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The role of marriage in the causal pathway from economic conditions early in life to mortality

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Abstract

This paper analyzes the interplay between early-life conditions and marital status, as determinants of adult mortality. We use individual data from Dutch registers (years 1815-2000), combined with business cycle conditions in childhood as indicators of early-life conditions. The empirical analysis estimates bivariate duration models of marriage and mortality, allowing for unobserved heterogeneity and causal effects. Results show that conditions around birth and school ages are important for marriage and mortality. Men typically enjoy a protective effect of marriage on mortality, whereas women suffer during childbearing ages. Having been born under favorable economic conditions reduces female mortality during childbearing ages.

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1 Introduction

Socioeconomic conditions during infancy and childhood are well established predictors of adult health and mortality (see Section 2 for detailed discussion and past literature). Poor socioeconomic status, leading to poor nutrition, and greater exposure to diseases in-utero and during childhood are associated with increased vulnerability to a whole range of health problems and lower life expectancy (see e.g. Case et al., 2003, Doblhammer, 2004, and Van den Berg et al., 2006).

Marriage also affects mortality, with married men exhibiting lower susceptibility to health problems like cardiovascular diseases and consequently exhibiting higher life expectancy (Phillips et al., 2001). Unlike the clear direction of the association between early life conditions and mortality, the relationship between marriage and mortality could be bidirectional. Marriage could involve direct material¹ or emotional transfers and care giving from the spouse, which could increase the well-being of a married individual. More indirectly, married individuals may experience lower psychological stress owing to a favorable societal attitude towards married individuals (Van Poppel, 1992), lead healthier lifestyles (lower consumption of alcohol or smoking; see Bodin, 2003 and references therein) and adopt less risk taking behavior, which may decrease risk of mortality. Consequently, marriage may be ‘*protective*’ against mortality (Johnson et al., 2000, Lund et al., 2004, Gardner and Oswald, 2004, and Murray, 2000). But several studies also find support for a ‘*selection*’ into marriage (e.g. Goldman 1993a, 1993b) according to which a range of factors like age, health, social background, income, occupation, education and race might affect marriage as well as mortality.² Better health, for instance, of married persons is then a consequence of the selection of ‘healthy’ persons into and ‘unhealthy’ individuals out of marriage. Any such positive selection into marriage would overstate the average causal effect of marriage on mortality at the individual level. The causal and the selection effect could both explain the lower mortality of married individuals (for e.g. see Hu and Goldman, 1990, Lillard and Panis, 1996). The difficulty to control for confounding factors makes it challenging to distinguish between these effects.

This study analyzes the interplay between early life conditions and marriage as determinants of high-age mortality. Specifically, we focus on the extent to which early-life conditions influence the positive or negative effect of marriage on mortality, and we consider the extent to which early-life conditions influence the entry rate into marriage (which we call the “marriage rate”). Figure 1 presents potential pathways between early life, marriage and later-life mortality. It contains four arrows, where the arrow that originates at birth and targets the arrow from marriage to mortality represents the interaction effect of early-life conditions and

¹For example by means of economies of scale and specialization within the household (Gardner and Oswald, 2004).

²For instance, factors like job security, high social background, high income, and education (Gardner and Oswald, 2004) increase one’s marriage prospects and also favorably affect the individual’s survival.

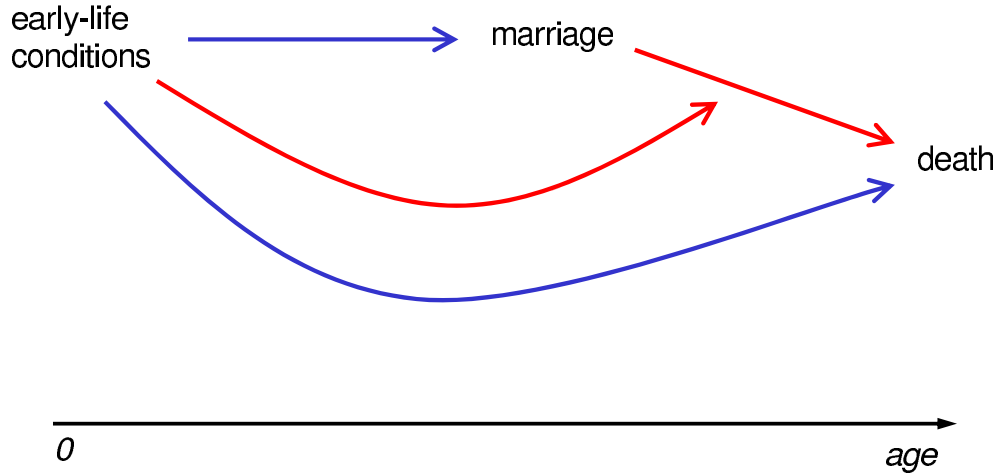


Figure 1: Pathways between early life conditions, marriage, and mortality, over an individual's lifetime.

marriage on mortality. As noted in the previous paragraphs, the arrow from early-life conditions to mortality and the arrow from marriage to mortality have been studied extensively. We focus on the other two arrows: the impact of economic conditions early in life on the individual rate of getting married, and the extent to which the protective effect of marriage depends on conditions early in life. However, for this purpose, all four arrows need to be analyzed simultaneously in the empirical analysis.

The results of the analysis shed light on the extent to which the effect of early life conditions on mortality later in life is channeled through marital status. More specifically, the results shed light on the use of marriage as a compensatory device in case of adverse early-life conditions. We are interested in the question whether individuals born in adverse conditions benefit from a larger protective effect of marriage on the mortality rate. Moreover, we want to know whether individuals born under adverse conditions marry earlier. If the protective effect is larger for them then this provides an incentive to marry earlier. Conversely, they may marry later because they may have worse opportunities in the marriage market.

As such, our paper is informative on the degree to which an economically bad start in life can be compensated by deliberate social behavior at prime age, and it is informative on the degree to which such a pathway is used by those for whom the gains are highest.

The empirical agenda sketched above faces two major selectivity problems. First, the

actual economic conditions in the household early in life are potentially endogenous as an explanation of events later in life, because of shared unobserved confounders. For instance, using parental income as an indicator for early-life-economic conditions would be problematic since it is likely that some unobserved factors might influence parental earnings as well as adult health of the offspring resulting in simultaneity bias. Secondly, marriage is potentially endogenous for mortality. To deal with the first problem, we use business cycle conditions in early years of life as an indicator of individual economic well-being. This is in line with the recent literature in which natural experiments (like epidemics, wars or famines) or transitory fluctuations in contextual variables (eg. food grain prices, gross domestic/ national products etc.) are used for this purpose. The former act as instruments for conditions in-utero and at birth aiding the identification of the causal effect of adverse early-life-conditions on late-life mortality. However, these severe environmental shocks are also likely to have selection effects. Selection would, for instance, arise due to some parents being more likely to have children during famines than others (Doblhammer et al., 2011). Consequently, the morbidity and mortality distribution of individuals born during such adversity would vary for reasons beyond the causal effect of famine making it hard to again pin-down the long-run effects of adverse early-life-conditions. Recently several studies have explained and used business cycles as an indicator of early-life economic conditions; see e.g. Van den Berg et al. (2006, 2011). These cyclical macroeconomic indicators are clearly exogenous at the individual level, unanticipated and still likely to affect resource accessibility and environment, thereby not suffer from confounding. So, any observed relationship between these business cycle indicators of early-life-conditions and late-life mortality can be interpreted as a long-run causal effect of the former on the latter.

To deal with the second selectivity problem, i.e., to control for any joint unobserved heterogeneity affecting both marriage and mortality, we model the individual's entry rate into marriage and the mortality rate simultaneously, allowing for selection on unobservables. We apply the so-called Timing-of-Events approach formalized by Abbring and Van den Berg (2003) to identify the causal effect of marriage. This approach requires minimal amount of randomness in the moment of marriage, which may be justified by the random nature of the arrival of opportunities in the marriage market. For given conditions early in life, the identification of the marriage effect does not require an instrumental variable for marriage. We discuss the identification strategy in more detail in the paper.

To date, there is no extensive literature on the effect of early-life conditions on marriage and on the extent to which marriage postpones mortality. Phillips et al. (2001) suggest that prenatal growth provides a link between marital status and mortality. Using a Finnish data set of male births, the authors note that the marriage rate is positively related to birth conditions like weight, height, head circumference, gestational age, even after controlling for

a wide range of factors like adult health³ and socioeconomic background characteristics. The authors hypothesize that fetal conditions may affect an individual's personality, socialization, sexuality and emotional responses in later life, consequently affecting their marital status and mortality later in life. This result is contradicted by Vågerö and Modin (2002) who, using a Swedish longitudinal panel covering individuals from birth to death, find no differences in mortality between ever married and never married women before versus after adjustment for prenatal conditions,⁴ once socioeconomic background (like marital status of mother, social class at birth) and adult conditions (occupation, education and income) have been controlled for. The same result is obtained for men: although married men are less likely to suffer from heart diseases and stroke than unmarried men, the risk ratios are unaffected if social factors at birth are adjusted for. The authors conclude that there is no evidence for early health status in life being the factor explaining differences in mortality across different marital statuses. Clearly, the studies by Phillips et al. (2001) and Vågerö and Modin (2002) are innovative, but they do not focus on selection on unobservables, and the findings are inconclusive on the presence and magnitude of the causal effects that we are interested in.

A joint study of conditions early in life, marriage and mortality requires individual data covering full lifetimes for a reasonably large sample of individuals. This necessitates the use of historical data. In this paper we use records from Dutch registers of birth, marriage and death certificates, covering 1815-2000. These individual level data are then combined with indicators of historical macro conditions. The individual register data have been used in a wide range of studies (see Mandemakers, 2000, for an overview) including studies on the effect of early-life conditions on mortality (Van den Berg et al., 2006, 2009). These studies have ignored marital status as an intermediate outcome between birth and death. The data have also been used in descriptive studies of determinants of the marriage rate and in studies on the association between marital status and mortality (see e.g. Van Poppel and Joung, 2001), though not addressing the issues we focus on.

Our results show that conditions around birth as well as around school ages are important for marital status and mortality. The results are strikingly different across gender. Men on average enjoy a protective effect of marriage on mortality. Women born in economic booms gain from marriage during childbearing ages, relative to women born in recessions who suffer a substantial negative effect on life expectancy during these years.

Section 2 provides a brief discussion of the past literature on the topic. Section 3 describes the individual data along with some institutional context of marriage over our observation window. This section also contains a discussion of the historical context used to identify the causal effects, and of the relevance for contemporary societies. The empirical approach is discussed in Section 4. Section 5 presents the estimation results along with sensitivity

³Measured using height and weight at age 15.

⁴The authors use birth weight for gestational age as a measure of fetal growth.

analyses and implications. Section 6 concludes.

2 Additional background literature

2.1 Long run effects of early life conditions

Impacts of early-life conditions on late-life morbidity and mortality have been the focus of a large and growing body of literature in recent years. Although long-run effects of conditions in early years of life are likely to be smaller than the effects of contemporaneous conditions, early-life conditions are likely to influence individual outcomes over a longer time span. The presence of long-run effects of early-life conditions has clear policy implications. If adverse early-life conditions results in worse late-life outcomes supportive policies should be targeted at individuals who have suffered from poor early-life conditions. The long time span over which adverse early-life conditions influence late-life outcomes in fact provides a long window of opportunity for such targeted preventive interventions.

But to start with, the important questions that emerge are: are there any long-run causal effects of early-life conditions? What stages of early life are relevant for late-life outcomes? And what are the underlying mechanisms through which these effects operate over the individual's lifetime? Several past studies have investigated the association between conditions in-utero, at birth or shortly after birth, for instance using markers of early-life conditions like birth weight, and late-life health outcomes. Van den Berg et al. (2011a) provide an extensive reference of studies from the fields of demography, epidemiology and medicine looking at the causal effect between socioeconomic status or economic conditions at birth and morbidity and mortality later in life. A recent economic addition to this field of literature uses business cycle conditions in birth year as exogenous indicators of economic conditions at birth and establishes a robust causal relationship between these conditions and late-life mortality (Van den Berg et al., 2006, 2009a,b).

Only recently, some interest has also arisen on the role of conditions during other critical stages of development, like in years after birth, on health outcomes in later years of life. Conditions in years after birth however can be confounded with conditions at birth and therefore identification of causal impacts of the former on late-life outcomes presents methodological issues. Isolation of these causal effects necessitates use of exogenous indicators of early-life conditions and joint modeling of these with later-life conditions. Van den Berg et al. (2009a) attempt exactly that. Using business cycle conditions, measured by the cyclical component of the national annual per-capita gross domestic product, as exogenous indicators of early-life conditions the authors estimate the causal effect of conditions at birth and between the ages of 1-4 years on late-life mortality. For a sample of individuals born in Denmark in 1873-1906, the authors find that in addition to the cycle at birth the condition

of the business cycle at age 3 had a significant impact on late-life mortality rates of these individuals. So an individual who reaches the age of 3 during a recession is found to have significantly higher mortality at advanced ages. While the methodological approach allows the authors to estimate the effects of conditions at birth and during ages 1-4 years on late-life mortality, recent literature finds that more advanced ages during childhood and adolescence are also critical for long-term development and outcomes. For instance, Van den Berg et al. (2010), considering a sample of Swedish immigrants find that age 9 also plays an important role in determining adult height which is taken as a measure of long-run health. Results from a sibling fixed effects analysis illustrate that children who migrate from poorer nations to richer Sweden at earlier ages are taller at age 18 than those migrating when older. Effects of poorer conditions are particularly worse for children aged 9 at migration, suggesting that this age is particularly critical for adult height.

Despite several studies having established strong association, and even some causal impact, between markers of early-life conditions and long-run health and mortality (see van den Berg et. al, 2011a and references therein of surveys and meta-studies exploring these relationships), very limited work has been done on trying to pin-down the mechanisms underlying this relationship. Van den Berg et al. (2009a) investigate the role of annual fluctuations in national indicators of food prices, wages, infant mortality rates and sex ratios in the year of birth on late-life mortality. The authors, while consistently finding a robust, causal relationship between the cyclical component of the GDP, in the birth year and at age three on long-run mortality for a Danish twin sample find no evidence of a significant effect of the other listed macroeconomic indicators. The authors find these results suggestive of the fact that annual fluctuations in food prices, wages, IMR and sex ratios might not be reflective of early-life conditions. This could be partly due to the fact that the available national level, annual fluctuation data of these macro-indicators may actually be smoothing out a lot of the relevant regional and seasonal variations that might be larger and more important for long-run effects. Other studies have suggested nutrition, disease exposure, stress and living conditions as possible channels linking early-life conditions to advanced age mortality.

