# Land Use, Residential Density, and Walking: 

The Multi-Ethnic Study of Atherosclerosis
Daniel A. Rodríguez, PhD,
Department of City and Regional Planning, Gillings School of Global Public Health, University of North Carolina, Chapel Hill, North Carolina
Kelly R. Evenson, PhD,
Department of Epidemiology, Gillings School of Global Public Health, University of North Carolina, Chapel Hill, North Carolina
Ana V. Diez Roux, MD PhD, and
Department of Epidemiology, University of Michigan, Ann Arbor. Michigan
Shannon J. Brines, M Eng
School of Natural Resources and Environment, University of Michigan, Ann Arbor. Michigan


#### Abstract

Background-The neighborhood environment may play a role in encouraging sedentary patterns, especially for middle-aged and older adults.

Purpose-Associations between walking and neighborhood population density, retail availability, and land use distribution were examined using data from a cohort of adults aged 45 to 84 years old.

Methods—Data from a multi-ethnic sample of 5529 adult residents of Baltimore MD, Chicago IL, Forsyth County NC, Los Angeles CA, New York NY, and St. Paul MN, enrolled in the Multi-Ethnic Study of Atherosclerosis in 2000-2002 were linked to secondary land use and population data. Participant reports of access to destinations and stores and objective measures of the percentage of land area in parcels devoted to retail land uses, the population divided by land area in parcels, and the mixture of uses for areas within 200 m of each participant's residence were examined. Multinomial logistic regression was used to investigate associations of self-reported and objective neighborhood characteristics with walking. All analyses were conducted in 2008 and 2009.

Results—After adjustment for individual-level characteristics and neighborhood connectivity, higher density, greater land area devoted to retail uses, and self-reported measures of proximity of destinations and ease of walking to places were each related to walking. In models including all land use measures, population density was positively associated with walking to places and with walking for exercise for more than $90 \mathrm{~min} / \mathrm{wk}$ both relative to no walking. Availability of retail was associated with walking to places relative to not walking, having a more proportional mix of land uses was associated with walking for exercise for more than $90 \mathrm{~min} / \mathrm{wk}$, while self-reported ease of access to places was related to higher levels of exercise walking both relative to not walking.


[^0]Conclusions-Residential density and the presence of retail uses are related to various walking behaviors. Efforts to increase walking may benefit from attention to the intensity and type of land development.

## Introduction

By limiting opportunities for being physically active in everyday life, contemporary urban areas are believed to play a role in encouraging sedentary patterns and obesity. Relative to young adults, the role of the neighborhood environment as a barrier or support of active lifestyles may be more pronounced for middle-aged and older adults. ${ }^{1}$ In addition to physical activity benefits, for older adults a supportive neighborhood environment may also encourage independent engagement in community life. ${ }^{2}$ Despite its importance, there is a paucity of studies examining the relationship between the built environment and physical activity among older adults. ${ }^{3-6}$

Proximity to nonresidential land uses, specifically retail uses, has been linked to higher walking rates for utilitarian purposes in the general population. ${ }^{7-12}$ For older adults, convenient access to nonresidential destinations has yielded inconsistent findings, ${ }^{6}$ although recent studies using objective measures of the built environment have shown more consistent associations. ${ }^{3,13}$ Only King et $\mathrm{al}^{3}$ examined access to retail land uses for older women, and the analysis was limited to department stores, discount, and hardware stores. They found positive associations between accessibility to retail and higher physical activity.

Beyond the presence of specific land uses, others have argued that the proportion of land devoted to different uses within a given distance from a home location may also affect levels of physical activity. ${ }^{7,8,14}$ Areas with more proportional mixing of uses may be supportive of walking because of the availability and variety of destinations. Further, this diversity may be more important for populations with limited access to automobiles, like children and older adults. ${ }^{15}$ Thus, not only proximity to specific uses such as retail but also the relative intensity among uses within one's neighborhood, may contribute to explaining physical activity. For example, a neighborhood with $95 \%$ of its parcel area devoted to residential uses and $5 \%$ to retail has a different, less proportionate distribution of area among uses than a neighborhood with $30 \%$ of its parcel area devoted to residential uses, $30 \%$ to retail, and $40 \%$ to institutional uses. Identifying associations of physical activity with specific uses of land, such as retail, and the intensity at which land is developed provides planners with guidance to improve communities and future decision-making.

