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# Contribution of the physical environment to socioeconomic gradients in walking in the Whitehall II study



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## ABSTRACT

Socioeconomic gradients in walking are well documented but the underlying reasons remain unclear. We examined the contribution of objective measures of the physical environment at residence to socioeconomic gradients in walking in 3363 participants (50–74 years) from the Whitehall II study (2002–2004). Individual-level socioeconomic position was measured as most recent employment grade. The contribution of multiple measures of the physical environment to socioeconomic position gradients in self-reported log transformed minutes walking/week was examined by linear regression. Objective measures of the physical environment contributed only to a small extent to socioeconomic gradients in walking in middle-aged and older adults living in Greater London, UK. Of these, only the number of killed and seriously injured road traffic casualties per km of road was predictive of walking. More walking in areas with high rates of road traffic casualties per km of road may signal an effect not of injury risk but of more central locations with multiple destinations within short distances ('compact neighbourhoods'). This has potential implications for urban planning to promote physical activity.

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## 1. Introduction

Walking is the most popular, accessible, and sustainable form of physical activity (Lee and Buchner, 2008). Its benefits for health have been well documented (World Health Organization, 2010). But it has been in decline in many countries. In Great Britain the average distance walked per person per year for transport purposes fell from 255 miles in 1975/76 to 187 miles in 2011 (Department for Transport, 2012). Reversing this trend and helping to increase walking as part of daily routine, could make an important contribution to overall physical activity levels and help reduce the risk of several non-communicable diseases (NCDs) (Lee and Buchner, 2008; World Health Organization, 2010) and the associated costs to the National Health Services (Jarrett et al., 2012). Identifying factors that increase regular walking and improve the walkability of neighbourhoods, especially among middle- and older-aged adults living in urban settings, is vital to addressing healthy aging (Kamphuis et al., 2009; Li et al., 2008).

This is especially true for those from lower socio-economic position (SEP) who are generally observed to have lower levels of overall physical activity than those from higher SEP, irrespective of the SEP indicator used (Ball et al., 2007; Chief Medical Officers of England, Scotland, Wales, and Northern Ireland, 2011; Hillsdon et al., 2008). These patterns are consistent with socioeconomic gradients in many health outcomes and represent a key pathway through which SEP affects health (Ball et al., 2007). However, the socioeconomic gradient in walking is less clear (Cerin et al., 2009).

There is increasing evidence that neighbourhood environments may affect, at least in part, individual's physical activity and walking behaviours. Several environmental measures, both objective and perceived, have been identified as important environmental correlates of walking in adults. However, most studies in this area have been carried out in the US and Australia (Bauman and Bull, 2007; Jones et al., 2007; Ogilvie et al., 2008) and the physical environment as well as walking patterns in Europe differ considerably (Bassett et al., 2008; Foster et al., 2009; Jones et al., 2007; Macintyre, 2007; Spittaels et al., 2009). In England, research on the environmental determinants of walking in adults is expanding (Dalton et al., 2013; Foster et al., 2009, 2004; Mytton et al., 2012; Panter et al., 2013; Panter and Jones, 2008; Poortinga, 2006). These studies build up the evidence base on the links between the physical environment and walking. However, the degree to which characteristics of the physical environment

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explain socio-economic variations in walking remains unclear. Studies elsewhere have used social-ecological models to identify personal, physical and social environmental characteristics as potential explanatory factors (Annear et al., 2009; Ball et al., 2007; Cerin et al., 2009; Kamphuis et al., 2009; Ogilvie et al., 2008; Turrell et al., 2013). Social-ecological models of behaviour suggest that human behaviour is influenced by the interaction between the individual and the social and physical environment (Cerin et al., 2009; Giles-Corti and Donovan, 2002). The analysis presented in this paper tries to help fill in this gap by focusing on the physical environment using objective measures around the place of residence.

Our aim was to investigate the degree to which such physical environment variables could explain individual-level socioeconomic gradients in total minutes walking per week in middle-aged and older adults living in London, UK.

## 2. Methods

### 2.1. Study population and design

We used data from the Whitehall II study, an occupational cohort of 10,308 London civil servants first recruited to the Whitehall study in 1985–1988 (Marmot and Brunner, 2005). Of these, 6914 (67.1%) participated in phase 7 in 2002–2004 and 3654 had their postcode within the M25 motorway. We excluded 45 participants, whose postcodes were not classified as residential using the Office for National Statistics Postcode Directory and 246 participants that had missing or invalid data on walking ( $n=221$ ), individual-level SEP ( $n=22$ ) and environmental factors ( $n=3$ ) leaving a total of 3363 participants. Ethical approval was provided by the London School of Hygiene and Tropical Medicine ethics committee (#5410).

### 2.2. Walking data

Participants completed a modified version of the previously validated Minnesota leisure-time physical activity questionnaire (Taylor et al., 1978) on their activities at work and in their free time. Self reported measures of walking were based on the following question: on average, for how many minutes did you walk outside your home/workplace on each weekday and each weekend day in the past week. Total minutes per week were calculated by adding the daily sub-totals.

