Estimated Deaths Attributable to Social Factors in the United States

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In 1993, an article provocatively titled "Actual Causes of Death in the United States" offered a new conceptualization of cause-of-death classification, one that acknowledged and quantified the contributions of behavior rather than the more typical pathological explanations recorded on death certificates.¹ The authors, McGinnis and Foege, found that the most prominent contributor to mortality in 1990 was tobacco (400000 deaths), followed by diet and activity patterns (300 000 deaths). A decade later, updated findings by Mokdad et al.² using data from 2000 showed progress in some areas but the growing contribution of obesogenic behavior (poor diet and physical inactivity). Despite controversy over the methods used to derive the attributable numbers of deaths and the validity of their estimates, especially in the article by Mokdad et al., the findings of both articles have been influential, are frequently cited and debated in the peer-reviewed literature,³⁻¹² and have been cited in discussions of national public health priorities.¹³

In a 2004 editorial accompanying the article by Mokdad et al., McGinnis and Foege noted that although

it is also important to better capture and apply evidence about the centrality of social circumstances to health status and outcomes ... the data are still not crisp enough to quantify the contributions [of social circumstances] in the same fashion as many other factors. $^{14(\mathrm{pl}264)}$

In the past 15 years, there has been growing interest in the social determinants of health, and several proposed frameworks describe the effects on individual and population health of social factors at multiple levels, including behavioral factors, features of an individual's social network and neighborhood, and social and economic policies.^{15,16} Numerous studies have demonstrated a link between mortality and social factors such as poverty and low education. Although the proposed causal chain linking adverse social factors to poor health is complicated, the evidence points to mechanisms

Objectives. We estimated the number of deaths attributable to social factors in the United States.

Methods. We conducted a MEDLINE search for all English-language articles published between 1980 and 2007 with estimates of the relation between social factors and adult all-cause mortality. We calculated summary relative risk estimates of mortality, and we obtained and used prevalence estimates for each social factor to calculate the population-attributable fraction for each factor. We then calculated the number of deaths attributable to each social factor in the United States in 2000.

Results. Approximately 245000 deaths in the United States in 2000 were attributable to low education, 176000 to racial segregation, 162000 to low social support, 133000 to individual-level poverty, 119000 to income inequality, and 39000 to area-level poverty.

Conclusions. The estimated number of deaths attributable to social factors in the United States is comparable to the number attributed to pathophysiological and behavioral causes. These findings argue for a broader public health conceptualization of the causes of mortality and an expansive policy approach that considers how social factors can be addressed to improve the health of populations. (*Am J Public Health.* 2011;101:1456–1465. doi:10.2105/AJPH.2010. 300086)

including risky health behaviors (e.g., smoking), inadequate access to health care, and poor nutrition, housing conditions, or work environments.¹⁷⁻²⁰ Social relationships have also been linked to mortality, as social ties influence health behaviors and social support buffers against stress, which in turn affects immune function, cardiovascular activity, and the progression of existing disease.^{21,22} Negative social interactions, including discrimination, have been linked to elevated mortality rates, potentially through adverse effects on mental and physical health as well as decreased access to resources.^{23,24} Finally, characteristics of one's residential environment may influence mortality through investment in health and social services in the community, effects of the built environment, and exposure to violence, stress, and social norms that promote adverse health behaviors.²⁵⁻²⁸

To date, few studies have provided population estimates of deaths attributable to social factors. For example, 1 study estimated that over 1 million deaths from 1996 to 2002 would have been avoided if all adults in the US population had at least a college education.²⁹ Other studies have estimated attributable fractions for mortality of 2% to 6% for poverty (depending on the year and data source),^{30,31} 9% to 25% for income inequality (depending on age group),³² and 18% to 25% for low neighborhood socioeconomic status (depending on gender and racial/ethnic group).³³ Building on these previous efforts, we aimed to estimate the number of deaths in the United States attributable to social factors, using a systematic review of the available literature combined with vital statistics data.

METHODS

To calculate the number of deaths attributable to social factors in the United States, we first estimated the relative risk (RR) of mortality associated with each social factor and obtained an estimate of the prevalence of each social factor in the United States. These estimates were used to calculate the population-attributable fraction of mortality for each factor, which

was multiplied by the total number of deaths in the United States in 2000 to estimate the number of deaths attributable to each social factor.