Relying on data from a large, multi-ethnic cohort of adults aged 45 to 84 years, associations between self-reported walking and neighborhood population density, retail access, and land use distribution, while controlling for other environmental and individual characteristics were examined. It was hypothesized that greater population density and improved access to retail land uses would be related to higher levels of walking for different purposes. Responding to calls for including objectively measured and perceptual environmental data simultaneously, 16-18 the study combines self-reported and objectively measured land use information. These analyses contribute to the understanding of the role that the mixing of particular land uses can play in supporting physical activity in middle-aged and older adults. Identifying the specific ways in which the mixing of land uses may affect physical activity has important implications for planning and public health policy.

## Methods

## Study Sample

The Multi-Ethnic Study of Atherosclerosis (MESA) is a longitudinal study of cardiovascular disease among adults between aged 45-84 years at 6 field sites in the U.S.: Baltimore MD, Chicago IL, Forsyth County NC, Los Angeles CA, New York NY, and St. Paul MN. ${ }^{19}$ There was no clinically overt cardiovascular disease at cohort incept. The baseline visit for MESA, on which these analyses are based, took place between July 2000 and September 2002. The study was approved by IRBs at each site and all participants gave written informed consent.

## Walking Outcomes

A detailed interviewer-administered, semiquantitative questionnaire adapted from the CrossCultural Activity Participation Study ${ }^{20,21}$ was used to collect data on all forms of physical activity, including leisure, household, work, and transportation activities at the baseline examination. The questionnaire was developed using extensive qualitative research ${ }^{22}$ and has been shown to have acceptable test-retest reliability and validity among a sample of women. ${ }^{23}$ For each type of activity queried, participants were asked (1) whether they did the activity during a typical week in the past month and (2) how many days per week and hours and minutes per day they did the activity.

For this study, the focus was on the types of physical activities related to walking, which are most likely to be associated with two key land characteristics: the type of land use and the intensity of residential development. The two walking behaviors examined were minutes per week in walking for transport (e.g., walking to get places such as to the bus, car, work, or store) defined as walking to places, and minutes per week walking for leisure (e.g., walking for exercise, pleasure, social reasons, walking during work breaks, walking the dog) defined as walking for exercise. Given unavoidable measurement error in reports of exact times of walking, the data were categorized rather than investigated as a continuous measure. Categories usually have better reliability than continuous measures and allow a parsimonious way to manage data skeweness. As a result, outcome variables were created by classifying each type of walking into three levels: no walking, walking time that is less than the median of nonzero data, and walking time greater or equal than median for nonzero data.

## Neighborhood Built Environment Characteristics

Neighborhood information was collected in part by the MESA Neighborhood Study, an ancillary study to MESA, which included the geocoding of participants' home address. All objective measures were derived using ArcGIS 9.2. Neighborhoods were person-specific, defined as the area covered by a circle of 200 m radius drawn around each person's home location.

Land use data were collected from municipal and regional governments in the six study sites. The data were dated between 2001 and 2005 depending on the site. An investigator classified the land use codes of each site into four mutually exclusive categories: retail (including commercial), residential, institutional, and office. For each parcel, whenever a retail use was present (regardless of other uses present in the building occupying the parcel), the parcel was coded as having a retail use. If the parcel had institutional uses (but no retail), it was coded as institutional use. If the parcel had industrial (but no retail or institutional), the parcel was coded as industrial use. Land uses in Baltimore County were categorized into only commercial and residential uses as their data lacked the institutional and office designations. A second investigator verified the classification and resolved disagreements. Appendixes A-F, available online at www.ajpm-online.net, detail the classification of land uses for each site.

Availability of retail in each neighborhood was calculated using the percentage of land area in parcels that contain retail uses. By focusing on the area in parcels, transportation features like roads and railroads, water bodies, and utilities are excluded from the calculations. One drawback of using parcel area is that it penalizes vertical development, for example by treating a parcel with a four-story building in the same way as a parcel with a one-story building. "Entropy" was calculated using the formula of Cervero and Kockelman ${ }^{24}$ to assess the similarity in the proportion of the area in parcels devoted to retail, residential, institutional, and office land uses. ${ }^{7,9,14,24-26}$ Entropy values range between 0 and 1 , with 1 representing equal proportion ( $25 \%$ ) among the four uses in the neighborhood and 0 representing the presence of a single dominant land use.