### 2.3. Socioeconomic position and covariates

Data on SEP were available at the individual and area-level. Individual-level data included current/most recent employment grade at the civil service, classified into six groups: clerical/support (lowest), executive, higher and senior executive officer, and unified grade (UG) 7 and UG 1–6 (highest), total household income, and educational attainment (measured as the highest level of education achieved). Area-level data, available at the lower layer super output area (LSOA), included the income score extracted from the income domain of the Index of Multiple Deprivation 2004 (Noble et al., 2004). LSOAs are administrative boundaries with a minimum population of 1000 residents and 400 households and a mean population of 1500 based on 2001 Census population figures (Noble et al., 2004). We selected employment grade as the focus of our analysis as this variable exhibited the most consistent and largest gradient in walking. We included the area-level SEP as a covariate in selected analyses.

Socio-demographic variables included sex, age, ethnicity (white vs other), and labour market status (remaining in civil service vs

working outside civil service, not working – retired, out of work and not working – longterm sick). These variables have been consistently found to be associated with walking and different types of physical activity and were treated as *a priori* confounders (The Chief Medical Officer, 2004). Health variables included body mass index (BMI; kg/m<sup>2</sup>), overall physical activity levels (light vs moderate and high activity), smoking status and number of comorbidities. We generated a composite indicator of multi-morbidity based on whether an individual had been diagnosed with diabetes or stroke, or was on cortico-steroids, ACE inhibitors, beta blockers or lipid lowering medications. We used this measure as a proxy measure of self-limiting health status.

### 2.4. Objective measures of the physical environment

Measures of the physical environment were generated using ArcGIS 10 (ESRI, 2010) at two spatial scales: (i) the LSOA and (ii) areas within 800 m of the centroid of the postcode of residence (there are approx. 14 households/UK residential postcode). We used Euclidean distances that represent an area within approximately a 10 min walk from home and is comparable to that used in other studies (Coombes et al., 2010; Dalton et al., 2013). A total of 40 environmental variables were examined in the following nine attribute categories: crime, proximity to services, green space, road/traffic density, land use, population density, road traffic injuries (RTIs), air pollution, and public transport provision. See Table 1 for definitions and data sources.

### 2.5. Statistical methods

We used regression modelling to estimate the relationship between individual-level SEP and walking and the influence of the physical environment. Values for total minutes walking were positively skewed and were log transformed. For ease of interpretation, regression coefficients ( $\beta$ ) were converted into per cent increase in average minutes walking using the formula  $[\exp(\beta) - 1] \times 100$ . Associations for environmental variables are presented as the per cent change in walking minutes per week for an increase from the 5th to the 95th centile of the explanatory variable.

To simplify analysis given highly correlated variables, we included in the regression models a single variable per attribute category shown in Table 1. To select these variables we used the 'all subsets' approach implemented in the Furnival–Wilson leaps-and-bounds algorithm, which uses five information criteria for selection: the smallest value of Akaike Information Criterion (AIC), corrected AIC (AIC<sub>c</sub>), and the Bayesian Information Criterion; the largest value of  $R^2_{Adj}$ ; and a value of Mallows's  $C_p$  that is close to the number of predictors in the models +1 or the smallest among the other Mallows's  $C_p$  values (Lindsey and Sheather, 2010). The SEP variables and *a priori* confounders were fixed throughout the process.

The associations between walking and individual-level SEP were examined using various models of co-variate adjustment, broadly using the theoretical frameworks and approaches used in previous studies (Giles-Corti and Donovan, 2002; Ogilvie et al., 2008). Results are presented without adjustment (Model 1); adjustment for *a priori* confounders only (Model 2); and adjustment for *a priori* confounders and the objectively measured physical environmental variables (one per attribute) entered simultaneously into the model (Model 3). Clustering of individuals within LSOAs was taken into account using robust standard errors.

Sensitivity analyses were performed to assess the robustness of the models. These were based on adjusting for the effect of health factors (BMI, co-morbidities and smoking), the exclusion of long-term ill (time spent walking independent of the physical environment due to physical impairment), the use of alternative individual-level SEP indicators (income and education), *a priori*

**Table 1**  
Data sources and definitions of the local (neighbourhood) environment using objective measures of the physical environment.

