Multilevel analyses of neighbourhood socioeconomic context and health outcomes: a critical review

K E Pickett, M Pearl

Abstract

Purpose—Interest in the effects of neighbourhood or local area social characteristics on health has increased in recent years, but to date the existing evidence has not been systematically reviewed. Multilevel or contextual analyses of social factors and health represent a possible reconciliation between two divergent epidemiological paradigms—individual risk factor epidemiology and an ecological approach.

Data sources—Keyword searching of Index Medicus (Medline) and additional references from retrieved articles.

Study selection—All original studies of the effect of local area social characteristics on individual health outcomes, adjusted for individual socioeconomic status, published in English before 1 June 1998 and focused on populations in developed countries.

Data synthesis—The methodological challenges posed by the design and interpretation of multilevel studies of local area effects are discussed and results summarised with reference to type of health outcome. All but two of the 25 reviewed studies reported a statistically significant association between at least one measure of social environment and a health outcome (contextual effect), after adjusting for individual level socioeconomic status (compositional effect). Contextual effects were generally modest and much smaller than compositional effects.

Conclusions—The evidence for modest neighbourhood effects on health is fairly consistent despite heterogeneity of study designs, substitution of local area measures for neighbourhood measures and probable measurement error. By drawing public health attention to the health risks associated with the social structure and ecology of neighbourhoods, innovative approaches to community level interventions may ensue.

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The association of health status and many diseases with socioeconomic status has been so widely demonstrated in varied populations¹ that adjustment for socioeconomic status has become routine in epidemiological analyses.² Health status is related to socioeconomic status across the socioeconomic gradient; even among populations with relatively high socio-

economic status, the most advantaged have better health status than the less advantaged.³

Population inequalities in disease are not generally accounted for by any known combination of individual genetic and environmental risk factors, and must therefore be attributable to other unmeasured factors, some of which may operate at an aggregate level (see various publications²⁻⁴⁻¹¹ for discussions). Winkelstein has pointed out that "ecological factors may be the most important determinants of the health and disease status of a population".¹² The neighbourhoods in which people live may influence health, operating through such mechanisms as: the availability and accessibility of health services; infrastructure deprivation (lack of parks, stores selling healthy foods at affordable prices, etc); the prevalence of prevailing attitudes towards health and health related behaviours; and stress and a lack of social support.⁸

Although there is an established tradition of inquiry into the impact of neighbourhood factors on sociological outcomes, such as educational attainment and labour market opportunities,¹³⁻¹⁵ neighbourhood variation in health has received less attention in epidemiology until recently. In part this is because of the intractability of the ecological fallacy when group level data are used to infer individual disease risk, and also because of a disciplinary focus on individual risk factors through much of this century.⁹⁻¹⁶ An increasing interest in societal influences on individual health status, along with improved statistical techniques for combining group level and individual level factors in regression models has spurred interest in contextual research in epidemiology.⁶

The statistical issues involved in multilevel studies have been well described,¹⁷ and hierarchical regression analysis is becoming widely accepted as the appropriate tool for examining group level effects on individual health. To date, there has been no published summary of the results of multilevel epidemiological studies and the literature reviews included with most published analyses have been incomplete. The validity and generalisability of neighbourhood effects remain open to question, and as yet there has been little empirical investigation of the causal pathways by which social environments translate into biological states of health and disease. Indeed, it is probable that neighbourhood or contextual effects will themselves be contextual, and that both the factors themselves and the magnitude of their effects will be context dependent. In this paper we

Department of Health Studies, University of Chicago, 5841 South Maryland Avenue, MC 2007, Chicago, IL 60637, USA
K E Pickett

Department of Family and Community Medicine, University of California, San Francisco
M Pearl

Correspondence to:
Dr Pickett
(kpickett@health.bsd.uchicago.edu)

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seek to summarise the epidemiological literature, paying particular attention to methodological issues inherent in multilevel studies, so that the literature can be viewed in its entirety.

Methods

Studies were identified via keyword searching on Medline using the terms multi-level, social class, neighborhood, socioeconomic factors, health outcomes, and additional studies were retrieved from reference lists. Inclusion criteria for studies were: (1) published in English in peer reviewed journals before June 1998, (2) study population in a developed country, (3) outcome of physical or mental health or health behaviour, measured at the individual level, (4) multilevel studies with socioeconomic information measured at both the individual level and area level. There is a large body of literature from the sociological and demographic literature covering community effects on fertility and sexual behaviour that is not covered in this review (see for example Brewster¹⁸ and Grady *et al.*¹⁹). The growing epidemiological literature on income inequality (see for example²⁰⁻²³) that is concerned with estimating the effect of differentials in socioeconomic status rather than the effect of low socioeconomic status in itself is also excluded, as it has methodological issues deserving of separate treatment.

We identified 25 studies using these criteria (table 1). We categorised results by health outcome: mortality, morbidity (only one study examined mental health) and health behaviours. Five studies had results in more than one category and are cross referenced in table 1. Thirteen studies were conducted in US samples, nine in the UK, two in the Netherlands and one in Finland.