Population density (hundred of people per acre) was measured using population data from the U.S. Census at the block level and dividing them by the land area in parcels. When a block was not fully contained within a neighborhood, its population was assigned in direct proportion to the area of the block contained within the neighborhood, which assumes a uniform population density within each block. Road connectivity was measured as the proportion of the neighborhood (the 200 m -radius circle area around each person's home) that is covered by a network buffer. The ratio varies between 0 and 1 , with 0 meaning that none of the circle area can be reached through the road network, and 1 meaning that the entire circle can be reached through the street network, denoting highest connectivity.

Subjective measures of the neighborhood physical environment were obtained from a questionnaire administered to MESA participants that included items on ease of walking to places and having stores within walking distance. Responses were reported on a 1 to 5 scale in which $1=$ strongly agree and $5=$ strongly disagree, and are treated as continuous. These questions were part of an 11-item index shown to have high test-retest reliability (intraclass correlation coefficient, ICC: $0.88,95 \% \mathrm{CI}: 0.79-0.93) .{ }^{27}$ The questionnaire also included two questions on the availability of YMCAs/YWCAs and on the availability of free community centers and schools open to the public, both reported as a binary variable (yes or no). The two variables were merged into a single variable defined as the availability of institutional uses for physical activity, and coded as binary variable (yes if either present or no neither is present). These two questions were part of an 8 -item index with high test-retest reliability (ICC: 0.85, $95 \% \mathrm{CI}: 0.75-0.92) .{ }^{27}$ Item reliabilities were not reported. In responding to these neighborhoods environment items, participants were asked to refer to the area about a 20minute or 1-mile walk from their home.

## Sociodemographic Measures

Person-level data on age, gender, race/ethnicity, family income, and education were selfreported during the baseline MESA examination. Age was classified into four categories (45-$54,55-64,65-74$, and $75-84$ years). Race and ethnicity were classified as Hispanic, nonHispanic white, non-Hispanic black, and Asian-Chinese. Family income was grouped into four categories (less than $\$ 20000, \$ 20000-\$ 39999, \$ 40000-74999$, and $\$ 75000$ or more). Education was categorized as less than high school, high school/GED diploma, college, and graduate/professional school.

## Statistical Analysis

Of the 6061 MESA participants at baseline that lived within geographic areas where land use data were available, 237 were excluded because their address information could not be connected to the road data set, likely the result of geocoding error, road data error, or that participants lived in very small roads not represented given the scale of the road data. An additional 284 were excluded because they were missing physical activity information, and 11
participants were excluded due to missing self-reported neighborhood environment data, leaving 5529 participants for analysis.

Multinomial logistic models were used to analyze the three-level categoric outcomes for each of the two outcome variables (walking to places and walking for exercise) using Stata 9.2. In all cases, no walking was used as the reference category. Robust SEs with clustering were used to account for potential correlations among participants within sites.

None of the neighborhood objective and self-reported variables had particularly high colinearity (variance inflation factor <4), suggesting that they measure different constructs or they measure similar constructs differently. Therefore, the neighborhood environment variables (objective and self-reported) were first entered one at a time into models that adjusted for individual characteristics (age, gender, education, race/ethnicity, and family income). Models also adjusted for neighborhood road connectivity, because it may be associated with both land use and walking and could therefore confound the association of land use with walking. Next, all environment variables were entered simultaneously into a single model, adjusting for the same factors. Finally, Stata's lincom command was used to provide a graphic representation of the relationships of interest. All analyses were conducted in 2008 and 2009.

## Results

Descriptive statistics for sociodemographic characteristics and walking activity of participants are shown in Table 1. Age of study participants ranged between 45 and 84 years. Just over half of the sample ( $51.7 \%$ ) were women and $40.1 \%$ of participants were non-Hispanic Caucasian, $25.9 \%$ non-Hispanic blacks, $22.1 \%$ Hispanics and $11.9 \%$ Chinese. The median time of walking to places was $150 \mathrm{~min} / \mathrm{wk}$ and the median time for exercise walking was $90 \mathrm{~min} / \mathrm{wk}$.