| Attribute  | Definitions   | Year (Source)  |
|--|---|--|
| <b>LSOA-level variables</b>  |   |  |
| Crime (1)  | Crime score   | 2002–2003 (IMD 2004 NS-ONS) (Noble et al., 2004)   |
| Proximity to services (2)  | Population weighted average road distance (km) to a food store<br>Population weighted average road distance (km) to a post office   |  |
| Green space (7)  | Area of public green space and area of domestic gardens (expressed in 1000 m <sup>2</sup> )<br>Percentages of public green space and public green space per 1000 population<br>Provision of public green space per capita (m <sup>2</sup> /person)<br>Percentages of domestic gardens and domestic gardens per 1000 population  | 2005 (GLUDS NS-ONS) (Department for Communities and Local Government, 2007)                      |
| Road/traffic density (3)   | Area allocated to transport (expressed in 1000 m <sup>2</sup> of roads, paths and rail)<br>Percentages of area allocated to transport (roads, paths and rail) and area allocated to roads   |  |
| Land use (4)   | Herfindahl–Hirschmann Index (HHI) <sup>a</sup><br>$HHI = \sum(P_i 100)^2$ , where $P$ is the proportion of each land type and $i$ is the land type<br>Spatial entropy score (SENS) <sup>b</sup><br>$-\sum(P_i \ln P_i) / \ln N$ , where $P$ is the proportion of each land type, $i$ is the land type and $N$ is the number of land types<br>Percentages of non-residential buildings and residential buildings |  |
| Population density (2)   | Crude (per km <sup>2</sup> ) and smoothed (per km <sup>2</sup> ) (based on 10 km buffer)  | 2001 (NS-ONS) (Office for National Statistics, 2001)   |
| <b>Postcode-level variables (within an area buffer of 800 m unless otherwise stated)</b> |   |  |
| Road traffic injuries (RTIs) (8)   | Number of all RTIs and RTIs involving pedestrians and/or cyclists only<br>Number of KSI and KSI involving pedestrians and/or cyclists only<br>RTIs per km of road and RTIs involving pedestrians and/or cyclists only per km of road<br>KSI per km of road and KSI involving pedestrians and/or cyclists only per km of road  | 2003 (Road accident data, DfT) (Department for Transport, Road Accident Statistics Branch, 2009) |
| Air pollution <sup>c</sup> (3)   | Annual average NO <sub>2</sub> (ppb), Annual average NO <sub>x</sub> (ppb) and Annual average PM <sub>10</sub> (µg per m <sup>3</sup> )   | 2003 (MRC-HPA, KCL) (Kelly et al., 2011)   |
| Access to public transport (APT) (4)   | Number of bus and coaches stops and stations<br>Number of bus and coaches stops and stations per km of road<br>Number of bus, coaches, train and metro stops and stations<br>Number of bus, coaches, train and metro stops and stations per km of road  | 2008 (NaPTAN, DfT) <sup>d</sup> (Department for Transport, 2013)                                 |
| Road/traffic density (6)   | Length of a-roads (m), length of local roads (m) and length of pedestrianised street (m)<br>Length of local roads as a proportion of all roads (%) and a-roads as a proportion of all roads (%)<br>Total length of road network (a-road, b-road, primary road, minor road, motorway, local street, pedestrianised street, private road with public access and road tunnel) (m)                                  | 2010 (Ordnance Survey OpenData) (Ordnance Survey, 2013)  |

Number of environmental variables per attribute category in parentheses.

DfT: Department for Transport; GLUDS: Generalised Land Use Database Statistics for England 2005; HPA: Health Protection Agency; IMD: Index of Multiple Deprivation; KSI: Killed and Seriously Injured; KSL: King's College London; LSOA: Lower Layer Super Output Area; MRC: Medical Research Council; NAEI: National Atmospheric Emissions Inventory; NaPTAN: National Public Transport Access Nodes; NO<sub>2</sub>: Nitrogen dioxide; NO<sub>x</sub>: Nitrogen oxides; NS-ONS: Neighbourhood Statistics – Office for National Statistics; NSPD: National Statistics Postcode Directory; OS: Ordnance Survey; PM: Particulate matter.

<sup>a</sup> Higher values represent less diversity in terms of land use.

<sup>b</sup> Measure of evenness and ranges from 0 to 1 with higher values representing a more heterogeneous and evenly mixed land-use per LSOA.

<sup>c</sup> 20 m<sup>2</sup> grid resolution.

<sup>d</sup> Restricted to bus, coaches, train and metro stops and stations that were active and created before 2008.

selected environmental variables based on previous studies in the UK, and analyses stratifying walking during weekdays or weekend days. All analyses were performed in Stata 12.1.

### 3. Results

Study participants were, on average, 61 years of age, and the majority remained working in or outside civil service (52.7%). Participants walked a total of 6 h/week, with slightly more walking on weekend than week days (50 vs 45 min/day). White males with higher SEP were over-represented in this sample. Compared to participants living within the M25 but not included in the analysis, this group was younger (62.7 vs 61.0), was composed of more males (48.5% vs 65.3%) and had fewer participants from the lower SEP group (33.6% vs 14.6%), retired (53.6% vs 41.2%) and coming from other ethnic background (23.4% vs 13.1%) (all  $p < 0.001$ , data not shown).

Characteristics of participants by SEP are summarised in Table 2. Compared to the high SEP group, lower SEP participants were older and were less likely to be male, white ethnicity, or working in or outside civil service. This group had a higher BMI, higher prevalence of co-morbidities and current smokers. In terms of physical activity, lower SEP participants, classified as clerical and support staff, spent, on average, more time on walking than

higher SEP participants (346 vs 310 min/week) with this type of activity comprising a greater proportion of total moderate activities. However, lower SEP participants reported spending more hours being sedentary or doing light activities, and less time doing moderate/vigorous activities.