Methodological issues in studying neighbourhood social factors

DEFINING AND MEASURING "NEIGHBOURHOOD"

All but two^{24, 25} of the studies used geographical boundaries, developed for the census or other political purposes, as proxies for actual communities or neighbourhoods (table 1). The choice of political boundaries permits straightforward linkage with routinely collected area level data, an appropriate choice in the early stage of investigation of aetiological hypotheses; however these units may be inappropriate if they do not correspond to the actual geographical distribution of the causal factors linking social environment to health. If, for example, social support is hypothesised to be a key mechanism then the interest might be in whether or not residents receive social support within the area they define as their neighbourhood,⁶ whereas if access to health care were considered more important, catchment areas for local health service providers would be preferred. Instead political boundaries provide very "rough ecological profiles".²⁶ These considerations also affect the choice of area size to use. Debate has focused on the best choice of area size when area level measures are to be used as proxies for individual measures,

however, the choice of area size in contextual studies is also deserving of thoughtful consideration.²⁷⁻³⁰

Much of the discussion of the most appropriate geographical sub-unit for measuring neighbourhood social factors variables has focused on homogeneity within areas.³¹⁻³³ A neighbourhood need not be homogenous to affect the lives of its inhabitants. In fact, complete homogeneity within an area precludes the study of contextual effects altogether. Extreme heterogeneity may render measures of the impact of neighbourhood averages, such as median household income, meaningless; indeed a current discussion on the health effects of income inequality suggests that both the average and the spread of neighbourhood social factors are worthy of examination.³⁴

CHOICE OF AREA LEVEL SOCIAL VARIABLES

Neighbourhood level variables are either derived from individual level variables, such as median household income, or integral to the neighbourhood and only measurable at that level,^{6, 35} such as number of recreational facilities.⁸ Only two of the studies included integral variables: level of services³⁶ and number of community groups.³⁷ The accessibility of census data may explain the paucity of research on integral variables. Diez-Roux has noted that derived variables are assumed to represent integral effects,⁶ while Macintyre *et al.* argue that studies should focus directly on the integral economic, cultural and political characteristics of neighbourhoods.⁸

Several composite indices have been developed to handle highly correlated neighbourhood level variables. The advantages of such indices include statistical efficiency and a simple presentation of results. Using many single measures separately may lead to collinearity and cumbersome or cluttered results, especially when the intention is to reflect a single underlying concept such as neighbourhood socioeconomic status, rather than examining the unique contribution of each component. However, indices also have drawbacks: they are difficult to construct and validate,^{38, 39} and tend to mask variation—that is, two areas with the same score may differ in the values that contributed to that score. Indices have limited external validity or utility across time⁴⁰ and space⁴¹ and, depending on their component variables and weights, may measure certain aspects of neighbourhoods, for example, structural deprivation, better than others.

In the US, census variables used in contextual analyses have been derived from the decennial censuses. Population counts and basic demographic variables such as age, race and gender are obtained for all residents, while a one in six sample provides further detail on employment, income, and education.⁴²

CONTROLLING FOR INDIVIDUAL LEVEL SOCIOECONOMIC STATUS

To understand the role of the social environment in relation to health, neighbourhood socioeconomic factors and individual socioeconomic status must be considered, as

Table 1 Summary of published studies of area level socioeconomic factors and health outcomes

Reference	Outcome	Sample	Neighbourhood definition (average or stated size)	Neighbourhood SES measures	Individual SES measures	Cofactors	Type of model	Significant area level effects after controlling for individual SES and cofactors
<i>1 Mortality studies</i>								
Anderson <i>et al</i> , 1997 ⁷⁵	All cause mortality	233 600 black or white adults over age 25 from US National Longitudinal Mortality Study	Census tract (4000)	Median family income	Annual family income	Sex, age, race	Cox proportional hazards model using robust covariance matrix	Among whites: RR of low <i>v</i> high income = 1.26 for men, 1.16 for women Among blacks: RR = 1.49 for men, no effect in black women or in either ethnic group over age 65
Davey Smith <i>et al</i> , 1997 ¹⁸	All cause mortality	5766 men aged 35–64 recruited from 27 workplaces in West Scotland	Postcode sector (4660)	Carstairs's index of deprivation	Cumulative lifetime social class, based on current, early adulthood and father's occupation	Age	Cox proportional hazards	None, with cumulative lifetime socioeconomic status in the model
Davey Smith <i>et al</i> , 1998 ^{65*}	All cause mortality	14 952 adult residents of West Scotland, aged 45–64	Postcode sector (4660)	Carstairs's index of deprivation	Occupational class	Sex, age	Cox proportional hazards	For most deprived <i>v</i> least deprived areas: in men RR = 1.34 for all cause mortality, 1.26 for CVD mortality; in women RR = 1.29 for all cause mortality, 1.33 for CVD mortality
Haan <i>et al</i> , 1987 ⁷⁷	All cause mortality	1811 residents of Alameda County, California, over age 35	Federal poverty area (151 000)	Residence within poverty area <i>v</i> not	Income, education, employment, health insurance	Sex, age, race, health	Logistic regression	RRs from 1.46–1.53 for residence in poverty area, adjusting for age, sex, race, health, and single measures of individual SES
Kaplan, 1996 ⁶⁸	As for: Haan, 1987	As for: Haan, 1987	Census tract (4000)	4 scales of neighbourhood type, based on factor analysis Proportion black and Hispanic, median income, education, female headed households, poor female headed households	Income	Sex, age	Cox proportional hazards	Relative hazards from 1.3–2.0 for high <i>v</i> low quartile in all 4 scales
LeClere <i>et al</i> , 1997 ⁷⁹	All cause mortality	346 917 white, black or Hispanic men and women over age 18 from US National Health Interview Survey	Census tract (4000)	Hispanic, median income, education, female headed households, poor female headed households	Education, income-to-needs ratio	Sex, age, race, marital status	Cox proportional hazards	Multiple models, eg: for men, RR for high proportion African-American tracts <i>v</i> low proportion = 1.13 to 1.18. For women, RR for high proportion female headed households <i>v</i> low proportion = 1.16, for high <i>v</i> low education = 0.84–0.86
LeClere <i>et al</i> , 1998 ⁶⁰	Heart disease mortality	199 221 white, black or Hispanic women over age 18 from US National Health Interview Survey	Census tract (4000)	Female headed household (female headship), black race, poverty, poor female headed households, median unemployment, income	Per capita household income, education, employment status	Age, race, marital status, BMI, pre-existing heart conditions or hypertension, limiting activity	Cox proportional hazards	Multiple models, eg: in women under 65, effects of all other tract level variables become non-significant when tract level % of female headship included in models, RR from 1.47–1.85 for highest quartile of female headship Effect of % female headship weaker in older women
Sloggett and Joshi, 1994 ⁶¹	All cause mortality before age 70	Population-based, longitudinal sample of 292 860 adult residents of England and Wales, ages 16–65	Electoral ward (5500)	Index based on unemployment, access to car, rental housing, social class	Occupational social class, housing tenure, access to car	Sex, age, region, marital status, presence of spouse, time period	Logistic regression	No significant area level effects in men, RR = 1.02 in women
Sloggett and Joshi, 1998 ^{62*}	All cause mortality before age 70	Population-based, longitudinal sample of over 300 000 residents of England and Wales, ages 10–64	Electoral ward (5500)	Index based on unemployment, access to car, rental housing, social class	Occupational social class, unemployment, housewife status, housing tenure, access to car	Sex, age, region, time period	Logistic regression	Comparing most deprived to least deprived areas: for men RR = 1.02; for women, RR = 1.04
Waizman and Smith, 1998 ⁶³	All cause mortality, and cardiovascular, cancer, external, and other cause mortality	10 161 black or white adults from US National Health and Nutrition Examination Study I	Federal poverty area (not given)	Residence within poverty area <i>v</i> not	Education, income	Sex, age, race, marital status, alcohol use, BMI, smoking, exercise, health status, hypertension, cholesterol	Cox proportional hazards	No significant effect in adults aged 55–74. In adults, 25–54 years, RR = 1.78 for all cause mortality, 1.9 for cardiovascular mortality, 1.95 for cancer mortality

