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Citation: Jafarey, S., Mainali, R. M. & Montes-Rojas, G. (2020). Age at Marriage, Social Norms and Female Education in Nepal. Review of Development Economics, 24(3), pp. 878-909. doi: 10.1111/rode.12692

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Age at Marriage, Social Norms and Female Education in Nepal Revision of RDE-2016-0011.R2

May 23, 2020

Abstract

We study the impact of age at marriage on female education. We hypothesise that in cultures where females marry young, parents' discount the pecuniary benefits of educating girls; the earlier the anticipated age at marriage the greater this discount. We empirically test this effect using household data from Nepal. We control for potential endogeneity of age at marriage by exploiting variations in cultural norms regarding dowry and differences in average age of female marriage among ethnicities and regions as instrumental variables. The econometric results support the hypothesis that female education is negatively affected by cultural norms that favour early marriage.

Keywords: Education, Marriage, Gender, Nepal.

JEL Classification: I20, J12, J16.

DATA AVAILABILITY STATEMENT: The data that support the findings of this study are available from the corresponding author on request.

1 Introduction

UN-sponsored millennium development goals (in particular, Sustainable Development Goal Five, SDG5, United Nations General Assembly, 2015) call on member countries to promote gender equality, an important dimension of which is related to education. While most countries have succeeded in narrowing the educational gender gap at primary and lower secondary levels, it continues to affect higher levels, particularly in South Asia. In this paper, we study the impact of age at marriage on female education, instrumenting the former via variations in cultural influences on female marriage age across ethnic groups in Nepal.

Demographers and ethnographers recognise that the age at which a typical male or female will marry is influenced by prevailing social norms.¹ Neugarten, Moore, and Lowe (1965) and Billari, Prskawetz, and Furnkranz (2003) argue that social norms directly determine the acceptable age range for individuals to enter marriage. The main hypothesis of this paper is that the earlier the culturally determined age at which a female is expected to marry, the less education she will receive, even in the years prior to her marriage. Our paper empirically tests this effect using data from a Nepalese survey that identified married females by the age at which they married, their educational attainment, and their ethnicity, along with other characteristics of their marital and parental households.

Nepal is a relevant country for studying this issue. It has a high incidence of child marriage (defined by the UNICEF as marriage before reaching age 18). As Table 1 shows, 40 percent of females in the age group 20-24 were married before 18, a rate that is second only to Bangladesh in South Asia. At the same time, Nepal's gender gap in education has been practically eliminated at primary level, greatly narrowed at lower secondary level but remains fairly high at upper secondary level, exceeding that of Bangladesh, India and Pakistan. This raises the question as to whether the phenomenon of early marriage, and the customs driving it, are undermining female education beyond the basic levels.²

¹See Wahhaj (2018) and Yount, Crandall, and Cheong (2018) for extensive literature reviews on this link. In particular, Wahhaj (2018) carries out a wide-ranging review of both economic and sociological explanations for early marriage and gender gaps in marriage age.

²It is also noteworthy that, at 82.8 percent, Nepal has one of the highest rates of female labour force participation anywhere. The corresponding figures for its neighbours are: Afghanistan (21.6 percent), Bangladesh (36.3 percent), Pakistan (21.9 percent), India (20.5 percent), although 20 years ago India was closer to where

Nepal has considerable variation in age at first marriage across ethnic groups and regions, a feature that we exploit in implementing an instrumental variable (IV) strategy. Our first instrument indicates membership of the Maithili-speaking community. Maithili is one of Nepal's three main languages; its speakers traditionally belong to a region called Mithila that straddles the Indo-Nepalese border, stretching from Northern Bihar in India to Jhanakpur in Southeastern Nepal. Maithili speakers inhabit both sides of the border.

Although Nepali Maithili speakers are not counted as a distinct ethnic group within Nepal, mainly because they are themselves divided into castes and religions, they share cultural traits with their neighbours in Bihar. One of these is the tradition of dowry. According to widespread popular perception, dowry-giving is more widely practiced by the Maithili community than by other communities of Nepal. Although less so in the case of Nepal, academic studies on India have identified Bihar, along with neighbouring Uttar Pradesh, as two states in which dowry is implemented more strictly than in other parts of India (Ashraf (1997), Srnivasan and Lee (2004), Dyson and Moore (1983)). The Maithili custom of *Tilak Pratha*, which links the value of the dowry to the grooms' economic status, encourages parents to marry their daughters young.

The impact of dowry traditions on age of marriage has been a matter of some discussion in the empirical literature, albeit in contexts outside Nepal. Ashraf, Bau, Nunn, and Voena (2020) study the impact of school construction policies in Indonesia and Zambia, and how the policy interacts with marriage customs. They find that girls' education only increased as a result of this policy in places where it is common for the brides' family to receive a payment when their daughter gets married (i.e., families only invest in their daughters' education if they can monetise it). Corno, Hildebrandt, and Voena (2020) look at the impact of weather shocks on child marriage in Africa and India, and find that the sign of the impacts depends on whether the prevalent marriage payments are dowry or bride price.

In Section 3.2, we justify the use of this instrument in greater detail, and in Section 2.2,

Bangladesh is now (see https://databank.worldbank.org (World Development Indicators 2019)). These figures suggest that Nepal's gender gap in upper secondary education is not necessarily related to norms that oppose female work outside the home.

we discuss other identification strategies implemented to study similar effects. However, we acknowledge the possibility of two sources of bias arising from this variable: first, that there is an inherent cultural bias in the Maithili community that disfavours female schooling on its own account; second, that the practice of dowry might influence girls' education because of income effects that might be especially significant for poor families.

We attempt to control for these potential biases by (i) including mother's education as a control for household attitudes to female education and (ii) rerunning our IV regressions using only the upper two quartiles of households in terms of wealth distribution. Our results remain robust to both checks. Nonetheless, we go on to employ a second instrument, namely the average age at marriage within a respondent's peer group, which we define as the ethnoregional group into which she was born and conduct the above robustness checks on this instrument as well. Our results continue to hold.

While the IV estimates have large confidence intervals, so that we cannot say that they are significantly different from the OLS estimates, they are in the majority of cases positive and significant. What we can infer is that the effect is between 0.2 and 0.5 years of schooling per one year increase in age-at-marriage.

The rest of the paper is organised as follows. Section 2 compares female education and age at marriage across the countries of South Asia and reviews the literature on gender gaps in education, female age at marriage and the interaction of the two. Section 3 explains the econometric model and discusses the identification assumptions. Section 4 describes the data and presents summary statistics. Section 5 reports the empirical results. The last section concludes.

2 Female education and early marriage in South Asia: Statistics and literature

In this section, we shall first provide some background details, based on recent statistics and information taken from secondary sources, concerning marriage age and school completion rates in Nepal and other South Asian countries. We shall then review the broader literature

on female schooling, age at marriage and their mutual relationship.

2.1 The South Asian background

We acknowledge that since the survey from which our data are taken, Nepal has made steady progress in both female educational attainment and the incidence of child marriage. Yet in Nepal and throughout South Asia, policymakers and academics remain concerned about both issues and believe that further progress needs to be made.

Table 1 provides an update on female education and age at marriage in five South Asian countries: Afghanistan, Bangladesh, India, Nepal and Pakistan. Columns 2-7 report school completion rates by gender for primary, lower secondary and upper secondary levels respectively; column 8 reports average age at first marriage for females and columns 9 and 10 report cumulative percentages of 20-24 year-old women who entered child marriage on or before two different age thresholds: 15 and 18. Note that these age thresholds roughly coincide with the ages of completion for lower secondary and upper secondary schooling levels, respectively.

Starting from similarly low levels in the early 1990s, India, Bangladesh and Nepal have forged ahead of Pakistan and Afghanistan in promoting female education and narrowing gender gaps in school completion. While India has the highest completion rates overall, Bangladesh has had the most success in reversing gender gaps; these now go the other way at primary and lower secondary levels. Nepal is somewhere in between these two countries in both dimensions.

At the same time, in all countries, females continue to lag behind males at the upper secondary level.³ This echoes the finding of Grant and Behrman (2010) that South Asia has lagged behind other parts of the developing world in eliminating gender inequality at

³Two caveats about the data. First, although the most recent in terms of availability, some of the data are from as early as 2011. It is likely that further progress has been made across the region. Second, the data on school completion in Table 1 were taken from from the UNICEF website. The World Bank WDI website tends to report higher completion rates. This is for two reasons. First, the UNICEF data are based on standardised DHS surveys that are conducted on a 5-year rotating basis across partner countries, while WDI uses a variety of sources, including administrative data, which can vary from one country to another in frequency and reliability. Second, the two measure completion rates differently: UNICEF measures it as the ratio of pupils completing a given level, whose age ranges from the normal age for completing that level to 5 years above that age, to the total population of children in that age range, while WDI defines it as the ratio of pupils entering the last year of the given stage, whose age is exactly at the normal age for that year of schooling, to the total population of children of the same age. These differences tend to make the WDI estimate higher than the UNICEF one.

post-primary levels.

Turning to age at marriage, Table 1 prima facie contradicts the widely hypothesised positive relationship between education and age at marriage. Pakistan, which lags substantially behind India, Nepal and Bangladesh in school attainment has the highest average age at female marriage and the lowest percentage of young women who married during childhood. Afghanistan, which has the widest gender gaps in education, has proportionately fewer child marriages than Nepal or Bangladesh. At the other end, Bangladesh, which has had the most success in furthering female education, remains the country with the highest incidence of child and early female marriage. Nepal comes next.

