1 Social Capital and Health: A Multilevel Cross-Lagged

2 Structural Equation Analysis

3 Ge Yu*1, Martin Wall**, John G. Sessions***, Yu Fu****

* Leeds Institute for Health Sciences, University of Leeds, 101 Clarendon Road, Leeds LS2 9LJ, England ** Centre for Social & Health Outcomes Research & Evaluation (SHORE), Massey University, PO Box 6137, Auckland 1010, New Zealand

***Department of Economics and IZA, University of Bath, Bath BA2 7AY, England

****School of Healthcare, University of Leeds, Leeds LS2 9JT, England

Abstract: We investigated the reciprocal relationship between individual social capital and perceived mental and physical health in the UK. Using data from the British Household Panel Survey from 1991 to 2008, we fitted cross-lagged structural equation models that include three indicators of social capital vis. social participation, social network, and loneliness. Given that multiple measurement points (level 1) are nested within individuals (level 2), we also applied a multilevel model to allow for residual variation in the outcomes at the occasion and individual levels. Controlling for gender, age, employment status, educational attainment, marital status, household wealth, and region, our analyses suggest that social participation predicts subsequent change in perceived mental health, and vice versa. However, whilst loneliness is found to be significantly related to perceived mental and physical health, reciprocal causality is not found for perceived mental health. Furthermore, we find evidence for reverse effects with both perceived mental and physical health appearing to be the dominant causal factor with respect to the prospective level of social network. Our findings thus shed further light on the importance of social participation and social inclusion in health promotion and aid the development of more effective public health policies in the UK.

Key Words: mental health, self-reported health, social capital, reciprocal influences, autoregressive cross lagged model, multilevel structural equations model

JEL Classification: J33, J41, J54.

Acknowledgements: Data from the British Household Panel Survey (BHPS) were supplied by the ESRC
 Data Archive. Neither the original collectors of the data nor the Archive bear any responsibility for the
 analysis or interpretations presented here.

¹ Corresponding author: Dr. Ge YU Leeds Institute for Health Sciences, University of Leeds, 101 Clarendon Road, Leeds LS2 9LJ (email: <a href="https://linear.ncbi.nlm.ncbi.

1 Research Highlights

- A reciprocal relationship exists between social capital and perceived health status
- Social participation predicts subsequent change in mental health and vice versa
- Positive perceived wellbeing helps individuals to develop a good support network
- Loneliness is significantly related to perceived mental and physical health

6

Main Text

1

2

1. Introduction

A growing recognition of the social determinants of health suggests that social capital 3 contributes to health inequalities, both within and between populations (Henderson & 4 5 Whiteford, 2003). Generally, the research suggests that higher levels of social capital can enhance an individual's sense of self-efficacy and mastery, reduce alienation and stress and 6 7 ultimately contribute to a sense of well-being, thereby improving health (Morrow, 1999). 8 There is also a consensus that social capital is important in encouraging a physically active lifestyle (Booth et al., 2000; Giles-Corti & Donovan, 2002; Greiner et al., 2004; Leyden, 9 10 2003). Social capital might therefore provide a theoretical basis for assessing the impact of 11 community-based health promotion programs on the broader health and life of a community (Baum, 2003). In particular, there is a pressing need in the UK to inform the 12 debate concerning the veracity of claims that building social capital is an important facet 13 of national health policy. Policy makers have geenerally accepted the importance of social 14 capital and made changes to health policy accordingly. For instance, the Allen Review, an 15 independent report presented to the UK Government, emphasises the importance of family 16 and community relationships in stimulating the physical, emotional and social development 17 of children and adolescents at key life stages (Allen, 2011). And the UK Department of 18 Health (DoH) has explicitly cited developing social capital as an important feature of health 19 promotion (DoH, 2001, 2006, 2010). 20 21 Previous studies highlight considerable debate over whether social capital is a feature of individuals (Burt, 2009), groups (Bourdieu & Wacquant, 1992) or both (Coleman, 1988; 22 Putnam, 2001). Kawachi (2006) argues that there are two distinct concepts of social 23 capital: social cohesion and social network. The former tends to emphasize social capital 24 25 as a group attribute and analyses it as a contextual effect on individual health. The later 26 describes social capital in terms of the resources that are embedded within an individual's

1 social networks (Lin, 1999). An additional distinction in research on social capital is 2 between structural and cognitive dimensions (Putnam et al., 1994). The structural dimension reflects the 'quantity' of social capital and is characterised by behavioural 3 manifestations of associational links between individuals or civic engagement. The 4 cognitive dimension is regarded as the 'quality' of social capital as it reflects subjective 5 attitudes such as trust in others and norms of reciprocity (Harpham et al., 2002; 6 Phongsavan et al., 2006). A number of studies have suggested that personal ties, contacts 7 and mutual support enhance an individual's access to information, resources, 8 opportunities and public welfare policy, making available assistance and emotional 9 support and thus meeting physical and mental health needs (Muntaner, 2004; Nakhaie & 10 Arnold, 2010; Pearce & Davey Smith, 2003). 11 12 Folland (2008) indicates that there are three prominent theoretical ideas as to how social capital may improve health: First, both physical and mental health may benefit from 13 sympathetic relationships, a trusting environment, or through the benefits of socializing. 14 Second, social capital provides information on the effectiveness of health care or health 15 16 behaviours. And third, increased positive social capital enhances an individual's sense of 17 responsibility, both to one's self and to one's key relationships, and would be expected to enhance the benefit of becoming and staying healthy. 18 Whilst international studies based on longitudinal data have generally supported a causal 19 relationship from social capital to health (Drukker et al., 2003; I. Kawachi et al., 1996; 20 21 Orthgomer et al., 1993; Welin et al., 1992), a systematic review by Murayama et al. (2012) finds that prospective evidence of the effect of social capital on health in the UK is 22 23 somewhat limited – only two out of nine articles. This obfuscates the relationship between 24 health outcomes and social capital and seriously impedes any attempt to identify causality. For example, De Silva et al.'s (2005) systematic review of the relationship between social 25 capital and mental health concludes that there is strong evidence that mental illness could 26