Relative Risk Estimates

We conducted a MEDLINE search for all English-language articles published between 1980 and 2007 with estimates of the relation between individual- and area-level social factors and adult all-cause mortality. Individuallevel social factors included education, poverty, health insurance status, employment status and job stress, social support, racism or discrimination, housing conditions, and early childhood stressors. Area-level social factors included area-level poverty, income inequality, deteriorating built environment, racial segregation, crime and violence, social capital, and availability of open or green spaces. We identified these articles to extract RR estimates from independent samples that could be combined through meta-analysis to obtain summary RR estimates for the relations between each social factor and mortality.

The included studies presented data sufficient for calculating an estimate of the association between at least 1 of the social factors of interest and adult all-cause mortality, using unweighted counts, RR estimates, regression coefficients, or mortality rates. For studies that concerned multiple levels of analysis, we included only those that appropriately used multilevel analytic methods. Figure 1 summarizes the studies that we considered, included, and excluded. We excluded articles presenting results from studies conducted outside of the United States, those limited to participants with a history of disease or using composite measures of socioeconomic status, and those that did not use adult all-cause mortality as an outcome measure. We also excluded review articles, articles providing insufficient data to calculate RR estimates, and articles presenting data only for proxy measures of the social factors of interest. This left a total of 120 eligible studies.

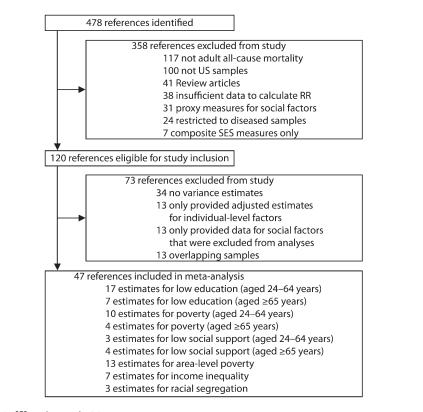
Further criteria for inclusion in the metaanalyses included the presentation of SE or other variance estimates to allow calculation of an approximate 95% confidence interval (CI) for a dichotomous contrast in the social factor of interest (e.g., low vs high educational attainment). Additionally, RR estimates unadjusted for potential mediators of the relation between the social factor and mortality were desired; however, this requirement was relaxed for estimates of the effect of area-level social factors since nearly all estimates in the literature were adjusted. Finally, we decided a priori to limit meta-analyses to social factors for which at least 3 RR estimates from separate studies were available.

We extracted RR estimates from the remaining 60 studies for the following factors: education, poverty, social support, area-level poverty, income inequality, and racial segregation. Because meta-analyses must be conducted on nonoverlapping samples,³⁴ we excluded an additional 13 articles because they provided only estimates for samples already represented by other articles. When multiple articles provided data for the same sample, we selected estimates incorporating the largest sample size, the longest duration of follow-up, and the fewest restrictions on the sample in terms of

age group or gender; additionally, we preferred estimates incorporating person-time data from longitudinal studies. The final 47 studies used in the meta-analyses are summarized in Table 1.

From each of the 47 articles, we extracted unadjusted RR estimates if provided; otherwise, we calculated RR estimates using unweighted or weighted counts, regression coefficients, or mortality rates according to standard methods.³⁴ The cutpoints used for dichotomous contrasts for each social factor, which are summarized in Table 2, were based on definitions most commonly used in the included studies and the literature on these social factors more generally.

When possible, we extracted age-specific estimates for 2 broad age groups, those aged 25 to 64 years at baseline and those aged 65 years or older at baseline. Although some evidence suggests that the relation between the social factors of interest and mortality decreases with age,¹⁹ most deaths occur among older individuals. Altogether, we extracted 68



Note. SES = socioeconomic status.

FIGURE 1—Flow diagram of studies considered for meta-analyses to derive summary relative risk (RR) estimates for each social factor in relation to mortality.