Table 2 shows descriptive statistics for the measures of objective and self-reported land use and residential development intensity. Neighborhoods had an average population density of 153.2 people per hectare. Forty-one percent of respondents had no retail land uses in their neighborhood and only a quarter of the sample had $10.6 \%$ or more of the parcel area in the neighborhood devoted to retail uses. The entropy measure revealed substantial variability in the land use mixes around the homes of participants. The percentage of participants agreeing or strongly agreeing with the statements "In my neighborhoods it is easy to walk to places" and "There are stores within walking distance of my home" were $79.8 \%$ and $76.3 \%$, respectively. On average $62.1 \%$ of participants reported having schools or community centers with recreational facilities available for free to the public or YMCA/YWCAs available within a 20-minute walk from their home.

## Walking to Places

Adjusted associations of the objective and self-reported land use/intensity variables with walking to places are shown in Table 3. When models were estimated for each exposure separately, higher levels of population density and the highest quartile of the percentage of parcel area devoted to retail were each associated with higher levels of walking to places after adjustment for age, gender, race/ethnicity, education, income, and street connectivity. Being in the top quartile ( $\geq 10.6 \%$ of parcel area in retail) relative to the baseline category of having no retail was associated with 1.81 higher odds of some walking ( $>0$ but $<150 \mathrm{~min} / \mathrm{wk}$ ) and 2.57 higher odds of walking to places $\geq 150 \mathrm{~min} / \mathrm{wk}$. None of the entropy measures was associated with walking to places.

For self-reported measures, people reporting that it was easier to walk to places had higher odds of walking to places, and those reporting more stores within walking distance had higher odds of walking to places $\geq 150 \mathrm{~min} / \mathrm{wk}$, after adjustment. Other land use characteristics
(availability of institutional uses) were not related to walking to places. When all the exposures were included in a single model, density remained positively associated with walking to places for both walking levels relative to no walking, and the third and top quartiles of retail area were positively associated with more walking. Having more stores within walking distance had higher odds of walking to places $\geq 150 \mathrm{~min} / \mathrm{wk}$, after adjustment Entropy was not associated with walking.

## Walking for Exercise

Table 4 shows adjusted associations for the exercise walking outcome. When models were estimated for each exposure separately, density and all self-reported measures were related to exercise walking for more than $90 \mathrm{~min} / \mathrm{wk}$, and ease of walking to places was the only variable related to some walking ( $>0$ and $<90 \mathrm{~min} / \mathrm{wk}$ ), relative to no walking. For the measures of land use mixtures, the third and top quartiles of retail area, and the top quartile of entropy were positively associated with walking more than $90 \mathrm{~min} / \mathrm{wk}$. When all the exposures were included in a single model, density, the top quartile of entropy and ease of walking to places remained positively related to exercise walking for more than $90 \mathrm{~min} / \mathrm{wk}$. Ease of walking to places remained significantly associated with some walking (>0 and <90 min/wk).

Figure 1 portrays how density and retail uses were jointly related to the probability of walking to places based on the parameters estimated, while holding constant all continuous variables at their means and all categoric variables at their modes. The values of density vary from the $5^{\text {th }}$ to the $95^{\text {th }}$ percentile in the data. The values for retail represent the indicator variables in quartiles used in the models. The probability of walking to places for less than $150 \mathrm{~min} / \mathrm{wk}$ relative to no walking increased from $75.7 \%$ to $98.2 \%$ when density and retail increased jointly from the $5^{\mathrm{h}}$ percentile to the $95^{\text {th }}$ percentile. For similar changes in density and retail, the probability of walking for exercise for more than $150 \mathrm{~min} / \mathrm{wk}$ relative to no walking increased from $66.4 \%$ to $95.2 \%$.

## Discussion

In a diverse population sample of middle-aged and older adults, objective and self-reported measures of land use and residential density were consistently associated with higher odds of walking. In adjusted models examining each measure separately, higher population density, and a higher percentage of parcel area devoted to retail land uses were each associated with higher odds of walking to places and walking for exercise. Weaker evidence was found for self-reported measures of ease of walking, presence of stores, and availability of institutional uses.

In models that included both objective and self-reported measures, higher population density and higher percentage of parcel area devoted to retail uses remained significantly associated with higher odds of walking to places. The estimates for the percentage of parcel area in retail uses suggest a dose-response relationship between exposure to retail uses and walking to places. In addition, higher density, being in the top quartile denoting the most proportional distribution of land among various uses, and self-reported ease of walking to places remained associated with walking for exercise after adjustment for other objective and self-reported land use measures.