With respect to the physical environment, people from lower SEP lived in areas that had higher road and population density, air pollution, number of killed and seriously injured per km (KSI/km) of road, and number of public transport stops and stations (bus, coaches, train and metro). They also lived in areas that were more mixed in terms of land use with a higher density of non-residential buildings, lower density of public green space and a lower average road distance to a super market or convenience store.

There was no clear evidence of association between SEP and walking in the unadjusted model (Table 3, Model 1) but when adjusted for *a priori* confounders there was evidence that people from lower SEP groups walked more minutes/week than those from higher SEP groups (Table 3, Model 2). Similarly, walking patterns remained the same irrespective of the SEP indicator used (data not shown). Non-white ethnic background, working outside civil service and being long-term sick (compared to remaining in civil service) were associated with a significant decrease in walking.

When investigating the association of environmental variables with walking, we observed that each of the following environmental

**Table 2**  
Characteristics of participants of the Whitehall II study and their residential environment according to socio-economic position (SEP) (n=3363).

|   | High SEP      |               | Medium SEP    |               | Low SEP       |               |
|---|---------------|---------------|---------------|---------------|---------------|---------------|
|   | UG1–UG6       | UG7           | SEO           | HEO           | EO            | C/S           |
| <b>Socio-demographic variables</b>  |               |               |               |               |               |               |
| Age in years (mean, SD)   | 61 (5.9)      | 60 (5.8)      | 60 (6.1)      | 60 (6.0)      | 62 (6.1)      | 63 (6.1)      |
| Male (%)  | 81.0          | 81.8          | 80.6          | 66.7          | 45.7          | 26.4          |
| White ethnicity (%)   | 97.8          | 96.8          | 92.0          | 87.6          | 72.7          | 67.9          |
| Labour Market Status (%)  |               |               |               |               |               |               |
| Remaining in CS (n=1110)  | 32.4          | 35.8          | 34.7          | 34.7          | 29.1          | 31.3          |
| Working outside CS (n=661)  | 29.0          | 22.1          | 20.0          | 18.8          | 14.3          | 8.5           |
| Not working – retired (n=1404)  | 34.5          | 38.2          | 40.1          | 41.1          | 49.7          | 51.0          |
| Out of work (n=131)   | 3.8           | 2.9           | 3.6           | 4.0           | 4.2           | 5.1           |
| Not working – LT sick (n=57)  | 0.4           | 1.0           | 1.6           | 1.3           | 2.7           | 4.1           |
| <b>Health variables</b>   |               |               |               |               |               |               |
| BMI (n=3195; kg/m <sup>2</sup> ) (mean, SD)   | 26.0 (3.95)   | 26.5 (4.49)   | 26.6 (4.49)   | 26.7 (4.46)   | 26.6 (4.83)   | 27.9 (4.88)   |
| No co-morbidity (%)   | 70.9          | 71            | 69.5          | 68.4          | 64.1          | 61.8          |
| Never smoker or Ex-smoker (n=3347) (%)  | 93.9          | 93.7          | 90.6          | 87.3          | 89.2          | 87.4          |
| <b>Physical activity variables (mean, SD)</b>   |               |               |               |               |               |               |
| Total minutes of walking per week in past week  | 310 (231.3)   | 296 (240.4)   | 326 (231.8)   | 321 (208.1)   | 329 (281.6)   | 346 (288.0)   |
| Percentage of total moderate METs attributed to walking (n=3321)                                      | 66.9          | 65.9          | 68.7          | 67.4          | 74.3          | 80.2          |
| Total hours per week being sedentary or doing light intensity physical activity (n=3335) <sup>a</sup> | 5.5 (4.66)    | 5.7 (4.98)    | 6.6 (5.30)    | 7.3 (5.45)    | 8.3 (5.96)    | 7.9 (5.41)    |
| Total hours per week doing moderate intensity physical activity (n=3331) <sup>b</sup>                 | 29.1 (18.18)  | 28.3 (19.46)  | 29.4 (18.01)  | 29.5 (17.66)  | 26.9 (19.63)  | 26.0 (19.61)  |
| Total hours per week doing vigorous intensity physical activity (n=3335) <sup>c</sup>                 | 5.0 (8.08)    | 4.3 (7.88)    | 4.1 (7.01)    | 4.2 (7.78)    | 2.8 (6.05)    | 1.4 (3.75)    |
| Average minutes walked on week days in last week (n=3340)   | 43 (35.0)     | 42 (39.6)     | 44 (32.8)     | 45 (31.4)     | 47 (43.2)     | 50 (45.3)     |
| Average minutes walked on weekend days in last week (n=3257)  | 49 (44.8)     | 45 (39.9)     | 54 (53.3)     | 49 (42.0)     | 51 (50.3)     | 54 (50.9)     |
| <b>LSOA-level environmental variables (mean, SD)</b>  |               |               |               |               |               |               |
| Crime score   | 0.0 (0.76)    | −0.1 (0.74)   | −0.1 (0.72)   | 0.0 (0.73)    | 0.2 (0.71)    | 0.2 (0.74)    |
| Density of non-residential buildings (%)  | 4.3 (5.89)    | 3.9 (5.65)    | 3.9 (4.84)    | 4.1 (4.65)    | 4.6 (5.23)    | 6.1 (7.08)    |
| Herfindahl–Hirschmann Index (HHI)   | 4316 (1313.0) | 4367 (1297.2) | 4301 (1275.8) | 4220 (1240.5) | 4079 (1200.1) | 3900 (1244.3) |
| Density of road network (%)   | 15.2 (7.24)   | 14.5 (6.43)   | 14.9 (6.10)   | 15.0 (6.01)   | 15.8 (6.13)   | 17.3 (6.88)   |
| Density of public green space (%)   | 25.0 (23.70)  | 26.1 (23.75)  | 23.7 (21.90)  | 23.5 (21.35)  | 23.7 (21.29)  | 21.0 (19.44)  |
| Population weighted average road distance to a food store (km)  | 1.0 (0.68)    | 1.0 (0.71)    | 1.0 (0.63)    | 1.0 (0.54)    | 1.0 (0.51)    | 0.9 (0.57)    |
| Population density per km <sup>2</sup>  | 5945 (4753.2) | 5500 (4362.7) | 5839 (4122.4) | 6062 (3988.7) | 6627 (4711.2) | 7856 (5515.1) |
| <b>Postcode-level environmental variables<sup>d</sup> (mean, SD)</b>                                  |               |               |               |               |               |               |
| Annual average NO <sub>2</sub> concentration (ppb) (20 m <sup>2</sup> grid resolution)                | 40.0 (6.69)   | 38.8 (6.23)   | 38.5 (5.33)   | 39.1 (5.49)   | 39.9 (5.68)   | 41.3 (6.59)   |
| KSI/km of road  | 0.25 (0.201)  | 0.23 (0.183)  | 0.23 (0.175)  | 0.24 (0.179)  | 0.26 (0.191)  | 0.32 (0.221)  |
| Number of KSI   | 6.7 (6.98)    | 6.1 (6.56)    | 6.0 (6.04)    | 6.3 (6.02)    | 7.0 (6.54)    | 9.3 (8.67)    |
| APT   | 35 (18.7)     | 32 (17.3)     | 32 (16.6)     | 33 (14.5)     | 34 (16.5)     | 39 (20.4)     |
| Length of a-road (m)  | 1928 (1757.5) | 1873 (1686.4) | 1810 (1859.1) | 1843 (1653.0) | 2021 (1834.1) | 2320 (2174.3) |

