The weaker sex? Vulnerable men and women's resilience to socio-economic disadvantage

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A B S T R A C T
Sex differences in mortality vary over time and place as a function of social, health, and medical circumstances. The magnitude of these variations, and their response to large socioeconomic changes, suggest that biological differences cannot fully account for sex differences in survival. Drawing on a wide swath of mortality data across countries and over time, we develop a set of empiric observations with which any theory about excess male mortality and its correlates will have to contend. We show that as societies develop, M/F survival first declines and then increases, a ‘sex difference in mortality transition’ embedded within the demographic and epidemiologic transitions. After the onset of this transition, cross-sectional variation in excess male mortality exhibits a consistent pattern of greater female resilience to mortality under socio-economic adversity. The causal mechanisms underlying these associations merit further research.

1. Introduction

Decades of research have found that women generally outlive men in developed countries (Beltrán-Sánchez, Finch, & Crimmins, 2015; Kalben, 2002; Verbrugge, 2012; Waldron, 1976). More recently, it has become evident that not only do women have longer life expectancy from birth (e0) in such societies, but their mortality rates at every age are lower, starting in utero (Catalano & Bruckner, 2006). So pervasive are these observations that some demographers now equate the longevity of the human species, at any given time and place, with the highest observed LE of women (Horton & Lo, 2013; Oeppen & Vaupel, 2002). Yet sex differences in mortality vary widely over time and place. In this paper we explore this variation in search of insights into why women live longer. We are motivated by the hope such insights will reveal opportunities to reduce the excess mortality of men, although this paper only documents associations and stops short of examining causal pathways. The causal mechanisms underlying these associations, and appropriate interventions to address those mechanisms, fall outside the scope of this paper and merit future research.

Efforts to explain sex differences in mortality are not new (Beltrán-Sánchez et al., 2015; Waldron, 1976; Kruger & Nesse, 2004; MacIntyre, Hung, & Sweeting, 1996; Møller, Fincher, & Thornhill, 2009; Taylor et al., 2009; Waldron, 1983; Yang & Kozioloki, 2012), and can be briefly categorized into three broad schools of thought. First is the notion of selective female survival advantage on a “hard-wired” biologic basis, for example the direct pathophysiologic benefit of female hormones on blood vessels (Drevenstedt, Crimmins, Vasunilashorn, & Finch, 2008; Mage & Donner, 2006). Second is the idea that socially mediated behavioral differences explain the gap—human males in virtually every society take more risks, are more violent and behave in ways that make them more prone to accidental injury, while females are more likely to be health-seeking (Bhattacharya, Gathmann & Miller, 2012; Case & Paxson, 2005; Concha-Barrientos et al., 2004; Cook, McGlynn, Devesa, Freedman, & Anderson, 2011; Cutler, Lange, Meara, Richards-Shubik, & Ruhm, 2011; Ezzati, Friedman, Kulkarni, & Murray, 2008; Gabel & Gerberich, 2002; Gillespie, Trotter, & Tuljapurkar, 2014; Hunter & Reddy, 2013; Kalben, 2002; McCartney, Mahmood, Leyland, Batty, & Hunt, 2011; Norström & Razvodovsky, 2010; Preston & Wang, 2011; Rahman, Strauss, Gertler, Ashley, & Fox, 1994; Tomkens et al., 2012). A third perspective views social difference as one manifestation of biologically driven behavioral difference, so-called sociobiology; by this perspective, biologic differences of greatest interest express themselves in...
different social behaviors which are mutable, at least in theory (Braveman, Egerter, & Williams, 2011; Chu & Lee, 2012; Gorman & Read, 2007; Ristvedt, 2014; Umberson & Montez, 2010).

In this paper we do not attempt to weigh the causal evidence for each of these mutually compatible pathways; rather we describe and contrast patterns of sex differences in mortality across time and place with which any theory will ultimately have to contend. We begin our investigation with the data that is of highest quality: the contemporary developed world. We then study patterns using a wide swath of available mortality data, within and between developing and developed countries and over the time periods for which reasonably reliable data are available. Of particular interest is the observed relationship between sex differences in mortality and other changes related to the demographic and epidemiologic transition (Mooney, 2002; Omran, 1971), since this relationship facilitates comparison of changes in developed countries—from which almost all published work on this subject has emerged—to those presently evolving in developing countries at an earlier phase of transition. We limit quantitative analyses to correlations and basic regressions, using markers of socioeconomic condition within and between countries based on available measures; it is not our intent to test the causal relationship between any specific factor(s) and sex differences in mortality, but rather to identify patterns to encourage such testing in future research.

The paper is organized as follows. After describing our data sources and methods, we examine variation in probability of survival to age 70 (S70) across US counties, extending previous research (Cullen, Cummins, & Fuchs, 2012) and showing that women consistently exhibit greater survival “resilience” to socioeconomic adversity. Part II explores changes in M/F mortality across now-developed countries since 1900, while Part III examines the evolution of sex differences in mortality in the contemporary developing world. Part IV turns to the Former Soviet Union (FSU) and Eastern Europe to exploit the great natural experiment unleashed by Gorbachev’s reforms and the subsequent “transformational recessions”. The final section summarizes our observations about variation over time and place, and then returns to the question of why women live longer than men and the implications for reducing excess male mortality.