References	Social Factors ^a	Sources of Data	Sample ^b	Years ^c
Anderson et al. ¹⁷	Poverty, aged 25-64 and	National Longitudinal Mortality Study	233 600 White and Black men and women who could be	1979-1989
	\geq 65 y; area-level poverty	and Census data	linked to census tract; number of areas not reported	
Backlund et al. ¹⁸	Low education, aged 25-64 y	National Longitudinal Mortality Study	415 224 men and women aged 25-64 y with complete	1979-1989
			information for all covariates of interest	
Bassuk et al. ³⁵	Low education, aged \geq 65 y;	EPESE	14456 men and women aged \ge 65 y from East Boston,	1982-1995
	poverty, aged ≥ 65 y		MA; rural lowa; New Haven, CT; and Piedmont, NC	
Batty et al. ³⁶	Low education, aged 25-64 y;	Vietnam Experience Study	4 316 men aged 30-49 y who entered military service in	1985-2000
	poverty, aged 25-64 y		the 1960s and 1970s and who participated in a telephone	
			interview in 1985 and a medical examination in 1986	
Beebe-Dimmer et al. ³⁷	Low education, aged 25-64 y;	Alameda County Study	3 087 women aged 17-94 y with complete information on	1965-1996
	poverty, aged 25-64 y		socioeconomic position at baseline	
Blazer ³⁸	Low social support, aged \geq 65 y	Community-based elderly living in	331 men and women aged 65 y or older who were included	1972-1975
		Durham County, NC	in 30-mo follow-up study	
Bucher and Ragland ³⁹	Low education, aged 25-64 y;	Western Collaborative Group Study	3154 White men aged 39-59 y who were free from coronary	1961-1983
	poverty, aged 25-64 y		heart disease or other obvious health problems at baseline	
Cerhan and Wallace ⁴⁰	Low social support, aged \geq 65 y	lowa 65+ Rural Health Study (part	2575 men and women aged ≥ 65 y living in lowa and	1981-1993
		of EPESE)	Washington counties, IA who were interviewed in person at	
			both baseline and follow-up	
Cooper et al. ⁴¹	Area-level poverty; income	NCHS and US Census data	White and Black men and women aged < 65 y in metropolitan	1989-1991
	inequality; racial segregation		areas with complete information for all covariates of	
			interest; number of areas: 267 metropolitan areas	
Daly et al. ⁴²	Income inequality	Panel Study of Income Dynamics	Men and women aged \geq 25 y who participated in PSID in	1988-1992
		(PSID) and census data	1988; number of areas: 50 states	
Eng et al. ²¹	Low social support, aged 25-64 y	Health Professionals Follow-Up Study	28 369 male health professionals aged 40-75 y who did	1986-1998
			not have preexisting disease prior to 1988 and who	
			provided social network data	
Feinglass et al. ⁴³	Low education, aged 25-64 y;	Health and Retirement Study	9 759 men and women aged 51-61 y living in the	1992-2002
	poverty, aged 25-64 y		contiguous United States	
Feldman et al. ⁴⁴	Low education, aged \geq 65 y	NHANES I, NHEFS	1 395 White men aged 65-74 y with complete information	1971-1984
			for all covariates of interest	
Fiscella and Franks ⁴⁵	Poverty, aged 25-64 y	NHANES I, NHEFS	6582 White and Black men and women aged 25-74 y with	1971-1987
			complete information on psychological distress	
Fiscella and Franks ²⁷	Income inequality	NHANES I, NHEFS	13 280 men and women aged 25-74 y with complete	1971-1987
			information for all covariates of interest; number of areas:	
			105 counties or combined county areas	
Franks et al. ⁴⁶	Low education, aged 25-64 y	NHANES I, NHEFS	4 882 White and Black men and women aged 25-74 y with	1971-1987
			information on health insurance status and who did not	
			have publicly funded health insurance	