APT: Access to Public Transport (Total number of bus, coaches, train and metro stops and stations); BMI: Body Mass Index; CS: Civil Service; C/S: Clerical/Support; EO: Executive Officer; HEO: Higher Executive Officer; KSI: Killed and Seriously Injured; LT: Long-term; MET: Metabolic Equivalent Task; NO<sub>2</sub>: Nitrogen dioxide; ppb: part per billion; SD: Standard Deviation; SEO: Senior Executive Office; SEP: Socio-Economic Position; UG: Unified Grade.

<sup>a</sup> < 3.0 METs (< 3.5 Kcal/min).

<sup>b</sup> 3.0–6.0 METs (3.5–7 Kcal/min).

<sup>c</sup> > 6.0 METs (> 7.0 Kcal/min).

<sup>d</sup> within 800 m area buffer, unless otherwise stated.

**Table 3**  
Per cent change and 95% confidence interval in total minutes walked associated with individual-level SEP with and without adjustment for confounders and attributes of the physical environment (n=3363).

|                             | Model 1 |              | Model 2 |                | Model 3 |                |
|-----------------------------|---------|--------------|---------|----------------|---------|----------------|
| <b>Main exposure</b>        |         |              |         |                |         |                |
| UG1–UG6 (reference)         | –       | –            | –       | –              | –       | –              |
| UG7                         | –7.0    | –13.9 to 0.5 | –6.8    | –13.7 to 0.7   | –6.4    | –13.4 to 1.2   |
| Senior Executive Officer    | 1.9     | –6.4 to 10.9 | 3.9     | –4.5 to 13.0   | 4.1     | –4.4 to 13.3   |
| Higher Executive Officer    | 1.4     | –6.4 to 9.9  | 5.2     | –2.9 to 13.9   | 5.5     | –2.6 to 14.4   |
| Executive Officer           | –0.4    | –8.2 to 8.0  | 9.9     | 0.7 to 19.9    | 9.8     | 0.6 to 19.9    |
| Clerical/Support            | 1.9     | –6.9 to 11.6 | 15.1    | 3.9 to 27.5    | 13.0    | 1.9 to 25.2    |
| P for linear trend          |         | 0.280        |         | 0.0003         |         | 0.0009         |
| <b>A priori confounders</b> |         |              |         |                |         |                |
| Sex (Female)                |         |              | –3.4    | –9.2 to 2.8    | –4.5    | –10.3 to 1.6   |
| Age in years                |         |              | 0.1     | –0.6 to 0.8    | 0.1     | –0.5 to 0.8    |
| Ethnicity (Other)           |         |              | –27.7   | –33.5 to –21.3 | –28.0   | –33.8 to –21.7 |
| Labour Market Status        |         |              |         |                |         |                |
| Remaining in CS (reference) |         |              |         |                |         |                |
| Working outside CS          |         |              | –10.1   | –16.8 to –2.8  | –10.6   | –17.3 to –3.3  |