Another factor that complicates the study of long-run effects of early-life conditions on mortality is that these effects could be cumulative, in the sense that effects of favorable or adverse conditions at birth could be exacerbated by schooling, career, family formation and so on. One particularly relevant intermediate life event studied in the literature is marriage. The rest of this section presents past literature on how marriage has been observed to influence mortality and the possible underlying mechanisms. The section ends with some background on how marriage is potentially endogenous to mortality; also determined by early-life conditions. The methodological set-up used in our study to deal with confounding conditions at birth, during childhood and adolescence and endogenous intermediate life events like marriage is discussed in detail in Section 4.

2.2 Effects of marriage on mortality

The lower mortality of married men seems to have become a well-established fact (for e.g. see Hu and Goldman, 1990, Hemström, 1996). Marriage, as already mentioned above, has been found to be positively associated with increased economic well-being, lower psycho-social stress due to social support (from spouse or society in general that that might be more accepting of a married person), adoption of healthy lifestyles (Modin, 2003 and references therein) and other activities associated with longer life expectancy. A recent study by Van den Berg et al. (2011*b*), on the causal effect of conjugal bereavement finds a 12% loss of residual life expectancy as a result of loss of a spouse due to death. Looking at morbidity, married men also seem to have lower susceptibility to health problems like cardiovascular diseases and consequently higher life expectancy (Phillips et.al, 2006). For instance, Van den Berg et al. (2011*b*) finds that in addition to reduction in residual life, death of the spouse also replaces healthy years of remaining life with years of chronic disease. Increased morbidity and mortality amongst the widowed can be due to simple factors (for instance, difficulty in doing household chores like cooking and cleaning by widowers leading to lowering of caloric intake or nutritional deficits). Past studies (for instance Ecob and Smith, 1999 and Benzeva and Judge, 2001) also find evidence of greater poverty amongst widows which is associated to poorer health and increased mortality.

Another important benefit of marriage at advanced ages is the provision of informal care by a spouse (see for instance Norton, 2000, and Lakdawalla and Philipson, 2002). Death of the spouse reduces the supply of informal care which then results in increased demand for formal care for two reasons. Firstly, more formal care is needed to fill in for the lost informal care and secondly worsening of health owing to bereavement increases the overall need for health care. To illustrate, Prigerson, Maciejewski and Rosenheck (2000) estimate the average formal health care costs for the Netherlands in 1989 at \$2,384 for widowed and \$1,498 for married individuals.

Some recent studies have looked for evidence for the use of marriage as a compensatory device in case of adverse early-life conditions. In Section 1 we already discussed Phillips et al. (2001) and Vågerö and Modin (2002). Modin (2003) compares the incidence of ischaemic heart disease (IHD) amongst children born out of wedlock, and therefore likely to be disadvantaged, to that in those born to married parents. The study uses a Swedish sample born between 1915-1929. At the time, unwed mothers usually belonged to the lowest socioeconomic stratum of the society and the ‘shame’ of unmarried conception was likely to make these mothers move away from their families which would further impoverish them and their children. Therefore using born-out-of wedlock as an indicator of early disadvantage in life, the author finds little difference in male mortality risks for married men whether born within or outside marriage. However, the incidence of IHD and mortality risks were significantly higher amongst unmarried-men born under unfavorable conditions. Considering

possible mechanisms underlying the protective, compensatory effect of marriage on health the author finds that, beyond any selection effect, the stigma of ‘failing’ to marry could lead to loss of social support and in fact even social isolation of an individual. This in turn has been shown to be associated to increased mortality related to IHD.

Part of the association between marital status and the mortality rate for men is now understood to be a causal effect of the former on the latter (see Lillard and Panis, 1996). Large gains associated to the causal effect of marriage on morbidity and mortality, for instance as health care savings, however necessitate careful determination of the extent of this effect. This requires controlling for the selection into marriage resulting from the presence of shared determinants of both marriage and mortality, like health, age and socioeconomic background, which could also lead to a significant association between marriage and mortality. This is particularly relevant in light of the fact that unlike consistent results of a favorable causal effect of marriage on male mortality few studies have found evidence of a similar effect for women. Another confounding factor however could be early-life conditions as a joint determinant of marriage and mortality rates. This issue is considered in the following subsection.

2.3 Determinants of marriage rate

Socioeconomic factors like parental education, social class, occupation, education, income and health are factors that are expected to influence marriage (and mortality). Labor and marriage market conditions are other possible determinants of marriage rates. Considering contemporaneous labor market conditions Blau, Kahn and Waldfogel (2000) find that better female and worse male labor markets imply lower marriage rates. Since marriage has traditionally led to lower labor market participation for women, especially in historical societies, it is easy to see that improved job conditions would increase the opportunity cost of marriage for women thereby reducing or delaying marriage. For men, on the other hand, better labor market conditions could result in higher wages and greater economic stability making them more attractive in the marriage market.

Current labor and marriage market conditions are however also likely to be influenced by negative macroeconomic shocks reducing the sizes of birth cohorts. In the context of the great famine in China, Peng (1987) for instance estimates that birth loss or postponement led to 25 million fewer birth during the period between 1958-1961. Brandt, Siow and Vogel (2008) discuss the net marital outcomes of famine-born cohorts 30 years hence. The authors suggest that marriage rates could be influenced by (1) decreased attractiveness in the marriage market owing to poorer health related to adverse early-life conditions; (2) increased economic attractiveness due to higher labor market demand for the otherwise smaller cohort and (3) increased marriage market demand due to relative scarcity of famine-cohorts from younger (women) and older (men) cohorts due to customary gender-differences in ages of

couples. Comparing cohorts born before, during and after the famine the authors find some evidence for decreased marriage market attractiveness of famine-born cohorts (also suggested for instance by Almond et al, 2007, Gorgens et al., 2005, St. Clair et al., 2005 and Luo Mu and Zhang, 2006) but no net effect of this on marriage rates. Decline in marriage attractiveness, results in a shift in the distribution of the usual age-difference between spouses for the famine-born cohort. Individuals born during the famine, more frequently entered into non-customary age pairings; i.e. several of them married their ‘own (less attractive) kind’ leaving the marriage rate unaffected. Investigating possible underlying mechanisms, the study finds that the noted decline in the marriage market value of the famine-born cohort doesn’t result from decreased human capital accumulation measured using educational attainment.

3 Data

3.1 Individual records

The Historical Sample of the Netherlands (HSN)⁵, dataset project Utrecht-Zeeland-Friesland 02 (UZF.02), is created by merging individual data from Dutch registers of birth, marriage and death certificates. It includes a random sample of individuals born in one of the three provinces of Utrecht, Friesland or Zeeland⁶ between 1812-1902. The last day of observation of the sample is December 31, 1999. It records key events in an individual’s life - birth, marriage and death- and also includes information on occupation of parents, gender and geographical location. As noted above, the data have been used in numerous other studies, so the present exposition can be brief.

Individual lifetime durations are noted in days. If the individual is still alive at the end of 1999, the date of death is not observed. The lifetime durations of individuals whose death dates are not observed are right-censored at their last day of observation, i.e. at birth or at marriage. As the legal age of marriage at the time was 16 years and the people who died before this age cannot contribute to the likelihood of marriage, these people are excluded from the model estimation. Further loss of observations owing to missing values of explanatory variables results in a final sample of 5593 individuals.

‘Social class’ is captured by a hierarchal index based on Van Tulder (1962)’s mapping from parental occupation into a six-layer (1 being the lowest and 6 the highest) hierarchical scale.⁷ This has been used in many other studies with the HSN data. In general, our observed

⁵See Mandemakers (2000) for further details of the sampling structure, goals of the HSN-database and more information on the HSN.

⁶The Netherlands, at the time, had 11 provinces and in terms of economic activity the three provinces included in this study were jointly very representative of the country. The same is true for aggregate mortality rates in our data which closely resemble patterns at the national level.

⁷Examples of common 19th century occupations in Van Tulder’s (1962) 6 social classes are as follows: (1) diker, day laborer, dock worker (2) beer brewer, farm laborer, florist, fisherman (3) barber, baker, shoe

Table 1: Sample sizes of three categories of individuals who reach age 16: those who die before marriage, those whose marriage and death date are observed, and those whose longevity is right-censored at marriage. Percentages by gender

	Number of Individuals	% Never Married	% Married- Dead	% Married- Censored
Total	5593	21.38	52.91	25.71
Men	2709	53.85	48.16	44.51
Women	2884	46.15	51.84	55.49

explanatory variables for individual marriage and mortality are realized at birth as opposed to those acquired later in life, as the latter may be endogenous or confounded. The place of residence at birth is included as a binary choice urbanization indicator which takes a value of 1 if the person is born in a city and 0 otherwise. One disadvantage of the unprecedented observation window is the absence of several explanatory variables commonly used in the mortality literature but unobserved in population registers. Notably, we do not observe the individual’s adult health status and access to public health services and medical technology.

To provide summary statistics of outcomes of interest, we distinguish between 3 types of people. The first group consists of people who never marry during their lifetime and therefore no marriage date is observed for them. The second group comprises of individuals for whom marriage as well as death dates are recorded. Those in the third category are not observed after their marriage and therefore their death dates are missing. Table 1 presents the sizes of the 3 groups and their composition in terms of gender. Table 2 gives further details for these 3 groups of people, once again by gender, for the duration of marriage and mortality, where observed.

Life-course study of late-life mortality risks of individuals more or less mandates the need for historical data with full individual lifetimes of a reasonable sample size. However, use of historical data requires some understanding of the institutions of the time. The following subsection aims to provide some context.

3.2 Historical context

All births and most marriages in the data took place more than 50 years ago. This calls for a discussion of the relevance of studies with such historical data for contemporary long-run health effects of early-life conditions. Clearly, at the time, economic and nutritional conditions in the Netherlands were different from current conditions. During the birth cohort

smith, carpenter (4) bailiff, merchant, innkeeper (5) factory manager, headmaster, infantry captain (6) lawyer, pharmacist, surgeon.

observation window, the Netherlands did not have an unemployment insurance (UI) system. Instead, people without work could try to obtain some income support from charities and churches. The absence of an UI system means that the business cycle is a relatively powerful determinant of household income. This strengthens the usefulness of an empirical approach to study effects of economic conditions early in life by instrumenting the latter with the business cycle.

It is also important to point out that recent medical research has shown that not just fetal malnourishment is associated with long-run effects on mortality, but, more in general, that discrepancies between early-life conditions in utero and shortly after birth on the one hand, and later lifestyle on the other hand, lead to long-run effects (see e.g. Mogren et al., 2001, and Holemans, Caluwaerts and André Van Assche, 2002; see also Fogel, 1997, for an overview). So in modern as well as historical societies, individuals born in low-income households with higher nutritional intakes later in life may be at risk at higher ages. Note that the virtual disappearance of infant mortality implies that those who would have died if born under adverse conditions in the nineteenth century nowadays survive into adulthood. This can be seen as a factor that contributes to the potential relevance of long-run effects in modern societies.

It is possible that the causal pathway from economic conditions to mortality at higher ages is amplified by stress at the household level shortly before and/or shortly after birth. Adverse aggregate conditions may induce stress by way of (a higher perceived probability of) income loss. Clearly, if stress is driven by exposure to adverse information and by relative deprivation compared to the relevant population, then stress effects may be as important today as they were say 100 years ago. Moreover, stress may exacerbate the effects of adverse nutrition and health infrastructure by the perception that nutrition and health care will be insufficient. Farah, Noble and Hurt (2008) find that poverty in the household leading to stress causes neurological damage among children in the first years of their life, resulting in a lower IQ.

For current developing countries, which in certain aspects may be regarded as similar to or worse off than the Netherlands in the period evaluated in the present paper, the existing literature has focused on inequalities in infant and child mortality by household socioeconomic status, since there are typically no long run data registers (see Sastry, 2004). In this sense, our paper aims to complement these studies by studying long-run mortality effects.

To assess the relevance of historical evidence of marriage effects, it is useful to cite some more information on the institution of marriage in Northwestern Europe within our observation window. Petersen (1960), Matthijs (2003), Hartman (2004) and Dribe and Lundh (2010) provide overviews, and the latter study also cites other recent overviews. In most of the 19th century, the average age at marriage was rather high, a substantial fraction of individuals

remained bachelor, and the average age difference between men and women was about 2 years. These features are also visible in our data; see Table 2. Socio-economic origin, age, and geographical origin have been found to be particularly strong determinants of marriage choice. Perhaps more importantly for our purposes is the fact that many women left the labor force upon marriage, and instead bore children and took care of the household. In the absence of societal social safety nets, the economic and care dependence of spouses was high.

One may therefore expect that marriage was even more important for survival than nowadays, in the Netherlands. Historical records also note a societal contempt for unmarried women beyond the age of 30 (Van Poppel, 1992). A similar but larger ‘stigma’ was attached to the unwed motherhood (see Modin, 2003 and Modin et al, 2009). Despite this, in some parts of Northwestern Europe, at the turn of the nineteenth century the share of illegitimate births could be as high as 11% on average and up to 20% in rural areas. In addition to the disadvantage of being born to mothers usually hailing from the lowest stratum of society these children were often deeply neglected, receiving little sympathy or support from the general public. Infant mortality rates amongst children born-out-of wedlock were therefore high. In light of these societal norms, women who conceived out-of-wedlock would have all the incentive to marry quickly if possible. In the absence of reliable fertility records for the individuals in our sample we are unable to comment on the timing of their marriage in relation to start of fertility. While rates of illegitimacy in the Netherlands are noted to be lower compared to Sweden at the time, conception-out-of-wedlock could be another determinant of marriage.

On the other hand, for the majority of the women, the association of marriage and child-birth means that women were exposed to life-threatening experiences during childbearing ages post matrimony. This, again, also applies to the current situation in developing countries. According to Dasgupta (2011), maternal mortality is the largest single cause of death among women in their reproductive years, in several poor countries. In Sub-Saharan Africa, maternal mortality is 90 times larger than in high-income countries (World Bank, 2010).