2. Data and methods

We measure mortality as survival to age 70 (S70) or LE from birth (e0) which we will refer to as simply LE for brevity. We prefer the former because of its reliability of estimation in small populations for which rates of mortality among older age groups are unstable. However, for many populations and subpopulations of a priori interest, we must rely on published estimates of LE, secondarily derived. As our measure of differential mortality we have chosen M/F (either M/F70 where possible, or M/FLE) as our outcome measure. The preference for M/F as a statistic is twofold: first, it is almost uniformly between 0.6 and 1 in the data, conferring some ease of presentation; and second, it is consistent with the evolving demographic concept that in high income, low fertility societies, female mortality represents a place and time the species longevity “gold standard”, a target we hope men could emulate, i.e. that M/F70 or M/FLE would approach unity. However, it should be noted that in other societies—particularly those pre-transition societies plagued by poverty and high maternal mortality and/or rampant discrimination against women—a M/F70 or M/FLE approaching or exceeding unity appears to imply the opposite: a red flag signaling that female survival is far below potential.

Despite the noted similarities between M/F70 or M/FLE—and the strong positive correlation between them—the metrics are not interchangeable. The meaning of an M/FLE of 0.90, for example, is not the same as an M/F70 of the same numeric value: the former is about average in our LE data sets, the latter so high as to be seen only in the very wealthiest and very poorest of populations.

Regarding choice of data sources, we decided, for quality and practical reasons to confine most of our study to the last 5 decades, a time period for which reasonable mortality data and some relevant covariate data are available. The major exception was data from the Human Mortality Database, which enables a look back to 1900 for 18 now high-income countries.

Others have previously published the average life expectancy for 187 countries by decade since 1970 (Wang et al., 2012). We grouped these countries using data from the Global Burden of Disease project (Lozano et al., 2012). Specifically, we defined five groups of countries (Group 1 most developed) based on the country’s 2010 Human Development Index, modified to exclude LE as a core measure to avoid autocorrelation in our analyses, as discussed below. The decision to classify based on stage of development at the end of the observation period, not the beginning, was arbitrary, and was designed to facilitate observation of sex differences in mortality patterns with foreknowledge of the countries’ economic/social development “endpoint”. Likewise we separated out the former Warsaw Pact countries, designated at Group 1E, because of their distinct survival and sex differences in mortality patterns. The countries classified in each of the five groups are listed in Supplementary Table 1.

A third a priori decision was to exclude from detailed consideration period-place combinations where maternal mortality was or remains very high and where epidemiologic and demographic transition has not yet begun. Therefore we have not analyzed data on M/F in any countries before 1900 or in contemporary Group 4 countries—the world’s very poorest—except for a single comparison with developing countries that have entered transition.

Finally, we have largely refrained from examining cause-specific mortality data because of substantial limitations in its availability and quality going back in time, although we return to discuss this pathway for sex differences in the final section.

The specific sources of data for each section of the paper are described in Appendix A.

3. Results

In this section, we show that as societies develop, M/F survival first declines and then increases, while cross-sectional variation in excess male mortality exhibits a consistent pattern of greater female resilience to mortality under socioeconomic adversity.

3.1. Part I: M/F in the US and other Group 1 countries in 2010

The left panel of Fig. 1 shows the distribution of S70 for white men and women in the US by county. The means for the populations are 0.67 for men and 0.82 for women and the standard deviations 0.05 and 0.03, respectively. As can be seen, women enjoy a sharp advantage and a smaller variance than men. As previously noted, within-sex geographic variation in US mortality can be largely explained by a small set of social, environmental and health care-related variables, as can between-race differences (Cullen et al., 2012), but these same variables do not explain the gulf between the sexes. Moreover, all are less than unity—there is no US county in which males have equal or better survival than females, though there are some counties for which the ratio approaches 1.

Fig. 2A-C shows that women consistently exhibit greater survival “resilience” to socioeconomic adversity. More or less identical relationships emerge with respect to percent in poverty, per capita
Fig. 1. Frequency distribution of S70 for US counties for Whites, Males and Females, and M/F S70. 3059 counties with at least 100 deaths/year between 2006 and 2010.

Fig. 2. MS70, FS70, and M/F S70 vs poverty, log income, education, and occupation.
income, or low educational attainment. Although survival is associated with each of these socioeconomic measures, men are far more “elastic” in response (which is consistent with the hypothesis that men are more vulnerable to adverse socioeconomic circumstances). OLS regressions, shown in Table 1, describe the relationships quantitatively. Though each of the four variables shown is itself a potent univariate predictor of mortality, tobacco use and obesity correlate weakly with sex differences in mortality after controlling for other covariates and add little to the model’s predictive power. Conditional on the other variables, current M/F smoking ratios also appear minimally related to M/FLE (Fig. S1); lagging the relationship enhances the correlation (Beltrán-Sánchez et al., 2015). Counties in the 16 Southern states have lower M/F70 after adjusting for the other covariates. The occupational similarity index explains substantial variation (Fig. 2D), an observation to which we return in the discussion.

The cross-sectional variation in M/F among and within other Group 1 countries reveals comparable relationships between sex differences in mortality and indicators of socioeconomic status (SES). Switching to M/FLE, Fig. 3 shows that log per capita GDP is strongly correlated with M/FLE across high-income countries. This same relationship appears to hold among geopolitical regions within Spain and Japan, selected because of the ready availability of the data (Fig. S2). Ecologic analyses of income strata in Canada and Denmark mirror this as well (Helweg-Larsen & Juel, 2000; Trovato & Lalu, 2005): to our knowledge there are no counter-examples among high-income countries.

### 3.2. Part II: M/F in the US and other Group 1 countries over time

We begin our inspection of the longitudinal change in M/F after World War II, when mortality data are more robust than for earlier periods. Fig. 4 shows the respective changes in M/F70 for all of the Group 1 countries. Japan exhibits a distinctive downward trend, somewhere between 1970 and 1985.