Table 1 continued

Reference	Outcome	Sample	Neighbourhood definition (average or stated size)	Neighbourhood SES measures	Individual SES measures	Cofactors	Type of model	Significant area level effects after controlling for individual SES and cofactors
2 Morbidity studies								
<i>(a) Infant and child health (See also RR for low birth weight in Sloggett and Joshi, 1998)</i>								
Morgan and Chinn, 1983 ⁶⁴	Asthma in last year, bronchitis in last year, respiratory illness, hospital stay in last year, physician consult in last 2 weeks	4902 children aged 5–11 years resident in England and Scotland from National Study of Health and Growth	Enumeration district (500)	ACORN group: classification of area based on factor analysis of 6 SES variables	Father or male guardian's occupational social class	Sex, age	Logistic regression	Effect of ACORN on bronchitis but not other outcomes.
O'Campo et al., 1997 ⁴⁷	Low birth weight	50 757 births in Baltimore, Maryland	Census tract (4000)	Home ownership, number of community groups, unemployment, housing violations, crime rate, wealth, income	Education, insurance status	Maternal age, prenatal care, education, health insurance status	Hierarchical logistic regression	RR = 1.11 for low per capita income, interaction effects of unemployment and maternal age, crime rate and maternal education, wealth and prenatal care, unemployment and prenatal care, per capita income and health insurance status
Roberts, 1997 ²⁵	Low birth weight	112 327 births in the Chicago Statistical Metropolitan Area	Community area	SES index, hardship, demography, residential stability, median rent, overcrowding, % black, % Hispanic	Education	Age, race, marital status, prenatal care, parity, smoking, alcohol use	Logistic regression	Economic hardship and median rent positively associated with low birth weight, area level SES, overcrowding, proportion of young residents and proportion of black residents negatively associated with low birth weight
<i>(b) Chronic disease among adults</i>								
<i>Cross referenced above</i>								
Davey Smith et al., 1998 ^{66a}	Diastolic blood pressure, cholesterol, height, BMI, FEV ₁ , bronchitis, angina, ECG ischaemia						Trend test of age adjusted means and proportions	In women, all outcomes except blood pressure and cholesterol were related to deprivation at p<0.05. Among men, BMI and ECG ischaemia were also not significant.
Diez-Roux, 1997 ^{66b}	Coronary heart disease, serum cholesterol, systolic blood pressure	12 601 black or white adults aged 45–64 years from 4 US communities in North Carolina, Minnesota, Mississippi, Maryland	Census block group (1000)	Education, median income, occupation, housing value	Income or education or occupation (each modelled only with area level analogue)	Age, field centre	Hierarchical linear and logistic regression	Multiple models: significant effects of area level SES on blood pressure (mean differences (MD) from 1.8–3.2) and cholesterol (MD from 4.4–5.2). CHD (RR for area level variables from 1.61–2.82) was only significant in women living in white communities but not in predominantly black communities or in men
Humphreys and Carr-Hill, 1991 ⁶⁵	Self assessed health, long term illness, respiratory function, symptom scores	4352 British adults aged over 18 from Health and Lifestyle Survey	Electoral ward (5500)	Clusters based on factor analysis of birthplace, unemployment, housing tenure, overcrowding, access to car, social class	Education, overcrowding	Sex, age, ethnicity, alcohol use, smoking, exercise, access to garden	Hierarchical linear regression	Multiple models: significant negative effects of unemployment, rental housing, no access to car, low social class on self assessed health, symptoms score; effect only of lack of access to car on respiratory function. No effects found for long term illness.
Jones and Duncan, 1995 ⁴	Self reported health, symptoms of heart disease, respiratory function	9003 British adults, aged over 18 from Health and Lifestyle Survey	Electoral ward (5500) and constituency	Urban environment, index of deprivation based on employment, social class, housing tenure and access to car, average household income	Social class, employment status, housing class, income	Sex, age, height, smoking, alcohol use, eating, exercising	Hierarchical logistic regression	Significant effect of ward deprivation on all outcomes. For respiratory function, a significant interaction between smoking and urban environment, for self rated health, an interaction between deprivation index and social class, for heart disease symptoms interaction between individual income and deprivation index
Krieger, 1992 ^{31*}	Hypertension, height	14 240 black or white members of Northern California Kaiser Permanente Medical Care Program	Census tract (4000) and block group (1000)	Proportion working class, impoverished and undereducated	Working class occupation	Sex, age, race, BMI (for hypertension only)	Multiple linear and logistic regression	Results shown for block group level only: coefficient for non-working class people in non-working class block group v working class block group = -0.9 for height in centimetres, RR = 1.2 for hypertension