- 1 result in low social capital as mentally ill individuals are more likely to appraise things
- 2 negatively and to withdraw socially.
- 3 Our aim in what follows is to investigate the temporal and directional character of the
- 4 relationship between individual-level social capital and perceived mental and physical
- 5 health using longitudinal data. Such data provide a distinct advantage over cross-sectional
- 6 data in the variety of sources of variability for understanding causality (Hedström &
- 7 Ylikoski, 2010). However, the longitudinal analyses in previous studies have been limited
- 8 to regression or latent growth models in which social capital is served as the criterion
- 9 measure. Using data from the British Household Panel Survey (BHPS) from 1991 to 2008,
- we constructed a cross-lagged structural equation model to consider three indicators of
- 11 social capital and health outcomes together, making it possible to unravel the reciprocal
- temporal relationships. Since multiple measurement points (level 1) are nested within
- individuals (level 2), the multilevel model is specified to account for two inherent types of
- 14 heterogeneity within-person across time and between-person thereby identifying the
- within-person variability over time from the between-person variability found in cross-
- sectional analyses (Hoffman & Stawski, 2009).
- 17 The paper is set out as follows: Section 2 describes our methods in detail whilst Section 3
- discusses our estimation and modelling. Our results are presented in Section 4 and final
- comments are collected in Section 5.

2. Methods

20

21 2.1. Data collection

- Our data are derived from the British Household Panel Survey (BHPS) from September
- 23 1991 through September 2008. The BHPS is a nationally representative panel survey of
- 24 the British population on a micro-social level following a sample of approximately 5,500
- 25 households and over 10,000 individual respondents aged 16 and over annually since 1991.

1 All original sample members are retained in the panel for as long as possible, even when

2 moving to new households. Those who join the household of a sample member are also

included in the survey for as long as they remain in the same household as a sample

member. As such, the BHPS includes detailed individual level data in a longitudinal

5 context that satisfy the basic requirement of our substantive analyses.

3

4

6

7

8

9

10

11

12

13

14

15

16

17

18

19

20

21

22

To ensure comparability over our sample period, we constructed a balanced panel in which information on all the required variables is reported at each wave and in which observations are limited to respondents who answer questions in each wave. The social capital indicators used in our study are not measured at every wave: social participation is recorded in waves 1-5, 7, 9, 11, 13, 15, and 17; social network is recorded in waves 2, 4, 6, 8, 10, 12, 14, 16, and 18; and loneliness is recorded in 1, 3, 5, 7, 9, 11, 13, 15, and 17. We therefore calculated an average of the variables from two adjacent waves every two waves over 18 waves to create values at nine measure points. For example, the value at the first measure point is the average of the first and second waves in the original data. The value at the second measure point is the average of the third and fourth waves, and so on. Information on employment, marital status, and educational attainment was estimated using the values at odd-numbered waves. Because the gap is only one year and most demographic variables are highly persistent, we contend that any bias is likely to be very small. Since estimation of an unbalanced panel is affected by attrition bias over time (Wooldridge, 2005), we focused our analysis on a balanced sample of 3,039 individuals, implying 27,351 observations over the nine measure points.

2.2. Measures of perceived mental health

We used the responses to the General Health Questionnaire (GHQ) to measure perceived mental health or psychological well-being. The BHPS uses a 12-item version of the GHQ (GHQ-12) based on answers to questions on concentration, sleep loss due to worry, perception of role, capability in decision making, whether constantly under strain, perception of problems in overcoming difficulties, enjoyment of day-to-day activities, ability to face problems, loss of confidence, self-worth, general happiness and whether suffering depression. The questionnaire is usually self-administered and is based on the respondent's assessment of their present psychological well-being (Bowling, 2005; Williams & Goldberg, 1988). The respondents are asked to indicate on a four-point ordinal scale how they have felt recently with respect to the item in question. We adopted the standard GHQ dichotomous coding method (i.e. '0 0 1 1 coding') for each of the four possible responses to each item, as advocated by the questionnaire's author (Williams & Goldberg, 1988). Using this method, the maximum score for any respondent is therefore twelve. The scoring was then reversed such that higher scores reflect an improvement in mental health or a reduction in mental illness. There is no universally used threshold value for GHQ-12 to identify probable self-rated mental health because the populations it is used on vary considerably. We chose a threshold value of eight, as suggested by the author of the questionnaire, to identify 'cases' of mental health and to create a dichotomous indicator of positive or negative self-rated mental health (Williams & Goldberg, 1988). The predictive and content validity of the GHQ-12 is good in comparison to other well-known scaling tests of mental health (see, for example, Bowling, 2005). The GHQ-12 also performs well in reliability tests and has been shown to be robust to re-testing, making it a suitable longitudinal instrument (Pevalin, 2000). For instance, the reliability of the GHQ-12 from 2003-2004 BHPS is of 0.89 for the dichotomous coding method (Hankins, 2007).

2.3. Measures of perceived physical health

1

2

3

4

5

6

7

8

9

10

11

12

13

14

15

16

17

18

19

20

21

22

23

24

25

26

The perceived physical health question in the BHPS is measured following an ordinal scale, with possible responses from 'very poor', 'poor', 'fair', 'good', or 'excellent'. The categories were collapsed into a dichotomous indicator by combining the 'poor' and 'very poor' responses and the 'fair', 'good' and excellent' responses such that the respondent was recorded as having either 'negative' or 'positive' self-rated health. Previous studies

- 1 have shown this measure to be one of the best predictors of healthcare utilisation, costs and
- 2 mortality (Bierman et al., 1999; Davies & E., 1981; Fylkesnes & Forde, 1991; Mossey &
- 3 Shapiro, 1982). We specified an ordered probability model in the regression analysis of
- 4 physical health.

5

2.4. Measures of social capital

- 6 Previous research has generally maintained that social capital is fundamentally multi-
- 7 dimensional with disputed and contrary definitions at both theoretical and empirical levels
- 8 (Cooper et al., 1999). The validity of currently available quantitative measures is keenly
- 9 disputable (Coulthard et al., 2001). The BHPS does however offer some reasonable
- individual-level indicators to tackle social capital's multi-dimensionality (see David J.
- 11 Pevalin & Rose, 2002) see Table 1 following. There is growing evidence of a lack of
- correlation between indicators of social capital, in turn hinting at several pathways from
- social capital to health (Giordano & Lindstrom, 2010; Lindström et al., 2004; Nummela et
- al., 2008). We, therefore, simultaneously investigated a range of measures for structural
- and cognitive social capital at the individual level and applied structural equation modelling
- 16 (SEM) to obtain estimates of several dimensions of social capital. SEM permits
- measurement error to be isolated and controlled for in a way that is not possible with
- 18 traditional methods of aggregating data.
- 19 [Insert Table 1]
- 20 We do not consider potential contextual effects for two reasons: First, the most common
- 21 approach to defining social capital in research on population health to date has been the
- social cohesion perspective (Murayama et al., 2012); and second, a systematic review of
- 23 social factors and health (Pickett & Pearl, 2001) and one recent multilevel study (Giordano
- et al., 2011) demonstrate that individual-level social capital proxies have the greatest
- 25 influence on individual health.