National level statistics, however, mask the diversity within each South Asian country, most of which have significant heterogeneity in ethnic, linguistic and religious composition, as well as in regional patterns of development. These differences are associated with considerable variation in issues related to gender equality along ethnic and regional lines. Sathar, Kiani, and Farooqui (1986) used labour force survey data from Pakistan, along with census figures for 1980, to study average age at first marriage for females, by province and rural/urban areas. They found considerable variation in this statistic, from 21.6 years in urban North West Frontier Province (now known as Khyber Pakhtunkhwa) to 17.6 in rural Baluchistan.⁴

In similar vein, Islam, Haque, and Hossain (2016) used the 2011 Demographic and Health Survey (DHS) for Bangladesh to study variations in the incidence of child marriage across its seven districts. Controlling for household wealth, spousal education, employment status, and religion, they found that child marriage was between two to four times more prevalent in the other six districts than in the district of Sylhet. They attributed these differences to two factors: poverty incidence and exposure to natural disasters. The poorest and most vulnerable district, Rangpur, had the highest propensity for female child marriage, while Sylhet's high rate of overseas emigration meant both that poverty rates were comparatively low and that income security was comparatively less dependent on climatic events. They also

⁴These figures represent Singulate Mean Age at Marriage, which includes never-married individuals in each age cohort. This normally results in a higher value of average age at marriage than would be the case if the sample included only ever-married individuals.

cite dowry traditions as one of the factors motivating female child marriage in the poorer districts: demands from the groom's family, which typically increase with the bride's age (also see Amin and Das (2014)), also become more salient under the pressure of poverty and insecurity.⁵

In the case of Nepal, two studies, Thapa (1989) and Aryal (2007), have used fertility surveys from 1976 and 2000 respectively to estimate ethnic variation in age at first marriage. Comparing their findings is complicated by the fact that they do not cover the same ethnic groups, partly because they differ in scope of regional coverage and partly because, with over 100 officially recognised groups, the ethnic map of Nepal is unusually complex: while some ethnic groups are further divided into different linguistic and religious sub-groups, others are so similar to each other that social scientists often lump them together. While both studies treat Gurung and Magar ethnicities as one, Thapa (1989) conflates Tharus with Satar and Mosar, while Aryal (2007) links them to Choudharys.⁶ In addition, many of the smaller ethnicities end up being lumped into a single category called 'Other', despite significant differences between them.

These differences notwithstanding, the two studies found remarkably consistent results. Using Brahmins as the reference group, they found that belonging to the Tharu ethnicity lowers marriage age, although for Aryal (2007), this result was insignificant. They both found that belonging to Newar and Gurung-Magar ethnicities delays marriage; similar effects were found by Aryal (2007) for the Kami-Damain ethnicity, and by Thapa (1989) for Kirate and Tamang.

Thapa (1989) explains the ethnic differences in his study by way of an ethnographic profile of each group. The picture he paints is one of highly diverse attitudes on issues related to youth, gender and sexuality. At one end, the high-caste Brahmins and Chhetris (Kshatriyas

⁵Amin and Das (2014), corroborate these interpretations: using district-level survey data on marriage practices, they found that Sylhet had the lowest incidence of dowry payment as well as the lowest rate of female child marriage for all age cohorts of ever-married females.

⁶The full list of differences between the two studies is as follows: the 1976 survey was based on a nationally representative sample, while the 2000 survey drew upon only two adjoining districts in Western Nepal; Thapa (1989) identified 10 groups: Brahmins; Chhetri-Thakuri, Newar, Muslim, Tharu-Satar-Mosar, Kirate, Gurung-Magar, Tamang and Other, while Aryal (2007) used seven: Brahmin, Chhetri, Gurung-Magar, Tharu-Choudhary, Kami-Damain, Newar; Aryal (2007) included age at menarche, while Thapa (1989) used detailed information on female employment.

in Sanskrit), along with Muslims, are socially conservative; Brahmins, in particular, consider it a source of punya ("merit") for girls to marry as young as possible in order to preserve their purity. At the other end, Tamangs and Kirates have fairly relaxed attitudes about the social mingling of boys and girls, even tolerating pre-marital sex, as well as divorce and female headed households. Gurungs, Magars and the indigenous Newars fall somewhere in between.⁷ Religion and race are also factors: while Brahmins and Chhetris are Indo-Aryan in origin and mainly practice Hinduism, Tamang, Kirate, Gurung etc. are Sino-Tibetan and are either Buddhist, or divided between Hindus and Buddhists or practicing syncretic forms of both religions. The exception in this account are the Tharu, who Thapa (1989) describes only in terms of their low socio-economic status, implying that early female marriage might be a response to poverty in their case.

2.2 Literature review

Since our goal is not to do a comprehensive analysis of either the gender gap in education or the determinants of marriage age, but to study the potential causal effect of the latter on the former, we shall concentrate on the literature that, to our understanding, helps shed light on this question.

Empirical studies on the gender gap in education can be divided into two strands. The first focuses on household characteristics, such as economic status and parental education, and how these influence gender preferences in schooling. In general these studies find that poverty, lack of social security, credit markets and low levels of parental education all contribute to gender biases in education (see, e.g., Jacoby and Skoufias, 1997; Cameron and Worswick, 2001; Sawada, 1997).

The second strand takes into account gender differences in labor market outcomes, especially with respect to returns to education (see, e.g., Rosenzweig and Schultz, 1982). This literature has produced mixed results on the pure returns to female education. While, e.g., Kingdom (1998) found on the basis of data from Uttar Pradesh in India that girls face

⁷Both authors, however, caution that the permissive traditions of ethnic groups such as Gurung are being eroded under the influence of the more dominant Chhetri-Brahmin culture, a process they call *Sanskritisation*.

lower economic rate of returns to education, Aslam (2009), Behrman and Deolalikar (1995), Asadullah (2006) found the opposite for, respectively, Pakistan, Indonesia and Bangladesh. Moreover, Munshi and Rosenzweig (2006) found that traditional caste restrictions on occupational mobility can restrict boys' occupational choices and therefore the quality of their education more than that of girls. Thus labor market outcomes do not present an unambiguous explanation for the gender gaps in female education in South Asian countries.

From a theoretical perspective, Lahiri and Self (2007) analyse the impact of patrilocal arrangements on female education. Patrilocality, which is especially widespread in South Asia, leads to the anticipation that a daughter's future earnings will accrue to her spousal, rather than her parental, household and this discourages investment in her education. Jafarey and Maiti (2015) argue that gender wage inequality leads directly to a discount on female schooling, and indirectly, via a marital division of labor in which females shoulder a disproportionate amount of responsibility for housework, to a further discount on girls' education. Child or early marriage also may operate by curtailing a girl's emotional and cognitive readiness to negotiate on her own behalf (Dixon-Mueller, 2008), including in family economic decisions and in market work after marriage.

Wahhaj (2018) endogenises age at marriage in an overlapping generations model with multi-period lived males and females. Multi-period lifespans provide females two periods over which to participate in the marriage market, while men participate in it only at the later of the two ages. Imperfect information about a prospective mate's "quality' can make men discount older women by raising the conditional probability that an older woman seeking marriage is of low quality. In equilibrium, older brides have to make dowry-like transfers to males. A higher proportion of females marrying young increases this conditional probability which in turn (i) increases the size of the transfer, (ii) incentivises the next cohort of females to also marry early, thus creating inter-generational persistence of early marriage. Increased outside options for females, such as through enhanced employment opportunities, can help dis-incentivise early marriage.

In their study of how early marriage contributes to a wider transmission of traditional

attitudes towards gender, Asadullah and Wahhaj (2019) outline a theoretical framework that determines age at marriage while accounting for its effect on female education, groom characteristics, the nature of the adult female's social network and her own social attitudes, both directly and through interaction with the other effects. The main theoretical implication is that early marriage can incline a female towards supporting traditional gender roles both directly, by plunging her into household responsibilities while still a girl, and, indirectly, by lowering her educational attainment, shaping the nature of her social peer group and making it more likely that she marries someone with traditional views.

We now turn to empirical literature. Following Becker's seminal work (Becker, 1973) an empirical literature developed in which marital decisions are treated as endogenous and their determinants studied. In recent years, this literature has turned increasingly to studying the interaction between marriage and female education. This is especially true in the context of South Asian countries, where parents consider a daughter's marriage to be one of the family's main milestones and start planning for it years in advance. Because of the potential two-way causality between age at marriage and female education, both the effect of age at marriage on female education and its reverse, the impact of education on postponing marriage, are important questions that have attracted attention in the literature. However, most papers concentrate on child marriage, *i.e.* marriage on or before the age of 18, while some, for reasons to do with identification strategy, concentrate on marriage soon after puberty. The present paper differs in asking how social norms regarding age at marriage affect female education, even after the age of majority.

Starting with the effect of education on age at marriage, Sathar, Kiani, and Farooqui (1986), Islam, Haque, and Hossain (2016), Thapa (1989), Aryal (2007) all found that higher levels of schooling were associated with higher age at marriage in Pakistan, Bangladesh and Nepal. These papers do not specifically study the causal impact of education on age at marriage. Among papers that do, Brien and Lillard (1994) used empirical evidence from Malaysia to study the role of education and enrolment in delaying marriage and first conception, and the role of marriage in delaying first conception and dropping out of school. They found that

changes in education and enrolment account for a substantial portion of the cohort trend toward later marriage in Malaysia. Mensch, Singh, and Casterline (2006) evaluate the effect of schooling on age at first marriage. Looking at evidence from 73 developing countries, they found that the expansion of schooling has led to a proportional increase in the age at first marriage for females but did not find a similar result for males.

Evidence from such studies has led many policymakers to support the provision of incentives for parents to increase their daughters' school attainment, as an important weapon in the fight against child marriage. Amin, Asadullah, Hossain, and Wahhaj (2017), however, challenge this in a recent policy brief. They point out that despite significant gains in increasing female schooling via targeted incentives, Bangladesh has not substantially reduced child marriage. An important observation is that incentives to educate girls work only to the point where they do not conflict with marriage prospects. If a suitably attractive proposal turns up, or soon after the girl completes secondary schooling, marriage takes over in determining her future life trajectory. Even in regions where conditional incentives have succeeded in raising age at marriage, such as Haryana state in India, it did not change the lack of agency that young girls have on marital choices. They advocate interventions that specifically target norms.

Investigating the reverse effect, of early marriage on education, is complicated by the possible endogeneity of age at marriage. This has been a major concern in the literature. Field and Ambrus (2008) look at the effect of early marriage on female schooling and other adult outcomes in Bangladesh, using menarche as an instrument for age at marriage. The age of menarche imposes a constraint on how early girls can be married. They find that early marriage significantly lowers female schooling and that each year's delay in marriage would increase female schooling by 0.22 years, an estimate that is within the same ballpark as the one we derive using our own IV strategy. Chari, Heath, Maertens, and Fatima (2017) studies the impact of child marriage on education and fertility in India, using the same instrument. They find that increasing the age at marriage by one year increases the number of years of education of the woman's children by 0.11 years.