Table 3 (continued)

|   | Model 1 | Model 2        | Model 3        |
|---|---------|----------------|----------------|
| Not working – retired   |         | –6.0           | –6.2           |
| Out of work   |         | –14.1 to 2.8   | –14.2 to 2.5   |
| Not working – LT sick   |         | 1.2            | 0.9            |
|   |         | –12.6 to 17.2  | –12.6 to 16.6  |
|   |         | –40.0          | –41.4          |
|   |         | –56.0 to –18.3 | –57.1 to –19.9 |
| <b>Environmental variables (5th–95th centile)</b>                             |         |                |                |
| <i>LSOA-level</i>   |         |                |                |
| Crime score (–1.09 to 1.33)   |         |                | 0.3            |
| Density of non-residential buildings (%) (0.3–15.8)                           |         |                | –9.1 to 10.6   |
| Density of road network (%) (4.2–26.3)  |         |                | 3.7            |
| Density of public green space (%) (1.5–73.4)                                  |         |                | –5.2 to 13.6   |
| Pop weighted road km to foodstore (0.33–1.91)                                 |         |                | 9.7            |
| Population density per km <sup>2</sup> (715–14,815)                           |         |                | –8.0 to 30.9   |
|   |         |                | 8.6            |
|   |         |                | –4.9 to 24.1   |
|   |         |                | –0.8           |
|   |         |                | –8.1 to 7.0    |
|   |         |                | 3.7            |
|   |         |                | –7.8 to 16.6   |
| <i>Postcode-level</i>   |         |                |                |
| Annual average NO <sub>2</sub> concentration (ppb) <sup>a</sup> (30.55–50.38) |         |                | –11.7          |
| KSI/km of road (800 m area buffer) (0.00–0.64)                                |         |                | –24.9 to 3.8   |
| APT (800 m area buffer) (11–64)   |         |                | 17.5           |
|   |         |                | 2.8 to 34.4    |
|   |         |                | 3.3            |
|   |         |                | –9.3 to 17.6   |

Model 1: Unadjusted; Model 2: Adjusted for *a priori* confounders; Model 3: As Model 2 and adjusted for environmental variables.

APT: Access to Public Transport (Total number of bus, coaches, train and metro stops and stations); CS: Civil Service; KSI: Killed and Seriously Injured; LT: Long-term; NO<sub>2</sub>: Nitrogen dioxide; ppb: part per billion; SEP: Socio-Economic Position; UG: Unified Grade.

<sup>a</sup> 20 m<sup>2</sup> grid resolution.

variables (fitted one at a time in addition to the *a priori* non-environmental confounders) was associated with increases in walking time: density of non-residential buildings, density of road network, population density, length of a-roads, number of public transport stops and stations, number of KSI and number of KSI/km of road. The greatest contribution to SEP gradients in walking was observed for KSI/km of road where the gradient in the lower SEP category was attenuated from 15.1% to 13.9% (data not shown).

Inclusion of all environmental variables in addition to the non-environmental *a priori* confounders led to only a small reduction in the SEP gradient in total minutes of walking per week (compared to a model with non-environmental *a priori* confounders alone), suggesting only limited influence of the physical environment on walking behaviour. Only the number of KSI/km of road within 800 m of the postcode of residence was significantly associated with walking (Table 3, Model 3). Area-level SEP was not independently associated with walking and inclusion in the model did not change individual-level SEP gradients in walking (data not shown).

Our findings were relatively insensitive to the type of SEP indicator used (data not shown). In models with additional adjustment for health factors (with and without excluding long-term ill participants), population density and KSI/km of road were both positively associated with total minutes per week of walking. Inclusion of attributes of the physical environment had some effect on the estimates of the SEP gradient in walking in models confined to week days, but not in models confined to weekend days (Web appendix Table S1, environmental variables fitted simultaneously in model).

#### 4. Discussion

This study provides new insights into the determinants of SEP gradients in walking and suggests that objective measures of the physical environment have only a very limited influence on such gradients among middle aged and older adults living in the Greater London area.

Socioeconomic position is known to be one of the strongest and most consistent predictors of walking and physical activity. Our aim was to investigate whether these observed SEP gradients in walking can be explained by objective measures of the physical environment. In our main analyses, only one of the environmental

variables analysed showed clear evidence of association with the total minutes of walking per week, namely the number of KSI/km of road within 800 m of residence. Why this variable should show a positive association with walking is not clear, but we speculate that it is an effect not of perceptions of injury risk but of the correlation between high KSI/km of road and city centre/local centre locations where there are multiple destinations within short distances. If there is a direct effect of a high casualty rate it seems more probable that it would dissuade walking than encourage it because of its impact on perceptions of safety (Cochrane et al., 2009). However, the KSI/km of road may be a surrogate of walkable access to local shops, services and facilities (Cochrane et al., 2009; Priyantha Wedagama et al., 2006), as more casualties (and hence high KSI/km) can be expected on roads where both pedestrian and vehicle densities are high (Schuurman et al., 2009). This is borne out by Fig. WA1, which shows that areas and roads with high number of KSI are nearer to central London or local ('London village') centres.