In Fig. 5 we show in cross-section the relationship in the US between M/F and per capita GDP (by State because of availability) at the nadir of M/F (around 1970) and forward to the present. This figure suggests that the cross-sectional “female resilience” pattern was already ensconced long before 1970 and has persisted. Striking too, although the slope appears to remain more or less unchanged over time, the correlation strengthens over time in both plots. Comparing Group 1 countries with each other during this 40-year period (Fig. S3), the same pattern is evident.

Next we examine the available data from the early 20th century to observe (available) Group 1 countries during their epidemiologic transition (Omran, 1971; Fink, 2013). Fig. 6 reveals this was a period of steady M/F decline in the U.S. and other Group

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### Table 1

| Predictors          | Outcome: M/F 570 | Outcome: Male 570 | Outcome: Female 570 |
|---------------------|------------------|------------------|---------------------|
| % Poverty           | -0.005/0.657***  | -0.002/0.297***  | -0.003/0.354***     |
| Log income PC       | 0.154/0.650***   | 0.117/0.459***   | 0.059/0.323***      |
| % Lower Edu (< 12 yr)| -0.003/0.541***  | -0.001/0.119***  | -0.000/0.088***     |
| Occupational similarity index | 0.437/0.643*** | 0.276/0.320*** | 0.202/0.270***      |
| Male smoke          | -0.002/0.251***  | 0.000/0.007      | -0.001/0.012        |
| Female smoke        | -0.003/0.279***  | -0.001/0.012     | -0.000/0.015        |
| Male obesity        | -0.006/0.419***  | 0.001/0.010      | -0.001/0.010        |
| Female obesity      | -0.006/0.444***  | 0.000/0.022*     | -0.000/0.070**      |
| R²                  | 0.628            | 0.720            | 0.709               |

Data from the 2006–2010 NCHS’s Compressed Mortality Files and US Census Bureau’s 5-yr 2010 ACS at the county level. Data restricted to Non-Hispanic Whites in counties with > 100 non-Hispanic White deaths under age 70 between 2006 and 2010.

* p < 0.05.
** p < 0.01.
*** p < 0.001.
1 countries for which we have data, using weighted averages and weighting by log (population). This downward trend in M/F reflects gradually increasing relative female survival. Notably, several countries—including the United States—started the 20th century with an M/FLE ratio exceeding 1.0, consistent with other evidence that before the demographic and epidemiologic transition women

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**Fig. 5.** M/FS70 vs average HS Grad. rate and average income, by decade, US States. *Spearman correlation coefficients.

**Fig. 6.** Male and female LE and M/FLE over years for USA (top row) and other developed countries (bottom row), 1900–2010.
suffered a mortality disadvantage. For example, Beltrán-Sánchez et al. (2015) show that excess adult male mortality emerged in birth cohorts of the late 19th and early 20th centuries in 13 western countries, with female mortality decreasing 70% faster than male mortality after 1880. Notably, however, female survival at ages over the reproductive period has been superior to that of men for as long as we have data (e.g. Fig. S4).

Fig. 7, in which we (reluctantly) resort to average LE as the independent variable for lack of a consistent measure for GDP or human development, shows how M/F varies across the 18 Group

Fig. 8. M/F over years, by development group. Group mean weighted by 1/2 log population of countries within group.
1 countries in each decade between 1900 and 2010. In the first two decades the reverse of the later resilience pattern is evident—women did relatively best in the higher LE countries—followed by a flattening of the relationship by 1920 before the familiar “resilience” pattern emerges and strengthens over time, reinforcing the picture we observed in the US (Fig. 5) and in the later decades for other Group 1 countries (Fig. S5).

### 3.3. Part III: M/F in developing countries (LMICs) in Groups 2, 3 and 4

Moving to the low- and middle-income countries (LMICs), three different patterns are salient, depicted in Fig. 8. In Group 2 (the most developed countries after Group 1, including such countries as Brazil, Mexico, Thailand and South Africa), we see a steady decline in M/FLE throughout the period 1970–2010, resembling the Group 1 countries between 1900 and 1970 with a suggestion of a “turnaround” in 2000 reminiscent of the trough in Group 1 countries 2–3 decades before. Group 3 countries, by contrast, show high levels of M/FLE before the decline that starts around 1990–2000. M/F in Group 4 countries—the world’s poorest—remains, by contrast, high throughout the period, and for a few countries actually exceeds 1.0 (Sub-Saharan African countries, data not shown) (Lozano et al., 2012).

Fig. 9 includes regressions of the relationship between M/FLE and average LE in cross-section by decade for countries in Groups 2 and 3. It appears that for Group 2 countries, about a decade after the M/F begins to decline, the pattern of “resilience” for women begins to emerge and strengthens in extent of variation explained; by 2010 the relationship is robust, not unlike what was observed between 1900 and 1980 for Group 1 countries. For the Group 3 countries, the relationship remains flat through 1990, after which M/F starts to fall. The cross-sectional resilience pattern emerges about a decade thereafter, by 2010 explaining about 50 percent of the variance. For Group 4 countries M/F stays very high and in cross-section shows no clear relationship to GDP (data not shown) for reasons we explore further below.

The “switch” in pattern is well illustrated in Fig. S6, which shows recent within-country variation in cross section for two populous countries for which reasonable quality data are available. The right panel depicts Brazil, a Group 2 country now of middle income, revealing the “resilience” pattern of M/FLE, here in a scatter against percent in poverty, similar to the pattern which emerged in Group 1 countries several decades earlier. Sri Lanka, on the other hand, is a Group 3 country which as recently as 1963 still had sufficiently high rates of maternal mortality that national rates of mortality were higher for women ages 15–40 than for men (Omran, 1971; Fink, 2013). This pattern provides a hint that the “pre-resilience” pattern of M/FLE, reminiscent of that in Group 1 countries in 1900–1910, and likely reflects persistent excessive maternal mortality in the poorer parts of developing countries early in their transition. This same pattern would appear to explain the high M/F in the Group 4 countries, consistent with high maternal mortality (Fig. S7); by contrast, maternal mortality rates are detectable but low in Group 3 countries, and much lower in Groups 1 and 2 (Hogan et al., 2010).