RESEARCH AND PRACTICE

Greenfield et al. ⁴⁷	Low social support, aged 25-64 y	National Alcohol Survey	5.093 men and women aged \geq 18 y with information on alcohol consumption and depression	1984-1995
Haan et al. ⁴⁸	Area-level poverty ^d	Alameda County Study	1811 men and women aged \geq 35 y who were residents of Oakland. California in 1965: number of areas not applicable	1965-1974
Hahn et al. ³⁰	Poverty, aged ≥65 y	NHANES I, NHEFS	White and Black men aged ≥ 65 y with complete information on all covariates of interest	1971-1984
Kawachi and Kennedy ⁴⁹	Income inequality	Compressed Mortality Files and Census data	Total population of the US in 1990; number of areas: 50 states	1990
Kennedy et al. ⁵⁰	Income inequality	Compressed Mortality Files and Census data	Total population of the US in 1990; number of areas: 50 states	1990
Krieger et al. ⁵¹	Area-level poverty; income inequality	Public Health Disparities Geocoding Project	Men aged <65 y residing in Massachusetts or Rhode Island; number of areas: 1566 census tracts	1989-1991
Lantz et al. ⁵² Liu et al. ⁵³	Low education, aged 25-64 y; poverty, aged 25-64 y	Americans' Changing Lives	1358 men aged ≥ 25 y in the contiguous United States	1986-1994
(1)	Low education, aged 25-64 y	Chicago Heart Association Detection Project	8047 White men aged 40-59 y who were free of myocardial infarction at baseline	1967-1978
(2)	Low education, aged 25-64 y	Chicago Peoples Gas Company and Western Electric Company studies	2 980 White men aged 40-59 y who were free of clinical coronary heart disease at baseline	1957-1980
Lochner et al. ⁵⁴	Income inequality	National Health Interview Survey and Current Population Survey	546 888 non-Hispanic White and Black men and women aged 18-74 y; number of areas; 48 states	1987-1995
Mare ⁵⁵	Low education, aged 25-64 y	National Longitudinal Survey of Labor Market Experiences of Mature Men	5 020 men aged 44-61 y	1966-1983
McDonough et al ⁵⁶	Low education, aged 25-64 y; poverty, aged 25-64 y	PSID	For this analysis, PSID sample was converted into 14 10-y panels, with total of 46.197 observations; each panel was restricted to individuals aged \geq 45 y in middle of 10-y period	1968-1989
McLaughlin and Stokes ⁵⁷	Area-level poverty; racial segregation	Compressed Mortality files and census data	Total population of the contiguous US; number of areas: 3067 counties	1988-1992
Muennig et al. ³¹	Poverty, aged ≥ 65 y	National Health Interview Survey	Men and women aged 65-74 y	1990-1995
Muntaner et al. ⁵⁸	Poverty, aged 25-64 y	National Health Interview Survey	377 129 men and women aged 25-64 y who were in civilian labor force at baseline and provided sufficient information about their occupation or industry to be classified by economic sector	1986-1997
Qureshi et al. ⁵⁹	Low education, aged 25-64 y	NHANES I, NHEFS, NHANES II Mortality Follow-up Study	14407 NHANES I participants aged 25-74 y, and 9 252 NHANES II participants aged 30-74 y in 1976-1980	1971-1992
Rehkopf et al. ⁶⁰	Low education, aged 25-64 and \geq 65 y; area-level poverty	Vital statistics and Census data	Total population of MA census tracts; number of areas not reported	1999-2001
Reidpath ⁶¹	Area-level poverty; racial segregation	Compressed Mortality files and census data	Total population of the United States; number of areas: 50 states	1989 - 1991
Robbins and Webb ⁶²	Area-level poverty	Vital statistics and Census data	Total population of Philadelphia, PA, census tracts; number of areas on renorted	1999-2001
Rogot et al. ⁶³	Low education, aged \geq 65 y	National Longitudinal Mortality Study	115 237 White and Black men and women aged ≥ 65 y	1979-1985