4 Empirical methodology

4.1 Outline of the approach to identify causal effects

Consider again Figure 1 in Section 1. We estimate a joint model for all four causal effects, taking into account that all variables may be affected by unobserved determinants. To deal with the potential endogeneity of the actual economic conditions in the household early in life, we use business cycle conditions in early years of life as an indicator of individual economic well-being. To explain how we deal with the endogeneity of marital status and the marriage date, it is useful to think of our data as containing two subsamples: one with individuals

Table 2: Summary statistics of duration variables

	Never-Married	Married-Dead	Married-Censored
<i>Age of Marriage:</i>			
Full sample	—	28.32* [26.34] (7.48)	27.90* [26.21] (6.67)
Men	—	29.59* [27.32] (7.90)	28.97* [26.99] (7.14)
Women	—	27.14* [25.42] (6.86)	27.06* [25.51] (6.14)
<i>Age of Death:</i>			
Full sample	57.10* [65.89] (25.22)	70.82* [74.76] (16.36)	—
Men	53.87* [61.02] (24.91)	71.27* [74.34] (15.07)	—
Women	60.88* [70.36] (25.09)	70.40* [75.10] (17.47)	—

* : mean, [] : median, () : standard deviation

born in adverse years and one with individuals born in favorable years. Suppose that for each of these two subsamples, one can estimate the full model separately (this requires identification for given early-life conditions that are equal for all subsample members). The estimation would give two sets of results, including two different effects of marriage on mortality. Contrasting these results then reveals the effects of the indicator of early-life conditions on all parameters in the model, including the interaction effect of the indicator of early-life conditions and the effect of marriage on mortality.⁸

What remains is to demonstrate that each of these two separate models is identified for given early-life conditions, even if the marriage date is endogenous in the sense that marriage and mortality have shared unobserved determinants. For this we rely on the Timing-of-Events approach for the identification of the effect of the occurrence of one event on the rate that another event occurs (see Abbring and Van den Berg, 2003). In our context, the former

⁸Notice that the empirical inference produces estimates of effects of the business-cycle *indicator* of early-life conditions; not of the effects of the all early-life conditions themselves. The extent to which one can generalize the conclusions about the former effects to conclusions about the latter effects depends on the extent to which the cyclical fluctuations in economic conditions are collinear to the over-all actual conditions early in life. We return to this issue below.

event is marriage and the latter is death. For given early-life conditions, our model reduces to a bivariate duration model for the duration until marriage and the duration until death, with a causal effect of marriage on the mortality rate and with possibly shared unobserved determinants of the marriage rate and the mortality rate. If marriage were not endogenous, conditional on observable characteristics, then the causal effect of matrimony on mortality could be estimated in a straightforward way as the coefficient of a time varying regressor that takes a value of 0 prior to marriage and 1 thereafter. However, as discussed above, several unobserved factors, like health, could drive the timing of both marriage and mortality. So for instance, a healthy person might marry earlier due to increased attractiveness in the marriage market but might also die later. Inability to take into account this potential correlation between unobserved factors driving marriage and mortality would then bias the estimates of the causal effect of marriage on mortality upwards. Identification of the causal effect of potentially endogenous marriage on mortality therefore requires explicit accounting for this correlation structure. The Timing-of-Events approach allows for the identification of such models, with correlated unobserved heterogeneity terms for marriage and mortality⁹, provided that (i) the unobservables are independent of the observed explanatory variables (i.e., the random effect assumption holds), and (ii) the marriage and mortality rates satisfy Mixed Proportional Hazard (MPH)-type specifications. It is important to point out that for given conditions early in life, the identification of the marriage effect does not require an instrumental variable (in the usual sense of the word) for marriage. Identification effectively exploits the fact that the causal marriage effect on mortality only works from the entry into marriage onwards, whereas the association between marriage and mortality due to shared determinants works at all ages. This requires a minimal amount of randomness in the moment of marriage, which in turn can be justified by the random element in the arrival of opportunities in the marriage market.

To disentangle the long-run effects of conditions at birth and during childhood, we may exploit the age variation in the timing of the stages of the business cycle across individuals.

The set-up of this section is as follows. In the next subsection we examine the business-cycle indicator of early-life conditions in detail. The subsequent subsection discusses the Timing-of-Events approach in detail.

4.2 Business cycles

In principle, one would like to compare cohorts born in economic booms to those born during economic troughs with otherwise identical conditions over life. This however is not possible due to the steady secular improvements in living conditions, medical innovations

⁹See Subsection 4.4 for details. By now, this approach has been used in dozens of studies. Richardson and Van den Berg (2011) contains an empirical example in a labor economics setting. They discuss in detail which assumptions are required to hold for the method to be applicable.

and health care over time. As Van den Berg et al. (2006) point out, this issue can be dealt with in a conservative way by comparing a cohort born in a specific boom to that born in the subsequent recession, because the latter benefit more from secular developments. In this case any reduction in longevity can be attributed to the cycle. However, given the small sample size of 5593 individuals, its impossible to compare outcomes from two consecutive stages of a cycle, especially if we wish to consider the two genders separately. Therefore, following Van den Berg et al. (2006) we identify intervals of successive years of "booms" and "recessions".

To obtain cyclical indicators, we decompose the historical time series on log annual real per capita GNP over the observation window. The GNP series, instead of the conventionally used GDP, is chosen purely for reasons of availability of mutually consistent observations over the years of interest. Due to the unavailability of GNP data for the years 1812-1814, we only consider individuals who were born in and after 1815. Figure 2 presents log annual real per capita GNP, measured in 1,000 Euros with 1995 as a base year. The graph highlights both the upward trend and the many cyclical fluctuations.¹⁰

We perform a trend/cycle decomposition of the log annual real per capital GNP using the Hodrick-Prescott filter with smoothing parameter 500. Figure 2 presents the cycle and trend of the GNP series as function of calendar time. The plot shows that periods of economic booms and recessions are clearly identifiable in the data and Van den Berg et al. (2006) show that these are robust with respect to the choice of the decomposition method and smoothing parameter. Figure 3 provides a histogram of the distribution over time of the cyclical term (or indicator) which will be our main explanatory variable. For most of the analysis we round-off the value of the cyclical term to a binary outcome representing economic upturns or downturns.

We additionally control for incidence of epidemics¹¹ and war. World War II (1940-45) has been the only war and occupation on Dutch soil since Napoleon. It included the severe famine of the winter of 1944/45, where mortality rates peaked because of malnutrition (Jewish genocide victims were excluded from the data). The period of the World War II is represented using a separate dummy variable as no reliable macro-economic data is available for this interval.

As discussed above, for the interpretation of the results it is relevant whether the birth cohort size varies over the business cycle. Bengtsson and Dribe (2006) find that parents in rural Sweden in the 19th century fine-tune their fertility outcomes with respect to the anticipated fluctuations in the harvest returns. In our case, this would affect the availability of partners in the marriage market at the mean age of marriage, and this may affect the marriage rate in turn. Some past literature (for instance Blau et al., 2000) has found an

¹⁰Jacobs and Smits (2001) discuss in detail the macro-economic time series in the Netherlands in the 19th century. Business cycles in the Netherlands were highly correlated to those in the United Kingdom.

¹¹See e.g. e.g. Almond and Mazumder (2005) and Almond (2006) for discussion on adverse effects of in-utero exposure to an epidemic on long term individual outcomes.

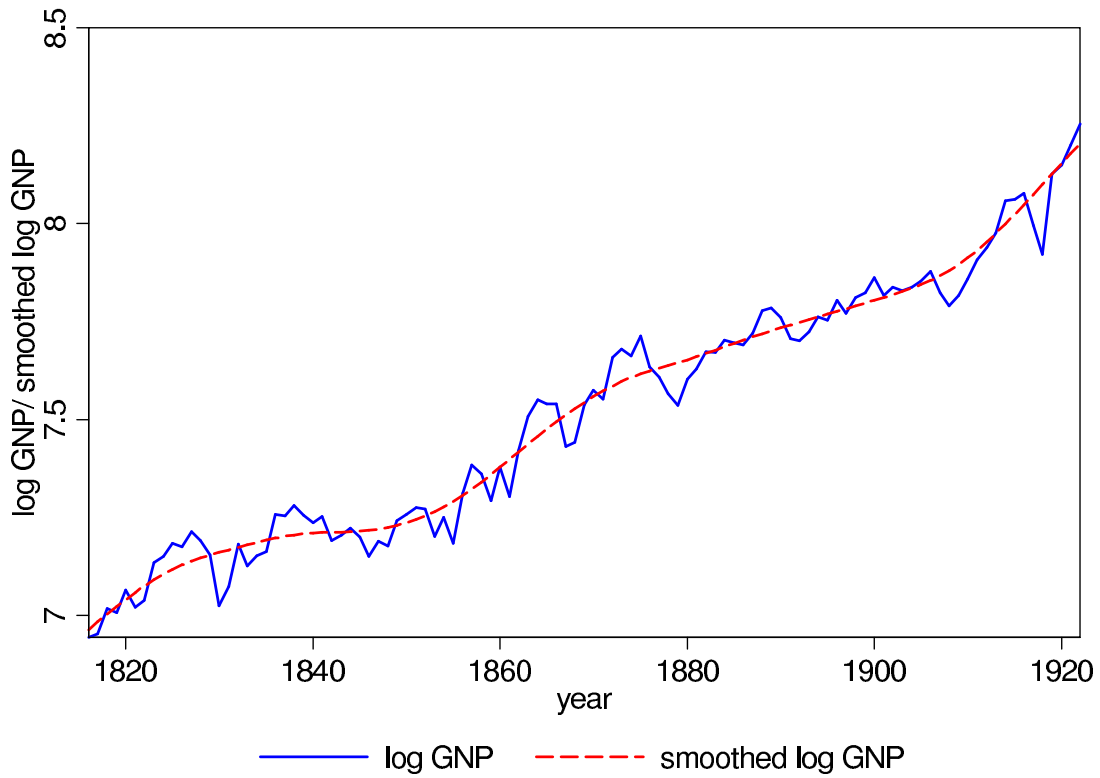


Figure 2: Log annual real per capita GNP.

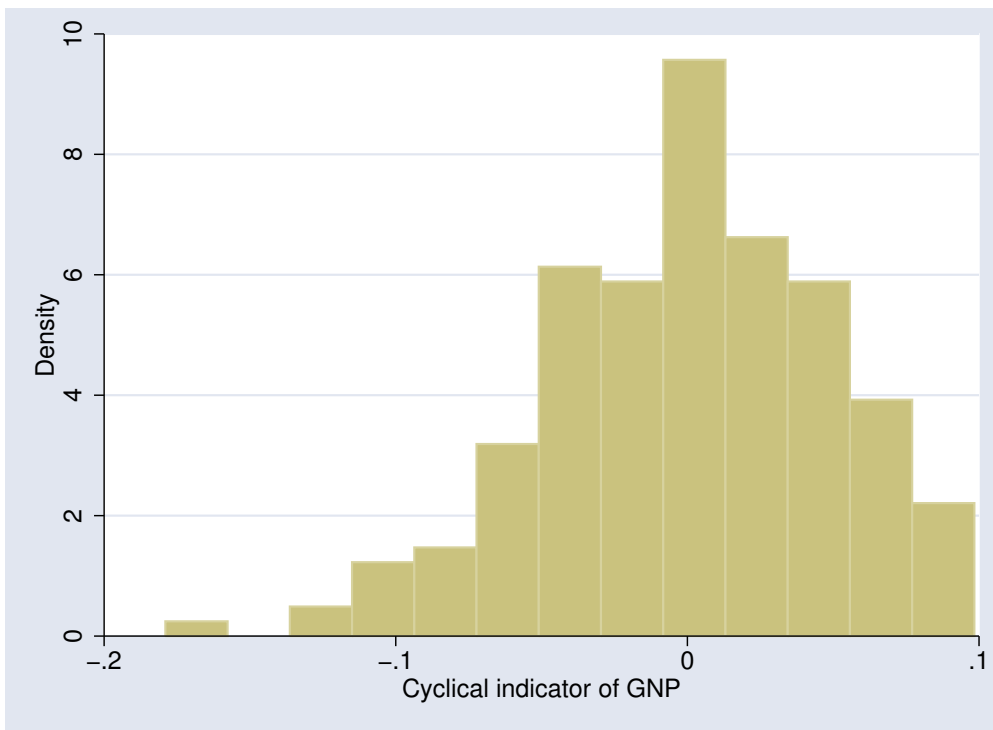


Figure 3: The distribution of the cyclical indicator of GNP over birth years.

inverse relationship between contemporaneous marriage market tightness and marriage rates. In sum, if the cohort size is pro-cyclical then, following this line of reasoning, we would expect that the marriage rate in the cohort is also pro-cyclical.¹² (At the same time, a large cohort size may suggest that relatively many frail individuals are born.) However, the availability of potential marriage partners at any point of time is also determined by contemporaneous economic conditions. And marriage markets depend on cohort sizes of men and women within certain age intervals of a size that is unknown to the researcher.

To proceed, we examine national time series of birth rates by gender.¹³ Regressing total births on the cyclical component of the GNP series, first in the year of birth and then separately in the year prior to birth, we find no significant correlations¹⁴ and hence little evidence of endogenous fertility.¹⁵ To get a closer look at the availability of potential marriage partners we consider sex-ratios over time and find that these remained pretty stable in the Netherlands at the time. Further, regressing sex-ratios on cyclical component of GNP series we find no significant correlation at age 0 or at age 16¹⁶. The information on ages of grooms and brides is only available for the province of Utrecht. Using this subset of the data, we find that the age difference between the groom and the bride is approximately normally distributed with the mean close to 2 years and a standard deviation of 5.84 years. Although on an average the bride was younger than the groom, in the light of this distribution, the researcher is forced to make some assumptions about what comprises the potential pool of marriage partners. Considering the ratio of men to 2 year younger women, we find that this ratio also shows only little variation overtime. Finally, these findings continue to hold while studying the role of social class in determining marriage and mortality, which reiterates the findings of Van den Berg et al. (2009) who find no significant effect of cyclical components of the business cycle at birth on the over-all cohort size or the cohort size by social class. This is as far as we can go to address the issue whether the composition of newborns in terms of unobserved characteristics varies over the cycle.