Table 1 continued

Reference	Outcome	Sample	Neighbourhood definition (average or stated size)	Neighbourhood SES measures	Individual SES measures	Cofactors	Type of model	Significant area level effects after controlling for individual SES and cofactors
Reijneveld, 1998 ⁶⁶	Self rated health, physical complaints, longterm disability, BMI	Random sample of 5121 adults over 16 years resident in Amsterdam	Borough (not given)	Mean income, household income below minimum, unemployment	Income, education, occupation	Sex, age, standardised mortality ratio of borough	Hierarchical logistic regression	RR = 1.2 for most deprived household income <i>v</i> least deprived and obese BMI, RR = 1.3 for intermediate mean income <i>v</i> least deprived mean income for longterm disability
Robert, 1998 ⁶⁷	Number of chronic conditions, functional limitations, self rated health	3617 adults, over 25 years from Americans' Changing Lives study	Census tract	Households receiving public assistance, family unemployment, family income <\$30 000, economic disadvantage index	Education, family income, family assets	Sex, age, race	Multiple linear regression	When all individual level SES variables in model: economic disadvantage index is a significant predictor of number of chronic conditions, households receiving public assistance is a significant predictor of self rated health
Shouls <i>et al</i> , 1996 ⁶⁸	Limiting long term illness	10% random subsample of adults over age 16 years, from Sample of Anonymised Records from British census	Local government district	Factors and clusters of census socioeconomic variables	Social class, deprivation score	Sex, age, ethnicity, marital status	Hierarchical logistic regression	Multiple models: health inequalities most pronounced in affluent areas, deprivation most important area level variable, interaction with sex—stronger area level effects in men
Sloggett and Joshi, 1998 ^{69*}	Long term limiting illness, low birth weight	Cross referenced above				Gender, age, region	Logistic regression	For long term limiting illness, RR = 1.08 for women and RR = 1.09 for men. For low birth weight, RR = 1.04. All RRs are <1.1 but are statistically significant, although much smaller than RR for individual level variables.
(c) Mental health Reijneveld and Schene, 1998 ⁷⁰	Mental disorders	As for Reijneveld, 1998 above				Sex, age, standardised mortality ratio of borough, plus family type, chronic physical limitation	Hierarchical logistic regression	None, with all individual level SES variables in model
3 Health behaviour studies Curry <i>et al</i> , 1993 ⁷⁴	Attitudes towards smoking, alcohol use and dietary fat intake	Random survey of 8849 adults, aged over 18 in 15 communities in Western USA	Self defined geographical communities	Residence, education, unemployment, residential stability	Education, employment, household income, residential stability	Sex, age, race, marital status, community attitudes towards health behaviours	Multiple linear regression	Significant effects of community attitudes and education on attitude to smoking and of residential stability on attitude to fat consumption
Diez-Roux <i>et al</i> , 1997 ^{76*}	Smoking	Cross referenced above						In mostly white communities: for men RR for smoking = 1.44 for low education, 1.6 for low household income, 1.68 for low housing value, 1.61 for low occupation; for women, RR for smoking = 1.42 for low occupation. In mostly black communities, significant effects in women for all area level effects but not in men, except for low occupation (RR = 1.54)
Karvonen and Rimpela, 1996 ⁷⁶	Smoking, alcohol use, physical activity, consumption of full fat milk	Population-based sample of 9121 Finnish teenagers aged 16 and 18 years	Municipality	Occupational structure, self sufficiency of employment, level of services	Occupation of head of household, type of school, type of family	Age, sex	Logistic regression	RR for high level of neighbourhood services and full fat milk use = 0.59, RR for low self sufficiency of employment and full fat milk use = 0.59 in boys, girls in areas of high occupational structure more likely to consume full fat milk, RR = 2.36. In boys, effect of education on alcohol use, modified by level of services, RR for alcohol use = 1.35 in areas with low self sufficiency of employment, RR for alcohol use = 1.47 for girls in highly educated areas

