actual to expected frequency

Rank	Educational Group Females	Educational Group Males	Ratio
1	5	5	6 69
2	6	6	4 53
3	13	13	3.85
4	9	9	3.61
5	2	2	3.06
6	7	7	2.98
7	8	8	2.80
8	4	4	2.72
9	10	10	2.69
10	1	1	2.49
11	8	10	2.37
12	11	11	2.32
13	7	8	2.28
14	5	8	2.13
15	12	12	2.06
16	3	1	1.96
17	1	3	1.92
18	5	6	1.85
19	7	13	1.73
20	3	7	1.73

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