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Rutledge et al. ⁶⁴	Low education, aged ≥ 65 y, low social support, aged ≥ 65 y	Study of Osteoporotic Fractures	7524 White community-dwelling women aged ≥ 65 y who had no history of bilateral hip replacement and who completed social network scale at follow-up	1988-1996
Schoenbach et al. ⁶⁵	Low social support, aged 25-64	Evans County Cardiovascular Epidemiologíc Studio	2059 residents of Evans County, GA, with complete data on social networks and mortality.	1967-1980
Schulz et al. ⁶⁶	ume = 50 y Low education, aged ≥ 65 y	cardiovascular Health Study	5201 men and women aged ≥65 y living in Forsyth County, NC; Washington County, MD; Sacramento County, CA; and Allednenv County, PA	1989-1995
Smith et al. ^{67,68}	Poverty, aged 25-64 y	Multiple Risk Factor Intervention Trial	320909 White and Black men aged 35-57 y	1973-1990
Snowdon et al. ⁶⁹	Low education, aged 25-64 and ≥ 65 y	screening Nun Study	306 Roman Catholic nuns aged \geq 50 y from Mankato, MN, province of School Sisters of Notre Dame	1936-1988
Steenland et al. ⁷⁰ (1)	Low education, aged 25-64 y	CPS-I	1051038 men and women aged \geq 30 y from 25 states in the linited states	1959-1972
(2) Thomas et al. ⁷¹	Low education, aged 25-64 y Area-level poverty	CPS-II Multiple Risk Factor Intervention Trial screening	1184.657 men and women aged \geq 30 y nationwide 293138 men and women aged \geq 30 y nationwide 293138 men aged 35-57 y with complete baseline health and median household income data; number of areas: 14.031	1982-1996 1973-1999
Turra and Goldman ⁷²	Low education, aged 25-64 y	National Health Interview Survey	census tracts 331079 Hispanic and non-Hispanic native-born White men and women aged ≥ 25 y with complete information for all covariates	1989-1997
Waitzman and Smith ²⁶	Area-level poverty ^d	NHANES I, NHEFS	of interest 10161 White and Black men and women aged 25-74 y with complete information on covariates and vital status; number of areas	1971-1987
Yabroff and Gordis ⁷³ (1)	Area-level poverty	National Multiple Cause of Death File	White and Black women aged ≥55 y in United States, number of	1990-1991
(2)	Area-level poverty	and certaus data NHIS	areas. 4.10 bounds for estimate 111776 White and Black women aged 255 y who participated in NHIS in 1987-1993; number of areas: 284 counties or clusters of counties for estimate	1987-1995
Young and Lyson ⁷⁴	Area-level poverty	Bureau of Health Professions Area Resource File and Census data	Total population of contiguous United States; number of areas: 3023 counties	1989-1991
Note. CPS = Cancer Preventi Epidemiological Follow-Up S ⁵ Social factors for which ea ^b Sample from which the estii the number of areas includ.	Note. CPS = Cancer Prevention Study; EPESE = Established Populations for Epidemiologic Studies of the Elderly; NCHS = National Center for Health Statistics; NHANES I = Nation. Epidemiological Follow-Up Survey; NHI = National Health Interview Survey; PSID = Panel Study of Income Dynamics. "Social factors for which each study contributed estimates in the meta-analysis. "Sample from which the estimate included in the meta-analysis. The number of areas included is also provided when possible.	Is for Epidemiologic Studies of the Elderly; NCHS= National Center Survey; PSID = Panel Study of Income Dynamics. Teta-analysis. Utained; age refers to age of the sample at baseline. For studies provided the	Note. CPS = Cancer Prevention Study; EPESE = Established Populations for Epidemiologic Studies of the Elderly; NCHS = National Center for Health Statistics, NHANES I = National Health and Examination Survey I; NHEFS = NHANES I = ⁵ ocial factors for which each study contributed estimates in the meta-analysis. ⁵ ocial factors for which the estimate included in the meta-analysis was obtained; age refers to age of the sameline. For studies providing estimates for area-level social factors (area-level poverty, income inequality, racial segregation), the number of areas included is also provided when possible.	S= NHANES 1 cial segregation),

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TABLE 2—Definitions Used to Calculate Dichotomous Contrasts for the Association Between Each Social Factor and Adult All-Cause Mortality and Prevalence Estimates for Each Social Factor: United States, 2000

	Definition for RR Estimates From Studies	Prevalence Estimates Used in PAF Calculations ^a			
Social Factor		Definition	Source		
Low education	<high <math="" school="" vs="">\geq high school diploma or equivalent</high>	% of adult population with < high school education	US Census Bureau Summary File 3 ⁷⁵		
Poverty	Annual household income of $<$10000 \text{ vs} \ge 10000^{b}	% of adult population living below the poverty level	US Census Bureau Summary File 3^{75}		
Low social support	"Low" vs "high" score on a social network index ^c	% of adult population with score of 0 or 1 on social network index ^c	National Health and Nutrition Examination Survey III ⁷⁶		
Area-level poverty	≥20% of population living below poverty level vs <20% living below poverty level ^d	% of adult population living in counties with \geq 20% of population living below the poverty level	US Census Bureau Summary File 3^{75}		
Income inequality	Gini coefficient 1 SD above the mean vs the mean value	% of adult population living in counties with Gini coefficient at or above the 25th percentile ^e	US Census Bureau, derived from household income data 75		
Racial segregation	% Black 1 SD above the mean vs the mean value	% of adult population living in counties with ≥25% of population reporting their race/ethnicity as non-Hispanic Black	US Census Bureau Summary File 1^{77}		

Note. PAF = population attributable fraction; RR = relative risk.

^aAdult population was defined as those aged \geq 25 years.