Table 1 continued

Reference	Outcome	Sample	Neighbourhood definition (average or stated size)	Neighbourhood SES measures	Individual SES measures	Cofactors	Type of model	Significant area level effects after controlling for individual SES and cofactors
Kleinschmidt <i>et al</i> , 1995 ⁴⁶	Smoking	Random sample of 7866 adults from England's North West Thames regional health survey <i>Cross referenced above</i>	Electoral ward	Carstair's Index, based on unemployment, overcrowding, access to car, social class	SES measured by a 17-level categorical composite	Sex, age	Hierarchical logistic regression	RR for smoking in most or least deprived areas = 1.52
Krieger, 1992 ^{31*}	Smoking							RR of smoking = 1.4 for non-working class women in non-working class block group working class block group RR for violence: unemployment = 3.4, low income = 4.4
O'Campo <i>et al</i> , 1995 ³⁷	Partner perpetrated violence in childbearing year	157 low income women from Baltimore, Maryland <i>Cross referenced above</i>	Census tract	Income, home ownership, unemployment, per capita crime rate	Employment, education, income	Age, race, marital status, social support, parity, partner drug use	Logistic regression and hierarchical logistic regression	RR for smoking: 1.19 for low average area level income, 1.23 for high % of household poverty, no effect of neighbourhood unemployment rate
Reijneveld, 1998 ^{66*}	Smoking							

*Study is also cross referenced under another outcome.

omitting either will result in incomplete model bias. Without individual level information, neighbourhood level variables may act partially or entirely as proxies for individual attributes and a partition of the contribution of each to the chosen health outcome is impossible. Without neighbourhood level measures, the impact of individual characteristics may be misunderstood.

Measurements of socioeconomic status are not routine in the US, despite widespread acceptance of the importance of these concepts as determinants of health.⁴³ Consequently, the choice of socioeconomic variables in data collection efforts is driven by convenience rather than theory. In the UK, occupational classification of social class is measured routinely, most frequently by the British Registrar General's Scale, and there is general agreement that the scale captures some aspects of relative social position or class. The most commonly used indicators of socioeconomic status in the US are education, occupation and income, and the relation of each of these to social class is a matter of some debate.^{44 45} One consensus that emerges from the literature is that all three are simple measures being used as proxies for complex concepts that we intuitively understand but cannot measure with accuracy, such as social standing, access to resources, health related attitudes, etc.

In 20 of the studies reviewed, individual level social class or socioeconomic status was measured by more than one variable, although not all of these studies included more than one measure in any model. Correlation between different measures of socioeconomic status makes the use of composite indices attractive (for example the 17 level index of individual socioeconomic status used in the study by Kleinschmidt *et al* of smoking behaviour⁴⁶). The disadvantages of using a composite index are identical to those discussed above for neighbourhood level composites: it becomes impossible to differentiate the independent and interactive effects of each component and valuable information can be obscured. In the study by O'Campo *et al* of low birth weight, the effect of neighbourhood per capita income on low birth weight is modified by individual health insurance status, and the effect of neighbourhood crime rates depends on individual education.⁴⁷ These interesting interactions could not have been observed if health insurance status and education had been combined into a single index.

When only a single measure of individual socioeconomic status is used, neighbourhood variables may be more likely to act as proxies for missing individual level information.

One study measured lifetime socioeconomic status as a combination of current, early adulthood and father's occupational class.⁴⁸ Interestingly, this was one of the two studies where neighbourhood effects were statistically non-significant in models adjusted for individual socioeconomic status, suggesting that neighbourhood characteristics may reflect lifetime social circumstances or that lifetime

socioeconomic status is more strongly related to health than current circumstances.

CONTROLLING POTENTIAL CONFOUNDING FACTORS

In studies of neighbourhood social factors and health outcomes, it is important for researchers to conceptualise the causal pathways by which they believe neighbourhood characteristics affect health. If causal pathways are believed to involve neighbourhood associated differences in health behaviours, such as smoking, then such behaviours are not potential confounding variables to be controlled, but component causes of a pathway that need to be explored.^{49 50} As much of the literature on neighbourhood social factors and health outcomes is exploratory in nature, a variety of approaches towards adjusting for confounding factors have been taken, and the causal pathways that underlie hypotheses about the effects of neighbourhood social factors are often not explicit.

When both a risk factor and a confounding factor are measured with error, the unmeasured variation in the confounding variable can “resonate” and cause residual confounding with unpredictable effects on estimates of relative risk, unless the strength and direction of the correlation between risk factor and confounder are known.⁵¹ It is probable that measurements of both neighbourhood and individual socioeconomic status contain error, and that risk estimates for neighbourhood level social factors are affected by residual confounding from measurement error of individual level socioeconomic status.

CHOICE OF ANALYTIC MODEL

Many of the multilevel studies we reviewed used single level linear and logistic regression analysis and Cox proportional hazards models to estimate the impact of neighbourhood factors on health. In fact, the hierarchical nature of such data, where individuals are nested within neighbourhoods, is more correctly approached with multilevel models that account for this hierarchical clustering.⁵² Statistical models that assume that individuals are independently sampled are unable to account for the intra-neighbourhood correlation that arises from the fact that people from the same neighbourhood will be more alike in unmeasured characteristics than people from different neighbourhoods. This violation of the independence assumption can lead to incorrect estimation of the standard errors of model parameters in non-hierarchical models and the possibility of incorrect inference concerning the effect of the neighbourhood level characteristics. Estimation techniques for hierarchical models for both discrete and continuous outcomes have been developed, and computer software to implement them is now available in standard statistical packages.⁵³ The importance of using multilevel techniques is a matter of current debate.^{53 54} Ten of the 25 studies reviewed used hierarchical models of some kind, all had publications dates between 1991–1998 (see table 1). The other 15, with publication dates from 1983–1998, used single