Age at menarche has also been used as an instrument for age at marriage by Dhamija and Roychowdhury (2020) to study female labour market outcomes in India. The authors find that delaying marriage does not significantly affect labour market participation, hourly wages, annual earnings or hours of work, even though it increases education and reduces fertility, channels which one would normally associate with better labour market outcomes for women. Their explanation is that older and more educated brides face a backlash from their male partners which counteracts the positive stimulus to labour market participation from the channels normally associated with delayed marriage.

More recently, Asadullah and Wahhaj (2019) provide a detailed discussion of age at menarche as an IV. On the basis of medical literature, they point out that age at menarche can itself be affected by acute physical and psychological stress, which in turn could depend on environmental factors affecting a female's parental household. For this reason, in their first stage regression, they use sister fixed effects along with age at menarche to control for environmental triggers, and birth year fixed effects for transitory shocks to household income, that could accelerate menarche. The main focus of their second stage, however, is not schooling levels, but the reinforcement effect of early marriage on the girl's adherence to traditional gender norms.

Using a combination of attitudinal and living standard surveys from Bangladesh, they find strong evidence of this effect, and go on to study the possible channels through which it arises: less school attainment, access to narrower and more traditional social networks, marriage into more conservative households, and a direct reinforcement effect arising from shouldering marital responsibilities from an early age. One by one, they rule out all but the direct channel. They do find that postponing marriage by one year increases schooling by 0.422 years, which is twice the size of the effect reported by Field and Ambrus (2008) but when they use only a sub-sample of women who had no schooling, they find that the effect of marriage age on adherence to norms is no different. Asadullah and Wahhaj (2019) also raise the issue that measurement errors in reporting age at marriage can lead to biased estimates of the effect of age at marriage on education, thus motivating the need of using IV to solve

the bias.

While age at menarche is certainly an econometrically valid instrument, its external validity is restricted to societies in which prevailing norms favour marriage as soon as a girl reaches puberty. While this remains comparatively true of Bangladesh, it has become less true of other South Asian countries, including Nepal, save for a few ethnic groups. Indeed, even for Bangladesh, Asadullah and Wahhaj (2019) state that the possible reason for why their estimated effect of age at menarche on age at marriage is lower than that of Field and Ambrus (2008) is that age at menarche is less of a binding constraint on age at marriage now (in 2014) than it was 20 years earlier.

Another limitation of focusing on marriage soon after puberty is that while it directly hinders female schooling by imposing household duties at a young age, schooling levels at those ages have already increased substantially for females, at least for countries such as Nepal. The concern remains, however, with schooling at upper secondary and tertiary levels, which happens some years past puberty. In addition, we are also concerned with the indirect disincentive to female education that marriage exerts at any age, via its implications for the returns to schooling of married females. In other words, even if a female gets married after the normal age for a particular level of schooling, the sooner she plans to marry after reaching that age, the less likely that she will attain that level in the first place.

Dahl (2010) does predict age at marriage beyond the context of very early marriages using an IV that exploits variation in the legal minimum age at which individuals can marry across the different states of United States. However, this IV relies not just on variation in the law, but also on the ability of institutions to enforce these laws, something that many developing countries lack. In the case of Nepal, such regional variation in law does not exist in the first place. We therefore use variations in cultural norms across Nepal's rich variety of ethno-linguistic communities for similar purposes, as described below.

⁸Refer to Table 1, which is based on UNICEF data: in Bangladesh, 22 percent of females marry by age 15, while in Nepal, the corresponding percentage is 7 and even lower in India and Pakistan; however from Table 4 which we have calculated using our own, admittedly earlier, dataset we can see that, given the diversity of age at marriage across ethnic groups in Nepal, for some ethnicities the figure might still be quite high.

3 Econometric model and instrumental variables

In this section we shall first describe our econometric strategy and instruments, then we shall defend the choice of instruments.

3.1 Empirical strategy

The main hypothesis of this paper is that the earlier the age at marriage of a female the less education she receives. An ordinary least squares (OLS) estimate of the effect of age at marriage on education will be potentially biased for at least three reasons. The first reason is that, as already mentioned, reverse causality can certainly arise. Second, there may be measurement errors arising from recall bias, which applies to our case of retrospective information. Third, girls' schooling in Nepal is likely to be affected by remoteness, poverty, son preference, and learning environments at school not conducive for girls. Our dataset contains imperfect information about these issues. Thus, we consider an instrumental variables (IV) identification strategy.

The potential endogeneity of age at marriage can come from several sources, both economic and cultural. The first possibility arises from a girl's own unobserved ability to convert education into labor market productivity. A girl with low ability is not expected to earn much even as a single female and this discounts any pecuniary benefits from delaying her marriage. Second, there is the possibility that in traditional South Asian societies, parents are influenced by cultural norms that jointly favour early marriage and disfavour female schooling. Both of these possibilities could induce a positive relationship between the two variables.

Then there are possibilities of an opposite bias. A girl might have traits that both enhance her position within her natal household and make her more marriageable. Physical appearance, personality, social skills would be examples of such traits. These would lead to a reduction in the age at marriage along with a higher level of education. This is specially true if we consider that education is a good in itself.⁹ Another possibility is that a girl's

⁹The possibility that education is a consumption good in addition to an investment in human capital has its precedents in the education and health literature. See, for example, early attempts to empirically disentangle these two effects by Schaafsma (1976) and Lazear (1977). Cutler and Lleras-Muney (2006) summarize a large body of evidence that establishes a positive relationship between health and education, even after accounting

education increases the chances of marrying a groom of higher socio-economic status. These factors would generate the opposite effect from that of educational ability.

Moreover, as discussed in the literature review, there may be measurement errors in age at marriage (see Asadullah and Wahhaj (2019)); thus the effect may be biased for this reason as well. Finally, there are may be unobservables that affect both age at marriage and education that we may not be able to control for given data limitations, such as remoteness, poverty, son preference, and learning environment for girls.

Longitudinal data that span enough years could enable us to control for some of these biases, but are unfortunately not available; we only observe *ex post* and retrospective decisions regarding education and the age at marriage. For all these reasons, an attempt to establish causality between these two variables requires the use of IV identification strategy. We use two IVs, both of which reflect community norms to predict female age at marriage. In Section 3.2 we justify the validity of these instruments.

The first instrument is a dummy for membership of the Maithili community. Their particular dowry practice, known as *Tilak Pratha*, is effectively a groom price that increases with the educational qualification and social standing of the groom. The result of *Tilak Pratha* is that parents try to get their daughters married as soon as possible because older girls are more likely to match with more mature and well-educated boys, putting upward pressure on the amount of dowry. The second instrument is the average age of marriage for the respondent's reference peer group, which in turn is defined as the intersection of the ethnic and regional community into which the respondent was born. The assumption here is that peer group effects are important in determining an ideal age at which a female marries.

We use three different IV models: (1) IV1: a binary variable denoting membership of the Maithili-community, (2) IV2: average age of females within the ethnic-regional grouping to which the respondent belongs, and (3) Two IVs: both instruments are used together. In the first-stage of each regression, age at marriage is regressed on the appropriate IV (and other control variables), and in the second-stage, educational attainment is regressed on the

for the effects of education on income. Their argument is that education leads to better decision-making and information-seeking and thus helps individuals maintain good health.

predicted age at marriage and other control variables.

The two-stage regression model can be written as,

$$Educ_i = \beta_0 + \beta_1 Mage_i + \beta_2 X_i + u_i, \tag{1}$$

$$Mage_i = \delta_0 + \delta_1 Z_i + \delta_2 X_i + v_i, \tag{2}$$

where Educ is years of schooling and Mage is age at marriage associated with female i. X comprises a set of exogenous covariates, representing individual as well as household characteristics such as age dummies, mother's and father's education, urban dummy, ethnic dummies as well as regional dummies. These two set of dummies correspond to the woman's parental house. Z is the IV set (IV1, IV2 or Two IVs). u and v are the idiosyncratic error terms associated with female i.

3.2 Justification of the IVs

With respect to the first IV, as we have already pointed out in the Introduction, the Maithili dowry tradition does not appear to have attracted much academic attention on the Nepali side of the Maithili region. ¹⁰ This could be because Maithili speakers are not counted as a distinct ethnicity but as members of other ethnic groups. ¹¹ It has, however, been a focus of community activism in regions where the Maithili are present, and has attracted the attention of national media and Kathmandu-based NGOs, such as Fight Violence Against Women (FVAW) and RECPHEC, a public health NGO. ¹² At the international level, (UN-ESCAP, 2012) has stated: "The Maithili speaking people in the *Terai* have the highest rate of child marriage, with 95.6% girls getting married before the age of 16. The main

¹⁰Ashraf (1997), Srnivasan and Lee (2004), Dyson and Moore (1983), however, identify Bihar state in India, with which the Maithili community is culturally and linguistically related, as one of two states in which dowry-giving traditions are deeply rooted and cut across religious and caste lines. Empirical findings from India also suggest a positive correlation between the size of the dowry and the socio-economic standing of the prospective husband (Jejeebhoy and Halli, 2006).

¹¹In our dataset, Maithili speakers are themselves classified as Brahmin, Muslim, Tharu, Yadav, *etc.* (see Table 6); the reason we can identify them is because of a unique question which asked respondents to identify their native language.

¹²On its website, http://fightvaw.org/news/view/519, FVAW highlights a demonstration held in June 2014 in Rajbiraj, a town in Satpari District, by Maithili women, in protest against the high incidence of child marriages in their community, and the dowry culture which they blamed for this evil. The protesters were demanding implementation of a law passed in 1976 outlawing *Tilak Pratha*.

reason behind this is the widely prevalent dowry system." The report goes on to link *Tilak*Pratha with early marriage: "a younger girl, on the other hand, can get a groom who will be comparatively younger and less qualified, thus demanding less Tilak money."

Our own data show that 63% of Maithili girls were married by the age of 16, compared with 41% of non-Maithali girls (see Table 5). These differences are significant at the 1% level, and provide *prime facie* evidence that *Tilak Pratha* influences marital behavior in Nepal within the Maithali community. Empirical evidence from our survey on household expenditures (see Table 2) show that in fact the dowry and wedding expenses represent a higher burden on the Maithili households than in non-Maithili (as a proportion of land holding value and household income).

While we are not aware of any evidence, whether anecdotal or academic, that Maithilis are against female education in its own right, from the point of statistical inference we cannot rule out the possibility that this is the case. In addition, the Maithili instrument could suffer from an additional bias, *i.e.* Maithilis marry their daughters young because of the income effects of large dowries. By contrast, Dalmia and Lawrence (2005) argue that dowry size is a function of differences in individual and household characteristics between grooms and brides. This suggests that the lower the gap in such characteristics, the smaller will be the dowry payment. This would actually encourage investment in daughters' education.