4.3 A bivariate duration model for marriage and mortality

For convenience, we use lower case symbols for random variables as well as their realizations, and we abstract from potential outcome variables. The outcomes of interest are the duration until marriage t_m and the duration up to death, t_d . We assume that all individual differences in the joint distribution of these two processes is conditional on calendar time τ , other

¹²Recall that an effect of the conditions at birth on the marriage rate by way of the health of the individual may go both ways: individuals born under adverse conditions may be less healthy and therefore have more difficulty in finding a partner, or these individuals are aware of higher benefits of marriage to mitigate a higher mortality rate and therefore have a higher marriage rate.

¹³Obtained for the whole of Netherlands from the Human Mortality Database (www.mortality.org).

¹⁴P-values of 0.37 and 0.84 respectively.

¹⁵See, for instance, Angrist, 2002 for a motivation for considering impact of sex ratios on marriage rates.

¹⁶p-value of 0.13 and 0.33 respectively.

socioeconomic and demographic factors x , current macro-economic conditions $z(\tau)$, trend components and cyclical indicators $z_{tr}(\tau - t + i)$ and $z_c(\tau - t + i)$ of macro-economic conditions in earlier years of life ($i \in \{0, \dots, t - 1\}$), various interaction terms, and the unobserved characteristics v . The vector x contains covariates that are observable at birth, and v is independent of x . Let t_m be the moment at which an individual gets married. The indicator function $I(t_m < t)$ is used to denote whether an individual is married at age t or not. The parameter δ captures the causal effect of marriage on the individual mortality rate. This parameter may in turn depend on various variables, including of course the early-life conditions. The studies mentioned in the previous sections suggest that the effect strongly depends on the age of the individual under consideration.

For ease of exposition, we may normalize τ for a given individual such that $\tau = 0$ at birth, and we may subsume the variables $z(\tau)$, $z_{tr}(\tau - t + i)$ and $z_c(\tau - t + i)$ in x , which accordingly becomes a time-varying explanatory variable $x(t)$. The unobserved determinants of the individual mortality rate and the marriage rate are denoted by v_d and v_m , respectively. The mortality rate at age t , conditional on $x(t)$, v_d , and t_m is denoted by $\theta_d(t, x(t), v_d, t_m)$ and is assumed to have the following specification

$$\theta_d(t, x(t), v_d, t_m) = \lambda_d(t) \exp(x'(t)\beta_d + \delta I(t_m < t) + v_d) \quad (1)$$

For $z(\tau)$ we take log annual real per capita GNP at t , as well as dummy variables for years with epidemics and World War II.¹⁷

Since the focus is on the impact of marriage on mortality, we only consider the set of individuals who reach age 16, i.e. the legal age of marriage. The individual is exposed to the possibility of marriage thereafter and we only consider outcomes after this age. However, we include information about the conditions prevailing in years of early childhood (1-6 years of age), leading right up to 16 years (ages between 7-12 and 13-15 years). These are summarized by 4 binary indicators. A binary boom / recession dummy is used to record a favorable (cyclical component > 0) / adverse (cyclical component < 0) period of the business cycle in the year of birth. 3 additional indicators of average cyclical macro-economic conditions during the age intervals of 1-6, 7-12 and 13-15 years are also included by means of dummies for whether or not the averages of the cyclical element of the GNP series is positive or negative between these ages.

The trend component $z_{tr}(\tau - t + i)$ of the GNP series in the years of birth and childhood, obtained from the Hodrick-Prescott decomposition, captures the secular long-run effects. Van den Berg et al. (2006) discuss in detail the empirical challenges in distinguishing the effects of these trend components from the effects of current log GNP $z(\tau)$ and age t , due to multicollinearity. All these variables are by and large increasing over time, and at the

¹⁷This takes care of the fact that GNP series is missing for the years of World War II.

individual level current log GNP can be captured fairly well by the sum of the trend component of the GNP in early years of life and an increasing function of age. Consequently, the trend component is mostly omitted from the model specification. For similar reasons calendar time τ is also left out. We do, however, include the contemporaneous cyclical conditions in the macro-economy which are also an indicator of current employment opportunities and the resulting marriage market conditions. Inclusion of the cyclical component of the GNP controls for the impact of contemporaneous employment conditions which have been noted to influence the ‘marriageability’ of the individual (for instance Blau et al., 2000). The trend component of the series captures all secular effects from birth to the current age.

For an individual of age t years who is not yet married, the marriage rate at t conditional on observed and unobserved characteristics $x(t)$ and v_m is denoted by $\theta_m(t|x(t), v_m)$ and is assumed to have the MPH specification given by,

$$\theta_m(t|x(t), v_m) = \lambda_m(t) \exp(x'(t)\beta_m + v_m) \quad (2)$$

where once again $x(t)$ is independent of v_m and the individual’s background characteristics x are constant over time.

Now consider the joint distribution of t_d and t_m . Conditional on $x(t)$, v_d and v_m , the only possible relation between the variables t_d and t_m is the relation by way of the direct/causal effect of a marriage on the mortality rate. In case of independence of v_d and v_m , we would have a standard duration model for $t_d|x(t), t_m$ in which $I(t_m < t)$ can be treated as a time-varying regressor that is orthogonal to the unobserved heterogeneity term v_d . However, if v_d and v_m are not independent, inference on $t_d|x(t), t_m$ has to be based on $t_d, t_m|x(t)$. This means that we need to integrate the individual likelihood contribution over the distribution $G(v_d, v_m)$ which is the joint distribution function of the unobserved characteristics v_d and v_m among 16 year olds. Right-censoring of individuals is solved in a straightforward manner within the duration analysis framework. We estimate the bivariate duration model with full maximum likelihood.

Strictly speaking, the effects of $z_c(\tau - t)$ in the model (including any effect on δ) capture the causal effects of the business cycle at birth. We interpret the cycle at birth as an exogenous indicator of the early-life conditions. Suppose that the actual economic well-being of the parents’ household at birth equals a permanent component plus a transitory component. If the permanent component is captured by social class and the transitory component equals a proportion of the business cycle indicator, then the quantitative effects of the business cycle indicator may be translated into quantitative effects of the actual economic conditions at birth.

4.4 Parameterization

We use flexible specifications for the causal effect δ of marriage on mortality rate, the duration dependence functions, and the bivariate unobserved heterogeneity distribution. In order to allow the causal effect of marriage on mortality δ to vary over the individual's lifetime, δ is expressed using Chebyshev polynomials, for instance of degree 4, in the age of the married individual. This polynomial could be specified simply as a sum of terms $\eta_i t^i$, $i = 0, 1, \dots, 4$ where t is the age of the individual. However, since the terms of t^i are not orthogonal, estimation of the parameters η_i is afflicted by multicollinearity. We take care of this problem by using Chebyshev polynomials of the second kind. In this case, the polynomial is specified as a sum of terms $\eta_i U_i(t)$, $i = 0, 1, \dots, 4$ where $U_0(t), U_1(t), U_2(t), U_3(t)$ and $U_4(t)$,¹⁸ are mutually orthogonal polynomials of indexed degree. Furthermore, we allow this effect of marriage on the mortality rate to vary by conditions in early life of the individual by including interaction terms of δ and the dummy of being born in a boom or not as determinants of the mortality rate.

This set up implies that the total age dependent causal effect of marriage on the mortality rate for a married individual would be given by

$$\delta = \sum_{i=0}^4 \eta_i^{ape} U_i(t) + \left(\sum_{i=0}^4 \eta_i^{a,int} U_i(t) \cdot I_{boom} \right) \quad (3)$$

where η_i^{ape} are the parameters corresponding to the mutually orthogonal polynomials $U_i(t)$ of degree i capturing the age dependence of the causal effect of marriage on individual death rate. The second term $\left(\sum_{i=0}^4 \eta_i^{a,int} U_i(t) \cdot I_{boom} \right)$ takes into account any effect of early-life conditions, represented by the dummy (I_{boom}) for being born in a year of economic boom or not. The parameters $\eta_i^{a,int}$ are the coefficients of this interaction term. Consequently, for a person born during an economic recession ($I_{boom} = 0$) the total causal effect is

$$\delta_{recession} = \sum_{i=0}^4 \eta_i^{ape} U_i(t) \quad (4)$$

The time dependence of the hazard functions is similarly expressed using Chebyshev polynomials of the second kind of degree 4 in age of the person. Thus, the duration dependence of the marriage and mortality rates are respectively given by:

$$\lambda_m(t) = \exp \left[\sum_{i=0}^4 \eta_i^m U_i(t) \right] \quad \text{and} \quad \lambda_d(t) = \exp \left[\sum_{i=0}^4 \eta_i^d U_i(t) \right] \quad (5)$$

These specifications contain 10 parameters in total (η_i^m and η_i^d , with $i = 0, 1, \dots, 4$).

¹⁸To start, the domain of the ages t where $t \in [0, 103]$ is linearly transformed to the domain of the orthogonal Chebyshev polynomials such that now $\hat{t} \in [-1, 1]$. This is done in our case by using the simple rule $\hat{t} = 2 \frac{(t-t_0)}{(n_t-1)} - 1$ where n_t is the year of the individual's life that is being considered. Then our orthogonal polynomials are: $U_0(\hat{t}) = 1$, $U_1(\hat{t}) = 2\hat{t}$, $U_2(\hat{t}) = 4\hat{t}^2 - 1$, $U_3(\hat{t}) = 8\hat{t}^3 - 4\hat{t}$, $U_4(\hat{t}) = 16\hat{t}^4 - 12\hat{t}^2 + 1$.

We take the joint distribution of the unobserved heterogeneity terms v_d and v_m to be bivariate discrete, with two unrestricted mass-point locations for each term. Let $v_d^1, v_d^2, v_m^1,$ and v_m^2 denote the points of support of v_d and v_m , respectively. The associated probabilities are denoted as follows:

$$\begin{aligned} \Pr(v_d = v_d^1, v_m = v_m^1) &= q_1, & \Pr(v_d = v_d^2, v_m = v_m^1) &= q_3 \\ \Pr(v_d = v_d^1, v_m = v_m^2) &= q_2, & \Pr(v_d = v_d^2, v_m = v_m^2) &= q_4 \end{aligned}$$

with $0 \leq q_i \leq 1$ for $i = 1, \dots, 4$, and $q_4 = 1 - q_1 - q_2 - q_3$.

The covariance of v_d and v_m is given by, $cov(v_d, v_m) = (q_1q_4 - q_2q_3) \cdot (v_d^1 - v_d^2) \cdot (v_m^1 - v_m^2)$. We note that $cov(v_d, v_m) = 0$ would imply independence of v_d and v_m and $q_1 = q_4 = 0$ or $q_2 = q_3 = 0$ would mean perfect correlation. In a regression framework, the set-up would be similar to a non-parametric, joint specification of the error structures of a triangular system of two simultaneous data generating processes - marriage and mortality. Identification would follow therefrom.

5 Results

5.1 Estimation results by gender

Table 3 presents the estimation results for the full model. For the estimates concerning entry into marriage, a positive value is associated with an earlier marriage. For the mortality rate, positive values of estimates signify a shorter lifetime.

The first crucial result is a significant causal effect of being married on the mortality rate for both men and women. Gender differences however are vital, and so are age and the conditions around the individual's birth. The estimates of the size of the effects of the latter are hard to read from the separate coefficients in Table 3. Figure 4 therefore presents, in a compact way, the impact of marriage on the instantaneous mortality rate by gender and also separately for birth during an economic boom versus a recession, as implied by our estimation results in Table 3. For sake of exposition, the instantaneous hazard rates are plotted for marriage at the age of 30. Similar results (not presented) are obtained for other ages of marriage. The figures also plot the mortality rates in the absence of marriage. To show the effect of marriage without 'contamination' from other explanatory variables, each panel averages over the other explanatory variables. Note however that the model includes a time-varying explanatory variable (GNP trend) whose effect runs against the age dependence of the mortality rate. Therefore, care should be taken when interpreting the increasing shapes of the mortality rates in the figure.

The four panels of Figure 4 clearly show a sudden jump in the mortality rates at the moment of marriage. For women born in a recession, the mortality rate shows a large and

long lasting increase in response to marriage. Favorable early life conditions help mitigate the adverse effect of marriage for women. For men, on the other hand, the impact of marriage on the mortality rate is favorable irrespective of cyclical conditions pertaining in the economy at the time of birth. This result goes against the view that there is no protective effect of marriage for women. Instead, the degree of protection depends on early-life conditions and changes with age. In any case, part of the association of marriage and life expectancy is causal for each gender.

We aim to determine whether the causal effect of marriage on mortality is statistically significant or not. Figure 5 displays the estimates of the age-dependent marriage effect interacted with the indicator of early-life conditions on mortality, along with the 95% confidence intervals, on the log mortality rate (that is, δ is plotted rather than $\exp \delta$). Once again, given large gender differences and the vital role of the economic conditions in early years of life, the plots are presented separately by gender and condition of the business cycle in the birth year. The results reiterate the presence of an age-dependent causal effect of marriage on mortality for both genders and the relevance of the early life conditions as suggested by the analysis of the instantaneous mortality rate around the time of marriage. We proceed to discuss the results for women and after that for men.

For women (Figure 5a) we find that marriage instantaneously significantly raises the mortality rate in the childbearing ages. This adverse effect of marriage is much stronger – and persists for a longer time – in case of birth under adverse economic conditions. So women born in favorable economic times appear to cope better with problems during the childbearing ages than women born in a year of recession. (in Subsection 4.3 we provide the implied quantitative estimates of average effects on longevity).