This interpretation is reinforced by the results for environmental variables entered into the model one at a time that indicated (in models adjusted for *a priori* non-environmental confounders) positive associations with levels of walking for higher road and population density, traffic-related air pollution, number of public transport stops and stations, higher density of non-residential buildings, lower density of public green space and a lower average road distance to a super market or convenience store. These patterns suggest that they are surrogates for some other feature of the local environment, and a correlate common to all is central location (Turrell et al., 2013). This may be an important observation for urban planning to promote physical activity, as it reinforces the importance of having multiple destinations within easy walking distance.

The results of our study were robust across a range of sensitivity analyses, including the use of alternative individual-level SEP indicators. Area-level SEP did not make an independent contribution to individual-level SEP gradients in walking, which may suggest that residents of high as well as low area-level SEP may equally benefit from highly-walkable environments (Van Dyck et al., 2010). The impact of the physical environment on SEP gradients in walking was greater on week days than weekend days, suggesting that people may respond to environmental features closer to their residence more strongly than to more distant environmental qualities (Giles-Corti and Donovan, 2002) on week days and the propensity to walk

may be more strongly influenced by attributes of the physical environment outside people's local environments (Ogilvie et al., 2008) on weekend days.

Our results are also broadly consistent with previous studies that have shown that personal characteristics and attributes of the physical and social environment contribute to SEP gradients in walking and physical activity (Ball et al., 2007; Cerin et al., 2009; Giles-Corti and Donovan, 2002; Hillsdon et al., 2008; Kamphuis et al., 2009; Ogilvie et al., 2008). Two studies in Melbourne and Perth, Australia, showed that objective measures of the physical environment contributed to a small extent in explaining SEP gradients in walking indicating that personal characteristics may be equally or more important (Ball et al., 2007; Giles-Corti and Donovan, 2002). Physical environment variables identified as explaining SEP gradients in walking included street connectivity, coastal proximity and access and use of recreational facilities (Ball et al., 2007; Giles-Corti and Donovan, 2002). Our findings on the lack of an association between walking, green space and area levels of crime are also consistent with a previous study in England (Foster et al., 2009).

In our study we only found limited evidence of an association between the physical environment and walking despite the range of environmental variables used. There are a number of reasons for this. First there might be other yet unknown objectively measured environmental factors that may be stronger predictors of walking. Second, the limited environmental heterogeneity in the study area may contribute to the lack of association between the physical environment and walking. Studies carried out at the national level or in areas with contrasting environments (e.g. urban vs rural) may be able to identify which attributes of the physical environment are more important for walking (and other health behaviours). Third, there may be lack of specificity in the physical environment variables used in this study and these variables may be stronger predictors of other health or physical activity behaviours but not walking (Foster et al., 2009; Giles-Corti et al., 2005b; Ogilvie et al., 2008). These issues call for an improvement in the tools used to assess physical activity and the physical environment and the studies looking at quantifying the impact of the physical and built environment on health behaviours and outcomes. Finally, attributes of one's social and material environment not investigated here, such as social capital, social connectivity and interaction, and access to a motor vehicle, are predictive of physical activity and may be more important factors in explaining SEP gradients in walking than the physical environment (Giles-Corti and Donovan, 2002; Lopez and Hynes, 2006; Turrell et al., 2013). Furthermore, perceptions of the physical environment may more directly shape walking behaviour compared to objective measures (Ball et al., 2008) particularly in older people (Annear et al., 2009). However, individuals living in the same environment may perceive this in different ways (King et al., 2005) and objective measures more effectively quantify the impact of the physical environment on health behaviours and facilitate the translation of study results directly into intervention strategies and policies (Cummins et al., 2007; Lin and Moudon, 2010). Previous studies in England looking at how perceptions of the physical environment might influence walking are limited and inconclusive. Foster et al. (2004) found no association between perceived measures of traffic density, perceived access to leisure centres or neighbourhood aesthetics and walking. In the same study, they reported gender differences between perceived safety from crime or park/open space convenience and walking (men but not women were more likely to walk if they had a park or open space within walking distance, whereas women but not men were more likely to walk if they felt safe during the day). Although we did not investigate differences by different socio-demographic groups here, it is likely that different aspects of the physical environment may affect these groups in

different ways (Foster et al., 2004; Macintyre et al., 2002; Panter and Jones, 2008) and this could be the subject of future research. Two studies failed to find any association between presence of social nuisances (vandalism/graffiti and deliberate damage to property) or distance to park and walking (Panter and Jones, 2008; Poortinga, 2006). Perceived measures of access to services and local shops have been consistently found to be related to walking (Panter and Jones, 2008; Poortinga, 2006), which provide further support to our finding that the KSI/km of road may act as a surrogate of accessibility to services in urban areas. Finally, people reporting convenience of public transport were more likely to uptake of walking (Panter et al., 2013).