^b\$10000 roughly corresponded to the poverty threshold for a family of 4 in the early to mid-1980s,⁷⁸ when many of the included studies were conducted.

^cSocial network indices in most included studies were based on that developed by Berkman and Syme⁷⁹; low scores indicated few social ties. The social network index included in NHANES III, from which the prevalence estimate was derived, ranged from 0 to 4, and included indicators of marriage or partnership, contact with friends and relatives, frequency of church or religious service attendance, and participation in voluntary organizations.⁷⁶

⁴20% or more of population living below the poverty level corresponds to the criteria for a "poverty area" put forth by the US Census Bureau.⁸⁰

^eA Gini coefficient in the top 25th percentile (0.459) represents areas with the highest levels of income inequality in the United States.

estimates from the 47 articles, as summarized in Figure 1. We calculated summary statistics for each social factor using Comprehensive Meta-Analysis version 2 (Biostat, Englewood, NJ). We used random-effects models for all summary estimates, taking into account unmeasured heterogeneity in effect estimates across studies and allowing greater weight to be given to studies conducted on smaller samples than when using fixed-effects models.³⁴

Prevalence Estimates and Mortality Data

Estimates of the prevalence of each social factor in the US adult population (aged ≥ 25 years) were obtained from the 2000 US Census,^{75,77} except for the prevalence of low social support, which was obtained from the Third National Health and Nutrition Examination Survey (NHANES III).⁷⁶ To derive prevalence estimates, we used cutpoints as similar as possible to those used when calculating dichotomous contrasts for each of the included studies. Table 2 summarizes the definitions and sources of data used to obtain prevalence estimates for each

social factor, and prevalence estimates for each factor are presented in Table 3.

We obtained the total number of deaths in 2000 from all causes by age group from the National Vital Statistics Report.⁸¹ Because the average duration of follow-up for studies providing RR estimates for samples aged 25 to 64 years at baseline was 10 years, we included deaths among persons aged 25 to 74 years for this age group, which was similar to the method used by Hahn et al.³⁰

Calculation of Population Attributable Fraction and Sensitivity Analyses

We calculated the population-attributable fraction (*PAF*) for each social factor using the following formula:

(1)
$$PAF = \frac{p(RR-1)}{p(RR-1)+1}$$

where RR is the summary RR estimate for mortality derived from the meta-analyses described and p is the prevalence of the social factor in the US population in 2000. The population-attributable fraction represents the proportion of all deaths that can be attributed to the social factor (i.e., the proportion of all deaths that would not have occurred in the absence of the social factor).^{19,82–84} The population-attributable fraction was then multiplied by the total number of deaths in the relevant age group to arrive at the number of deaths attributable to the social factor in that age group.

We conducted sensitivity analyses to assess the robustness of the summary RR estimate for each social factor using alternate cut points or multiple categories (e.g., tertiles) rather than a dichotomous contrast in exposure levels.

RESULTS

Table 3 provides the summary RR estimates and corresponding 95% CIs derived from meta-analyses of the relations between each social factor and adult all-cause mortality. RRs for mortality associated with low education and poverty were higher for individuals aged 25 to 64 years than they were for those aged 65

TABLE 3—Calculation of the Number of US Deaths in 2000 Attributable to Each Social Factor

Social Factor and Age Group	RR (95% CI) ^a	Prevalence, % ^b	PAF, %°	Total Deaths, ^d No.	Deaths Attributable to Social Factor, ^e No.
		Individual-lev	el factors		
Low education					
≥25 y					244 526
25-64 y	1.81 (1.64, 2.00)	16.1	11.5	972645	112209
≥65 y	1.23 (0.86, 1.76)	34.5	7.4	1 799 825	132317
Poverty					
≥25 y					133250
25-64 y	1.75 (1.51, 2.04)	9.5	6.7	972645	64 692
≥65 y	1.40 (1.37, 1.43)	9.9	3.8	1 799 825	68 558
Low social support					
≥25 y					161 522
25-64 y	1.34 (1.23, 1.47)	21.0	6.7	972645	64819
≥65 y	1.34 (1.16, 1.55)	16.7	5.4	1 799 825	96 703
		Area-level	factors ^f		
Area-level poverty	1.22 (1.17, 1.28)	7.8	1.7	2 331 261	39 330
Income inequality	1.17 (1.06, 1.29)	31.7	5.1	2 331 261	119208
Racial segregation	1.59 (1.31, 1.94)	13.8	7.5	2 331 261	175520

Note. CI = confidence interval; PAF = population attributable fraction; RR = relative risk.