2.4.1. Structural social capital

1

Structural social capital represents individual social participation and networks in the local 2 3 neighbourhood. Social participation is commonly referred to as a behavioural/activity component of social capital and individual social capital is commonly measured by asking 4 individuals about their participation in social relationships and organisations (Bain & 5 6 Hicks, 1998). The social participation latent variable in this study is predicted by the observed involvement in the voluntary associations listed in Table 1. The second measure, 7 'social network', is that of social support from/to friends, since friends can provide an 8 important source of emotional support for adults (Adams, 1985) and the frequency of 9 10 contact with friends is often considered as bonding social capital (Brisson & Usher, 2007; Derose, 2008; Lowndes, 2004). There is also evidence to suggest that children and 11 12 adolescents gain some protection against internalising behaviours, such as depression and suicidal ideation, when they enjoy wider networks, either directly with their peers or 13 indirectly through their parents' networks (Rotenberg et al., 2004). Respondents in the 14 BHPS are asked how regularly they are in touch with their three closest friends. Each item 15 16 uses response options of 'no contact', 'less often', 'at least once month', 'at least once 17 week', and 'most days', and utilises a five point scale. This three-item friendship network latent variable measures overall relationship with the three closest friends in this study. As 18 Bertotti et al. (2013) find that social participation and social network are both significantly 19 20 associated with mental health, but the sign of correlation is of opposite direction, we used 21 these two measures separately rather than as a single structural component.

2.4.2. Cognitive social capital

22

23

24

25

26

One of the important aspects of cognitive social capital is the emotional and practical support it offers in times of need. Loneliness is often viewed as a subjective measure of social interaction and the antithesis to social support, highlighting the importance of social perceptions and evaluations of personal relationships (Victor et al., 2000). Since the

- 1 literature suggests that being socially isolated can negatively affect mental as well as
- 2 physical health (Holt-Lunstad et al., 2010), we identified loneliness as a perceived lack of
- 3 social and emotional support. The BHPS includes variables indicating whether respondents
- 4 have someone who will listen to them, help them in a crisis, relax with them, appreciates
- 5 them, or comforts them. In this study these variables were coded as binary outcomes with
- 6 1 indicating that they have no-one and 0 otherwise.

2.5. Demographic factors

7

- 8 We used six demographic factors (age, gender, marital status, highest level of education,
- 9 employment status, and annual household income) in our analyses. These factors are often
- associated with basic variations in health (Chandola, 2000; Rose & Pevalin, 2000). Current
- annual household income was constructed from information on the annual labour and non-
- 12 labour income of each member of the household. To allow for the effects of household size
- and composition, household income was equivalised using the McClements scale (see
- 14 Taylor et al., 1998), deflated to 2005 prices using the retail price index and transformed to
- natural logarithms to allow for concavity between health outcomes and income. We used
- age to remove any within-cohort age effects and also allowed for a flexible relationship
- between health outcomes and age by specifying a cubic polynomial in age (i.e. AGE, AGE²)
- and AGE³). We included indicators for region of residence in our models but the parameter
- 19 estimates are not reported as geographical variation is not the focus of this paper and the
- 20 categories used in these variables are rather cruder. Our variables are defined in Table 2
- 21 following:

23

22 [Insert Table 2]

3. Models and Estimation Methods

- We conducted autoregressive cross-lagged panel models (ACLPM) (Cole & Maxwell,
- 25 2003; Curran, 2000) to simultaneously address reciprocal influences on individual social

capital and health outcomes. Since multilevel structural equation model (SEM) allows for the use of latent variables to correct for measurement error, multivariate outcomes, flexible multiple group comparisons, and the calculation of overall fit statistics for model evaluation (Bovaird, 2007; Curran, 2003; Mehta & Neale, 2005), we implemented a two-level SEM approach to partition between- and within-person effects. A simultaneous equation model that allows for autoregressive effects and cross-lagged effects between health outcomes (Y_{ti}^H) and social capital (Y_{ti}^{SC}) at each measure point may be written (t =2, ..., 9) as

9
$$Y_{ti}^{H} = \alpha_{t}^{H} + \beta_{1}^{H} Y_{t-1,i}^{H} + \beta_{2}^{H} Y_{t-1,i}^{SC} + \delta^{H} X_{t-1,i} + \gamma^{H} Z_{i} + \mu_{i}^{H} + \varepsilon_{ti}^{H}$$
 (1)

10
$$Y_{ti}^{SC} = \alpha_t^{SC} + \beta_1^{SC} Y_{t-1,i}^{SC} + \beta_2^{SC} Y_{t-1,i}^{H} + \delta^{SC} X_{t-1,i} + \gamma^{SC} Z_i + \mu_i^{SC} + \varepsilon_{ti}^{SC}$$
 (2)

where t represents an occasion, t represents an individual, α_t is a time-varying intercept term, $Y_{t-1,i}^H$ and $Y_{t-1,i}^{SC}$ are the lags of one time unit for health outcome and social capital, δ and γ are row vectors of coefficients of X_{ti} and Z_t , which are respectively a vector of control variables that vary over both individuals and time (e.g. marital status, educational attainment, household income) and a vector of control variables that vary over individuals but not over time (e.g. gender). The term μ_t denotes fixed effects that vary across individuals whilst ε_{ti} are random disturbances that are assumed to be independent of each other and normally distributed with means of zero and constant variance. We also assume that X_{ti} is strictly exogenous, meaning that it is independent of ε_{ti} . With respect to Y_{ti}^H and Y_{ti}^{SC} , we cannot assume strict exogeneity because both variables appear as dependent variables. Instead, we assume that they are sequentially exogenous (Wooldridge, 2010). β_1 represents the autoregressive effects, or the effects of social capital and health outcomes on themselves measured at a later occasion. A small or zero autoregressive coefficient means that there has been a substantial reshuffling of the individual's standings on the construct over time. In contrast, a sizable autoregressive coefficient means that the