KEY POINTS

- Attributing health disparities to neighbourhood social context requires the isolation of individual level socioeconomic influence.
- “Neighbourhood” has been operationally defined in various ways in studies in developed countries, but few have conformed to natural boundaries.
- Findings of significant interactions suggest that neighbourhood context may differentially affect the health of people.

level models. Although we noted an increase of hierarchical modelling with time, five studies published in 1998 used single level models. One study that presented results from both single level and multilevel analyses of the effect of neighbourhood characteristics on domestic violence provides an illustration of the potential problems that may arise from an inappropriate choice of models.³⁷ The odds ratios (and 95% confidence intervals) for risk of domestic violence according to residence in a low income neighbourhood were 4.4 (1.1, 18.2) in a hierarchical model, and 4.9 (0.36, 66.7) in a single level model. There is little change in the estimate of effect but sufficient change in the estimate of the standard error to affect significance tests.

Results

Results of the 25 studies are presented in the last column of table 1. The studies are grouped by the health outcome of interest to allow for easier comparison.

MORTALITY STUDIES

Ten studies investigated the effects of neighbourhood social factors on mortality,^{48 55–63} although two of the studies were analyses of the same sample,^{57 58} one study⁶⁰ was conducted on a subset of another,⁵⁹ and one study⁶² was a longer follow up of a previously analysed cohort.⁶¹ All of the studies focused on all cause mortality (sometimes with separate analyses of cause specific mortality) in both men and women, except for one that examined mortality attributable to heart disease in women.⁶⁰ Neighbourhood effects are fairly consistent across studies, with modest (RR less than 2.0) but statistically significant increased risk of mortality in poorer or more deprived neighbourhoods. In contrast, Davey Smith and colleagues found effects of neighbourhood deprivation within categories of lifetime socioeconomic status, but the overall effect of neighbourhood deprivation was not significant.⁴⁸ Sloggett and Joshi found essentially no role for neighbourhood factors in a large cohort with nine years of follow up, with no significant area level effects in men and a significant relative risk of only 1.02 in women.⁶¹ However, after 13 years of follow up, significant neighbourhood effects were found in both men and women.⁶²

Three of these studies found the effect of neighbourhood to be modified by age^{55 60 63}; in all three there was less impact of neighbourhood

factors in older age groups, suggesting that other factors related to survival may be more important in older age groups. Haan *et al* and Kaplan report separate analyses of the same sample.^{57 58} The greater magnitude of the neighbourhood effect in Kaplan's study may be attributable to the finer scale of the defined neighbourhoods (census tracts versus federal poverty area).

Only one of the mortality studies used an analytic model that accounted for the hierarchical structure of the data, and its results are consistent with the overall finding of modestly increased mortality risk.⁵⁵

MORBIDITY STUDIES

Infant and child health

The three studies that examined infant birth weight all found significant neighbourhood effects,^{25 47 62} but in all three the effect was modest (RR less than 2.0). Neighbourhoods with a high percentage of black residents were found to protect against low birth weight in one study,²⁵ while another reported multiple interactions between characteristics of mothers and their neighbourhoods.⁴⁷ For example, the association of prenatal care with reduced incidence of low birth weight was stronger in areas with low unemployment, compared with areas with high unemployment, which suggests that prenatal care is less protective for women living in deprived neighbourhoods. In the only study of childhood illness, Morgan and Chinn showed that ACORN group, a classification system for neighbourhood characteristics, was associated with bronchitis in the previous 12 months, but asthma, all respiratory illnesses, doctor visits and hospital stays were not.⁶⁴

Chronic disease among adults

Ten studies investigated morbidity in adults, including self rated health,^{4 65 66} long term disability or illness,^{62 65-68} cardiovascular risk factors, symptoms or disease,^{4 31 56 69} and respiratory function or illness.^{4 56 65} Most studies investigated multiple chronic conditions and outcomes in order to capture a general concept of adult health, whereas others focused on particular outcomes (see for example studies^{31 68 69}).

Three of four studies on self rated health found significant neighbourhood effects.^{4 65 67} Reijneveld found no significant neighbourhood effects on self rated poor health after adjustment of income, education and occupation.⁶⁶ However, this study and the same author's study of mental health (see below) may have lacked statistical power.

Three studies found no significant neighbourhood effects on long term illness,⁶⁵ functional limitations,⁶⁷ and long term physical limitations.⁶⁶ Robert did find an effect of neighbourhood economic disadvantage (a composite index) on number of chronic diseases but no single neighbourhood variable had a significant effect.⁶⁷ Shouls *et al* reported that neighbourhood deprivation was associated with increased risk of long term illness, and that the neighbourhood effect was stronger for men than women.⁶⁸ Small but significant

neighbourhood effects on long term limiting illness were reported in a more recent study from the UK.⁶²

Among the studies of coronary heart disease and its risk factors, Diez-Roux *et al* found neighbourhood effects on systolic blood pressure and serum cholesterol in all areas studied, but for heart disease only among women living in predominantly white areas.⁶⁹ Neighbourhood deprivation scores were associated with increased body mass index and prevalence of angina and ischaemia among women, and increased prevalence of angina among men in a study population in Scotland.⁵⁶ Jones and Duncan found increased reporting of heart disease symptoms as neighbourhood deprivation increased among low and middle income adults, but the opposite among adults with high incomes.⁴ Neighbourhood effects on hypertension among non-working class subjects were reported by Krieger.³¹

All three studies of adult respiratory function reported at least one significant area level effect. Humphreys and Carr-Hill studied five neighbourhood characteristics and found that only the percentage of people not owning a car was a significant predictor.⁶⁵ Jones and Duncan found that urban neighbourhoods were associated with poor respiratory functioning among non-smokers, while smokers had poor functioning regardless of neighbourhood urbanity.⁴ Davey Smith *et al* showed significant trend tests for increasing neighbourhood deprivation and respiratory function and bronchitis.⁵⁶

Studies of mental health

Only one study focused on mental health as an outcome.⁷⁰ No significant neighbourhood effect persisted after adjustment for family size, occupation, and education. This study may have suffered from insufficient statistical power for two reasons: (1) there were only 22 neighbourhoods (boroughs), limiting the ability to detect between group differences¹⁷; and (2) the boroughs may have been too homogenous, creating collinearity between individual and neighbourhood SES measures.