It is plausible that the increased mortality during childbearing ages, as compared to the mortality when being single, reflects the health hazards of pregnancy, delivery, childbearing, and taking care of small children. Indeed, in the absence of advanced contraceptives, pregnancies would follow soon after marriage. Additional risk factors for married women in childbearing ages are (i) a possible reduction of nutrition upon the arrival of children, as the total available amount needs to be shared among a larger number of household members, and (ii) an increased exposure to infectious diseases brought into the household by small children. Investigation into the precise driving forces would require data on causes of death (for instance during childbirth). Maternal mortality (i.e., mortality at birth of a child) statistics are unavailable for the Netherlands for our observation window. However, studies report figures of maternal mortality in pre-industrial western societies ranging up to 1600 deaths per 100,000 live births (De Brouwere et al., 1998). Maternal mortality rates in the Netherlands can be expected to be similar to those of Sweden (250-300) and England and Wales (400-450) around 1870. Results from studies on trends in age and gender specific mortality declines in the Netherlands (for e.g. Wolleswinkel-van den Bosch et al., 1998) find a decline

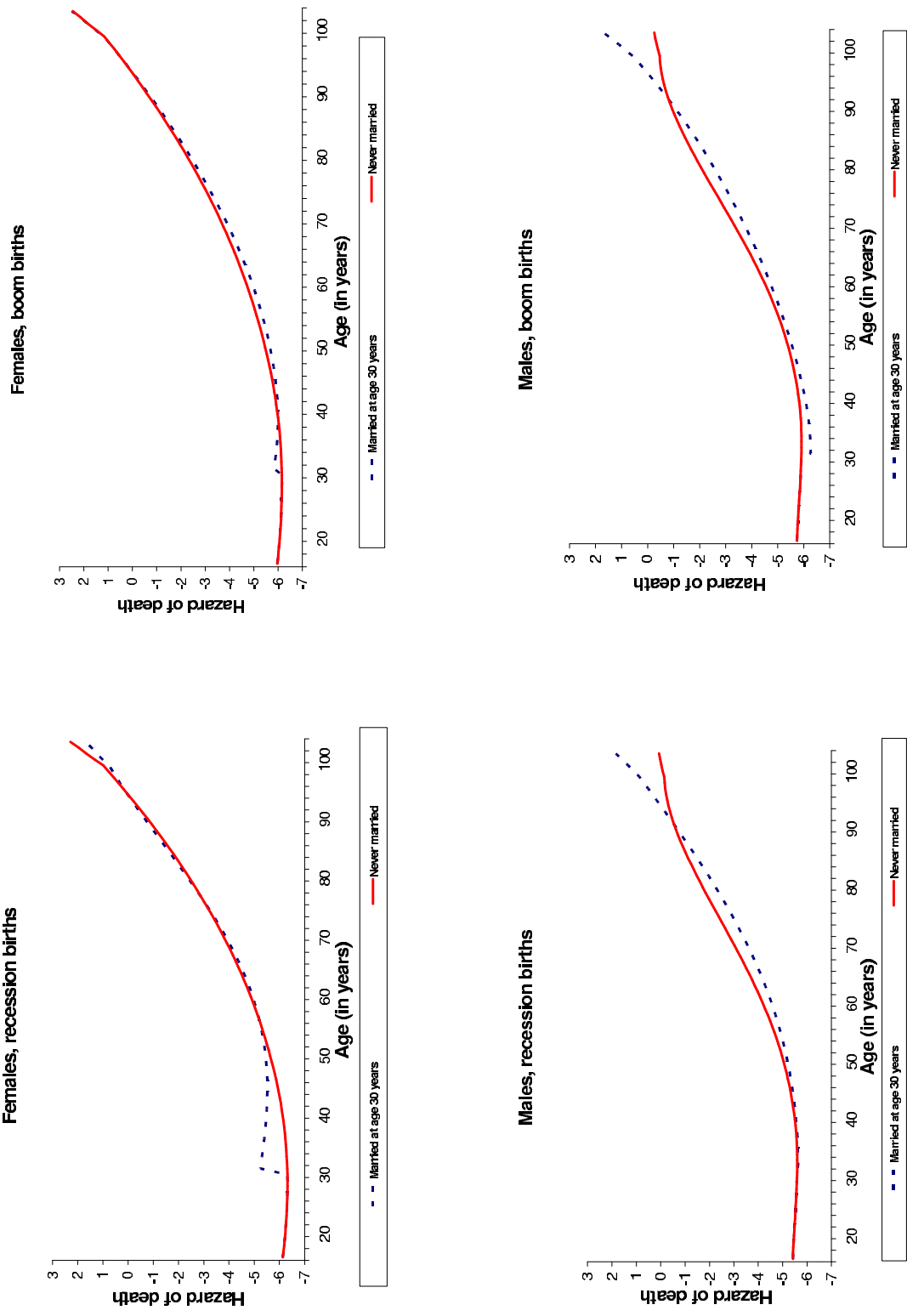


Figure 4: Impact of marriage at age 30 on mortality rate, by gender and by state of the business cycle at birth.

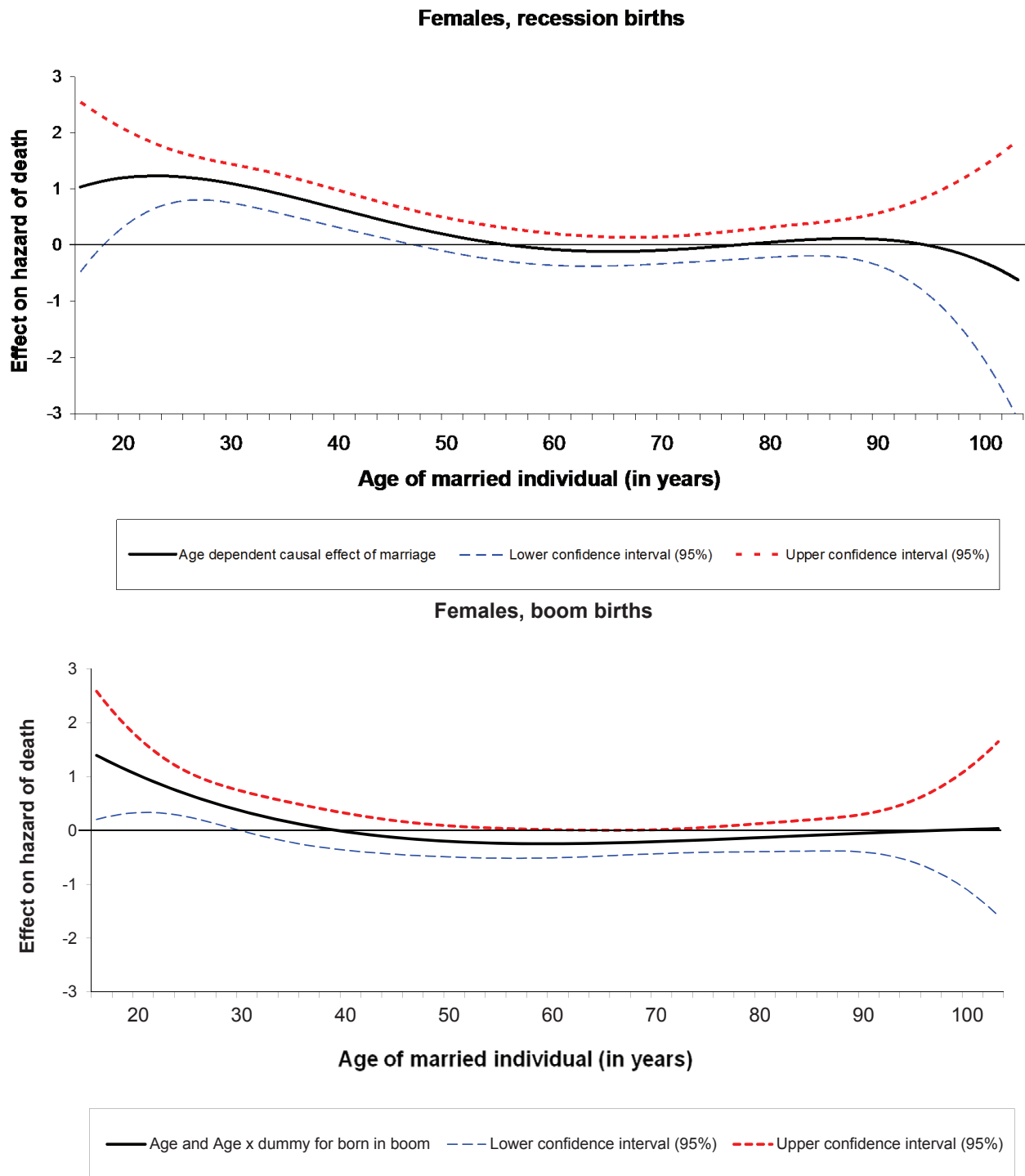


Figure 5: (a) Causal effect of marriage on the mortality rate interacted with economic conditions at birth, as a function of age, for women.

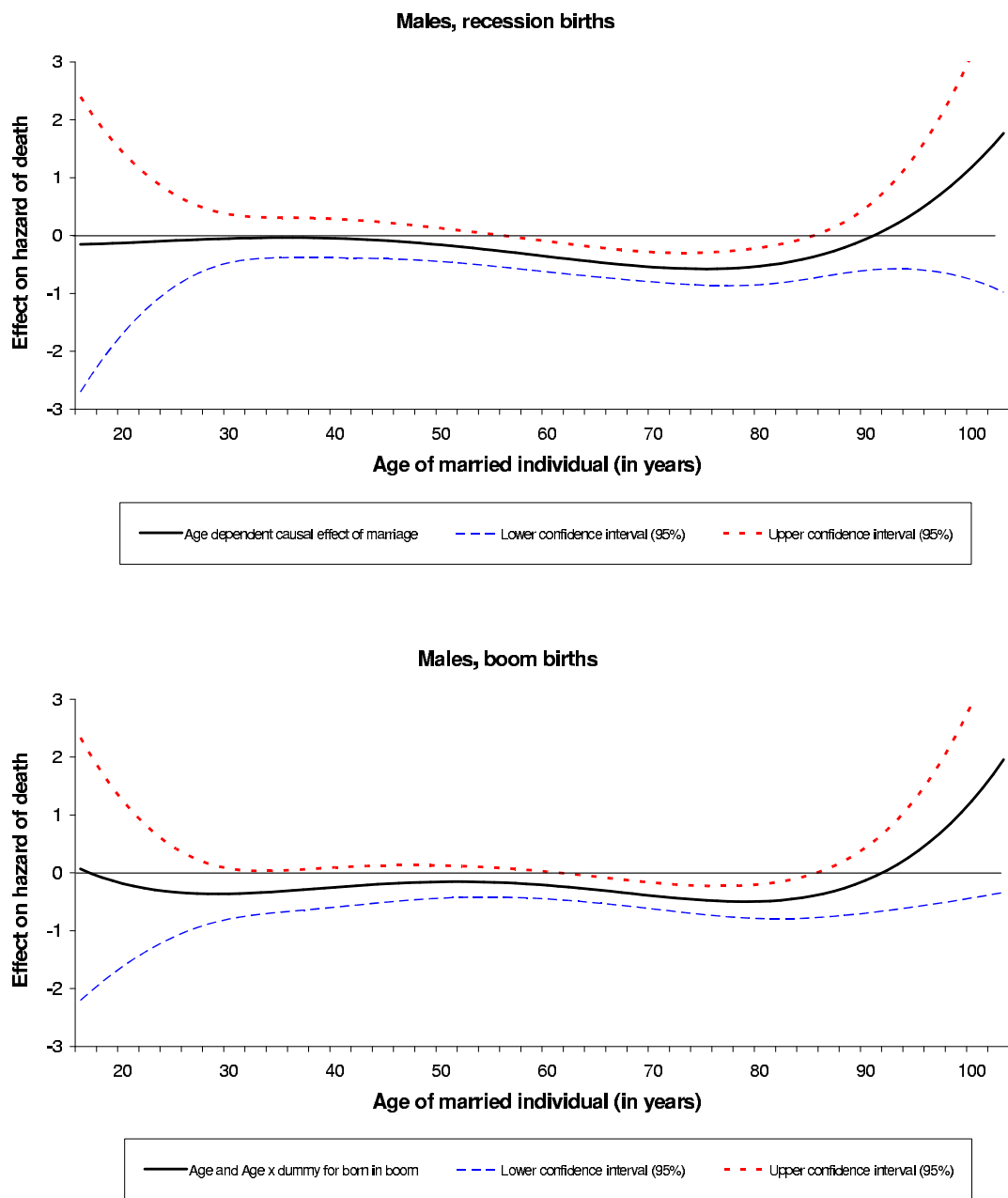


Figure 5: (b) Causal effect of marriage on the mortality rate interacted with economic conditions at birth, as a function of age, for men.

in female mortality towards the end of our observation window for the age interval of 20-49. The authors link this to a decline in marital fertility that started around the same time.

Our results are then consistent with the view that early-life conditions influence the resilience of women during the childbearing stage of the life course. For lack of data, the epidemiological literature has not addressed the effect of early-life conditions on the female mortality associated with pregnancy and delivery. However, a number of studies have demonstrated early-life effects on pregnancy complications and poor reproductive success, where the data are collected retrospectively among those who survive the delivery of their children. Lumey and Stein (1997) show that among women who had been exposed to a famine in utero and who survived up to age 43, the offspring was more likely to suffer from perinatal death. Innes et al. (1999), using birth weight as a proxy for early-life conditions, observe an effect of low birth weight on the risk of developing preeclampsia during pregnancy. The latter is a potentially deadly condition. Hackman et al. (1983) find an inverse association between the mother's birth weight and the baby's need for intensive care. See also the surveys by Lummaa (2003) and Sloboda et al. (2011). The latter reports that women with low birth weight show a marked reduction in ovarian and uterine size in adolescence. Under the assumption that neonatal health problems for the offspring and maternal health problems during childbirth may have common determinants, these studies are of relevance for us. Specifically, they reinforce our interpretation of the role of early-life conditions on health during the childbearing stage of the life course.

Potentially, our empirical finding that early-life conditions influence the length of the age interval during which marriage is not protective against mortality could also be attributed to an effect of early-life conditions on the length of the fertility age interval (age at menopause minus age at menarche). However, according to the epidemiological literature, there is no clear association between nutritional conditions early in life and the size of this interval or on the age at menopause (see Sloboda et al., 2011, for a survey).

Notice that the long-run effect of early-life conditions on female mortality is entirely driven through marriage, in the following sense. Early-life conditions affect the extent to which marriage is protective for mortality. However, they do not affect the mortality rate if marriage does not take place in one's lifetime.

At the same time, female marriage rates are unaffected by conditions in the years of birth and early childhood (early childhood being ages 1-6 years, which the medical literature identifies as crucial for long term development; see e.g. Power et al., 2003). This shows that any strategic considerations to enter or postpone marriage in response to favorable or adverse economic conditions early in life do not play a major role as determinants of marriage. At the very least, any such behavior does not result in visible effects on the marriage rates. Interestingly, the aforementioned study of Lumey and Stein (1997) finds that age at first delivery does not depend on whether the woman was in utero during a famine or not.

Turning now to men (Figure 5b), we find a protective causal impact of marriage on the mortality rate. The effect is significant over the typical ages at death of about 56-85. This finding is intuitive in light of social observations like growing loneliness owing to shrinking social circles for single individuals. Marriage on the other hand could offer support from a wife during older ages and improve quality of life by means of better housekeeping and personal care. The HSN does not record the time of death of spouses of the individuals in the sample. The absence of a consistently positive protective effect of marriage beyond the ages of 85 years probably reflects a limitation of our polynomial specification.