^aSummary relative risk estimates derived from meta-analyses as described in Methods.

^bPrevalence of each social factor in the US population of the relevant age, according to 2000 US Census data, except low social support, according to data from the Third National Health and Nutrition Examination Survey, as reported in Ford et al., 2006.⁷⁶

^cPAF = ([p(RR-1)] / [p(RR-1) + 1]) × 100, where p is the prevalence expressed as a proportion and RR is the relative risk estimate for the group of interest.

^dTotal number of deaths in each age group in 2000, from Minino et al., 2002.⁸¹ For low education, poverty, and low social support, deaths for the younger age group include deaths for those aged 25–74 y to account for an average of 10 y of follow-up time in studies used to calculate the summary relative risk estimate.

 e Deaths attributable to social factor = (PAF/100)×total deaths in 2000. Numbers reflect the use of a nonrounded population attributable fraction in calculations.

^fAge group for all area-level factors was \geq 25 y.

years or older; for example, the RR was 1.75 (95% CI=1.51, 2.04) for poor versus nonpoor individuals aged 25 to 64 years, but the RR was 1.40 (95% CI=1.37, 1.43) for poor versus nonpoor individuals aged 65 years or older. Adverse levels for all social factors considered were associated with increased mortality, although the RR of mortality for low education among those aged 65 years or older was not statistically significant (RR=1.23; 95% CI=0.86, 1.76).

Table 3 also shows the population-attributable fraction for each social factor. These fractions ranged from 1.7% for area-level poverty to 11.5% for less than a high school education among those aged 25 to 64 years. From these population-attributable fraction estimates and mortality data, we estimated that approximately 245000 deaths in the United States in 2000 were attributable to low education, 133 000 to poverty, 162 000 to low social support, 39 000 to area-level poverty, 119 000 to income inequality, and 176 000 to racial segregation.

Our sensitivity analyses showed that the summary RR estimates varied in magnitude but not direction depending on the choice of cutpoints and categories for the exposure. Among those aged 25 to 64 years, summary RR estimates for the relation between low education and mortality ranged from 1.17 to 2.45, those for poverty ranged from 1.20 to 2.39, and those for low social support ranged from 1.08 to 1.54. For area-level poverty, summary RR estimates ranged from 1.10 to 1.15, those for income inequality ranged from 1.14 to 1.32, and those for racial segregation

ranged from 1.47 to 2.54. Complete results of the sensitivity analyses are available from the authors upon request.

DISCUSSION

We found that in 2000, approximately 245000 deaths in the United States were attributable to low education, 176 000 to racial segregation, 162000 to low social support, 133 000 to individual-level poverty, 119 000 to income inequality, and 39000 to area-level poverty. These mortality estimates are comparable to deaths from the leading pathophysiological causes. For example, the number of deaths we calculated as attributable to low education is comparable to the number caused by acute myocardial infarction (192898), a subset of heart disease, which was the leading cause of death in the United States in 2000.⁸¹ The number of deaths attributable to racial segregation is comparable to the number from cerebrovascular disease (167 661), the third leading cause of death in 2000, and the number attributable to low social support is comparable to deaths from lung cancer (155521).

Our estimates of the number of deaths attributable to social factors can be loosely compared with previous estimates, although our approach differs methodologically from prior efforts. Woolf et al. reported that an average of 196000 deaths would have been avoided each year from 1996 to 2002 if all adults in the United States had had a college education, compared with our estimate of 245000 deaths attributable to having less than a high school education in 2000.29 Our numbers are higher because we included deaths among those aged 65 years or older, whereas Woolf et al. included deaths only among individuals aged 25 to 64 years. Hahn et al. estimated that 6% of deaths in the United States in 1991 could be attributed to poverty, corresponding to 91000 deaths among those aged 25 years or older,³⁰ whereas Muennig et al. estimated that 2.3% of deaths in the United States in 2000 could be attributed to poverty, corresponding to 54000 deaths.³¹ Although our estimated population-attributable fraction for mortality attributable to poverty was 4.5%, roughly between these 2 previous estimates, our estimate of the number of deaths attributable to poverty (133000) was higher than the estimate

by Hahn et al. This higher estimate is partly because of differences in age stratification and the use of deaths among all races rather than those among Whites and Blacks only,30 and partly because we estimated deaths for a later period in which there was a greater number of deaths overall. By contrast, our estimates of the population-attributable fraction for mortality associated with area-level poverty (1.7%) and with income inequality (5.1%) are not directly comparable to those reported in previous studies, which looked at excess mortality in neighborhoods with medium and low levels of socioeconomic status (encompassing a broader array of factors, including educational level and median housing value)³³ and at the percentage of mortality in areas with high levels of income inequality that could be attributed to that income inequality.32