STUDIES OF HEALTH BEHAVIOURS

Seven studies investigated the effects of neighbourhood social factors on health behaviours or attitudes.^{24 31 36 37 46 66 69} Five of these studies looked at smoking behaviour as a primary outcome,^{31 36 46 66 69} one also examined alcohol and dietary intake,³⁶ and one examined individual attitudes towards smoking, alcohol use and dietary intake, rather than the behaviours themselves.²⁴ One study looked at reproductive health behaviours,³¹ and one study focused on domestic violence.³⁷

Four of the five papers that assessed the effects of neighbourhood social factors on smoking reported increased relative risks (RR) of smoking between 1.2–1.7 in neighbourhoods with low socioeconomic status.^{31 46 66 69} The study by Karvonen and Rimpela in a Finnish population reported no significant relations between neighbourhood and smoking,³⁶ however this study focused on a sample of adolescents, aged 16–18 years, whereas the

other four studies of smoking were in adults. Diez-Roux *et al* found that the effect of neighbourhood social factors on smoking was modified by both gender and race.⁶⁹

Karvonen and Rimpela report several modest interactions between neighbourhood socioeconomic status and gender in relation to adolescent health behaviours, despite finding no effects for smoking.³⁶ For example, the relative risk for alcohol use was 1.35 among boys living in areas with low employment status compared with boys living in areas with better employment status, whereas the relative risk for alcohol use was 1.47 among girls living in areas with high education status compared with areas with low education status. Further interactions between neighbourhood factors and school type were reported, as well as equally complex results for the use of full fat milk products.

Curry *et al* studied attitudes towards health behaviours, hypothesising that neighbourhood socioeconomic status, as well as the prevalence of health behaviours, will be related to social tolerance and normative attitudes towards health related behaviours.²⁴ Indeed, they found neighbourhood effects on attitudes towards smoking and dietary fat consumption, but not on attitudes towards alcohol consumption.

O'Campo and colleagues studied male partner violence towards women during the childbearing year and report the largest magnitude of neighbourhood effects of all the studies we identified, a relative risk of violence of 3.42 for high neighbourhood unemployment and of 4.4 for low neighbourhood income.³⁷ These greater magnitudes may be attributable to the more direct pathways that can be hypothesised to lead from stressful neighbourhood contexts towards violent behaviour, than can be conjectured for other health outcomes.

Discussion

We have reviewed multilevel studies of neighbourhood socioeconomic context and health. In 23 of the 25 studies we identified, researchers reported a statistically significant association between at least one neighbourhood measure of socioeconomic status and health, controlling for individual socioeconomic status. The studies that found no association included the only study of mental health⁷⁰ and the only study to measure lifetime rather than current individual socioeconomic status.⁴⁸ Despite this apparent consistency across studies, a detailed appraisal of this literature suggests a more complicated picture.

An inclusion criterion for this review was adjustment for individual level socioeconomic status. However, some studies adjusted for only one measure of individual socioeconomic status, whereas others adjusted for two or more. Without adequate control of individual socioeconomic status, neighbourhood level effects may act as proxies for unmeasured aspects of individual socioeconomic status.²⁷ Reijneveld's study of mental disorders illustrates the effects of controlling for multiple measures of individual socioeconomic status.⁷⁰ In models adjusting for individual level educa-

tion or occupation, a statistically significant association was demonstrated between low neighbourhood income and increased prevalence of mental disorders. However, when individual level income was added to these models, there was no statistically significant neighbourhood level effect. In general, studies adjusting for more than one individual level measure of socioeconomic status found smaller measures of association between neighbourhood level socioeconomic status and health. For example, Sloggett and Joshi's study found a much weaker association of neighbourhood socioeconomic status with all cause mortality, adjusting for three measures of individual level socioeconomic status,⁶¹ than the analyses of Haan *et al*'s of the same association,⁵⁷ each of which were adjusted for only one measure of individual level socioeconomic status. On the other hand, the extent that neighbourhood socioeconomic status determines individual income, education, and occupation, controlling for individual socioeconomic status may remove part of the contextual effect.

We grouped studies by type of outcome, as presented in table 1, to allow for easier comparison of similar studies. However, as this literature is still fairly sparse, there are not enough replication studies using the same health outcomes, covariates, exposures and study designs to allow for more than a preliminary guess of the magnitude of neighbourhood effects for particular health outcomes. Domestic violence during the childbearing year showed the strongest association with neighbourhood socioeconomic context.³⁷ In general, risk ratios for low neighbourhood socioeconomic status and negative health behaviours were consistent and modest, as were those for mortality, but the impact of neighbourhood characteristics on morbidity was more variable; evidence for long term illness and disability was weak, while evidence for respiratory function in adults was stronger.