That maternal mortality may partially explain the pattern of female resilience emerging a decade or two after national rates of M/F start to fall is further suggested by modern China, a country that would have ranked as a Group 3 country as recently as 1980 but has become Group 2 (and classified as such by our schema). Fig. S8 shows M/F70 for over 2300 county-level units in China based on county-specific life-tables calculated by Cai Yong from the year 2000 census (Cai, 2005). Looking at the aggregate data (left panel) there appears to be no relationship between county log per capita GDP and M/F70. Stratification by rural/urban status reveals a more nuanced picture: rural areas (middle panel) resemble the pattern observed in Sri Lanka, with the highest M/F among the poorest counties, in several cases here exceeding 1, consistent with son preference and China’s large male-to-female sex ratio at birth; whereas the urban areas (right panel) distribute more like Brazil or the US, with higher M/F70 in more-developed areas. Moreover, change over time is also consistent with the patterns of M/F survival noted earlier: based on census data on LE for three of the poorest provinces (Guizhou, Qinghai and Yunnan) with data extending back to 1981, average M/FLE decreased from 0.98 in 1981 to 0.93 in 2010. By contrast, M/FLE in China’s wealthiest city, Shanghai, increased from 0.94 in 1981 to 0.95 in 2000 (Cai, 2005).
3.4. Part IV: M/F in Eastern Europe and the former Soviet Union (Group 1E)

The experience of Eastern European countries, including the former Soviet Union (FSU), adds a unique dimension to our understanding of sex differences in mortality. These nations display the lowest values for M/F of any group of countries in the world, based on the most current data available, evident from even cursory inspection of the map shown in Fig. S9. Moreover, as shown vividly in Fig. 10, the current situation is actually an improvement for men relative to the nadir seen two decades ago. The figure illustrates another remarkable feature not evident elsewhere in the world, which is volatility of sex differences in mortality, matched otherwise only in demographic disasters such as epidemics and wars. This observation must be viewed in the context of the enormous political change that swept this region during the 1980’s and 90’s, namely the liberalization of state communism during the 80’s consequent to Gorbachev’s policies in the USSR (associated with rapid and demonstrable improvement in the relative mortality of men), and the subsequent demise of that system in the FSU and former Warsaw Pact countries and replacement with market systems in all. This was accompanied by a “transformational recession” that depressed real standards of living for most of the population (Kornai, 1994), associated with rapidly rising mortality for men for some years, while female mortality rates were less affected, hence the plummeting M/F. For completeness we depict the somewhat “melted” experience of Germany (Fig. S10). Like other non-FSU Warsaw pact countries, men faltered in the late 80’s and even more so after the collapse of the Berlin wall, but since they followed a more typical “Group 1” pattern as part of greater Germany (Vogt & Kluge, 2014).

Because of the historic heavier use of alcohol in this region of the world than any other, and the plausibility of its role as mediator for mortality rate gyrations, toxic levels of alcohol consumption have been the focus of much study (Gerry, 2012; McKee et al., 2011). Many analysts credit reduction in excess male mortality to one specific aspect of the Gorbachev reforms—alcohol consumption taxes—in the 80’s, and blame the subsequent spike in male mortality on the elimination of those alcohol taxes after 1990 (see for example [Bhattacharya et al., 2012]); this account is consistent with the biphasic change in sex differences in mortality in the FSU during the 1980’s seen in Fig. 10. There is a smoother decline in M/F in the neighboring states including East Germany, states not as directly influenced by the Gorbachev alcohol controls as Russia. Comparative data exploring the statistical association between male survival decline and changes in the rate of mortality from acute intoxication among the Russian Oblasts over the two time periods 1978–88 (alcohol less available) and 1988–98 (alcohol more available) may raise the question whether alcohol was the root cause of the rapid increase in male mortality, or one of its mediators. As shown in Fig. S11, the gyrations in sex differences in 6 of the 8 Oblasts were accompanied by dramatic period changes in the rate of acute alcohol-related hospital deaths; however, comparable changes in M/F occurred in the other two—the North Caucasus and South—with virtually no evidence of substantial acute alcohol-related deaths over the period, likely because these regions, albeit of modest comparative population size, are predominantly Muslim. This is not to suggest previous studies have inappropriately targeted the role of alcohol as a rapid and epidemic killer of men, but rather that the role of alcohol may be better viewed as mediating a relationship between social conditions and male mortality rates—seen here as M/F—that finds differential expression in different social and geopolitical contexts. This intuition would appear to be consistent with the fact that despite an abrupt and impressive “transformational recession” in which per capita GDP nosedived, the “resilience” pattern of M/F appears moderately well preserved across the Group 1E countries (Fig. S12).

4. Discussion

From the above observations we draw a series of ten inferences, presented roughly in the order of those least to most speculative; since we have offered no identification strategy in the data, none is intended to suggest causal inference.

1. Sex differences in mortality vary over time and place as a function of socioeconomic and possibly medical conditions. The magnitude of these variations, and their abruptness in response to large socioeconomic changes, suggest that intrinsic biological differences alone cannot fully account for observed sex differences in survival. While many have previously observed the variation in sex differences in mortality over time and place, the assembled evidence suggests that such variation follows distinct and identifiable patterns of social change. While some of the underlying patterns are more readily explained than others (as discussed below), there would appear to be little “randomness” in M/F for any population of reasonable size to stably estimate either survival probabilities or LE (with the possible exception of the world’s poorest states, for which reliable data is lacking).