Several issues should be considered when interpreting these findings. Limited availability of data from US samples prevented us from considering some social factors and, in some cases, forced us to base our RR estimates on small numbers of studies. Previous analyses^{1,2} also relied on small numbers of studies in some cases to derive their attributable risk estimates; we suggest that our approach of conducting a systematic meta-analysis allowed us to capture the relations as accurately as possible. The 6 social factors considered are highly interrelated; thus, deaths attributed to each factor are not necessarily mutually exclusive. In addition, in the absence of stratum-specific estimates we could not assess possible heterogeneity in effects, and when only adjusted RR estimates were available we likely underestimated the true number of deaths because the RR estimates on which we based our calculations were derived by controlling for mediating variables rather than confounders. Our methods assume that the relations between social factors and mortality that were estimated in the 1980s and 1990s, when most of the included studies were conducted, still applied in 2000, the year used for our prevalence and mortality data. Although subgroup analyses we conducted suggested no differences in the relation between each social factor and mortality in different time periods, others have suggested that disparities in mortality by socioeconomic status have been increasing during the past few decades.⁸⁵

Our meta-analytic results are only as valid and reliable as the studies upon which they are based. Although many of the RR estimates used in the meta-analyses were derived from national samples, some were conducted in specific populations or areas of the country. These samples may not reflect the target populationspecifically, the adult US population-used to calculate the number of attributable deaths. The measures and definitions used to operationalize the social factors of interest were not always consistent across studies, although sensitivity analyses suggested no substantial differences in RR estimates when using alternate cutpoints. Additionally, the approach used to calculate the population attributable fraction is not strictly valid in the presence of confounding or effect modification, although it may provide reasonably accurate results in practice despite methodological limitations.^{83,84} We used unadjusted estimates and stratified by covariates whenever possible but were restricted to adjusted estimates for the area-level social factors considered.

The extent of the potential bias in our estimates depends on whether there is residual confounding present in the adjusted estimates and the degree of effect measure modification.⁸⁶ Although the bias in the presence of confounding alone may be predictable-incomplete control of positive confounding leads to an overestimate of the RR that translates into an overestimate of the attributable numbers of deaths-it is difficult to predict the direction of bias when there is heterogeneity in the RR estimates.⁸³ This difficulty reflects a methodological limitation inherent in using adjusted RR estimates to derive population attributable fraction estimates: residual confounding and effect heterogeneity will affect summary estimates of the RRs and lead to bias in the populationattributable fraction estimates. Ultimately, however, this concern applies to all studies that rest on meta-analytic techniques, including the ones that we build on in conducting this work. One conclusion that can be drawn from our work is that individual study results may not be useful for synthetic analyses such as ours unless these studies provide detailed data summaries and subgroup estimates in addition to the final, multiply adjusted estimates.

Finally, we limited our analysis to structural social factors that are largely features of individual experiences or group context. We did not consider stress processes that may explain the link between social factors and mortality. In many ways, stress processes may be considered a mediator of some of the factors we study, so we accounted for them. However, stress processes may also mediate the relation between other "nonsocial" factors and mortality, so we might have underestimated the contribution of social factors to mortality in the United States. This analysis suggests that, within a multifactorial framework, social causes can be linked to death as readily as can pathophysiological and behavioral causes. All of these factors contribute substantially to the burden of disease in the United States, and all need focused research efforts and public health efforts to mitigate their consequences.

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Contributors

S. Galea wrote the first draft of the article, supervised data analysis, and serves as study guarantor. M. Tracy was responsible for data collection and analysis, with input from K.J. Hoggatt. C. DiMaggio contributed to the meta-analytic methods. S. Galea and A. Karpati conceptualized the study and its design. All authors provided critical edits on drafts of the article and approved the final version.

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Human Participant Protection

No protocol approval was necessary because there were no human participants directly engaged in this work.

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