As for the role of conditions in early years of life, in contrast to women, for men we find no significant effect of being born in a boom as opposed to being born in a recession on the protective effect of marriage on the mortality rate. Though men born during adverse economic conditions seem to be enjoying the positive marital effect for marginally longer than married men born during favorable conditions, this difference is not statistically significant. Of course, men born under favorable conditions live on average longer (we discuss this in the next paragraph). Finally, for both men and women our results again show that marital status does not have a time constant impact on the mortality rate throughout life.

Considering the direct impact of early life conditions on mortality, we find a significantly lower mortality rate amongst men born during a boom. This reiterates the results of Van den Berg et al. (2006) who estimate mortality models without including marital status as an explanatory or intermediate variable. Another striking result is a significant negative effect of average cyclical conditions during the age interval of 7-12 years on the marriage as well as the mortality rate of men. We postulate two explanations for this. The first one concerns education. The age interval 7-12 coincided with primary school in the Netherlands, which prior to 1901 was not compulsory and only free for the very poor. Many individuals did not get more formal education than this. Better economic conditions at these ages could facilitate the entry into secondary education; moreover it could lead to larger professional involvement and consequent delays in marriage. In recessions, financial adversity could increase temporary absences from school affecting negatively at least the ‘quality’ of education (Dunn et al., 2003).

Better educational opportunities could also explain the significant negative impact of favorable conditions at ages 7-12 on male mortality. Studies such as Cutler and Lleras-Muney (2006) and Maccini and Yang (2009) find a mediating effect of education on the mortality rate. The fact that we do not find a significant effect of average cyclical conditions during the age interval of 7-12 years on the marriage and mortality rates for women is not inconsistent with this. School attendance of women was often lower and shorter than for men, and career concerns were mostly absent.

The second explanation, which is especially relevant for the direct effect of conditions at ages 7-12 on male mortality, is that these ages include a critical or sensitive period in

boys' development towards their adult health status. Specifically, Van den Berg et al. (2010) identify such a period at around age 9 in the sense that if conditions at this age are adverse then adult height is lower.

Class differences are very important for nuptiality. Male members of the three lower social classes exhibit a much larger marriage rate relative to the upper classes. This is in line with past observations of more frequent and younger marriages for the lower social classes resulting from increased economic opportunities following the industrial revolution (see the literature mentioned in Section 3). Possibilities of social class upward mobility by means of marriage may also arise for women. Investigation into marriage market prospects is left to future work.

Finally, considering age dependence of exit rates into marriage and mortality we find the expected inverted U-shape for the former and a monotonically increasing one for the latter (see Figure 6.¹⁹ We observe that the marriage rate increases until the age of 32 for men and 29 for women after which it consistently declines though at a slower rate after the mid 40's. This sudden slow-down in the declining marriage rate could indicate second marriages. However, in the absence of information about multiple marriages and continued marital status of individuals we are unable to comment any further.

5.2 Sensitivity analysis

5.2.1 Other specifications for the marriage effect on mortality

As robustness checks we estimate several alternative specifications of the causal effect of marriage on the individual mortality rate. First, we try a simpler model with only the age dependent marital effect on mortality without the interactions with the dummy for being born in a boom or not. Another specification replaces the age of the married individual with the number of years married as a determinant of the causal effect of marriage on mortality. This specification is tested with and without additional interaction terms between early life conditions and the number of years married. Finally, following past literature we estimate a 'basic' model where the causal effect of marriage is specified as a time varying regressor i.e. takes a value of 0 before the person is married and 1 after his marriage. Our results are robust to all these alternative specifications. Tests confirm that our full model as estimated above is a better model specification. For sake of brevity, detailed discussion of these alternative specifications and full parameter estimates are not presented here but can be requested from the authors.

¹⁹For sake of completeness we depict the age dependence over the full age range as observed in the data. However, no unexpected patterns are observed in marriage and mortality baselines when shorter age intervals are considered. Note that the scales of values on the vertical axes are determined by normalizations. Hence, the values as such are not informative.

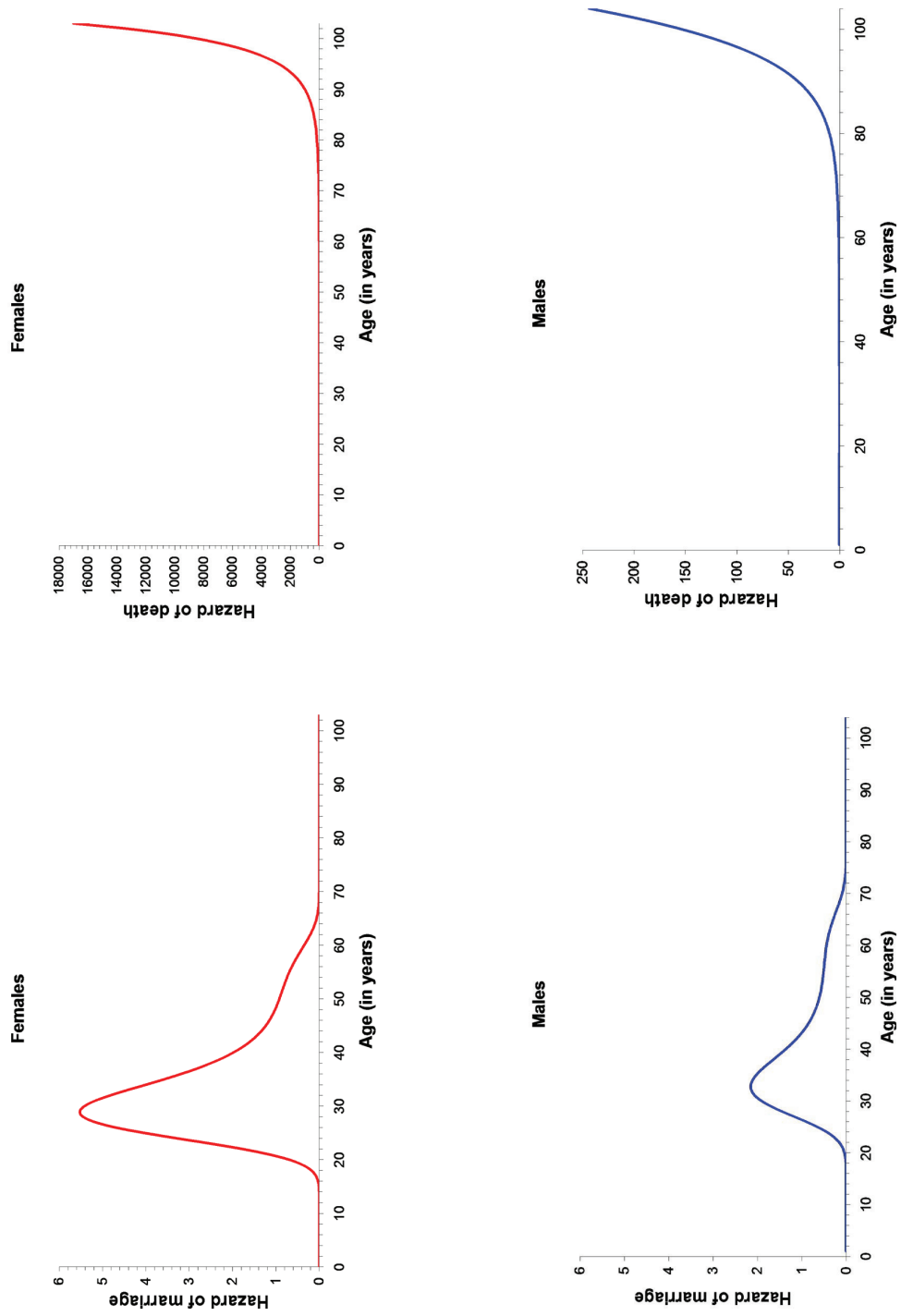


Figure 6: Age dependence of marriage and death (baselines) by gender.

5.2.2 Alternative specifications of other explanatory variables

Different specifications were also tried for other independent variables. Without presenting the detailed parameter estimates of these alternative specifications, this subsection briefly discusses the distinctive features of each of these options. Given our interest in the impact of early conditions in life on marital and mortality outcomes later in adult life we start by giving a closer look to our indicators of early life conditions. First, instead of our 4 binary indicators of early life conditions - birth in a year of economic boom and average cyclical macroeconomic conditions during the ages of 1-6, 7-12 and 13-15 years - we re-estimated our model of marriage and mortality using the actual, average values of the cyclical component of the GNP series at birth or during these age intervals. Our results are robust to this variation. We also tried alternative age intervals for our average cyclical indicators and once again our results remain unchanged. Irrespective of the choice of the intervals the average cyclical conditions during the ages covering the years 7-12 continue to be influential in the marital and death outcomes for men. Distinguishing between the effect of an economic boom around the time of entering primary school and that closer to finishing primary schooling could help shed further light on potential channels underlying the results we observe. Unfortunately our data does not record school enrollment for the subjects and moreover since schooling was neither mandatory nor essentially starting at a fixed age we are unable to comment any further on the possible underlying mechanisms.

5.2.3 The relevance of early conditions in life for the model fit

In the light of past literature that focuses on adult health as a determinant of individual marriage and mortality rates we try to assess the value added by these early life conditions in our estimation. We do so by re-estimating our models without controlling for economic conditions and exposure to epidemics during childhood and years of adolescence. For women, we compare our model with interactions between early life conditions and an age dependent causal effect of marriage to a simpler model with just an age dependent causal effect of marriage on mortality without any controls for early conditions in life. We note that the latter is nested in the former and a likelihood ratio (LR) test rejects the smaller model²⁰. Similarly for men for whom early life conditions did not significantly interact with the causal effect of marriage on the mortality rate, the direct contribution of cyclical economic conditions in first years of life on later life mortality is highly relevant.²¹ From this experiment we conclude that early life conditions are an important determinant of individual marriage and

²⁰LR statistic for the full model vs. the model with age dependent causal effect on marriage without controls for early conditions in life, 41.96 for women with a $\chi^2(20)$, 5% critical value 31.41.

²¹LR statistic for model with age dependent causal effect of marriage on the mortality rate and direct controls of early life conditions vs. model with age dependent causal effect on marriage without controls for early conditions in life, 57.23 for men with a $\chi^2(20)$, 5% critical value 31.41.

mortality later in life. This result provides support to the hypothesis that the link between marital status and mortality is to some extent driven by conditions in the early years of an individual's life.

5.3 Additional discussion and implications

Using our parameter estimates in Table 3 and the actual ages of marriage of the individuals in the sample we find that on an average²² marriage implies a 2.16% decrease in longevity for women. However, once we control for business cycle conditions in the year of birth these figures look very different. For women born during an economic boom, marriage in fact has favorable impact on their life expectancy (0.61% increase in expected lifetime). Therefore, the result of an adverse effect of marriage on the mortality rate for women aged less than 52 years is driven only by women born during economic downswings. For this group marriage reduces expected longevity by 5.40%. For men, marriage leads to a 4.77% increase in life expectancy on an average with no significant difference between those born during economic boom versus births during economic recessions.

Given the non-constant protective effect of marriage over an individuals lifetime, it is also useful to consider by how much life expectancy changes if you marry at any given age. Figure 7 presents the change in life expectancy as a consequence of marriage for every possible age of being married (16 -103 years), calculated using the parameter estimates from our model and averaging over all other explanatory variables. Results are once again presented separately by gender and economic boom or not in the year of birth. Getting married at young ages (below about 25 years) shortens longevity regardless of early-life conditions, as compared to staying single. This is most likely because marriage at young ages increases the length of the childbearing age interval. The adverse effect reduces with increasing age at marriage. Married teenagers are in the worst position. Beyond the mid twenties the adverse effect of marriage on longevity only holds for women born in recessions. This finding suggests that women who might have already suffered a health set-back early in life are less able to cope with future health strains. For men on the other hand, the protective effect is generally higher the younger they marry. We cannot identify the reasons for this result from the data we have. However, early on set of healthier lifestyle and safe habits are plausible causes. Finally, once again we see that the role of early life conditions via marriage is less relevant for men.

The presence of adverse health consequences of marriage for women raises the question why women choose marriage, especially since decisions involve expected present values of various options, and any long-run benefits of marriage are discounted more heavily than the short-run costs. A similar concern has arisen in the "family pay gap" literature that

²²Averaging over individuals marrying at various ages.