These possibilities have received some attention in the empirical literature and the results are mixed. Employing household survey data from the Indian states of Uttar Pradesh and Karnataka, Dalmia and Lawrence (2005) found that, contrary to their own argument, brides' human capital was positively correlated with the amount of dowry. The authors themselves pointed to two types of possible confounding biases in their data. First, in a polygamous marriage market, a relatively large number of women might have been competing for a limited number of eligible men, and both the educational level of women and the dowry might have reflected this asymmetry between men and women. Second, both variables might have been positively correlated with household wealth. In equilibrium, educated women might marry educated men, and thus have to pay a higher dowry because the price for marrying a educated

man is high.

Another study, by Anderson (2007), estimated the effects of brides' education on dowry payments (parental characteristics and distance to school were used as IVs in the education regression). Employing data from Pakistan this study found a positive relationship between the brides' education and dowry size. However, when the average level of education in the region was controlled for, the estimated coefficient on bride's education became statistically insignificant.

A different finding was reported by Amin and Das (2014) in the case of Bangladesh. Using a detailed, nationally representative, dataset on gender norms and marital practices, they studied differences in age at first marriage and dowry payments across different cohorts of ever married females. They find that both age at marriage and the incidence and amount of dowry payments are higher for 'young' married females than they were for their 'old' counterparts, implying that progress in raising marriage age has not necessarily led to a weakening of dowry traditions; if anything they have been strengthened. Within each age cohort, however, an increase in age at first marriage by a few years led to an increase in the amount of dowry, with the increase steeper for the younger cohort than the older one. The implications are that dowry culture traditionally penalises delayed marriage in Bangladesh, in line with the prediction of Wahhaj (2018). They also find, unlike Dalmia and Lawrence (2005) and Anderson (2007), that both the likelihood of dowry payment and that of marrying before 15 are negatively related to the bride having at least secondary education. These studies suggest that dowry size might not directly discourage female schooling.

In light of this and the possibility of a Maithili-specific bias against female education, we employ our second instrument, namely the average marriage age for the respondent's ethnoregional peer group. Our use of this instrument is based on a long-standing literature in demography and sociology that investigates the existence of socio-cultural norms regarding an ideal age at marriage. While sociologists such as Settersten and Hagestad (1996) and Neugarten, Moore, and Lowe (1965) were interested in the broader issue of age norms for various "life-course" transitions, demographers are specifically interested in age at marriage

and the length of the reproductive cycle in women (see Billari, Prskawetz, and Furnkranz, 2003). Both Neugarten, Moore, and Lowe (1965) and Billari, Prskawetz, and Furnkranz (2003) cite survey evidence on popular perceptions regarding ideal ages and/or age limits for marriage, the latter from 1960's USA and the former from 1990's Italy.¹³

Theoretical justification for this assumption also comes from Wahhaj (2018): the more females who marry younger, the greater the negative externality affecting older women on the marriage market. Our argument is that in countries like Nepal, marriage markets would be localised; so age at marriage norms would vary by a combination of ethnicity and location, for which our best proxy is the female's birth region.

We now consider whether our second instrument could be contaminated by correlation between community norms regarding age at marriage and those regarding female education. While we cannot conclusively prove that such correlation does not exist, we offer two arguments in defence of its independence.

First, even in the Pakistani province of Khyber-Pakhtunkhwa (K-P), which is considered the most socially conservative and outwardly biased against female education, survey evidence suggests that parents are generally supportive of girls going to school. Cyan, Rider, Price, and Roberts (2019) conducted an attitudinal survey of 694 rural households who had at least one high school age daughter, either attending or having attended at least some school. The survey was conducted in the Dir region, which was chosen because it is considered one of the most conservative even by K-P standards, and was one of the areas targeted by the Pakistani Taliban during their insurgency. They found overwhelming agreement (89 percent) with the principle of girls receiving more than primary schooling and 90 percent in the case

¹³According to the data cited by Billari, Prskawetz, and Furnkranz (2003), older women perceived age limits for marriage more frequently than younger ones and all age groups believed more strongly in a minimum age than a maximum. For example, 11% of women born between 1945-1947 believed in an upper age limit but only 5% of women born in 1973 did so. These are results from modern Europe. Casual evidence suggests that such culturally influenced age limits are far stronger in traditional South Asian ones than in modern European ones. Unfortunately we are not aware of similar survey evidence from Asia but even in the 1960s survey data from the USA, Neugarten, Moore, and Lowe (1965) reported that 80% of male and 90% of female respondents believed that men should marry between the ages of 20-25 and 85% of male and 90% of women set the analogous age range for women between 19-24.

¹⁴The sample of households was drawn using registry records of current and former pupils at local schools so it was inevitable that all households had at least one daughter with positive schooling. The authors acknowledge the bias that this creates but attempt to control for it by asking respondents about the overall attitudes of their fellow villagers and comparing the responses for consistency.

of their own daughter's schooling.

At the same time, the authors found evidence that gender differences did appear both in how a guardian's gender determined how much they value girls' education and how guardians prioritised girls' education relative to that of boys. Female guardians were 50 percent more likely than male ones to 'strongly support' female education as opposed to merely 'support'. In addition, one of the most widely cited reasons given, especially by female guardians, for a girl to not go to school was that she was 'needed at home". This suggests a bias in favour of traditional gender roles, even though 93 percent of the respondents disagreed with the assertion that education was important only for males. The authors attribute this inconsistency to a lack of family resources rather than a pro-son bias; however given the literature on gender differences in education cited earlier, pro-son bias cannot be ruled out, even if it is induced not by innate preference but by economic necessity.

The issue of son preference is explicitly studied by Hatlebakk (2017). Using a bespoke survey of rural households in southeast Nepal, the author studies how birth order affects the total number of births in the family, the education provided to surviving children and other economic outcomes. One of the main findings is that a first born girl leads to a larger number of children born (from a median of 3 children if the first born is male to 4 if she is female), while having a first born sister leads to more education for younger brothers (by 1.2 years). There is no direct effect from number of children to schooling. These effects are interpreted as indicative of son preference, the first of a desire to have at least two sons and the second as enabling a boy to focus exclusively on education.

The context of son preference in Hatlebakk (2017) is similar to the one hinted at in Cyan, Rider, Price, and Roberts (2019) and also to the first strand of literature, reviewed earlier in Section 2, that explained anti-female bias in resource allocation among poor, rural households: boys represent a better investment in economic security than girls. Such a bias need not itself be deeply rooted in cultural norms, and could decline with economic advancement and better schooling opportunities. As we have seen in the literature on age at marriage, cultural norms around marriage are more deep rooted and do not fade with economic betterment (Amin,

Asadullah, Hossain, and Wahhaj, 2017). In our own study, we have attempted to control for biases induced by poverty by considering a sub-sample of the wealthier half of households in terms of wealth; our results continue to hold.

At the same time, one reason why son preference might be more deep rooted is patrilineality. den Boer and Hudson (2017) compare evidence from South Korea and Vietnam, both countries with strong patrilineal traditions, that the sex ratio at birth can *increase* with economic and educational betterment. Nonetheless, after an upward trend through the 1980s and 1990s, South Korea managed to bring the sex ratio down over the last two decades; in Vietnam the data show an increasing trend, notwithstanding its own impressive economic growth. Through an analysis of the factors that contributed to South Korea's success, the authors argue for a multi-pronged approach, combining economic safety nets for the elderly with legislation and community-based action. The question arises why certain social norms do not fade away as their economic necessity wanes.

In a widely cited paper, Elster (1989) argues that for norms to be *social*, they must be shared by others and sustained by their collective approval or disapproval, as well as feelings of individual shame in the case of those who violate them and pride for those who uphold them even when there are no witnesses to the event. It is this combination of community-and self-policing that explains why they persist even if there is no material basis for their existence. Patrilineality could be one such norm, along with other marital customs such as dowry and child marriage, essentially because they involve arrangements that are highly visible to everyone in the community.

Patrilineality is certainly widespread across South Asia. In the case of Nepal, a qualitative survey by Brunson (2010) found that as fertility rates decline, young females report an even stronger preference for sons, despite acknowledging that the economic value of daughters has been increasing over time. The main reason stated for this preference was that since daughters will become part of their spousal households, parents without a son will lose financial and moral support in old age. The author concludes that it is such insecurity, rather than religious or ideological conviction, that underlies son preference.

It is not apparent, however, whether patrilineality plays a role in lowering female age at marriage. Indeed one might expect that, at least households without any sons would actually be motivated to delay marrying off a daughter, in order to benefit from her contribution to household income for at least some part of her adult life. Moreover, in order to invalidate at least the Maithili instrument, the effect of patrilineality would have to be of a different magnitude in their culture than in others. Unfortunately, we do not have the means to test either of these hypotheses.

This takes us to our second justification for the second instrument: even if there are cultural norms that lead to both a bias against female schooling and a bias in favour of girls marrying early, these norms are more likely to be based on the values and attitudes of the broader ethnic group to which the female belongs, than on localised peer-group effects. In using the average age-at-marriage for each respondent's peer group, we are capturing variations arising from peer-group effects, which are unlikely to be driven by a broader dislike for female education amongst the respondent's wider ethnic community. See the Online Appendix for the six ethnicities and six regions used in the paper, for which the IV correspond to the average taken over the interaction of the two classifications.

A final argument that that our IVs do not directly affect female education is that in all specifications, mother's education is included as a direct control. The idea is that any inherent cultural bias against female education will already be captured by a mother's education, when the latter is included along with other household characteristics that determine the girl's education. This is particularly true in South Asia where marriage is typically endogamous, so that mother's education would be closely correlated with cultural attitudes towards female education on both sides of the marriage equation. Indeed, our results show that mother's education is only significant for the education regression and not the age at marriage one, which implies that while there are norms affecting female education these are not directly correlated with age at marriage.

Our identification approach is different from Field and Ambrus (2008) and Asadullah and Wahhaj (2019) who use age of menarche. First, as discussed in the Introduction, child

marriage is less prevalent in Nepal so menarche is likely to pose less of a constraint. Second, we are mostly concerned with the anticipatory effect of age at marriage on a girl's education, rather than the direct disruption that would arise if a school-age girl gets married and has to start attending to spousal duties. Finally, age of menarche is not available in our dataset. It should be noted that our proposed approach of considering community norms that are specifically correlated with age-at-marriage allows estimating the effect of interest in more general set-ups than when age of menarche is used.