2. A “sex differences in mortality transition” unfolds as part of the demographic and epidemiologic transitions, beginning with the emergence of the now near-universal “female survival advantage” (M/F survival < 1), heralded by significant reductions in fertility and maternal mortality during the reproductive years. It is almost certain, though data are incomplete, that there was a time in the history of all now developed (Group 1) countries, and those now developing (Groups 2 and 3), wherein female mortality exceeded that of men. In developed countries the turning point likely occurred between the late 19th century (for northern Europe and Switzerland, for example) and 1910 (see Fig. S5). In Group 2 countries this change occurred later, most likely in the mid-twentieth century (although confirmation is problematic because we do not have reliable data on these countries for this time period). We observe this same sex differences in mortality transition, occurring between 1970 and 1990, in countries less far along in development (Group 3). Tragically, in some Group 4 countries M/F > 1 remains true still...
today. Omran in his seminal presentation of the epidemiologic transition in 1971 (Omran, 1971) opines this was due to maternal mortality at a time when fertility rates were high and the combination of medical knowledge and resources insufficient to prevent frequent maternal deaths from bleeding and infection in poor countries. This conclusion would appear to be reinforced by our observations of Group 2 and 3 countries as they have entered transition, and the data on maternal mortality presented in Fig. S7.

Subsequently, within each of these societies, as the survival of women begins to improve, a distinctive cross-sectional pattern emerges wherein M/F is lower where development is higher (inverse correlation) a pattern we have referred to above as “pre-resilience”. While we do not have sufficient local data to formally test this hypothesis, this early transition pattern likely reflects a “lag” in the decline of maternal mortality in poorer parts of newly transitioning countries.

3. Shortly after the onset of the sex differences in mortality transition, a pattern of “female resilience” emerges in which the survival advantage of women is greatest in cross-section in places where SES or development is least.

In every situation we have examined, a striking and not immediately intuitive pattern emerges in cross-section soon after onset of transition: M/F becomes positively correlated with indices of development. This happens because as we move our attention from regions with high indices of development to regions with lower indices of development we observe that both men and women tend to have lower survival rates, but men more strikingly so (i.e., M/F tends to be lower for less well-off regions). This “female resilience” pattern between indices of SES and M/F appears subsequently to persist over time.

This “resilience” pattern emerges within a couple of decades after maternal mortality declines to relatively low levels, as it did in the period 1900–1940 in the most developed countries, perhaps around 1990 for the Group 2 countries, and is just beginning to emerge in the last decade in Group 3 countries. That this relationship emerges so predictably as epidemiologic transition progresses—in more or less every observable culture and society (except those poorest of the Group 3 countries and the Group 4 countries which have not yet entered transition)—suggests that the pattern is unlikely to be explained by any specific policy, custom, habit, medical treatment, or health behavior which vary idiosyncratically over time and place.

4. M/F continues to decline even after the immediate contribution of declines in maternal mortality is accounted for.

What might not, ex ante, have seemed inevitable is observed: a decade or two after maternal mortality has declined to relatively low levels—e.g. developed countries after 1950 or Group 2 countries after 1980—M/F continues to decline for some further decades. We have not explored in this paper the reasons for this continued decline nor the best explanations for the timing of the turnout described in the next point, but note here the universality of the pattern among Group 1 counties—including Japan, which may in other regards prove an outlier—and the evidence that Group 2 countries are following the same pathway.

5. At a certain point later in transition, the longitudinal pattern of declining M/F turns around—M/F rises as “men start to catch up”.

This inflection point in the sex differences in mortality transition is evident in almost all high-income (Group 1) countries, as well as most middle-income (Group 2) countries.

Best observed presently for the most advanced (Group 1) countries (Fig. 8), with a strong signal that Group 2 is poised to follow, a further change in sex differences in mortality appears to occur: men are catching up, with M/F slowly rising in the US since about 1970 and in the rest of the developed world (Groups 1 and 1E) between that time and 1990, while improvement in the survival of men appears to have begun in Group 2 countries between 2000 and the present. It is instructive to investigate the pattern within Japan, one of the world’s fastest developing countries after World War II and with a distinctive set of cultural norms. As seen in Fig. 11, growth in per capita income was remarkable, and with growth came greater disparities among the regions of the country in terms of mean per capita income. The evolution of the resilience pattern is also evident, with a hint that some prefectures have “slipped” towards lower M/F, consistent with the less marked “U” shape longitudinal pattern in Japan compared with that seen in other Group 1 countries in Fig. 4.

6. Over time, the female resilience pattern—the positive association of M/F with SES—appears to strengthen.

Whether comparing within groups of countries or regions within a single country, there is evidence that the resilience pattern, in which women survive relatively better in circumstances of lesser socioeconomic advantage, strengthens over time, with the correlation (Spearman’s Rho) between M/F and several measures of SES eventually reaching the range of 0.8 or higher. Noteworthy is the perpetuation of this resilience pattern after the tipping point where male survival improves relatively (approximately 1970 for Group 1 and 2000 or so for Group 2).

7. It would appear that the patterns of sex differences in mortality observed through the epidemiologic transition for high-income (Group 1) countries are being recapitulated in low- and middle-income countries (Groups 2 and 3).