individual's relative standings on the construct have been relatively constant over time. β_2 1 describes cross-lagged effects that are the effects of individuals' social capital on their 2 subsequent health outcomes and the effect of health outcomes on subsequent social capital. 3 The model defined by equations 1 and 2 leads to a two-level cross-lagged analysis for the 4 individual responses with repeated measures (level 1) nested within individuals (level 2), 5 which allows for the control of unmeasured confounders and the presumption that the 6 coefficients are constant over time. The two equations are simultaneously estimated on our 7 balanced panel of data by maximum likelihood methods in generalised SEM procedure of 8 Stata v13.1 (StataCorp, Texas, USA). 9 ACLPM is specified to examine reciprocal relationships between individual social capital 10 and health outcomes over a total of nine measure points or occasions. In Figure 1 following, 11 12 autoregressive effects are represented as single-headed arrows running from a given variable at one occasion to the same variable at the next occasion. The indicators of social 13 capital to prospectively predict health status and for health status to prospectively predict 14 social capital over an interval are illustrated by diagonal single-headed arrows. The error 15 16 terms associated with the indicators of social capital at follow-up are hypothesised as 17 correlated because we assumed that factors contributing to measurement error in latent

4. Results

18

19

20

21

22

23

24

25

Table 3 presents descriptive statistics for all of the variables used in our analysis for the analytic sample broken down by mental and physical health status. Stratifying the sample by 'positive' and 'negative' reveals that individuals who rate their mental health as positive tend to be younger, more likely to be male, married, employed, retired, and to have a higher real household income, and to be less likely to be divorced/separated or unemployed than their counterparts who rate as negative. Similarly, individuals are more likely to rate their

variables would be consistent across the two occasions.

- 1 physical health as positive if they are younger, male, employed and if they have higher
- 2 academic qualifications and higher household income.
- 3 [Insert Table 3]
- 4 Our results in Figure 1 show that the stationary autoregressive effect of self-rated mental
- 5 (physical) health [0.42 (0.55), p<0.01], is significant, as are the stationary autoregressive
- effect of social capital, social participation (0.50, p < 0.01), social network (0.49, p < 0.01),
- and loneliness (0.30, p < 0.01). These coefficients indicate moderate stability of mental
- 8 (physical) health status and social capital over occasions.
- 9 Net of autoregressive effects, the stationary lagged effect of social participation on
- perceived mental health is significant (4.09, p < 0.01). There is also evidence of a lagged
- effect in the opposite direction, but the magnitude is relatively small (0.016, p < 0.01). There
- is some indication that lagged social network is positively related to perceived mental
- 13 (physical) health although neither is found to be significant. Lagged mental and physical
- health do affect individuals' social network as 0.002 and 0.01 at the 1% level, respectively.
- Lagged loneliness is significant and negative impacts are found on both mental (-0.05,
- 16 p<0.01) and physical health (-0.06, p<0.01). However, only lagged physical health
- negatively affects loneliness (-0.05, p<0.01), a higher physical health score at occasion t-1
- is associated with a lower loneliness score at occasion t.
- 19 [Insert Figure 1]
- 20 It is apparent from Table 4 that younger and males generally present better perceived health,
- both mental and physical. Compared to the baseline category of married/cohabiting,
- 22 individuals who are widowed or never married exhibit worse perceived mental health,
- whilst only widowed respondents exhibited worse perceived physical health at the 5%
- 24 significance level. There is some indication that higher academic qualifications are
- associated with better perceived mental and physical health (as compared to the baseline

- of respondents with no qualifications). Few of the employment status categories are
- 2 significant. The retired and disabled are associated with worse perceived physical health,
- 3 and the disabled report relatively negative perceived mental health. Higher household
- 4 income is associated with positive perceived physical health.
- 5 [Insert Table 4]

6

7

8

9

10

11

12

13

14

15

16

17

18

19

20

21

22

23

24

25

5. Conclusions

Given that social capital plays an important and growing role in UK health policy, it is vital that health enhancing intervention programs are targeted towards those population groups that are in the greatest need. In most studies, these groups have been identified through cross-sectional analyses that cannot exclude the possibility of reverse causality. Moreover, cross-section data provides only a snap-shot of the distribution of health status at a particular point in time and renders population intervention less cost-effective in terms of identifying at-risk groups. Our aim in this study has been to extend prior cross-sectional research and to shed further light on unidirectional and bidirectional causal relations between individual-level social capital and health problems using UK panel data, thereby aiding the development of more effective public health policies in the UK. Our longitudinal analyses suggest that whilst there is substantial stability in both perceived mental and physical health, the former exhibits lower fluctuation over time than the latter. Our results further indicate that social participation strongly predicts future perceived mental health, whilst simultaneous reciprocal causality occurs between them. Our results are consistent with Bertotti et al. (2013) and Kawachi and Berkman (2001) who argue that social participation contributes to health by providing a sense of meaning to individual's lives as well as increasing access to social support. Social relationships formed by social participation improve mental health by increasing the participants' fulfilment of attachment, their social approval, access to resources and emotional gratification (Moen et

al., 1992). Therefore, social participation is important for recovery and improving the 1 2 health outcomes for individuals with poor mental health. For instance, a meta-analysis of 147 studies involving almost 100,000 individuals finds that religious involvement is also 3 associated with reduced depression, particularly for stressed populations (Smith et al., 4 5 2003). Strategies to advantage communities with higher levels of social capital may include individual and community empowerment (Wallerstein, 2006), community arts, and access 6 to safe, green community spaces. 7 Our study also supports previous findings that poor mental health has a detrimental impact 8 on a person's ability to participate economically and socially in social and civil activities 9 10 (Psychiatrists, 2009). Although in our study the estimated impact may be small in magnitude, it is worth noting that exclusion from key areas of social life, such as social 11 interaction and political engagement, as well as from health service engagement results in 12 inequality, which is also a major determinant of negative mental health and a marker of 13 other risk factors (Parsonage, 2007). Interventions that use social contact or a combination 14 of social contact and education are effective at increasing awareness of poor mental health 15 16 in selected group and changing negative attitude in ways that will improve relationships, 17 job performance and health (Corrigan et al., 2001). Despite the paucity of evidence that individual social network in preceding time periods is linked to increase perceived 18 mental/physical health at subsequent time points, our results suggest that positive perceived 19 20 mental and physical wellbeing helps individuals to develop a good support network. The mutuality and reciprocity that occurs through social network, builds social capital, which 21 22 in turn is associated with well-being and resilience (McKenzie & Harpham, 2006). For example, the UK Department of Health (2012) in the related Implementation Framework 23 recommends the development of peer support as one of the roles of mental health 24 25 organisations in implementing the strategy.