4 Data

This paper employs data from the 2003 National Living Standard Survey of Nepal, carried out by its Central Bureau of Statistics with the technical support of the World Bank and UK Department of International Development. The survey follows the World Bank's Living Standard Measurement Survey Strategy and applies a two-step stratified sampling scheme. It took place over 269 Primary Sampling Units, covering 73 out of a total of 75 districts in Nepal and comprises information related to demography, education and literacy, health and maternity, and other information at the household and individual levels. The data cover the five administrative regions of Nepal: Eastern, Central, Western, Mid-Western and Far-Western, and an additional category of Abroad for those who were not residing in Nepal at the time of the survey (they were mostly in India).

The survey has a total of 5240 households and 28110 individuals. This is a unique survey where we can identify the Maithili community from a specific question on language. We restrict the sample to ever-married females (still married, divorced, separated or widowed), which results in 5028 females. This may lead to potential sample selection bias since unmarried females would be systematically excluded. Table 3 reports females' marital status for different age groups. The table shows that the likelihood of marriage increases monotonically until the age of 30 years, after which less than 2.5% females remain unmarried. We thus consider two sub-samples, Sample2549 (3760 observations) and Sample3049 (2818 observations), representing married women in the age ranges of 25-49 and 30-49 respectively,

in order to minimise this potential selection bias. The upper limit of 49 is imposed to exclude potential selection bias because of respondent mortality.

The survey contains two types of educational information on individuals: (1) the highest level of completed schooling, and (2) a categorical question about whether the individual (i) never attended school, (ii) attended in the past and (iii) is currently attending school. Only 28% (from the Sample2549 sub-sample) answered question (1). For those respondents who did not answer question (1) but answered question (2-i), we imputed their educational level as zero. This increased the sample size considerably from 1079 to 3760 for Sample2549 and from 684 to 2818 for Sample3049. We define the measure of educational achievement derived from question (1) as Educ1, and the measure derived by including the imputed values for those who answered question (2-i), as Educ2. See Table 7 for the summary statistics in our sample.

The average school attainment for married women was 7.51 years using Educ1 and fell dramatically to 2.16 years when Educ2 is used. Geographically the distribution of married women was 22%, 34%, 25%, 7%, 4% and 8% from the Eastern, Central, Western, Midwestern, Far-western regions and Abroad, respectively, and 80% live in rural areas. They belong to fourteen different ethnicities. ¹⁵

Table 4 presents average years of education, average age at first marriage and incidence of very early (≤ 15 years old) marriage by ethnicity for women aged 25-49 in our dataset; education figures are presented for both Educ1 and Educ2.¹⁶ For each group, average years of education fall considerably once females who reported never attending school are included.

Looking across ethnicities, females belonging to Brahmin, Chhetri, Newar and Gurung have the highest educational attainment, while Tharu, Kami, Muslim, Yadav and Sarki have the lowest, especially when women with no schooling are factored in. In the case of Brahmins and Chhetris, age at marriage is relatively low (approximately 17.5 years) and the proportion of very early marriages relatively high (approximately 25 percent). This could be the result

¹⁵Brahmin, Chhetri, Newar, Magar, Tharu, Tamang, Kami, Yadav, Muslim, Rai, Gurung, Limbu, Sarki, and Other.

 $^{^{16}}$ Only one of 46 females of the Sarki ethnic group reported having attended school so we have excluded this group from Educ1 for the purposes of this table.

of their high socio-economic status combined with their conservative outook, as outlined by Thapa (1989). Gurungs and Newars have some of the highest ages at marriage and lowest incidences of very early marriage, again in line with Thapa (1989). The contradictions to his account appear in the case of Tamangs and Magars, who have considerable proportions of girls in very early marriage. The interesting case if that of Limbu, where low school attainment coexists with a low incidence of very early marriage. This could be because of the fact that Limbus are a sub-group of the Kirate group that Thapa (1989) cited for their eclectic religious traditions and comparatively relaxed cultural norms.

Table 5 presents more granular information on the distributions of marriage age and education for Sample2549 and Sample3049 respectively. The upper part of Table 5 shows the distribution of marriage age: across Sample2549, 45% were married at or before the age of 16 years, another 39% were married between 17 and 20, while only 2% got married after the age of 27 years. There is also a considerably lower age at marriage within the Maithili community as compared to the non-Maithili communities. The lower part of Table 5 reports the educational background of married females. The majority of married women, 71%, do not appear to have any formal schooling. Of the remainder, only 10% attained primary school, 4% secondary school, 7% high school and 8% received higher education.

5 Results

Table 8 presents the first-stage (i.e. eq. (2)) and Table 9 second-stage (i.e. eq. (1)) baseline regressions, for the Sample2549 and Sample3049 sub-samples, respectively. White robust standard errors are reported. Regional and ethnicity dummy variables are included but their coefficients are not reported. Education is measured, as explained in Section 4, by both Educ1 and Educ2. In the discussions below, the results following from each of these two different measures are analogously identified as the Educ1 and Educ2 samples, respectively. In order to save space, coefficients are not reported for all the explanatory variables that were used in the regressions, but they are available upon request.

The first column in Table 9 shows the OLS coefficients. Taken at face value, they imply

that increasing age at marriage by one year is likely to increase females' educational level by 0.314 years using Educ1 and 0.195 years using Educ2 for the sample of 25-49 years-old, and 0.270 years using Educ1 and 0.162 years using Educ2 for the sample of 30-49 years-old.

We next consider the IV estimates. In IV1, membership to the Maithili community has the expected negative and significant relationship with age at marriage (see Table 8). The estimated coefficient for the Educ1 sample is -1.72 for 25-49 years old, and -1.64 for 30-49 years old (see Table 9). Analogous coefficients of -0.89 and -1.14 are estimated for the Educ2 sample, for 25-49 and 30-49 years old, respectively. The first-stage IV2 model shows positive and statistically significant coefficients for Avmage. When both IV are used together the Maithili coefficients are slightly reduced but retain their statistical significance. The calculated F-statistics (reported in Table 9) are no less than 10 for the largest 25-49 years old sample indicating strong joint significance of the estimated coefficients, but this statistic falls in magnitude when the smaller sub-sample of 30-49 years old is used. In the Two IV model, the p-values for the Sargan over-identifying restriction test (reported in Table 9) cannot reject the null hypothesis of validity of the IV.

Turning to the second-stage results, each of the IV models shows a positive impact of delaying age at marriage (Mage) on education although the level of significance varies across models and samples. For the 25-49 years old sample, Educ1 IV1 model shows a coefficient of age at marriage on education of 0.334 (not significant), IV2 0.453 (significant at the 5% level), and Two IV model 0.410 (significant at the 1% level). For Educ2, Mage also has a positive (statistically significant at 1% level) effect in all models: 0.565, 0.327 and 0.363 for IV1, IV2 and Two IV models, respectively.¹⁷

For the 30-49 years old sub-sample, Educ1 model, the coefficients of Mage are not sta-

 $^{^{17}}$ We would expect marital age to have a stronger effect on years of schooling than on the decision between "some" and "no" schooling. This is reflected to some extent in the coefficients of Mage being larger in most regressions for Educ1, in which comparatively fewer females reported no schooling, than in Educ2, which has a large proportion of such females. Referring to Table 9, the exceptional case is that of IV1, proxying Maithili membership, for which the magnitudes are reversed. One explanation for this could be that compositional effects arise with respect to the IV1 dummy: as we see in Table 5, 87% of Maithili women have no formal schooling, and Maithilis would thus be under-represented in Educ1, relative to their proportion in Educ2. This could also explain why the coefficient of Mage tends to be insignificant in many IV1 regressions that use Educ1. Finally, we should note that the standard errors of all regressions using Educ1 are larger than for those that use Educ2, making simple comparisons of point estimates problematic even when the Maithili dummy is not being used.

tistically significant except for OLS. However, for *Educ*2, *Mage* has a positive effect in all models: 0.350 (at 5%), 0.180 (at 10%) and 0.216 (at 5%) for IV1, IV2 and Two IV models, respectively.

These estimates are roughly in line with but slightly higher than the one found by Field and Ambrus (2008) for Bangladesh where increasing age at marriage by one year increases education by 0.22 years. They are somewhat lower than Asadullah and Wahhaj (2019), who found the effect to be 0.422. Apart from country-specific effects, the differences could be a result of the time gap between the survey data that we used and the ones used by the latter two papers.

Note, however, that compared to OLS, standard errors are considerably higher, which makes the point estimate less precise. If, however, the point estimates are taken at face value, the IV estimates suggest that unobservables were biasing down OLS. That is, there should be girl's traits that favour both more education and early marriage, and this effect is potentially of a higher order effect than labor productivity unobserved ability and culture biases against education.

5.1 Robustness and validity of the estimated results

In this section, we consider potential sources of bias in our estimates and outline our attempts to address them. We present results only for the sub-sample of 25-49 years old females.

One of the main concerns with our instruments, both of which reflect cultural norms and practices regarding female age at marriage, has been the possibility of a correlation between these norms and those that underlie female education. The insignificance of the results on mother's education in the first-stage regressions suggests that such norms are independent of each other. Nonetheless other biases might still arise.

First, there is the possibility that poverty drives parents both to keep their daughters out of school and to marry them young so that the burden of maintenance falls on their husbands and in-laws. Moreover, poor parents could be more susceptible to trading off girls' education for the sake of accumulating a sufficient dowry, even in communities that do not practice dowry culture as strictly as Maithilis do.

Second, a potential detrimental effect of early marriage on female education may arise because a significant proportion of females were getting married during childhood and were therefore obliged to abandon schooling and take up household duties. While this would be a valid effect in its own right, our main concern is with the *anticipatory* disincentive to female education that early marriage induces, and not just its disruptive effect once marriage has taken place.

Third, a possible bias affecting only the Maithili instrument, is that this might reflect regional variations in marriage practice, especially regarding age at marriage, rather than an effect of dowry culture specific to Maithilis. This possibility arises because Maithilis are concentrated in certain regions of Nepal that border India; to be precise in four of the six regions of our survey data: Eastern, Central, Western and Abroad. Since cultural practices in Nepal do vary by region and the concomitant degree of urbanisation, this could arise as a source of bias.