By focusing on land use and residential density in six diverse urbanized areas in the U.S, this study extends prior evidence ${ }^{9,14,28,29}$ regarding the importance of land use and residential density for walking in middle-to-older age adults. Although measures of neighborhood perceptions were limited, the results suggest that objective features of neighborhoods may influence residents' behaviors independently of their perceptions. Interestingly, perceived
presence of stores within walking distance remained significant for the highest level of walking to places even when objective measures were controlled.

Density was the measure most consistently related to walking. Few studies have included as much variation in density as the present study, and fewer have focused on middle-aged and older adults. The strength of density in predicting walking activity has been previously noted ${ }^{9,28,30,31,32}$, but studies of older adults remain rare. The results suggest that the importance of density for physical activity promotion goes beyond the connectivity and access to destinations that density brings.

Figure 1, showing the joint contribution of density and retail to explaining the probability of walking to places, has two salient characteristics: nonlinearity and high uncertainty. First, the figure graphically depicts walking benefits from densifying and including retail land uses can materialize when density and retail are already considerable, moving toward the higher percentiles of their respective distributions. Second, the CIs suggest that even though the probability of walking to places increases when density and retail increase jointly from their $10^{\text {th }}$ percentile to their $80^{\text {th }}$ percentile, the uncertainty around the estimates is such that the predicted change in walking to places is no different from zero at a $95 \%$ level of confidence.

Results for the entropy variable were not entirely consistent. The highest quartile of entropy was associated with walking for exercise in models adjusted for individual-level characteristics. However, entropy was not associated with walking to places. This contrasts with other studies ${ }^{9,29}$ and may be the result of measurement differences. Although mean entropy in this study is almost identical to values in other studies, ${ }^{9,24}$ the figures cannot be compared directly. Further, the theoretic reasons to expect similarity in the proportion of land devoted to different uses to be related to walking are unclear. An instance in which a residential household is surrounded by walkable nonresidential destinations yields a disproportionate distribution of land uses in an environment supportive of walking to places. The evidence provided here, in addition to theoretic limitations, and the difficulty in correctly interpreting and communicating its meaning, suggests caution in using entropy as a neighborhood environmental measure in future studies.

Compared to other studies, the neighborhood area definition of a 200 m circle is small. Measures drawn from circles of 400 m and 800 m radii were tested by examining model fit using the Bayesian information criterion (BIC). Raftery ${ }^{33}$ suggests that evidence favoring one model over another is weak, positive, strong, or very strong if the absolute difference in BIC for two models is $0-2,2-6,6-10$, or $>10$, respectively. With the exception of the single model with all exposures explaining exercise walking which exhibited weak evidence favoring the 400 m buffer, all other models with exposures measured for the 200 m circle were strongly or very strongly favored over larger circles. These results contrast with Berke et al ${ }^{13}$, who found no pattern in model fit at various buffer sizes.

One explanation for the results favoring the smallest circle is that for an older population proximal land uses may be more relevant than uses that are more distant. Another explanation is that the retail and entropy measures are neighborhood-scale dependent, a phenomenon known as the modifiable areal unit problem. ${ }^{34}$ As the neighborhood area definition increases, neighborhood heterogeneity increases, thereby decreasing variation in the entropy and retail measures.

Limitations of this study include the use of self-reported walking, the reliance on land use information collected from diverse sources, and potential residual confounding. Bias caused by the cross-sectional design also is a possibility, since people who enjoy walking are more likely to move to areas that support walking. Misspecification of the relevant geographic area could also have affected the results.

## Conclusion

## Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

## Acknowledgments

This study was funded by a grant from the Robert Wood Johnson Foundation Active Living Research Program. Partial funding was also provided by R01 HL071759 from NIH NHLBI (National Heart, Lung, and Blood Institute). The MESA Study was supported by contracts N01-HC-95159 through N01-HC-95165 and N01-HC-95169 from the NIH NHLBI. The content is solely the responsibility of the authors and does not necessarily represent the official views of the NIH. The authors thank the other investigators, staff, and participants of the MESA Study for their valuable contributions. A full list of participating MESA investigators and institutions can be found at http://www.mesa-nhlbi.org. Lastly, we appreciate the spatial assistance of Melissa Smiley and data management from Fang Wen.