Study limitations should be considered whilst interpreting our results. These include the cross-sectional design and the reliance on self-reported measures of walking, although a recent study found that self-reported physical activity at phase 5 (1995–1996) was predictive of objectively measured physical activity at phase 9 (2008–2009) in a sub-sample of the Whitehall II participants (Hamer et al., 2012). Walking, irrespective of purpose, has important health benefits (World Health Organization, 2010), however different types of walking (transport and recreational) may have different demographic correlates (Kruger et al., 2008) and may be differentially affected by the physical environment (Ball et al., 2007; Giles-Corti et al., 2005b; Li et al., 2008). We only looked at the residential environment but much of the walking may take place as part of a journey to work or at work. Attributes of the physical environment on the way to work (or other destinations) or at work may be stronger predictors of walking or the propensity to walk (Chaix et al., 2013). External validity may be limited since our study population is not representative of the general population in England and civil service employment grades only included non-manual occupation not covering the full range of adult SEP. Uncontrolled or residual confounding can not be ruled out. For example, we were not able to adjust for car use and car ownership, which might explain some of the SEP gradient in walking, although car ownership may itself be a consequence of choice in physical activity rather than an independent effect of it. This is relevant to the issue of direction of causation which is relevant to a number of associations in this analysis (e.g. an inverse relationship between BMI and walking may be a cause or a consequence of physical (in) activity). Finally, the exclusion of low SEP participants with missing values for walking may result in selection bias. If these participants were less likely to have walked, then the individual-level SEP gradients reported here are likely to be an overestimate of the true magnitude of SEP gradients in walking in this population (Rothman et al., 2008).

A number of methodological issues should also be discussed. A predefined use of an area, either the use of administrative or statistical boundaries or area buffers may not reflect how people perceive their local environment, particularly in relation to walking (Saelens et al., 2003; Smith et al., 2010), and may not be appropriate scales to use for different types of human activities (Macintyre et al., 2002). We also made a number of assumptions when examining the relationship between access, availability and provision of services and resources (e.g. public transport, services and green space) and real use. We were unable to directly correlate these as we did not have information on the type, quality and use of these services and resources. These information are essential and should be included in future studies (Foster et al., 2009; Giles-Corti et al., 2005a; Mitchell and Popham, 2008). Although residential self selection bias is an important consideration, results from a recent longitudinal study found that self selection was not related to changes in walking (Giles-Corti et al., 2013). Among the different ways in addressing this (Cao et al., 2009), it has been suggested that in lieu of information on self-selection, conditioning models on SEP and socio-demographic

characteristics is likely to address, at least partially, confounding that results from residential self-selection (Bentley et al., 2010). Alternative measures of traffic safety than what we used have been proposed to be more appropriate measures of an individual's risk to RTAs, such as a rate per population (Schuurman et al., 2009) or distance travelled (Sebert Kuhlmann et al., 2009).

This study has important strengths. The Whitehall II study is a well documented cohort study, with detailed data on individual-level SEP. We used a range of secondary datasets collected by various Governmental Departments to generate objective environmental measures. Although these datasets had a high degree of completeness we were unable to confirm their quality and validity. Except public transport stops and station and the road network, all other data were collected at approximately the same time as people were surveyed about their walking and our study is therefore unlikely to suffer from misclassification of environmental exposure due to changes in the built environment over time. This said, studies should employ neighbourhood audits, where feasible, to confirm the validity of secondary data sources. We also tested the robustness of our results in sensitivity analyses using different SEP indicators. Finally, focusing on this age group has important policy implications due to the aging population and the effect that this may have on healthcare expenditure, allocation and utilisation. Understanding which attributes of the physical environment can influence physical activity behaviour in this age group can help reduce the economic and social burden of NCDs and improve individual quality of life (Li et al., 2008).

In conclusion, we found that objective measures of the physical environment explain SEP gradients in walking to only limited degree, with the impact being greater in week days than weekend days. In recent years, promoting active travel (*i.e.* walking and cycling) and the need to provide a supportive environment have been the focus of policy agendas in relation to health, transport and climate change (British Medical Association, 2012; Chief Medical Officers of England, Scotland, Wales, and Northern Ireland, 2011; Haines et al., 2009; National Institute for Health and Clinical Excellence, 2008). The possible interpretation that walking is greater in central locations with shorter, more walkable, access to multiple destinations has evident implications for public health and urban planning policy given the objective to promote walking (and sustainability in travel) especially among middle aged and older adults. More objective measures of walking behaviour and perceptions of the environment should be included in future research.

### Contributorship statement

TP generated the environmental variables and CT had access to the Whitehall II data. TP takes responsibility for the integrity of the data and accuracy of the data analyses. TP wrote the first full draft of the manuscript. PW and CT made suggestions on the content and structure of the manuscript. All authors contributed to subsequent drafts and critical revision of the manuscript.

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### Appendix A. Supporting information

Supplementary data associated with this article can be found in the online version at <http://dx.doi.org/10.1016/j.healthplace.2014.02.011>.

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