The results for the robustness analysis are summarized in Table 10, in which we include only the main variables of interest.

We start by looking at the possibility that poverty underlies the observed relationship between female education and age at marriage. We run regressions on a restricted sub-sample of households that belong to the upper half of the wealth distribution proxied by land holding. This information is only available for the marital household, and there is no such variable for the married women parental household. The underlying assumption is that marriages are more likely to occur among families of similar wealth status. We shall discuss separately the cases of Educ1 and Educ2.

For Educ1, the first-stage coefficients of the instruments increase in value and remain significant at the 1% level across all IV models. In the second-stage regression the coefficient of age at marriage increased for IV1 and dropped in value and/or significance for IV2 and Two IV models, possibly due to the reduced sample size. For Educ2, while a marginal decrease is observed in the second-stage regression across the three IV models, they remain

statistically significant. The p-value of the Sargan tests and the F-statistics support the validity of the instruments in this sub-sample. The important point is that by and large our qualitative results continue to hold at similar levels of significance, especially in the larger Educ2 sub-sample.

Second, we look at the possibility that the detrimental effect of early marriage on female education arises because of very early marriage. To filter out this effect, we run regressions on the sub-sample of females who married above the age of 15. Fifteen is the age set by the International Labor Organization (ILO) convention as the minimum age of employment and is also an age by which most children will have completed secondary school. If child marriage is the main driving force behind low female education we would expect insignificant effects of age at marriage on education in these sub-samples. Overall the results are similar in magnitude and significance to the corresponding baseline regression models, showing a positive effect of age of marriage on education. However, the Sargan test rejects the exogeneity of IV in the Educ2 case.

The third potential source of bias is that the Maithili instrument might reflect regional variations in marriage practice rather than the effect of Maithili dowry culture. We estimated our models on a sub-sample that comes from regions in which the Maithali community are concentrated. This sub-sample includes the Eastern, Central, Western and Abroad regions but excludes the Mid-Western and Far Western regions. The estimates reported are similar to the corresponding baseline models.

An anonymous referee pointed out that since there is gender parity in primary schooling in Nepal and school facilities would have been very different for someone aged 25 and 49 years old, the results could be specific to the completion of secondary grade. In order to explore this issue we include the regression results for a restricted sample of 25-35 years old in Table 11. The rationale is that if the effects were driven by differences in birth cohort effects these should be different when using the restricted sample. The results are still positive and in line with the baseline results. There are some difference in magnitude but they are however within a 95% confidence interval of each other.

6 Conclusions

We investigated the impact of age at marriage on female education using survey data from Nepal. We instrumented age at marriage via variables that reflect cultural norms and peer group effects around the socially acceptable age at which females should marry. While the results differed across our different instrumental variables and samples, the estimates indicate that each year's delay in marriage increases female education from 0.2 to 0.5 years. These figures are roughly in line with the estimates found by Field and Ambrus (2008) of 0.22 and those reported by Asadullah and Wahhaj (2019) of 0.42.

These findings support the attempts by social reformers and governments to curtail the practice of early marriage in countries where it is encouraged by tradition, particularly across the South Asian sub-continent. Policies that increase marriage age might increase parent's incentives to spend on girls' education. In particular, our findings suggest that an important channel for policy intervention would be addressing cultural norms regarding female marriage. In line with this, policymakers should work closely with and support community-based organisations that try to lift women out their traditional roles as wives and mothers. In Nepal, organisations such as Nepal Lending Hands and Jhanakpur Women's Development Centre have been established for precisely this purpose.

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Table 1: Comparisons of Female Education and Marriage Age across South Asia

		Schoo	ol Comp	oletion Ra	tes^a		Female	e Marr	iage
			Lo	ower	U	pper	Average	Perce	nt Married
	Pri	mary	Seco	ondary	Seco	ondary	Age at First	On	or Before
Country	Male	Female	Male	Female	Male	Female	Marriage ^b	15 ^a	18 ^a
Afghanistan	67.2	40.2	49.3	25.6	32.3	14.4	21.2	8.8	34.8
Bangladesh	76.3	89.1	59.2	70.5	31.5	27.3	19.2	22.4	58.6
India	91.5	91.3	82.4	79.3	46.5	39.7	20.7	6.8	27.3
Nepal	. 83.9	82.3	71.4	67.9	51.9	38.5	20.7	7	39.5
Pakistan	64	55.4	54.7	44.6	23.6	23.3	23.1	2.8	21

Source:

Table 2: Wedding expenses: Current year (in '000)

		_			
	Maithili			Non-Maithi	li
Total	Rural	Urban	Total	Rural	Urban
19.39(38.13)	20.84(39.92)	7.04(11.86)	5.66(26.70)	5.55(28.7)	5.99(21.90)
57	48	9	764	582	182
7.62(20.96)	7.75(21.41)	5.38(11.10)	8.41(32.37)	6.43(16.15)	19.31(72.50)
232	220	12	1776	1503	273
.219	.251	0.060	.020	.029	.015
.005	.015	.0004	.0005	.0005	.0005
.088	.092	.041	.044	.040	.054
.004	.004	.003	.001	.001	.0007
	19.39(38.13) 57 7.62(20.96) 232 .219 .005 .088	Total Rural 19.39(38.13) 20.84(39.92) 57 48 7.62(20.96) 7.75(21.41) 232 220 .219 .251 .005 .015 .088 .092	$\begin{array}{c cccc} Total & Rural & Urban \\ \hline 19.39(38.13) & 20.84(39.92) & 7.04(11.86) \\ 57 & 48 & 9 \\ \hline 7.62(20.96) & 7.75(21.41) & 5.38(11.10) \\ 232 & 220 & 12 \\ .219 & .251 & 0.060 \\ .005 & .015 & .0004 \\ .088 & .092 & .041 \\ \hline \end{array}$	$ \begin{array}{c ccccccccccccccccccccccccccccccccccc$	$ \begin{array}{c ccccccccccccccccccccccccccccccccccc$

Note: D-cost=dowry paid, Wed-exp= marriage, birth and other ceremonies expenses. These figures represent aggregate household data. Standard deviations in ().

⁽a) https://data.unicef.org (Demographic and Health Survey) Year of Data: Afghanistan, 2015; India, Nepal 2016; Bangladesh 2019 (Education) 2014 (Marriage Age); Pakistan 2018 (Education) 2013 (Marriage Age)
(b) https://databank.worldbank.org (Gender Statistics Database); Year of Data: Afghanistan, Bangladesh, Pakistan 2013; India 2011; Nepal 2014.

Table 3: Females' marital status by age group (in %)

Age group	Married	Divorced	Separated	Widow	Unmarried
<= 15	2.76	0.10	-	0.05	97.09
16-20	42.98	0.19	0.51	0.13	56.20
21-24	76.08	0.10	0.52	0.21	23.09
25-29	90.76	-	0.84	0.65	7.74
30-34	93.74	-	1.76	2.09	2.41
35-39	93.35	0.18	0.72	3.60	2.16
40-44	89.49	0.26	2.37	5.78	2.10
45-49	83.22	0.34	2.37	12.37	1.69
Total*	59.51	0.14	1.15	8.91	30.29

Notes: * all ages, including age> 49.

Table 4: Education and Age at Marriage by Ethnic Group

		Years of I	Educati	ion	Age at		Married at	
Ethnic	E	duc1	E	duc2	Mai	rriage	$\leq 15 \text{ Y}$	$r_{ m rs}$
Group	Ave	St Dev	Ave	St Dev	Ave	St Dev	Proportion	St Dev
Brahmin	7.87	3.45	4.03	4.65	17.37	3.55	0.260	0.439
Chhetri	7.09	3.46	2.07	3.70	17.70	3.38	0.219	0.414
Newar	8.99	3.58	5.59	5.20	19.69	3,68	0.086	0.281
Magar	6.58	2.90	1.68	3.23	17.87	3.12	0.223	0.417
Tharu	6.20	3.04	0.65	2.13	16.19	2.87	0.389	0.489
Tamang	6.08	3.35	0.83	2.42	17.79	3.28	0.318	0.467
Kami	6.29	3.64	0.69	2.30	16.95	3.44	0.318	0.467
Yadav	5.33	1.92	0.55	1.73	14.89	2.63	0.529	0.501
Muslim	5.54	2.30	0.40	1.55	15.28	2.69	0.530	0.500
Rai	5.83	3.36	1.74	3.24	20.06	4.14	0.066	0.249
Gurung	7.20	3.41	2.53	3.99	19.31	4.35	0.144	0.353
Damai	6.86	3.01	1.25	2.94	17.34	3.98	0.308	0.465
Limbu	5.82	3.30	1.57	3.10	21.4	5.28	0.079	0.272
Sarki	N/A	N/A	0.18	1.19	15.62	3.08	0.500	0.506
Others	7.13	3.46	1.26	3.08	16.47	3.20	0.367	0.482

Notes: Sample of 25-49 years old women.

Table 5: Comparison of age at marriage and educational distribution

		Sample2549			Sample3049		
Variable	All	Non-Maithili	Maithili	All	Non-Maithili	Maithili	
		Age at	marriage				
Average	17.44(.059)	17.71(.064)	15.78(.127)	17.34(.078)	17.61(.077)	15.48(.157)	
Married ≤ 16	.45(.008)	.42(.008)	.65(.021)	.47(.009)	.44(.009)	.69(.024)	
Married 17-18	.25(.007)	.25(.007)	.22(.018)	.24(.008)	.25(.008)	.20(.021)	
Married 19-20	.14(.005)	.15(.006)	.09(.012)	.14(.006)	.15(.007)	.08(.014)	
Married 21-22	.07(.004)	.08(.004)	.02(.006)	.07(.004)	.07(.005)	.02(.006)	
Married 23-24	.04(.003)	.04(.003)	.01(.0050	.03(.003)	.03(.003)	.005(.002)	
Married 25-26	.03(.002)	.03(.003)	.005(.002)	.03(.003)	.03(.003)	.005(.002)	
Married ≥ 27	.02(.002)	.02(.002)	.005(.002)	.02(.002)	.03(.003)	.005(.002)	
Education							
No formal schooling	.71(.007)	.69(.008)	.87(.014)	.76(.008)	.73(.008)	.92(.014)	
Primary [1-5]	.10(.004)	.11(.005)	.06(.010)	.09(.005)	.10(.005)	.04(.009)	
Secondary [6-7]	.04(.003)	.03(.003)	.03(.007)	.03(.003)	.03(.003)	.01(.006)	
High school [8-10]	.07(.004)	.08(.004)	.02(.006)	.06(.004)	.07(.005)	.01(.005)	
Higher education $[\geq 11]$.08(.004)	.09(.004)	.02(.006)	.06(.004)	.07(.007)	.02(.007)	
Obs.	3760	3244	516	2818	2460	358	

Notes: Grades corresponding to each educational level from variable Educ2 are presented in brackets. Standard deviations in parentheses.