1 Our findings also support the view that loneliness has a significant negative impact upon 2 perceived mental and physical health. Cacioppo and Patrick (2008) find that loneliness causes higher rises in morning levels of the stress hormone cortisol, altered gene expression 3 in immune cells, and higher blood pressure. Loneliness is also associated with an increased 4 risk of depression, sleep problems and a faster progression of Alzheimer's disease. 5 6 Tackling social isolation formed the logic for much of the 'Third Way' policy agenda of the UK Blair Labour governments (Giddens, 2013). The significant influence of mental 7 health on loneliness may provide evidence that loneliness is sometimes due to the 8 unwillingness of others to befriend the mentally ill with the stigma associated with poor 9 10 mental health creating a substantial barrier to socialisation (Harvey & Brophy, 2011). Whilst some of the mental ill withdraw from others as a way of managing symptoms, many 11 desire more connection. For example, nearly 45% of participants in the Australian National 12 Survey of Mental Health and Wellbeing with psychosis felt they are in need of good friends 13 (Jablensky et al., 2000). It is therefore necessary to confront biased social attitudes in order 14 to reduce the discrimination and stigma of individuals who are living with poor mental 15 16 health. There are also systematic differences in health outcomes across socio-economic groups. In 17 general, age, gender, marital status, employment status and household income are 18 19 significantly related to changes in both perceived mental and physical health. The analyses suggest that older individuals rate their health as more negative compared to younger 20 21 individuals (Zack et al., 2004). Rates of positive perceived health are higher among high school graduates with further education (Mikolajczyk et al., 2008; Mirowsky & Ross, 22 23 1998) and among males compared to females (Benyamini et al., 2003). Our study also 24 provides evidence that marriage is associated with enhanced perceived mental health (Simon, 2002) and adjusted household income is associated with perceived physical health 25 (Subramanian et al., 2003). 26

This study has distinguished three indicators of social capital and their relative impacts on 1 2 both perceived mental and physical health. Our statistical model clearly establishes the temporal relation between the two constructs and protects against the potential biasing 3 effects of reverse causation. It further allows for the differentiation of individual-specific 4 influences as well as the differentiation between time-varying and time-invariant 5 unmeasured influences on health outcomes using panel data. The estimation of these 6 individual-level and occasion-level effects renders it possible to draw valid and reliable 7 conclusions regarding the relative magnitudes of reciprocal effects of social capital and 8 health outcomes. 9 10 There are, however, several limitations in our data. The self-reported retrospective measures for health outcomes almost certainly lead to some degree of self-reported bias. 11 In particular, self-reported bias may inflate the size of the correlation of construct across 12 time and reduce the unexplained variance available for other latent variables (Marsh, 1993). 13 A second limitation is that, similar to most panel data, the BHPS is not based on sensitive 14 designs that can provide powerful methodological possibilities to understand genetic 15 16 influences on personality traits leading to consistent behaviour, thoughts, and emotions 17 across situation and context (see, for example, Hahn et al., 2012; Kenrick & Funder, 1988). The third limitation is that there may be potential dilution bias from regression to the 18 average values from two waves in dynamic models (Liker et al., 1985). And finally, a 19 20 number of commentators argue that there is more than one type of social capital. This study mainly focuses on 'individual' (i.e. bonding) social capital – that is, horizontal tight-knit 21 22 ties between individuals sharing similar demographic characteristics – rather than 'linking' social capital – that is, vertical connections that span differences in power. Szreter (2002) 23 argues that the decline in linking social capital is likely to lead to an increase in health 24 25 inequities. Recent studies suggest that social capital can be influenced by contextual, relational, and psychological attributes such as neighbourhood capacity and norms (Yu et 26

- al., 2011). It is therefore important to more closely examine the contextual and individual
- 2 elements of social capital separately in future research.

References

3

- Adams, R.G. (1985). Emotional closeness and physical distance between friends: Implications for elderly women living in age-segregated and age-integrated settings. *The International Journal of Aging and Human Development*, 22, 55-76.
- 7 Allen, G. (2011). Early intervention: the next steps, an independent report to Her Majesty's government by Graham Allen MP: The Stationery Office.
- Bain, K., & Hicks, N. (1998). Building social capital and reaching out to excluded groups: the challenge of
 partnerships. CELAM meeting on the struggle against poverty towards the turn of the millennium.
 Washington DC.
- Baum, F.E. (2003). The effectiveness of community-based health promotion in Healthy Cities programmes. *Healthy cities and urban policy research*, 104-130.
- Benyamini, Y., Blumstein, T., Lusky, A., & Modan, B. (2003). Gender differences in the self-rated health—mortality association: Is it poor self-rated health that predicts mortality or excellent self-rated health that predicts survival? *The gerontologist*, 43, 396-405.
- Bertotti, M., Watts, P., Netuveli, G., Yu, G., Schmidt, E., Tobi, P., et al. (2013). Types of Social Capital and
 Mental Disorder in Deprived Urban Areas: A Multilevel Study of 40 Disadvantaged London
 Neighbourhoods. *PloS one*, 8, e80127.
- Bierman, A.S., Bubolz, T.A., Fisher, E.S., & Wasson, J.H. (1999). How well does a single question about health predict the financial health of Medicare managed care plans? *Effective Clinical Practice*, 2, 7.
- Booth, M.L., Owen, N., Bauman, A., Clavisi, O., & Leslie, E. (2000). Social—cognitive and perceived environment influences associated with physical activity in older Australians. *Preventive Medicine*, 31, 15-22.
- Bourdieu, P., & Wacquant, L.J. (1992). An invitation to reflexive sociology: University of Chicago Press.
- Bovaird, J.A. (2007). *Multilevel structural equation models for contextual factors*: Lawrence Erlbaum Associates Publishers.
- Bowling, A. (2005). *Measuring health: a review of quality of life measurement scales*: Open University Press.
- 31 Brisson, D., & Usher, C.L. (2007). The Effects of Informal Neighborhood Bonding Social Capital and Neighborhood Context on Homeownership for Families Living in Poverty. *Journal of Urban Affairs*, 29, 65-75.
- Burt, R.S. (2009). Structural holes: The social structure of competition: Harvard university press.
- Cacioppo, J.T., & Patrick, W. (2008). Loneliness: Human nature and the need for social connection: WW
 Norton & Company.
- Chandola, T. (2000). Social class differences in mortality using the National Statistics Socio-economic Classification: a reply to Rose and Pevalin. *Social Science & Medicine*, 51, 1129-1133.
- Cole, D.A., & Maxwell, S.E. (2003). Testing mediational models with longitudinal data: questions and tips in the use of structural equation modeling. *Journal of abnormal psychology,* 112, 558.