It is possible, and even plausible, that some characteristics of neighbourhoods may be more or less related to health outcomes than others, although many characteristics of neighbourhoods are highly correlated. For instance average neighbourhood income might be a better predictor of health status than the proportion of households suffering from overcrowding. The level at which variables are measured may also be important, for example, poverty at the census block group level might be more strongly associated with health than poverty at the county level. In the studies we review, it is difficult to compare the impact of different neighbourhood characteristics or definitions because of the heterogeneity in study designs. Studies that used indices of several neighbourhood socioeconomic characteristics to rank neighbourhoods on a single dimension (usually poverty or deprivation) and those that used factor analysis to identify clusters of neighbourhood characteristics do not permit discrimination between the effects of different neighbourhood characteristics.

In studies with only a single individual level SES variable, the neighbourhood level SES

variables may be capturing unmeasured individual level variation in outcome,²⁷ however we do not believe that models that include only one measure of neighbourhood level socioeconomic status are equally suspect. Neighbourhood level socioeconomic characteristics are much more highly correlated than individual level socioeconomic factors, so that misspecifying the neighbourhood level effect is less likely to occur. The choice of neighbourhood level variables may be less critical than ensuring proper control for individual level socioeconomic status.

Neighbourhood socioeconomic context might affect health either directly, if simply living in a deprived neighbourhood is deleterious to health,⁷ or indirectly through such mechanisms as the availability and accessibility of health services, healthy foods or recreational facilities, environmental pollution, normative attitudes towards health, and social support.^{6 8 17} Measures of neighbourhood socioeconomic status can therefore be viewed as both proxies for unmeasured mechanisms or as actual exposures in their own right, or both.

It is therefore important for researchers to begin to be explicit about the causal pathways they believe to be operating between neighbourhood socioeconomic context and health, and to consider how adjustment for factors on the causal pathway may bias estimates of neighbourhood factors. For example, adjusting for smoking, which may be a consequence of living in a deprived neighbourhood, as well as a cause of poor respiratory function, may weaken the association between neighbourhood and health outcome. On the other hand, researchers may be interested in how the association between smoking and respiratory function is modified by neighbourhood characteristics. Most of the studies we reviewed were exploratory in nature and did not specify the causal mechanisms linking the factors included in their multivariate analyses, but this is clearly an important next step for understanding the relation between neighbourhood and health.

British studies of neighbourhood effects stem from a larger movement examining social inequalities and health that includes studies of income inequality, regional and rural-urban variation in health and social gradient research (see, for example, references^{3 4 10 33 65 71-74}). Proponents and critics of this kind of research tend to be divided along sharply political lines. In the US, concern for social justice may be the motivation for some of this research but debate concerning its implications has not reached the political arena with any force. Epidemiologists and others in public health often feel that identifying social determinants of health may be fruitless if the ability to change social structures and inequalities lies outside of the public health domain. While these studies may provide ammunition for political debate and draw attention to inequities in health, they also serve the purpose of identifying types of geographical areas where traditional public health interventions, aimed at individual risk reduction, may best be targeted and providing impetus for new

interventions when interesting associations are discovered.

In the studies we review, relative risks are typically modest. However, the population attributable risk of living in neighbourhoods with low socioeconomic status is likely to be high, as such conditions are extremely prevalent.

A potential problem with these studies is that their statistical power and findings depend on there being people within each neighbourhood who are not typical of the neighbourhood, as heterogeneity is needed to distinguish between individual level and neighbourhood level effects. In other words, these studies are driven by “fish out of water”—people who may be uncharacteristic of the neighbourhood in which they live in ways that researchers do not measure. Therefore, factors that may be associated with being atypical might explain apparent neighbourhood effects.

In addition, results derived from these small numbers of atypical residents may generalise to a small population group. For instance, Roberts found that while being black increased a woman's individual risk of having a low birthweight infant, living in a predominantly black neighbourhood was associated with a decreased risk.²⁵ This means that black women living in predominantly white neighbourhoods are particularly vulnerable. However, because more black women will live in predominantly black neighbourhoods than in predominantly white neighbourhoods, focusing prevention and policy efforts on the small number of atypical women would be inefficient. Attention to the prevalence of the exposure, as well as relative risks, will ensure that preventive efforts and public health policy will focus on those population sub-groups and geographical areas where most benefit can be expected.

It is clear from our review that investigations of the role of neighbourhood level social factors on health are characteristic of preliminary, exploratory studies in epidemiology. Certain aspects of study design are in need of improvement before the field can advance. Firstly, definitions of neighbourhood need to reflect actual neighbourhood boundaries more accurately. Secondly, careful delineation of theorised causal pathways will lead to more precise definition and measurement of factors at the neighbourhood level that will allow tests of causal hypotheses. Qualitative information, such as that collected in sociological and ethnographic research, can inform and guide this process. Thirdly, if multilevel analyses of neighbourhood level effects are to provide useful information to guide public health policy and preventive programmes, data measuring important factors in real neighbourhoods need to be routinely collected and linked to health outcome data. As an example of what can be achieved in this manner, the city of Chicago has defined and collected information on community areas since the 1920s, giving rise to a rich tradition of inquiry into the relations between neighbourhood factors and social outcomes (see for example, Sampson *et al*²⁸). When defined neighbourhoods are “ecologically

meaningful", constructs of social context are theoretically based and examined for construct validity, and competing hypotheses are explicitly defined and tested, we will better understand the effect of neighbourhood context on health. We hope that this review will show what has already been achieved and point the way to more sophisticated studies of societal determinants of health.

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