Table 6: Distribution of the Maithili community

Sample 2549	Sample 3049
thnic distribution	
.02(.005)	.02(.007)
.16(.016)	.17(.019)
.14(.014)	.13(.017)
.03(.007)	.02(.007)
.04(.008)	.03(.009)
.61(.018)	.63(.025)
gional distribution	n
.38(.021)	.38(.025)
.36(.021)	.36(.025)
.01(.003)	.01(.004)
-	-
-	-
.25(.018)	.25(.015)
516	358
	thnic distribution .02(.005) .16(.016) .14(.014) .03(.007) .04(.008) .61(.018) gional distribution .38(.021) .36(.021) .01(.003)25(.018)

Notes: Standard deviations in parentheses.

Table 7: Descriptive statistics

	Table 1: Desci	riptive statistics
Variable	Sample 2549	Sample3049
Educ1	7.51(.106)	7.37(.136)
Educ2	2.16(.063)	1.78(.068)
Feduc	2.75(.138)	2.75(.175)
Meduc	.649(.070)	.611(.087)
Urban	.202(.012)	.219(.015)
Mage	19.00(.107)	18.97(.144)
Age dummies		
25-29	.366(.014)	-
30-34	.217(.012)	.342(.018)
35-49	.220(.012)	.346(.018)
40-44	.108(.008)	.178(.014)
45-49	.084(.008)	.133(.012)
Ethnic dummies		
Brahman	.255(.013)	.271(.017)
Chettri	.155(.011)	.160(.014)
Newar	.253(.013)	.276(.017)
Magar	.046(.006)	.042(.007)
Tharu	.022(.004)	.017(.005)
Tamang	.021(.004)	.014(.004)
Kami	.012(.003)	.010(.003)
Yadav	.010(.003)	.005(.002)
Muslim	.012(.003)	.010(.003)
Rai	.024(.004)	.016(.004)
Gurung	.032(.005)	.035(.007)
Damai	.010(.003)	.004(.002)
Limbu	.012(.003)	.010(.003)
Sarki	.001(.001)	-
Others	.142(.010)	.124(.012)
Regional dummies		
Eastern	.216(.012)	.192(.015)
Central	.335(.014)	.365(.018)
Western	.253(.013)	.248(.016)
Mid-western	.072(.007)	.077(.010)
Far-western	.033(.005)	.030(.006)
Abroad	.076(.008)	.071(.009)
Notes, Ctandard deviation	a in mananthagas	

Notes: Standard deviations in parentheses.

Table 8: First-stage regression results: Dependent variable Mage

		$\frac{\text{rst-stage reg}}{\text{IV2}}$	gression resul			
	IV1		Two IV	IV1	IV2	Two IV
	Sub-	sample age			sample age	5U-49
	1 50 1444		Sub-sample			1 0004
Maithali	-1.724***		-1.595***	-1.640**		-1.338*
	(0.527)	o = contribute	(0.522)	(0.798)	0.00.00	(0.789)
Avemage		0.746***	0.714***		0.834***	0.796***
		(0.172)	(0.176)		(0.201)	(0.205)
Age 30-34	-0.185	-0.0978	-0.179			
	(0.272)	(0.270)	(0.271)			
Age $35-39$	-0.318	-0.281	-0.327	-0.130	-0.171	-0.142
	(0.272)	(0.272)	(0.269)	(0.328)	(0.323)	(0.324)
Age 40-44	-0.141	-0.121	-0.151	0.0358	-0.0358	0.0147
	(0.354)	(0.356)	(0.353)	(0.395)	(0.392)	(0.396)
Age 45-49	-0.713*	-0.673*	-0.738*	-0.473	-0.513	-0.499
	(0.396)	(0.375)	(0.380)	(0.427)	(0.414)	(0.417)
feduc	0.0968***	0.0930***	0.0971***	0.115***	0.113***	0.115***
	(0.0248)	(0.0247)	(0.0246)	(0.0323)	(0.0318)	(0.0319)
meduc	-0.0408	-0.0293	-0.0337	-0.0685	-0.0497	-0.0529
	(0.0488)	(0.0493)	(0.0486)	(0.0662)	(0.0648)	(0.0644)
urban	1.301***	1.171***	1.131***	1.580***	1.454***	1.433***
	(0.330)	(0.331)	(0.334)	(0.446)	(0.443)	(0.448)
Obs.	1,079	1,079	1,079	684	684	684
R2	0.182	0.188	0.196	0.192	0.205	0.209
			Sub-sample			
Maithali	-0.892***		-0.791***	-1.145***		-1.024***
	(0.183)		(0.181)	(0.222)		(0.219)
Avemage	. ,	1.001***	0.981***	, ,	1.008***	0.979***
_		(0.0952)	(0.0953)		(0.112)	(0.112)
Age 30-34	-0.0912	-0.116	-0.136		. ,	, ,
	(0.153)	(0.150)	(0.150)			
Age 35-39	-0.245*	-0.264*	-0.288**	-0.139	-0.130	-0.138
_	(0.143)	(0.142)	(0.141)	(0.163)	(0.161)	(0.161)
Age 40-44	-0.442***	-0.449***	-0.481***	-0.361**	-0.337*	-0.354*
_	(0.167)	(0.164)	(0.164)	(0.183)	(0.181)	(0.181)
Age 45-49	-0.815***	-0.844***	-0.858***	-0.725***	-0.727***	-0.723***
_	(0.194)	(0.192)	(0.191)	(0.210)	(0.208)	(0.207)
Feduc	0.118***	0.117***	0.118***	0.120***	0.120***	0.121***
	(0.0213)	(0.0212)	(0.0211)	(0.0272)	(0.0269)	(0.0269)
Meduc	0.000417	0.00987	0.00373	-0.0271	-0.0140	-0.0206
	(0.0470)	(0.0472)	(0.0471)	(0.0612)	(0.0603)	(0.0605)
Urban	1.724***	1.520***	1.493***	2.037***	1.852***	1.819***
	(0.276)	(0.279)	(0.279)	(0.351)	(0.355)	(0.355)
Obs.	3,760	3,760	3,760	2,818	2,818	2,818
R2	0.190	0.207	0.211	0.193	0.208	0.213
	0.200	J.=.J.	·	0.200	0.200	0.440

Notes: White robust standard errors in parenthesis. *** significant at 1%, ** significant 5%, * significant at 10% level. IV1: Maithili.

IV2: Average. Age:25-29 as base category for subsample 25-49 and Age:30-34 as base category for subsample 30-49. Regional and ethnicity dummies are included but not reported.

Table 9: Second-stage regression results: Dependent variable Educ1 or Educ2

Table	OLS	IV1	$\frac{\text{IV2}}{\text{IV2}}$	Two IV	OLS	$\frac{1 \text{ OI } Educz}{\text{IV1}}$	IV2	Two IV
			e age 25-49				e age 30-49	
		<u>r</u>		ependent va	riable Educ			
Mage	0.314***	0.334	0.453**	0.410***	0.270***	-0.0484	0.175	0.130
	(0.0286)	(0.239)	(0.213)	(0.157)	(0.0340)	(0.435)	(0.167)	(0.158)
Age 30-34	-0.355	-0.353	-0.342	-0.346		()	()	()
0	(0.236)	(0.234)	(0.236)	(0.234)				
Age 35-39	-0.435*	-0.429*	-0.398	-0.409*	-0.115	-0.168	-0.131	-0.138
8	(0.233)	(0.236)	(0.243)	(0.236)	(0.267)	(0.290)	(0.267)	(0.268)
Age 40-44	-0.561*	-0.559*	-0.546*	-0.551*	-0.274	-0.282	-0.277	-0.278
O	(0.299)	(0.297)	(0.304)	(0.300)	(0.327)	(0.346)	(0.324)	(0.326)
Age 45-49	-1.199***	-1.186***	-1.110***	-1.137***	-0.965**	-1.121**	-1.011**	-1.033***
8	(0.372)	(0.400)	(0.399)	(0.384)	(0.389)	(0.462)	(0.395)	(0.397)
Feduc	0.185***	0.183***	0.172***	0.176***	0.204***	0.240***	0.214***	0.220***
	(0.0206)	(0.0300)	(0.0281)	(0.0246)	(0.0259)	(0.0579)	(0.0320)	(0.0319)
Meduc	0.0922***	0.0930***	0.0973***	0.0957***	0.107***	0.0860*	0.101**	0.0977**
	(0.0314)	(0.0321)	(0.0337)	(0.0325)	(0.0402)	(0.0485)	(0.0397)	(0.0393)
Urban	1.858***	1.830***	1.669***	1.728***	1.810***	2.324***	1.964***	2.036***
	(0.278)	(0.426)	(0.400)	(0.350)	(0.371)	(0.803)	(0.449)	(0.446)
Obs.	1,079	1,079	1,079	1,079	684	684	684	684
R2	0.362	0.361	0.345	0.354	0.365	0.273	0.357	0.348
F-test		10.7	18.8	13.8		4.2	17.3	9.9
Sargan				0.70				0.59
			D	ependent va	riable Educa	2		
Mage	0.195***	0.565***	0.327***	0.363***	0.162***	0.350**	0.180*	0.216***
O	(0.0172)	(0.189)	(0.0886)	(0.0816)	(0.0184)	(0.148)	(0.0978)	(0.0837)
Age 30-34	-0.655***	-0.630***	-0.646***	-0.644***	,	,	,	,
J	(0.156)	(0.163)	(0.156)	(0.156)				
Age 35-39	-1.156***	-1.076***	-1.128***	-1.120***	-0.496***	-0.472***	-0.494***	-0.489***
J	(0.142)	(0.153)	(0.142)	(0.143)	(0.150)	(0.153)	(0.150)	(0.150)
Age 40-44	-1.615***	-1.466***	-1.562***	-1.547***	-0.956***	-0.891***	-0.950***	-0.937***
_	(0.146)	(0.174)	(0.150)	(0.150)	(0.153)	(0.163)	(0.156)	(0.155)
Age 45-49	-1.642***	-1.347***	-1.537***	-1.508***	-0.981***	-0.844***	-0.968***	-0.942***
	(0.157)	(0.232)	(0.171)	(0.171)	(0.163)	(0.201)	(0.178)	(0.174)
Feduc	0.388***	0.345***	0.373***	0.368***	0.396***	0.373***	0.394***	0.389***
	(0.0238)	(0.0313)	(0.0256)	(0.0250)	(0.0297)	(0.0336)	(0.0322)	(0.0313)
Meduc	0.217***	0.214***	0.216***	0.216***	0.231***	0.235***	0.232***	0.232***
	(0.0414)	(0.0413)	(0.0404)	(0.0403)	(0.0531)	(0.0526)	(0.0528)	(0.0526)
Urban	2.699***	2.049***	2.467***	2.403***	2.698***	2.305***	2.660***	2.585***
	(0.290)	(0.444)	(0.322)	(0.317)	(0.352)	(0.468)	(0.394)	(0.383)
Obs.	3,760	3,760	3,760	3,760	2,818	2,818	2,818	2,818
R2	0.447	0.349	0.435	0.427	0.423	0.391	0.423	0.421
F-test		23.8	110.6	65.2		26.7	81.1	52.2
Sargan				0.21				0.31
	et etandard orrore	in parenthesis **	* significant at 1%	, ** significant 5%.	* significant at 1	0% lovel Magais	4t-J	