- Coleman, J.S. (1988). Social capital in the creation of human capital. *American journal of sociology*, S95 S120.
- Corrigan, P.W., River, L.P., Lundin, R.K., Penn, D.L., Uphoff-Wasowski, K., Campion, J., et al. (2001).
 Three strategies for changing attributions about severe mental illness. *Schizophrenia bulletin*, 27, 187.
- 6 Coulthard, M., Walker, A., & Morgan, A. (2001). Assessing people's perceptions of their neighbourhood 7 and community involvement (Part 1). London: Health Development Agency.
- 8 Curran, P.J. (2000). A latent curve framework for the study of developmental trajectories in adolescent substance use.
- 10 Curran, P.J. (2003). Have multilevel models been structural equation models all along? *Multivariate Behavioral Research*, 38, 529-569.
- Davies, A.R., & E., W.J.J. (1981). Measuring health perceptions in the Health Insurance Experiment. Santa Monica, CA: The Rand Corporation.
- De Silva, M.J., McKenzie, K., Harpham, T., & Huttly, S.R. (2005). Social capital and mental illness: a systematic review. *J Epidemiol Community Health*, 59, 619-627.
- 16 Department of Health (2001). Making it happen a guide to mental health promotion. London.
- 17 Department of Health (2006). Health Challenge England next steps for Choosing Health. London.
- Department of Health (2010). Future of Social Work in Adult Social Services in England. London.
- 19 Department of Health (2012). No Health Without Mental Health: Implementation Framework.
- Derose, K.P. (2008). Do Bonding, Bridging, and Linking Social Capital Affect Preventable Hospitalizations?
 Health Services Research, 43, 1520-1541.
- Drukker, M., Kaplan, C., Feron, F., & van Os, J. (2003). Children's health-related quality of life, neighbourhood socio-economic deprivation and social capital. A contextual analysis. *Social Science & Medicine*, 57, 825-841.
- Folland, S. (2008). An economic model of social capital and health. *Health Economics, Policy and Law,* 3, 333-348.
- Fylkesnes, K., & Forde, O.H. (1991). The Tromso Study Predictors of Self-Evaluated Health Has Society
 Adopted the Expanded Health Concept. Social Science & Medicine, 32, 141-146.
- 29 Giddens, A. (2013). The third way: The renewal of social democracy: John Wiley & Sons.
- Giles-Corti, B., & Donovan, R.J. (2002). The relative influence of individual, social and physical environment determinants of physical activity. *Social science & medicine*, 54, 1793-1812.
- Giordano, G.N., & Lindstrom, M. (2010). The impact of changes in different aspects of social capital and material conditions on self-rated health over time: a longitudinal cohort study. *Social science & medicine*, 70, 700-710.
- Giordano, G.N., Ohlsson, H., & Lindström, M. (2011). Social capital and health—Purely a question of context? *Health & place*, 17, 946-953.
- Greiner, K.A., Li, C., Kawachi, I., Hunt, D.C., & Ahluwalia, J.S. (2004). The relationships of social participation and community ratings to health and health behaviors in areas with high and low population density. *Social science & medicine*, 59, 2303-2312.

- Hahn, E., Spinath, F.M., Siedler, T., Wagner, G.G., Schupp, J., & Kandler, C. (2012). The complexity of personality: advantages of a genetically sensitive multi-group design. *Behavior genetics*, 42, 221-233.
- Harpham, T., Grant, E., & Thomas, E. (2002). Measuring social capital within health surveys: key issues.
 Health policy and planning, 17, 106-111.
- 6 Harvey, C., & Brophy, L. (2011). Social isolation in people with mental illness. *Medicine Today*, 12.
- Hedström, P., & Ylikoski, P. (2010). Causal mechanisms in the social sciences. *Annual Review of Sociology*, 36, 49-67.
- 9 Henderson, S., & Whiteford, H. (2003). Social capital and mental health. Lancet, 362, 505-506.
- Hoffman, L., & Stawski, R.S. (2009). Persons as contexts: Evaluating between-person and within-person effects in longitudinal analysis. *Research in Human Development*, 6, 97-120.
- Holt-Lunstad, J., Smith, T.B., & Layton, J.B. (2010). Social relationships and mortality risk: a meta-analytic review. *PLoS medicine*, 7, e1000316.
- Jablensky, A., McGrath, J., Herrman, H., Castle, D., Gureje, O., Evans, M., et al. (2000). Psychotic disorders in urban areas: an overview of the Study on Low Prevalence Disorders. *Australian and New Zealand journal of psychiatry*, 34, 221-236.
- 17 Kawachi, I. (2006). Commentary: social capital and health: making the connections one step at a time.