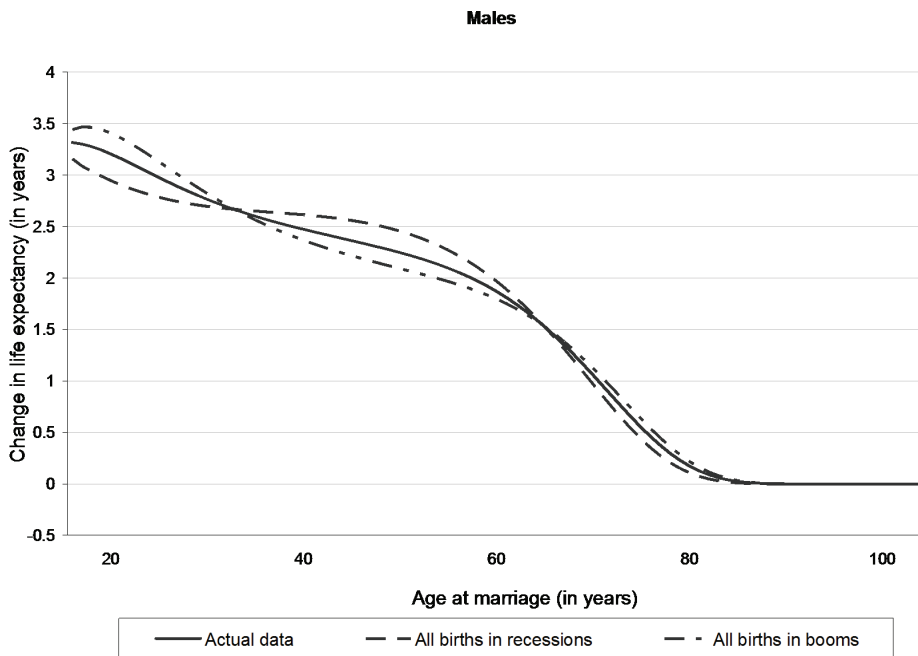
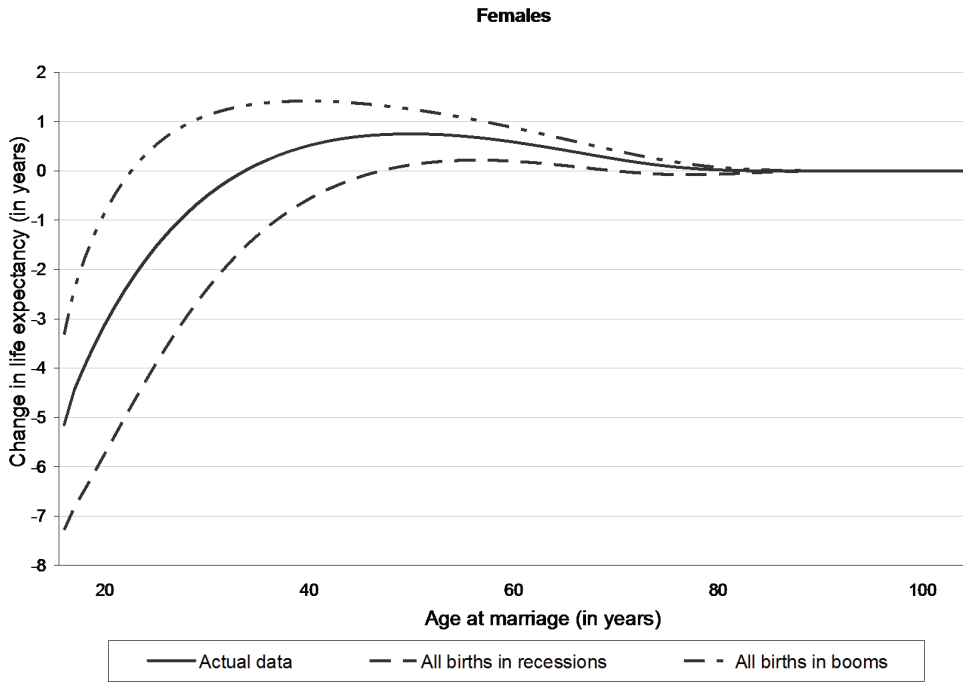


Figure 7: Expected changes in life expectancy as a causal effect of marriage at different ages of getting married.

finds large wage penalties for women choosing to have children. It appears that not only do women planning to have children self select themselves into lower earning occupations and jobs, they also accept large wage losses on return to labor market after child-related employment breaks (see e.g. Beblo et al., 2006). Recent social-psychological literature on female well-being provides some insight into the forces driving these choices. Abele-Brehm in a recent study using longitudinal data on about 2000 individuals finds higher levels of “life satisfaction” amongst women living with partners, with women on maternal leave being especially satisfied. This field of research seems to indicate that while women pay a large cost in terms of income and even health by choosing to have a family, family life is crucially important for their “happiness” making having a family the preferred choice for a lot of women. Wong (2007) structurally estimates an equilibrium matching model of the marriage market and the labor market, and she concludes that women derive a large non-pecuniary utility flow from being married and having children. Without such non-pecuniary utility, the fit of the model is significantly worse. Of course, evolutionary theory provides a more fundamental explanation for why women prefer to engage in an institution such as marriage that provides a setting within which to obtain and raise offspring.

Several obvious similarities exist between 19th century Dutch society and the current-day developing world. Therefore results drawn from this study could help policy makers in less developed economies in their struggle against child deprivation and high mortality rates (see De Brouwere et al., 1998). Supporting children born in adverse economic times, by means of extra provisions of food, housing and health care, will not only help decrease infant and child mortality but in fact increase over all male life expectancy. Special care could be taken in supporting female children born in economic downturns for whom health consequences of adverse early economic conditions are indirect (via marriage) and not immediately visible. In societies where the girl child is frequently considered only secondary to her male siblings, in absence of immediate consequences of female child deprivation, her needs are likely to be easily ignored during poor economic times leading to life long adverse health consequences. Further support could be provided to women during their child bearing ages. This could be done by discouraging marriages of very young women especially in rural areas or within lower social classes and religious communities by setting and enforcing suitable legal age of marriage. Additionally, access to modern contraceptives could help curb quick successive pregnancies that lead to high infant and maternal mortality rates. Active family planning programs could also allow couples to enjoy the benefits of partnership without suffering from its negative health consequences. Over a longer time horizon, urbanization, economic development of the country (reflected in high per capital real GNP) and more education would help discourage early marriages and consequently its adverse consequences, especially for women.

In future work it would be interesting to consider other (and possibly multiple) marital

transitions like - divorced, separated, widowed etc. for each individual. This would provide more precise results about the protective effect of marriage under weaker assumptions (i.e. v could be allowed to be dependent on x). It would be also useful to have a closer look at the impact of social class on individual exits into matrimony or death. Although we controlled for social class using a linear, hierarchal indicator, we are unable to study each of the classes separately due to small sample sizes. A larger data set would help facilitate such an analysis. On a slightly different front, it would be interesting to study marriage market tightness as a determinant of the marriage rate by social classes, gender, degree of urbanization of place of residence and age. For this we would need to merge the HSN with marital life tables for the Netherlands for our observation window.

In future research it would be useful to have data records that include observations of the timing of childbirths and the attained level of education. This would enable a somewhat more direct assessment of the mechanisms that we postulate to drive the causal pathways we find. For example, we could allow the causal effect of marriage on mortality to depend on the moments of childbirths. Barring data on education, it would also be interesting to allow the causal effect of marriage on male mortality to depend on additional indicators, like the state of the business cycle at ages 7 to 12.

6 Conclusion

The empirical analyses with historical data generate a range of insights into causal pathways between economic conditions early in life, marriage, and mortality. These are identified while taking account of selection effects due to unobserved confounders. The results are markedly different between men and women.

For women, the extent to which marriage protects against mortality depends on the economic conditions early in life. Birth under adverse conditions implies that longevity is reduced upon marriage, as compared to staying unmarried. Conversely, birth under favorable conditions implies that longevity is extended upon marriage. In each case, the effect of marital status on mortality is not uniform as a function of age. The health costs of marriage are borne early on, whereas the protective benefits occur after the childbearing ages. But for women born under favorable conditions, the costs during childbearing ages are smaller, and the age at which benefits outweigh costs occurs earlier in life.

We provide a range of reasons for why the health costs of marriage during childbearing ages are due to the health hazards of pregnancy, delivery, childbearing, and taking care of small children. Our results are consistent with the view that early-life conditions influence the resilience of women during this stage of the life course. In current times, in Western societies, maternal death during deliveries and during childbearing ages in general is very rare. However, it is plausible that the various stages of childbearing are still a health burden

for the mother, and it is obviously useful to know that this burden is larger in case the mother was exposed to adverse conditions in her own birth year. As we have seen, in poor countries, maternal mortality is still the dominant death cause during reproductive years.

The analysis for women also shows that early-life conditions do not influence the marriage rate. This shows that strategic considerations to enter or postpone marriage in response to favorable or adverse economic conditions early in life do not play a major role as determinants of marriage. The decision to marry is driven by other behavioral motivations.

For men the results are different. Marriage is protective at all ages, and the size of the protective effect on the mortality rate does not depend on conditions early in life. At the same time, conditions around birth have an autonomous long-run effect on mortality. For men, conditions around the ages 7 to 12 are important for the marriage rate as well as the mortality rate. Presumably, these are the ages in our sample during which decisions are made regarding education and career. Favorable conditions at these ages lead to a postponement of marriage and to lower mortality later in life.

The long-run causal pathway from early-life economic conditions to mortality late in life differs by gender. For women, the long-run effect of early-life conditions on mortality is driven 100% through marriage. Early-life conditions affect the extent to which marriage is protective for mortality. However, they do not affect the mortality rate if marriage does not take place in one's lifetime. For men, the long-run effect is present regardless of the marital status during one's adult life. Its size is not affected by marriage at all.

References

- Abbring, Jaap H. and Van den Berg, Gerard J. (2003), The non-parametric identification of treatment effects in duration models, *Econometrica*, Vol. 71, pp.1491–1517.
- Abele-Brehm, Andrea (2006), Who is happiest? Career and family as determinants of professionals' life satisfaction in the "Life Rush Hour" between thirty and forty: Findings from the Erlangen longitudinal study.
- Almond, Douglas (2006), Is the 1918 Influenza Pandemic Over? Long-Term Effects of In Utero Influenza Exposure in the Post-1940 U.S. Population, *Journal of Political Economy*, Vol. 114(4), pp. 672-712.
- Almond, Douglas and Mazumder, Bhashkar (2006), The 1918 Influenza Pandemic and Subsequent Health Outcomes: An Analysis of SIPP Data, *The American Economic Review: Papers and Proceedings*, Vol. 95(2), pp. 258-262.
- Angrist, Joshua (2002), How Do Sex Ratios Affect Marriage and Labor Markets? Evidence from America's Second Generation', *The Quarterly Journal of Economics*, Vol. 117(3), pp. 997-1038.
- Beblo, Miriam; Bender, Stefan and Wolf, Elke (2006), The wage effects of entering motherhood - a within-firm matching approach, ZEW Discussion Paper No. 06-053.
- Benzeva, M. and Judge, K. (2001), Income and health: the time dimension, *Social Science and Medicine*, Vol. 52, pp. 1371-1390.
- Blau, Francine D.; Kahn, Lawrence M. and Waldfogel, Jane (2000), Understanding Young Women's Marriage Decisions: The Role of Labor and Marriage Market Conditions, *Industrial and Labor Relations Review*, Vol. 53, pp. 624-647.
- Brandt, Loren; Siow, Aloysius and Vogel, Carl (2008), Large shocks and small changes in the marriage market for famine born cohorts in China, Working paper University of Toronto Department of Economics, No. 334.
- Case, Anne; Fertig, Angela; and Paxson, Christina (2003), From cradle to grave? The lasting impact of childhood health and circumstance, Working paper, NBER and Princeton University.
- Cutler, David M. and Lleras-Muney, Adriana (2006), Education and Health: Evaluating Theories and Evidence, NBER Working Papers 12352, National Bureau of Economic Research, Inc.
- Dasgupta, Partha (2011), Personal histories and poverty traps, in: J. Lin and B. Plescovik (eds.), *Proceedings of the Annual World Bank Conference on Development Economics*, World Bank, Washington DC, forthcoming.

- De Brouwere, Vincent; Tonglet, René and Van Lerberghe, Wim (1998), Strategies for reducing maternal mortality in developing countries: what can we learn from the history of the industrialized West?, *Tropical Medicine & International Health*, Vol. 3 (10), pp. 771–782.
- Doblhammer, Gabriele (2004), *The Late Life Legacy of Very Early Life*, Springer, Berlin.
- Dribe, Martin, and Lundh, Christer (2010), Marriage choices and social reproduction: The interrelationship between partner selection and intergenerational socioeconomic mobility in 19th-century Sweden, *Demographic Research*, Vol. 22, pp. 347–382.
- Ecob, R. and Smith, G. (1999), Income and health: What is the nature of the relationship?, *Social Science and Medicine*, Vol. 48, pp. 693–705.
- Farah, M.J., K.G. Noble and H. Hurt (2008), Poverty, privilege, and brain development: empirical findings and ethical implications, Working paper, University of Pennsylvania.
- Fogel, R.W. (1997), New findings on secular trends in nutrition and mortality: some implications for population theory, in: M.R. Rosenzweig and O. Stark (eds.), *Handbook of Population and Family Economics*, North-Holland, Amsterdam.
- Gardner, Jonathan; and Oswald, Andrew J. (2004), How is mortality affected by Money, Marriage and Stress?“, *Journal of Health Economics*, Vol. 23(6), pp. 1181–1207.
- Goldman, Noreen (1993a), Marriage selection and mortality patterns: inferences and fallacies, *Demography*, Vol. 30, pp. 189–208.
- (1993b), The perils of single life in contemporary Japan, *Journal of Marriage and the Family*, Vol. 55, pp. 191–204.
- Hackman, Evette, Emanuel, Irvin, Van Belle, Gerald; and Daling, Janet (1983), Maternal birth weight and subsequent pregnancy outcome, *Journal of the American Medical Association*, Vol. 250, pp. 2016–2019.
- Hartman, Mary S. (2004), *The Household and the Making of History: A Subversive View of the Western Past*, Cambridge University Press, Cambridge.
- Hemström, Ö (1996), Is marriage dissolution linked to differences in mortality risk for men and women?, *Journal of Marriage and the Family*, Vol. 58, pp. 366–378.
- Holemans, K., S. Caluwaerts, and F. André Van Assche (2002), Unravelling the fetal origins hypothesis, *Lancet* 360, 2073.
- Hu, Yuanreng; and Goldman, Noreen (1990), Mortality differentials by marital status: An international comparison, *Demography*, Vol. 27, pp. 233–50.
- Innes, Kim E., Marshall, Julie A., Byers, Tim E.; and Calonge, Ned (1999), A woman’s own birth weight and gestational age predict her later risk of developing preeclampsia, a precursor of chronic disease, *Epidemiology*, Vol. 10, pp. 153–160.