Our observations may offer a new way of looking at the epidemiologic transition stages as originally defined in 1971 (Omran, 1971; Fink, 2013). Omran was writing, as chance would have it, at a critical historic moment that he could not have foreseen, as Group 1 countries were moving from the era of ever-improving relative survival for women into the modern era in which men have begun to catch up. At that very time, those countries we now dub Group 2 were beginning to enter transition. Omran defined the “quartet” now generally appreciated to be the cornerstones of epidemiologic transition: (1) decline in fertility rates with a concomitant decline in maternal mortality; (2) rise in labor wages and productivity, with associated social welfare benefits including better nutrition and housing; (3) decline in malnutrition and infections as the major causes of death, with emergence of chronic diseases as has been seen in Group 1 and now evident in Groups 2 and 3 countries as well; and (4) despite the emergence of non-communicable
chronic diseases, a dramatic rise in overall LE due to reductions in infant and maternal mortality and acute infections. Based on our own observations, we would add to Omran’s list a fifth phenomenon: the emergence of the female survival advantage, characterized here as “resilience” from the emerging NCD epidemic. Moreover, we would speculate that the cresting of that advantage as development proceeds, now evident in all developed countries, may demarcate yet a further phase in the demographic transition, though it is too early to do more than prognosticate, as Group 2 countries as a group have just entered this phase, and Group 3 countries have yet to arrive. Perhaps more importantly, from the perspective of sex differences in mortality, transition appears to demonstrate an impressively consistent pattern, at least based upon the data available. Viewing Fig. 8 through the lens of what was learned from examination of earlier decades for Group 1, one could readily imagine that the x-axis represents not 4 decade-markers for each of four groups of nations, but 16 “place-time” markers, structured like a classical “rondo” in which each group embarks on the transition pathway 30–40 years after the previous one, then replicates its path. Obviously it is premature to consider this empirically proved, but we offer it as a prediction that might be verified in the future.

8. In wealthy countries, and wealthiest regions within such countries, M/F approaches—but does not reach—unity. From the evidence presented it is clear that some Group 1 countries as a whole, e.g. Iceland, and within highly developed nations some states or counties, such as Santa Clara California, have M/F ratios that are approaching 0.96 or 0.97 for LE and 0.95 for S70. We use the term “approach” with great intention, as we not only can observe these high values but also the slow ascent which preceded, demarcating these settings from others—earlier in time or in poorer countries—in which identical M/F numerical values would garner an altogether different interpretation. It is equally noteworthy that we observe no cases of M/F > 1 as would be expected if these near-unity values represented “mean” levels around which there was random variation. In point of fact a value in excess of 1 is not encountered in a single country or sub-region of a Group 1 country, nor even in a Group 2 country (except perhaps a handful of Chinese counties, mostly rural in a unique setting for which there are other plausible explanations related to family planning policies, son preference, and their unintended social consequences). This would suggest that M/FLE = 0.97 may represent an upper bound, at least barring any future change in causes of mortality that might affect the sexes differentially.

9. Risky behaviors, such as smoking or alcohol consumption, have been identified in some settings as causal or contributory to the observed variation in sex differences in mortality. However, the consistency of the pattern in different countries and cultures suggests more “upstream” determinants may be driving the disproportionate gains in female survival over time and the strong ubiquitous pattern of “resilience” to socioeconomic adversity that has emerged. What factors underlie this phenomenon? As noted it is unlikely that maternal mortality, or other adverse health impacts associated with reproduction, play a role—even lingering—in this phenomenon that seems very robust to variation in geography, culture and ethnicity. It might be tempting to attribute this phase to the more rapid adoption by men than women of particular subsets of “bad behavior”—tobacco and alcohol abuse, dangerous use of motor vehicles, violence, or work in dangerous occupations, to name the more obvious contenders—or that the advantage relates to women’s known greater propensity to use the health care system (Bertakis, Azari, Helms, Callahan, & Robbins, 2000; Oksuzyan, Juel, Vaupel, & Christensen, 2008; Sindelar, 1982); indeed, there is substantial evidence that each of these is a proximate cause of differential mortality between men and women in some settings (Concha-Barrientos et al., 2004; Cutler et al., 2011; Ezzati et al., 2008; Hunter & Reddy, 2013; Kalben, 2002; McCartney et al., 2011; Norström & Razvodovsky, 2010; Tomkins et al., 2012). The ubiquity of the pattern globally, after adjusting for stage of development—despite differences in sex-specific behaviors in different regions, cultures and societies—suggests that the resilience of women to socioeconomic adversity during the “post-maternal mortality” era—or conversely the vulnerability of men not evident when women still died frequently in childbirth—may have a more fundamental “upstream” origin.

10. The convergence of M/F towards 1 in advanced societies appears to be associated with convergence of the lifestyles of men and women. It might be tempting to explain the “inflection point” in sex differences in mortality by one or another social/behavioral changes that occurred in this time frame—for example, in some countries women began to smoke more, joined traditionally male sectors of the workforce, or the like. One parsimonious theory is that with further development, the “least developed” parts of the country, where female resilience to socioeconomic adversity is most evident, converge to the higher level of development in other parts of the country. Furthermore, populations migrate towards the economically developed parts of each country where M/F is higher, as particularly evident in rapid urbanization of most developing countries (Fink, 2013).