 18 *International Journal of Epidemiology*, 35, 989-993.
- 19 Kawachi, I., & Berkman, L.F. (2001). Social ties and mental health. *Journal of Urban health*, 78, 458-467.
- Kawachi, I., Colditz, G.A., Ascherio, A., Rimm, E.B., Giovannucci, E., Stampfer, M.J., et al. (1996). A
 prospective study of social networks in relation to total mortality and cardiovascular disease in men
 in the USA. *Journal of Epidemiology and Community Health*, 50, 245-251.
- Kenrick, D.T., & Funder, D.C. (1988). Profiting from controversy: Lessons from the person-situation debate.
 American Psychologist, 43, 23.
- Leyden, K.M. (2003). Social capital and the built environment: the importance of walkable neighborhoods.
 American journal of public health, 93, 1546-1551.
- Liker, J.K., Augustyniak, S., & Duncan, G.J. (1985). Panel data and models of change: A comparison of first
 difference and conventional two-wave models. *Social Science Research*, 14, 80-101.
- 29 Lin, N. (1999). Building a network theory of social capital. *Connections*, 22, 28-51.
- Lindström, M., Moghaddassi, M., & Merlo, J. (2004). Individual self-reported health, social participation and neighbourhood: a multilevel analysis in Malmö, Sweden. *Preventive Medicine*, 39, 135-141.
- Lowndes, V. (2004). Getting On or Getting By? Women, Social Capital and Political Participation. *The British Journal of Politics & International Relations*, 6, 45-64.
- Marsh, H.W. (1993). Stability of individual differences in multiwave panel studies: Comparison of simplex models and one-factor models. *Journal of Educational Measurement*, 30, 157-183.
- 36 McKenzie, K., & Harpham, T. (2006). Social capital and mental health: Jessica Kingsley Publishers.
- Mehta, P.D., & Neale, M.C. (2005). People are variables too: multilevel structural equations modeling. *Psychological methods*, 10, 259.
- Mikolajczyk, R.T., Brzoska, P., Maier, C., Ottova, V., Meier, S., Dudziak, U., et al. (2008). Factors associated with self-rated health status in university students: a cross-sectional study in three European countries. *BMC public health*, 8, 215.

- Mirowsky, J., & Ross, C.E. (1998). Education, personal control, lifestyle and health A human capital hypothesis. *Research on Aging*, 20, 415-449.
- Moen, P., Dempster-McClain, D., & Williams Jr, R.M. (1992). Successful aging: A life-course perspective on women's multiple roles and health. *American Journal of Sociology*, 1612-1638.
- Morrow, V. (1999). Conceptualising social capital in relation to the well-being of children and young people: a critical review. *Sociological Review*, 47, 744-765.
- Mossey, J.M., & Shapiro, E. (1982). Self-Rated Health a Predictor of Mortality among the Elderly. *American Journal of Public Health*, 72, 800-808.
- 9 Muntaner, C. (2004). Commentary: social capital, social class, and the slow progress of psychosocial epidemiology. *International Journal of Epidemiology*, 33, 674-680.
- Murayama, H., Fujiwara, Y., & Kawachi, I. (2012). Social capital and health: a review of prospective multilevel studies. *Journal of Epidemiology*, 22, 179-187.
- Nakhaie, R., & Arnold, R. (2010). A four year (1996–2000) analysis of social capital and health status of Canadians: The difference that love makes. *Social science & medicine*, 71, 1037-1044.
- Nummela, O., Sulander, T., Rahkonen, O., Karisto, A., & Uutela, A. (2008). Social participation, trust and self-rated health: a study among ageing people in urban, semi-urban and rural settings. *Health & place*, 14, 243-253.
- Orthgomer, K., Rosengren, A., & Wilhelmsen, L. (1993). Lack of Social Support and Incidence of Coronary Heart-Disease in Middle-Aged Swedish Men. *Psychosomatic Medicine*, 55, 37-43.
- Parsonage, M. (2007). Mental Health at Work: Developing the business case. *Policy Paper*.
- Pearce, N., & Davey Smith, G. (2003). Is social capital the key to inequalities in health? *American journal* of public health, 93, 122-129.
- Pevalin, D.J. (2000). Multiple applications of the GHQ-12 in a general population sample: an investigation of long-term retest effects. *Social Psychiatry and Psychiatric Epidemiology*, 35, 508-512.
- Pevalin, D.J., & Rose, D. (2002). Social capital for health. Investigating the links between social capital and
 health using the British Household Panel Survey. London Health Development Agency.
- Phongsavan, P., Chey, T., Bauman, A., Brooks, R., & Silove, D. (2006). Social capital, socio-economic status and psychological distress among Australian adults. *Social science & medicine*, 63, 2546-2561.
- Pickett, K.E., & Pearl, M. (2001). Multilevel analyses of neighbourhood socioeconomic context and health outcomes: a critical review. *Journal of epidemiology and community health*, 55, 111-122.
- Psychiatrists, R.C.o. (2009). *Mental Health and Social Inclusion: Making Psychiatry and Mental Health Services Fit for the 21st Century:* Royal College of Psychiatrists.
- 34 Putnam, R.D. (2001). Bowling alone: The collapse and revival of American community: Simon and Schuster.
- Putnam, R.D., Leonardi, R., & Nanetti, R.Y. (1994). *Making democracy work: Civic traditions in modern Italy*: Princeton university press.
- Rose, D., & Pevalin, D.J. (2000). Social class differences in mortality using the National Statistics Socioeconomic Classification - too little, too soon: a reply to Chandola. *Social Science & Medicine*, 51, 1121-1127.
- Rotenberg, K.J., McDougall, P., Boulton, M.J., Vaillancourt, T., Fox, C., & Hymel, S. (2004). Cross-sectional and longitudinal relations among peer-reported trustworthiness, social relationships, and

1 2	psychological adjustment in children and early adolescents from the United Kingdom and Canada. <i>Journal of Experimental Child Psychology</i> , 88, 46-67.
3 4	Simon, R.W. (2002). Revisiting the Relationships among Gender, Marital Status, and Mental Health1. <i>American journal of sociology</i> , 107, 1065-1096.
5 6	Smith, T.B., McCullough, M.E., & Poll, J. (2003). Religiousness and depression: evidence for a main effect and the moderating influence of stressful life events. <i>Psychological bulletin</i> , 129, 614.
7 8 9	Subramanian, S., Delgado, I., Jadue, L., Vega, J., & Kawachi, I. (2003). Income inequality and health: multilevel analysis of Chilean communities. <i>Journal of epidemiology and community health</i> , 57, 844-848.
10 11	Szreter, S. (2002). The state of social capital: Bringing back in power, politics, and history. <i>Theory and Society</i> , 31, 573-621.
12 13	Taylor, M.F., Brice, J., Prentice-Lane, N.B., & Prentice-Lane, E. (1998). British Household Panel Survey: User Manual. Colchester: University of Essex.
14 15	Victor, C., Scambler, S., Bond, J., & Bowling, A. (2000). Being alone in later life: loneliness, social isolation and living alone. <i>Reviews in Clinical Gerontology</i> , 10, 407-417.
16	Wallerstein, N. (2006). What is the evidence on effectiveness of empowerment to improve health?
17 18 19 20	Welin, L., Larsson, B., Svardsudd, K., Tibblin, B., & Tibblin, G. (1992). Social Network and Activities in Relation to Mortality from Cardiovascular-Diseases, Cancer and Other Causes - a 12 Year Follow-up of the Study of Men Born in 1913 and 1923. <i>Journal of Epidemiology and Community Health</i> , 46, 127-132.
21 22	Williams, P., & Goldberg, D. (1988). A user's guide to the General Health Questionnaire. <i>Berkshire: NFER, Nelson</i> .
23 24	Wooldridge, J.M. (2005). Simple solutions to the initial conditions problem in dynamic, nonlinear panel data models with unobserved heterogeneity. <i>Journal of applied econometrics</i> , 20, 39-54.
25	Wooldridge, J.M. (2010). Econometric analysis of cross section and panel data: MIT press.
26 27 28	Yu, G., Renton, A., Wall, M., Estacio, E., Cawley, J., & Datta, P. (2011). Prevalence of Low Physical Activity and its Relation to Social Environment in Deprived Areas in the London Borough of Redbridge. <i>Social Indicators Research</i> , 104, 311-322.
29 30 31	Zack, M.M., Moriarty, D.G., Stroup, D.F., Ford, E.S., & Mokdad, A.H. (2004). Worsening trends in adult health-related quality of life and self-rated health-United States, 1993-2001. <i>Public health reports</i> , 119, 493.
32	
33	
34	