Notes: White robust standard errors in parenthesis. *** significant at 1%, ** significant 5%, * significant at 10% level. Mage is treated as endogenous. IV1: Maithili. IV2: Avemage. Age:25-29 as base category for subsample 25-49 and Age:30-34 as base category for subsample 30-49. Regional and ethnicity dummies are included but not reported.

Table 10: Robustness checks (I)

Two IV OLS IVI IV2 Two IV OLS IVI IV2 Sub-sample for Educ1 First-stage: dep.var. Mage -0.916* -0.845 -1.554*** -1.554*** 0.949*** -0.916* -0.845 0.522) 0.532) 0.680*** 0.949*** -0.916* -0.779*** 0.1729 0.680*** 0.949*** -0.916* -0.170 0.172 0.680*** 0.949*** 0.150 0.165 0.167 0.184 0.196 0.200 530 1,003 1,003 1,003 965 965 965 0.274 0.165 0.167 0.184 0.188 0.196 0.200 0.274 0.160 0.167 0.194 0.188 0.265 965 965 0.182 0.036 0.167 0.194 0.188 0.266 965 965 0.182 0.036 0.167 0.196** 0.315*** 0.341 0.341 0.341 0.341 0.341 <td< th=""><th></th><th></th><th>Upper wealt</th><th>Upper wealth households</th><th></th><th>Ad Ad</th><th>Table 10: nobustiless effects (1) Adult marriage (M)</th><th>$\frac{\Delta m}{m} \frac{1}{m}$</th><th>15)</th><th></th><th>Four 1</th><th>Four regions</th><th></th></td<>			Upper wealt	Upper wealth households		Ad Ad	Table 10: nobustiless effects (1) Adult marriage (M)	$\frac{\Delta m}{m} \frac{1}{m}$	15)		Four 1	Four regions	
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$			IV1	IV2			IV1	r I	Two IV	OLS	IV1	IV2	Two IV
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$							Sub-sample	e for Educi					
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$						Ŧ		lep.var. Ma	·ge				
$ \begin{array}{c ccccccccccccccccccccccccccccccccccc$	Maithali		-1.976***		-1.820***		-0.916*		-0.845		-1.554***		-1.540***
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$			(0.578)		(0.586)		(0.521)		(0.522)		(0.532)		(0.526)
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	Avemage			0.974***	0.949***			0.727***	0.719***			0.680***	0.676***
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$				(0.180)	(0.184)			(0.170)	(0.172)			(0.200)	(0.200)
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	Obs.		530	530	530	1,003	1,003	1,003	965	965	965		
Second-stage: dep.var. $EducI$ 0.306*** 0.447* 0.335** 0.362*** 0.294*** 0.358 0.415* 0.407** 0.315*** 0.420 0.489* 0.0456) (0.256) (0.155) (0.138) (0.0315) (0.476) (0.214) (0.196) (0.0298) (0.266	R2		0.242	0.264	0.274	0.150	0.165	0.167	0.184	0.188	0.196		
$\begin{array}{cccccccccccccccccccccccccccccccccccc$						Sec	1	dep.var. Ea	luc1				
$ \begin{array}{c ccccccccccccccccccccccccccccccccccc$	Mage	0.306***	0.447*	0.335**	0.362***	0.294***	0.358	0.415*	0.407**	0.315***	0.420	0.489*	0.462**
$\begin{array}{cccccccccccccccccccccccccccccccccccc$		(0.0456)	(0.256)	(0.155)	(0.138)	(0.0315)	(0.476)	(0.214)	(0.196)	(0.0298)	(0.266)	(0.266)	(0.186)
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	Obs.	530	530	530	530	1,003	1,003	1,003	1,003	965	965	965	965
$ \begin{array}{c ccccccccccccccccccccccccccccccccccc$	R2	0.365	0.350	0.364	0.363	0.347	0.344	0.336	0.338	0.367	0.357	0.341	0.349
$ \begin{array}{c ccccccccccccccccccccccccccccccccccc$	F-test		11.7	29.1	17.8		3.1	18.3	10.4		8.5	11.6	10.2
First-stage: dep.var. Mage	Sargan				0.71				0.91		•		0.85
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$							Sub-sample	e for Educ2					
$ \begin{array}{c ccccccccccccccccccccccccccccccccccc$						Ħ	'irst-stage: c	dep.var. Ma	·ge				
$ \begin{array}{c ccccccccccccccccccccccccccccccccccc$	Maithali		-1.231***		-1.095***		-0.755***		-0.658***		-0.729***		-0.824***
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$			(0.261)		(0.258)		(0.166)		(0.165)		(0.189)		(0.187)
$ \begin{array}{c ccccccccccccccccccccccccccccccccccc$	Avemage			0.968	0.936***			0.774***	0.755***			0.945***	0.974***
$ \begin{array}{c ccccccccccccccccccccccccccccccccccc$				(0.118)	(0.119)			(0.0959)	(0.0962)			(0.110)	(0.110)
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	Obs.		1,877	1,877	1,877	3,128	3,128	3,128	3,076	3,076	3,076		
Second-stage: dep.var. $Educ2$ $0.186*** 0.386** 0.323*** 0.338*** 0.338*** 0.201*** 1.016*** 0.370*** 0.471*** 0.196*** 0.579** 0.313**$ $1.877 $	R2		0.195	0.210	0.215	0.157	0.170	0.173	0.205	0.216	0.220		
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$						Sec	l	dep.var. E_a	luc2				
$ \begin{array}{cccccccccccccccccccccccccccccccccccc$	nean) mage	0.186***	0.386**	0.323***	0.338***	0.201***	1.016***	0.370***	0.471***	0.196***	0.579**	0.313**	0.364***
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	Obs.	1,877	1,877	1,877	1,877	3,128	3,128	3,128	3,128	3,076	3,076	3,076	3,076
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	R2	0.375	0.343	0.360	0.356	0.445	0.099	0.430	0.407	0.455	0.353	0.445	0.435
0.76	F-test		22.3	67.5	41.3		20.6	65.0	39.4		14.9	74.0	47.5
	Sargan				0.76				0.02				0.30

Notes: White robust standard errors in parenthesis. *** significant at 1%, ** significant 5%, * significant at 10% level. Mage is treated as endogenous. IV1: Maithili. IV2: Avmage. Sample of 25-49 years old. Upper wealth households correspond to top 50% households in terms of land holding. Adult marriage: Mage \geq 15. Four regions: Eastern, Central, Western and Abroad. The regression models also contain the covariates in

Tables 8 and 9.

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Table 11: Robustness checks (II)

	OLS	IV1	IV2	Two IV	OLS	IV1	IV2	Two IV
	Sub	o-sample for	25-35 years			-sample for	30-35 years	old
				Sub-sample	for Educ1			
			F	irst-stage: d	ep.var. Mag	ge		
Maithali		-1.873***		-1.803***		-2.539*		-2.315*
		(0.630)		(0.623)		(1.326)		(1.314)
Avemage			0.627**	0.592**			0.670	0.578
			(0.249)	(0.246)			(0.421)	(0.412)
Obs.		734	734	734		339	339	339
R2		0.206	0.202	0.213		0.236	0.232	0.241
				cond-stage: o				
Mage	0.321***	0.411	0.875**	0.596***	0.229***	0.0630	0.347	0.174
	(0.0356)	(0.277)	(0.435)	(0.229)	(0.0473)	(0.480)	(0.477)	(0.349)
Obs.	734	734	734	734	339	339	339	339
R-2	0.372	0.365	0.119	0.309	0.374	0.348	0.361	0.371
F-test	,	8.9	6.3	7.2		3.7	2.5	2.84
Sargan				0.32				0.65
				Sub-sample				
			F	irst-stage: d	ep.var. Mag	_		
Maithali		-0.581**		-0.519**		-0.894***		-0.805**
		(0.234)		(0.230)		(0.344)		(0.342)
Avemage			0.949***	0.939***			0.995***	0.974***
			(0.151)	(0.150)			(0.237)	(0.238)
Obs.		2,035	2,035	2,035		1,093	1,093	1,093
R-squared		0.225	0.242	0.244		0.224	0.239	0.243
				cond-stage: o	-			
Mage	0.189***	0.983**	0.484***	0.531***	0.189***	0.663*	0.145	0.238
	(0.0315)	(0.488)	(0.169)	(0.163)	(0.0315)	(0.384)	(0.194)	(0.175)
Obs.	1,093	2,035	2,035	2,035	1,093	1,093	1,093	1,093
R2	0.464	0.218	0.458	0.446	0.464	0.323	0.463	0.463
F-test	,	6.18	39.7	22.6		6.7	17.6	11.9
Sargan				0.24				0.17

Notes: White robust standard errors in parenthesis. *** significant at 1%, ** significant 5%, * significant at 10% level. Mage is treated

as endogenous. IV1: Maithili. IV2: Avmage. The regression models also contain the covariates in Tables 8 and 9, except that it includes

a full set of dummy variables for each age.