Another way to conceptualize the phenomenon of convergence of M/F towards 1 is to consider broadly the lifestyles emerging in the richest parts of the developed world. On the one hand, women are achieving greater role parity, as legal and social barriers to their advancement are eroding in formerly male-dominated arenas such as construction, manufacturing, business management, academics, other professions, and political leadership. At the same time men, now more often sharing many of the same needs and interests as women, are more likely in most cultures to provide child-care and other family roles formerly delegated to women. Moreover an increasing fraction of households have single or same-sex heads. However these cultural phenomena are perceived, there can be little doubt that the formerly distinct sex roles are themselves converging in such societies; viewing this convergence as related to the near convergence of M/F seems an attractive hypothesis. Japan, which uniquely among Group 1 countries M/F is receding from 1 over the past several decades (see Fig. 4), may be instructive, with a very low occupational similarity index remains a significant correlate of M/F70 even when controlling for all the other predictors, as was seen graphically in panel D of Fig. 2. Like the Group

For example, Jiaying Zhao’s analysis of mortality data in East Asia from the 1970s reveals that changes in smoking patterns are unlikely to explain the dramatic changes in cause-specific sex differences in mortality (to oversimplify, largely because women never smoked and men always have in societies like China, Japan, and Korea) (Zhao, 2013). In 13 western countries, Beltrán-Sánchez et al. (2015) estimate that smoking-attributable deaths accounted for no more than one-third of excess male mortality at ages 50–70 for cohorts born in the early 20th century.
1 country comparison, the US also has its “outlier”: Alaska. Despite being in the top 10 percent of US states by SES measures, the State has a low occupational similarity index and a far lower-than-expected M/F70 as seen in Table 2. Arguably, the regional differences in M/F70, as noted previously for the US South even after adjustment for occupational similarity (Table 1), may be a signal supporting a similar mechanism.

4.1. Limitations

There are important limitations to our approach that must be considered:

1. First, as we conceded at the outset, our effort has required use of very diverse data sets, each with quirks and opportunities for imprecision and bias. In many cases we have relied on life table analyses of others to impute sex-specific S70 or LE. Perhaps most significantly, we have been limited to what was available; in many cases data do not extend back in time far enough nor geographically widely enough for our purposes, leaving multiple empiric gaps (such as lack of evidence for Group 2 countries when M/F likely exceeded 1).

2. We do not address over time and place the roles of sex-specific causes of death, with the exception of maternal mortality, and even for that we lack detailed data for most times and countries. There is considerable evidence that after epidemiologic transition cardiovascular disease (CVD, including heart attack, stroke, heart failure) is the major cause of mortality and of its change (Crimmins, 1981), as well as a disease that more often prematurely kills men. For example, by linking cause-specific mortality data from the World Health Organization (WHO) Mortality Database to cohort mortality from the HMD, Beltrán-Sánchez et al. (2015) estimate that heart disease and stroke accounted for over 40% of the increase in M:F mortality ratios between the 1880 and 1919 birth cohorts. They argue (p. 8996) “that men not only had more changes in diet and energy expenditures than women but that men also had underlying greater biological vulnerability to these changes.” It is tempting to explain all of the late changes in M:F by sex-differences in CVD risk factors: smoking, diet, physical inactivity, etc. Indeed, the positive correlation between M:F and SES has strengthened during the period CVD evolved from a disease of the relatively affluent to a disease largely afflicting poorer populations in Group 1 countries, a pattern evidently recurring in LMICs (Harper, Lynch, & Smith, 2011; Saquib, Saquib, Ahmed, Khanam, & Cullen, 2012). Nothing in our analysis can, in and of itself, disprove such a reductionist assertion. However, as noted, any theory of sex differences in mortality must be able to account for observations from myriad countries, cultures and ethnicities in which the distributions of many risks, and their timing in relationship to other developmental and medical changes, are variable. For example, there is compelling evidence that in south Asian countries women, more than men, are afflicted by inactivity, poor diet and obesity, even if they smoke far less (Saquib et al., 2012, 2013). The limited availability and quality of disease-specific mortality data has precluded our further exploration of such considerations, which represent important directions for future research.

3. We lack data for numerous independent covariates of a priori interest—e.g. differential educational attainment and career experience, differences in opportunity for managerial and professional roles, religious laws and customs, differential access to, and quality of, health care, etc. The importance of such unmeasured covariates in our analyses awaits further research.

4. We have no way to account for yet another compelling difference well documented in many societies, namely differential health seeking behavior; women utilize approximately double the healthcare services of their male counterparts in developed societies (Bertakis et al., 2000; Oksuzyan et al., 2008; Sindelar, 1982). The importance of this difference as a cause rather than a result of sex differences in mortality, outside the context of improvements in obstetric care, is impossible to assess from our data.

5. Even for those covariates that we have investigated—per capita GDP, educational attainment, percent in poverty—we lack consistent definitions and metrics over time.

4.2. Implications for pathways mediating sex differences in mortality

We return in closing to the question with which we started: why do women live longer than men? Our study aims to better understand the underlying basis of the century-long female survival advantage in current high-income countries, and the emerging advantage in most of the rest of the world.

As noted in the introduction, there are three broad theories that have received attention; we now return to each. The first theory is that women enjoy a hard-wired, biologic advantage, conferred during human evolution. While none of the data point to a specific basis, there almost certainly is a biologic advantage that seems impervious to—indeed, becomes more evident under—environmental or socioeconomic stress. How else could we explain the universality of the female survival advantage over time, culture, religion, political regime and place, once the scourge of maternal mortality has been overcome? And as noted earlier, even in the setting of high maternal mortality rates, women over 40 had lower mortality than men (Fig. S4). In not one single US county, nor in any single country in Groups 1–3 including 1E, do more men