Figure Captions

Figure 1. Lags and cross-lags in multilevel equations model for social capital-health reciprocal effects at time t-1 and t (n=24312)

Tables

Table 1. Items of Social Capital

Question item	Response/scoring			
Social Participation				
Member of political party trade union environmental group parents association tenants or residents group religious group voluntary service group other community group	No = 0 $Yes = 1$			
Social Network				
How often do you see or get in touch with your 1st/2nd/3rd closest friend either by visiting, writing or by telephone	No contact=0; Less often = 1; At least once a month = 2; At least once a week = 3; Most days = 4			
Loneliness				
Is there someone who will listen? Is there someone to help in a crisis? Is there someone you can relax with? Anyone who really appreciates you? Anyone you can count on to offer comfort	No one = 2; Yes, one person = 1; Yes, more than one person = 0			

Table 2. Variable Definitions

MENTAL HEALTH	Continuous score, range from 0 to 12 (the higher, the better)
PHYSICAL HEALTH	Ordinal scale, range from 1 to 5 (the higher, the better)
AGE	Age in years at 1st December of current time point
FEMALE	1 if female, 0 otherwise (reference group)
MALE	1 if male, 0 otherwise
MARRIED	1 if married or living as a couple, 0 otherwise (reference group)
SEPARATED	1 if divorced or separated, 0 otherwise
WIDOW	1 if widowed, 0 otherwise
NEVER MARRIED	1 if never married, 0 otherwise
WITHOUT QUALIFICATION	1 if no qualification, 0 otherwise (reference group)
WITH QUALIFICATION	1 if qualification, 0 otherwise
WITH HIGHER QUALIFICATION	1 if higher degree, 0 otherwise
PAID EMPLOYMENT	1 if in paid employed, 0 otherwise (reference group)
SELF EMPLOYMENT	1 if self-employed, 0 otherwise
UNEMPLOYMENT	1 if unemployed, 0 otherwise
RETIRED	1 if retired, 0 otherwise
STUDENT	1 if full-time student, 0 otherwise
OTHER EMPLOYMENT	1 if other employment status, 0 otherwise
LOG (HOUSEHOLD INCOME)	Natural log of equivalised annual real household income in pounds

Table 3. Variable Means by Health Indicators

	Self-rated Mental Health		Self-rated Physical Health	
	Positive	Negative	Positive	Negative
	<i>N</i> = 19648	<i>N</i> = 4664	N = 22462	N = 1850
AGE	45.84	47.06	47.11	50.65
FEMALE	0.566	0.671	0.579	0.661
MALE	0.434	0.329	0.421	0.339
MARRIED	0.701	0.644	0.690	0.657
SEPARATED	0.094	0.151	0.099	0.165
WIDOW	0.047	0.048	0.051	0.064
NEVER MARRIED	0.156	0.157	0.160	0.114
WITHOUT QUALIFICATION	0.175	0.182	0.178	0.316
WITH QUALIFICATION	0.408	0.393	0.397	0.386
WITH HIGHER QUALIFICATION	0.422	0.414	0.421	0.295
PAID EMPLOYMENT	0.602	0.553	0.602	0.341
SELF EMPLOYMENT	0.085	0.072	0.084	0.045
UN EMPLOYMENT	0.019	0.039	0.022	0.030
RETIRED	0.175	0.143	0.177	0.250
STUDENT	0.011	0.010	0.010	0.012
OTHER EMPLOYMENT	0.013	0.010	0.009	0.010
LOG (HOUSEHOLD INCOME)	10.148	10.085	10.146	9.855

Table 4. Estimated Coefficients from Multilevel Cross-Lagged Model

	Self-rated Me	ntal Health	Self-rated	
	N=24312			
	Coef.	S.E.	Coef.	S.E.
AGE	-0.052 ***	0.016	-0.024**	0.012
AGE2	0.148***	0.034	0.040*	0.024
AGE3	-0.011***	0.002	-0.003**	0.002
MALE	0.374***	0.022	0.106**	0.042
SEPARATED	-0.091*	0.049	-0.009	0.039
WIDOW	-0.273***	0.069	-0.113**	0.056
NEVER MARRIED	-0.173***	0.051	0.006	0.045
WITH QUALIFICATION	0.159***	0.047	0.210***	0.059
WITH HIGHER QUALIFICATION	0.130***	0.048	0.268***	0.066
SELF EMPLOYMENT	0.018	0.050	0.053	0.038
UN EMPLOYMENT	0.117	0.079	0.097*	0.055
RETIRED	0.067	0.050	-0.078**	0.037
STUDENT	0.150*	0.090	-0.078	0.060
OTHER EMPLOYMENT	0.046	0.060	-0.047	0.045
LOG (HOUSEHOLD INCOME)	0.007	0.022	0.054***	0.018

^{*}p<0.1, **p<0.05, ***p<0.01

Notes: Time dummies and geographic covariates have been suppressed from results

Figures

Figure 1. Lags and cross-lags in multilevel equations model for social capital-health reciprocal effects at time t-1 and t (n=24312)