- Jacobs, Jan and Smits, Jan-Pieter (2001), Business cycles in the Netherlands, 1815-1913. Working paper, Groningen University.
- Johnson, N.J., Backlund, E., Sorlie, P.D. and Loveless C.A. (2000), Marital status and mortality: the national longitudinal mortality study, *Annals of Epidemiology*, Vol. 10(4), pp. 224-238.
- Lakdawalla D.N. and Philipson, T. (2002), The rise in old-age longevity and the market for long-term care, *American Economic Review*, Vol. 92(1), pp. 295-306.
- Lillard, Lee A.; and Panis, Constantijn W. A. (1996), Marital Status and Mortality: The Role of Health, *Demography*, Vol.33, No.3., pp. 313-327.
- Lumey, L.H. and Stein, Aryeh D. (1997), In utero exposure to famine and subsequent fertility: the Dutch famine birth cohort study, *American Journal of Public Health*, Vol. 87, pp. 1962–1966.
- Lummaa, Virpi (2003), Early developmental conditions and reproductive success in humans: downstream effects of prenatal famine, birthweight, and timing of birth, *American Journal of Human Biology*, Vol. 15, pp. 370–379.
- Lund, Rikke; Holstein, Bjørn Ewald; and Osler, Merete (2004), Marital history from age 15 to 40 years and subsequent 10-years mortality: a longitudinal study of Danish males born in 1953, *International Journal of Epidemiology*, Vol. 33(2), pp. 389-97.
- Maccini, Sharon, and Dean Yang (2009), Under the Weather: Health, Schooling, and Economic Consequences of Early-Life Rainfall, *American Economic Review*, 99(3), pp. 1006–26.
- Mandemakers, Kees (2000), The Netherlands. Historical Sample of the Netherlands, in P. Kelly Hall, R. McCaa, G. Thorvaldsen (ed.), *Handbook of International Historical Microdata for Population Research* (Minnesota Population Center Minneapolis), pp. 149–177.
- Matthijs, Koen (2003), Demographic and sociological indicators of privatisation of marriage in the 19th century in Flanders, *European Journal of Population*, Vol. 19, pp. 375–412.
- Modin, Bitte (2003), Born out of wedlock and never married - it breaks a man's heart, *Social Science and Medicine*, Vol. 57, pp. 487-501.
- Modin, Bitte, Koupil, Ilona and Vågerö, Denny (2009), The impact of early twentieth century illegitimacy across three generations. Longevity and intergenerational correlates, *Social Science and Medicine*, Vol. 68, pp. 1633-1640.
- Mogren, I., U. Högberg, B. Stegmayr, B. Lindahl, and H. Stenlund (2001), Fetal exposure, heredity and risk indicators for cardiovascular disease in a Swedish welfare cohort, *International Journal of Epidemiology* 30, 853–862.

- Murray, John E., (2000), Marital Protection and Marital Selection: Evidence from a Historical-Prospective Sample of American Men, *Demography*, Vol. 37, pp. 511-521.
- Norton, E. (2000), Long-term care, *Handbooks of Health Economics*, Chapter 21, North-Holland, Amsterdam.
- Peng, Xizhe (1987), Demographic Consequences of the Great Leap Forward in China's Provinces, *Population and Development Review*, Vol. 13(4) , pp. 639-670.
- Petersen, William (1960), The Demographic Transition in the Netherlands, *American Sociological Review*, Vol. 25(3), pp. 334-347.
- Phillips, David I. W.; Handelsman, David J.; Eriksson, Johan G.; Forsen, Tom; Osmond, Clive; and Barker, David J.P. (2001), Prenatal growth and subsequent marital status: Longitudinal study, *British Medical Journal*, Vol. 322, pp. 771.
- Power, Chris; Li, Leah; Manor, Orly; and Davey Smith, G. (2003), Combination of low birth weight and high adult body mass index: at what age is it established and what are its determinants?, *Journal of Epidemiology and Community Health*, Vol. 57, pp. 969-973
- Prigerson H., Maciejewski, P. and Rosenheck, R. (2000), Preliminary explorations of the harmful interactive effects of widowhood and marital harmony on health, health service use, and health service costs, *The Gerontologist*, Vol. 40, pp. 349-357.
- Richardson, Katarina and Van den Berg, Gerard J. (2011), Duration dependence versus unobserved heterogeneity in treatment effects: Swedish labor market training and the transition rate to employment, *Journal of Applied Econometrics*, forthcoming.
- Sastry, N. (2004), Trends in socioeconomic inequalities in mortality in developing countries: the case of child survival in Sao Paulo, Brazil, *Demography* 41, 443-464.
- Sloboda, Deborah M., Hickey, Martha; and Hart, Roger (2011), Reproduction in females: the role of the early life environment, *Human Reproduction*, forthcoming.
- Vågerö, Denny; and Modin, Bitte (2002), Prenatal growth, subsequent marital status, and mortality: longitudinal study, *British Medical Journal*, Vol. 324, pp. 398.
- Van den Berg, Gerard J., Doblhammer, Gabriele, and Christensen, Kaare (2009a), Exogenous determinants of early-life conditions, and mortality later in life, *Social Science and Medicine*, Vol. 68, pp. 1591-1598.
- Van den Berg, Gerard J., Doblhammer, Gabriele, and Christensen, Kaare (2011a), Being born under adverse economic conditions leads to a higher cardiovascular mortality rate later in life: Evidence based on individuals born at different stages of the business cycle, *Demography*, forthcoming.
- Van den Berg, Gerard J., Lindeboom, Maarten and López, Marta (2009b), Inequality in individual mortality and economic conditions earlier in life, *Social Science and Medicine*,

Vol. 69(9), pp. 1360–1367.

Van den Berg, Gerard J., Lindeboom, Maarten and Portrait, France (2006), Economic Conditions Early in Life and Individual Mortality, *American Economic Review*, Vol. 96(1), pp. 290–302.

Van den Berg, Gerard J., Lindeboom, Maarten and Portrait, France (2011*b*), Conjugal Bereavement Effects on Health and Mortality at Advanced Ages, *Journal of Health Economics*, forthcoming.

Van den Berg, Gerard J., Lundborg, Petter, Nystedt, Paul; and Rooth, Dan-Olof (2010), Critical periods during childhood and adolescence: a study of adult height among immigrant siblings, Working paper, Lund University.

Van Poppel, Frans,(1992), Trouwen in Nederland: Een Historische-Demografische Studie van de 19e en Vroeg-20e Eeuw, Working paper, NIDI, The Hague.

Van Poppel, Frans; and Joung, Inez (2001), Long-Term Trends in Marital Status - Mortality Differences in the Netherlands 1850-1970, *Journal of Biosocial Sciences*, Vol.33, pp. 279–303.

Wolleswinkel-Van den Bosch, Judith H.; Van Poppel, Frans; Tabeau, Ewa; and Mackenbach, Johan P. (1998), Mortality decline in the Netherlands in the period 1850-1992: a turning point analysis, *Social Science and Medicine*, Vol. 47(4), pp. 429-443.

Wong, Linda Y. (2007), Labor market development and marriage, Working paper, Binghamton University.

World Bank (2010), *World Development Indicators*, World Bank, Washington DC.

Table 3: Parameter estimates for the full model with interactions between age and conditions at birth in the causal effect of marriage on the mortality rate (first out of three parts of the table)

Variable	Full Sample		Men		Women	
	Est.	t-stat.	Est.	t-stat.	Est.	t-stat.
<i>Individual background characteristics affecting the marriage rate:</i>						
Female	0.45	9.46				
Social class father at birth	-0.08	-4.35	-0.11	-4.00	-0.04	-1.55
Father is literate	-0.11	-1.52	-0.03	-0.27	-0.13	-1.38
Born in urban area	-0.07	-1.30	0.09	1.15	-0.20	-2.53
Born in province Utrecht*	0.04	0.75	0.12	1.42	0.02	0.27
Born in province Zeeland*	0.17	3.24	0.10	1.27	0.24	3.40
<i>Business cycle conditions early in life affecting the marriage rate:</i>						
Boom (instead of recession) at birth	-0.04	-0.70	-0.01	-0.16	-0.08	-0.98
Cycle indicator for age 1 up to 6	-0.01	-0.19	-0.12	-1.50	0.03	0.46
Cycle indicator for age 7 up to 12	-0.11	-1.97	-0.21	-2.46	-0.08	-0.98
Cycle indicator for age 13 up to 15	-0.04	-0.22	0.14	0.54	-0.28	-1.29
<i>Exposure to epidemics early in life affecting the marriage rate:</i>						
1849 Cholera in Utrecht during age 1-6	-0.12	-0.09	-0.05	-0.02	0.08	0.05
1870/1 smallpox during age 1-6	-0.89	-1.98	0.12	0.21	-1.82	-2.77
1849 Cholera in Utrecht during age 7-12	-2.37	-1.58	-1.90	-0.93	-2.98	-1.26
1870/1 smallpox during age 7-12	0.03	0.06	-0.11	-0.15	0.02	0.02
1849 Cholera in Utrecht during age 13-15	-3.43	-2.95	-3.01	-1.73	-3.17	-1.85
1870/1 smallpox during age 13-15	1.15	2.44	0.42	0.63	1.27	2.02
<i>Contemporaneous macro conditions affecting the marriage rate:</i>						
1849 cholera in Utrecht	-0.42	-1.01	-0.28	-0.48	-0.56	-0.95
1870/1 smallpox	-0.02	-0.11	-0.13	-0.56	0.11	0.50
1918 influenza	0.14	0.92	0.16	0.72	0.14	0.69
World War II (GNP missing)	-3.12	-4.07	-2.34	-2.19	-4.45	-3.84
Current Trend (log annual real p.c. GNP)	-0.23	-2.71	-0.17	-1.44	-0.33	-2.94
Current Cycle (log annual real p.c. GNP)	0.20	0.63	0.16	0.60	-0.06	-0.15
<i>Age effect on marriage rate:</i>						
η_0^m	-9.39	-7.10	-9.56	-5.58	-15.98	-5.07
η_1^m	-8.88	-5.81	-8.05	-4.40	-19.41	-4.69
η_2^m	-13.39	-8.59	-14.27	-7.17	-22.95	-5.81
η_3^m	-3.83	-4.51	-3.63	-3.46	-9.04	-4.25
η_4^m	-4.72	-10.15	-5.30	-8.15	-7.15	-7.32
<i>Unobserved heterogeneity terms for marriage:</i>						
v_m^1	-1.73	-15.78	-1.81	-11.99	-1.40	-9.56
v_m^2	0.60	23.73	0.67	17.41	0.77	16.53
<i>Unobserved heterogeneity terms for death:</i>						
v_d^1	0.16	5.68	0.14	3.511	0.17	5.618
v_d^2	-1.24	-2.66	-1.25	-1.65	-1.41	-2.36

Table 3: (continued; second out of three parts)

Variable	Full Sample		Men		Women	
	Est.	t-stat.	Est.	t-stat.	Est.	t-stat.
<i>Individual background characteristics affecting the mortality rate:</i>						
Female	-0.16	-3.96				
Social class father at birth	0.00	0.17	0.02	0.68	-0.02	-0.86
Father is literate	-0.02	-0.31	-0.07	-0.79	0.05	0.54
Born in urban area	0.07	1.42	0.21	2.89	-0.06	-0.81
Born in province Utrecht*	0.25	4.74	0.23	3.12	0.28	3.67
Born in province Zeeland*	0.13	2.67	0.08	1.10	0.17	2.49
<i>Business cycle conditions early in life affecting the mortality rate:</i>						
Boom (instead of recession) at birth	-0.12	-1.63	-0.32	-3.08	0.17	1.40
Cycle indicator for age 1 up to 6	0.02	0.44	0.03	0.47	0.01	0.19
Cycle indicator for age 7 up to 12	-0.14	-2.74	-0.17	-2.36	-0.09	-1.24
Cycle indicator for age 13 up to 15	0.18	0.93	0.14	0.54	0.28	1.14
<i>Exposure to epidemics early in life affecting the mortality rate:</i>						
1849 Cholera in Utrecht during age 1-6	0.57	0.55	-0.38	-0.27	0.98	0.68
1870/1 smallpox during age 1-6	-1.61	-3.50	3.31	2.58	-1.70	-2.57
1849 Cholera in Utrecht during age 7-12	1.80	1.84	-1.38	-2.14	0.14	0.09
1870/1 smallpox during age 7-12	-1.55	-3.00	-1.06	-1.51	-2.37	-3.04
1849 Cholera in Utrecht during age 13-15	-0.88	-1.30	-1.20	-1.03	-0.96	-1.12
1870/1 smallpox during age 13-15	0.44	1.02	0.63	0.99	0.08	0.15
<i>Contemporaneous macro conditions affecting the mortality rate:</i>						
1849 cholera in Utrecht	1.14	2.52	1.55	3.07	0.31	0.31
1870/1 smallpox	0.57	2.41	0.35	0.97	0.74	2.37
1918 influenza	-0.08	-0.40	-0.02	-0.08	-0.12	-0.42
World War II (GNP missing)	-4.86	-11.38	-3.55	-5.57	-6.62	-10.66
Current Trend (log annual real p.c. GNP)	-0.60	-11.98	-0.45	-6.05	-0.80	-10.93
Current Cycle (log annual real p.c. GNP)	-0.28	-1.13	0.00	0.00	-0.31	-1.03
<i>Effect of marital status on the mortality rate:</i>						
η_0^{ape}	0.16	0.84	-0.18	-0.50	0.33	1.38
η_1^{ape}	0.23	0.35	-0.05	-0.11	0.54	1.06
η_2^{ape}	-0.06	-1.17	-0.06	-0.88	-0.08	-1.03
η_3^{ape}	0.68	0.34	1.04	2.03	0.43	0.91
η_4^{ape}	-0.04	-0.77	-0.09	-1.07	-0.02	-0.26
Age \times boom at birth $\left(\eta_0^{a,int} \right)$	0.02	0.07	0.08	0.18	-0.09	-0.31
Age \times boom at birth $\left(\eta_1^{a,int} \right)$	-0.18	-0.60	-0.12	-0.19	-0.23	-0.64
Age \times boom at birth $\left(\eta_2^{a,int} \right)$	0.36	0.98	0.22	0.30	0.55	1.16
Age \times boom at birth $\left(\eta_3^{a,int} \right)$	-0.38	-1.60	-0.29	0.64	-0.46	-1.54
Age \times boom at birth $\left(\eta_4^{a,int} \right)$	0.23	1.43	0.18	0.68	0.30	1.33

Table 3: (continued; third out of three parts)

Variable	Full Sample		Men		Women	
	Est.	t-stat.	Est.	t-stat.	Est.	t-stat.
<i>Age effect on the mortality rate:</i>						
η_0^d	1.29	3.17	0.24	0.39	2.62	4.41
η_1^d	1.94	24.65	1.83	14.19	2.13	19.94
η_2^d	0.83	7.97	0.71	3.91	1.01	7.20
η_3^d	-0.05	-0.73	-0.12	-1.09	0.03	0.31
η_4^d	-0.14	-1.78	-0.23	-1.82	-0.02	-0.16
<i>Joint probabilities of unobserved heterogeneities:</i>						
q_1	0.39	14.38	0.42	10.24	0.48	12.12
q_2	0.41	15.69	0.40	11.26	0.33	9.36
q_3	0.11	5.10	0.11	3.16	0.13	4.98
q_4	0.09	4.28	0.07	2.53	0.07	3.38
- log likelihood	33374.03		16941.33		16299.30	
Number of individuals	5593		2709		2884	

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