### Table 2

| Alaska and Alaskan counties. | M/F S70 | Predicted M/F S70* | % Poverty | Income perCapita | % low education, < 12 yr school | Occupational similarity index |
|-----------------------------|--------|-------------------|-----------|-----------------|---------------------------------|-------------------------------|
| I. Alaska                   |        |                   |           |                 |                                 |                               |
| Alaska                      | 0.85   | 0.92              | 7.5       | 51,971          | 10.0                            | 0.39                          |
| Mean, all States            | 0.90   | 0.90              | 13.2      | 41,948          | 12.3                            | 0.51                          |
| II. Five largest counties in Alaska |        |                   |           |                 |                                 |                               |
| Matanuska-Susitna Borough, AK | 0.80   | 0.89              | 7.9       | 56,634          | 14.4                            | 0.35                          |
| Kenai Peninsula Borough, AK  | 0.82   | 0.90              | 8.6       | 57,096          | 12.4                            | 0.37                          |
| Fairbanks North Star Borough, AK | 0.85   | 0.93              | 5.8       | 58,945          | 7.1                             | 0.45                          |
| Juneau, AK                  | 0.85   | 0.94              | 5.2       | 70,092          | 6.8                             | 0.62                          |
| Anchorage, AK               | 0.84   | 0.94              | 3.6       | 76,228          | 7.7                             | 0.64                          |
| Mean, all counties          | 0.84   | 0.82              | 15.2      | 45,308          | 20.7                            | 0.56                          |

* Predicted M/F S70 is predicted using % poverty, income per capita, and % not graduate high school.
survive to age 70 than women do.

But despite the data limitations, we can infer more. For while some sex-specific difference in either $S_{70}$ or LE appears to be constant, the magnitude is not. We have seen, with the benefit of longitudinal and cross-sectional observations, that $M/F_{LE}$ in very highly developed populations is asymptotically approaching 0.97 and $M/F_{LE}$ is approaching 0.95, which translates to 2–3 years of extra life on average for women, or a 5 percent higher likelihood of survival to age 70.

So if the life expectancy difference in the Group 1–3 and 1E countries averages 6–8 years currently, and the difference in survival to 70 still exceeds 10 percent in many Group 1 countries, including the US, what accounts for the remainder? The second broad theory proposes that sex-differences in health behaviors deserve consideration. This theory has indeed received a great deal of attention, with special attention to tobacco and alcohol (Bhattacharya et al., 2012; McCartney et al., 2011; Preston & Wang, 2011). Differences between the sexes in their proclivities toward violence, dangerous occupations, risky driving, and athletic behaviors no doubt play a role, especially in mortality differences among young adults. But two thorny questions cannot be readily dismissed. First is the need to explain the universality of the pattern of female resilience to socioeconomic adversity, which appears to be as true of countries like Russia and Japan as in western Judeo-Christian ones, and is evident in rapidly developing countries like Brazil, China, Iran and Thailand.

Accepting that in almost all societies there are striking and lethal differences between male and female behavior choices, the question remains as to why these different life choices arise. Here we come to the third broad area of speculation—socio-biologic differences between the sexes, which has come to mean hereditary biologic differences whose expression is not manifest in “biology” but in social behavior. Most notable among these behaviors are “nesting” and family-protecting roles, in which sex differences appear common throughout human society and also in other primates—indeed, observed among other animal kingdoms as well. As such one would distinguish the roles of sex hormones as mediators of pathologic changes in blood vessels from their contribution to the social planning and networking behaviors of women, which differ so markedly from men’s, at least historically. How, mechanistically, inborn differences in proclivities to behave certain ways may contribute to the resilience of women to socioeconomic adversity we observe in every culture once epidemiologic transition takes hold is something about which we can only speculate. But while men may be deprived of the biologic drivers, in theory the protective behaviors themselves could be taught or culturally programmed.

Regarding our cross-sectional finding of consistent female resilience to socio-economic adversity, two recent empirical studies from the US provide evidence for a causal pathway of some plausibility that emerges early in the life of disadvantaged boys vis-à-vis girls. Comparing same-family brothers and sisters, Autor, Figlio, Karbownik, Roth, and Wasserman (2016) document that boys growing up in socio-economically disadvantaged households perform worse on standardized tests throughout elementary and middle school, have higher rates of absences and behavioral problems, and are less likely to graduate from high school than are their sisters. Chetty, Hendren, Lin, Majerovitz, and Scuderi (2016) show that men who grew up in low-income households (especially those from concentrated poverty) are less likely to be employed as 30-year-olds, compared to women who grew up in similarly deprived circumstances. These mechanisms of behavioral problems, lower educational attainment, lower employment and (perhaps) higher likelihood of criminal involvement may contribute to differential patterns of risky behavior and the gender gap in young-adult and middle-age health and survival.

In looking for explanations for our second set of findings—the narrowing of male-female differentials in mortality in high income countries over time—the data do not support a strictly numerical reason based on females encountering a biological ceiling; female survival continues to improve more or less linearly, even in countries with a high level of life expectancy. A more promising line of inquiry, but one we did not pursue because accurate data are not available for many of the countries and time periods covered in this paper, is the influence of differences in health behaviors, advances in medical care, and changes in causes of death. The decline in relative importance of cardiovascular mortality consequent to treatment for hypertension and hyperlipidemia stands out, along with widespread use of aspirin and interventional cardiology. Looking to the future, the prospects for further decreases in male-female differences in survival look good. To the extent that remaining differences are attributable to sex differences in roles and behaviors, a period of “gender homogenization” in which roles and behaviors of men and women converge might be expected to result in further convergence of mortality.

Finally, consider the most robust finding of this paper: that the largest male-female differences in mortality occur in conditions of socioeconomic adversity. If social welfare programs and economic policy reduce the number of households and communities living in such adverse conditions, the sex-differential for the country as a whole should decrease. If this speculation is correct we may be entering an era in which only the (modest) female genetic advantage should prevent men from achieving survival parity.

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Appendix A. Supporting information

Supplementary data associated with this article can be found in the online version at http://dx.doi.org/10.1016/j.ssmp.2016.06.006.

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