## References

1. Chodzko-Zajko W, Sheppard L, Senior J, Park CH, Mockenhaupt R, Bazzarre T. The national blueprint for promoting physical activity in the mid-life and older adult population. Quest 2005;57(1):2-11.
2. Kochera, A.; Straight, A. Beyond 50.05. Washington, DC: American Association of Retired Persons; 2005.
3. King WC, Belle SH, Brach JS, Simkin-Silverman LR, Soska T, Kriska AM. Objective measures of neighborhood environment and physical activity in older women. Am J Prev Med 2005;28(5):461469. [PubMed: 15894150]
4. King A, Castro C, Wilcox S, Eyler A, Sallis J, Brownson R. Personal and environmental factors associated with physical inactivity among different racial/ethnic groups of US middle- and older-aged women. Health Psychology 2000;19(4):354-364. [PubMed: 10907654]
5. Wilcox S, Castro C, King AC, Houseman RA, Brownson R. Determinants of leisure time physical activity in rural compared with urban older and ethnically diverse women in the United States. Journal of Epidemiology and Community Health 2000;54:667-72. [PubMed: 10942445]
6. Cunningham GO, Michael YL. Concepts guiding the study of the impact of the built environment on physical activity for older adults: a review of the literature. Am J Health Promot 2004;18(6):435-43. [PubMed: 15293929]
7. Cerin E, Leslie E, du Toit L, Owen N, Frank LD. Destinations that matter: associations with walking for transport. Health Place 2007;13(3):713-24. [PubMed: 17239654]
8. Frank LD, Sallis JF, Conway TL, Chapman JE, Saelens BE, Bachman W. Many pathways from land use to health - Associations between neighborhood walkability and active transportation, body mass index, and air quality. J Am Plann Assoc 2006;72(1):75-87.
9. Frank LD, Schmid TL, Sallis JF, Chapman J, Saelens BE. Linking objectively measured physical activity with objectively measured urban form: findings from SMARTRAQ. Am J Prev Med 2005;28 (2 Suppl 2):117-25. [PubMed: 15694519]
10. Giles-Corti B, Broomhall MH, Knuiman M, Collins C, Douglas K, Ng K, et al. Increasing walking - How important is distance to, attractiveness, and size of public open space? Am J Prev Med 2005;28 (2):169-176. [PubMed: 15694525]
11. McCormack GR, Giles-Corti B, Bulsara M. The relationship between destination proximity, destination mix and physical activity behaviors. Prev Med 2008;46(1):33-40. [PubMed: 17481721]
12. Saelens B, Handy S. Built Environment Correlates of Walking: A Review. Medicine \& Science in Sports \& Exercise 2008;40:S550-566. [PubMed: 18562973]
13. Berke EM, Koepsell TD, Moudon AV, Hoskins RE, Larson EB. Association of the built environment with physical activity and obesity in older persons. Am J Public Health 2007;97(3):486-92. [PubMed: 17267713]
14. Frank LD, Andresen MA, Schmid TL. Obesity relationships with community design, physical activity, and time spent in cars. Am J Prev Med 2004;27(2):87-96. [PubMed: 15261894]
15. Li F, Harmer PA, Cardinal BJ, Bosworth M, Acock A, Johnson-Shelton D, et al. Built environment, adiposity, and physical activity in adults aged 50-75. Am J Prev Med 2008;35(1):38-46. [PubMed: 18541175]
16. Duncan MJ, Spence JC, Mummery WK. Perceived environment and physical activity: a meta-analysis of selected environmental characteristics. International Journal of Behavioral Nutrition and Physical Activity 2005;2:9. [PubMed: 16076386]
17. McCormack G, Giles-Corti B, Lange A, Smith T, Martin K, Pikora T. An update of recent evidence of the relationship between objective and self-report measures of the physical environment and physical activity behaviours. J Sci Med Sport 2004;7(1 Supplement):81-92. [PubMed: 15214606]
18. McGinn AP, Evenson KR, Herring AH, Huston SL, Rodriguez DA. Exploring Associations between Physical Activity and Perceived and Objective Measures of the Built Environment. J Urban Health 2007;84(2):162-84. [PubMed: 17273926]
19. Bild DE, Bluemke DA, Burke GL, Detrano R, Diez Roux AV, Folsom AR, et al. Multiethnic study of atherosclerosis: objectives and design. Am J Epidemiol 2002;156(9):871-81. [PubMed: 12397006]
20. Ainsworth BE, Irwin ML, Addy CL, Whitt MC, Stolarczyk LM. Moderate physical activity patterns of minority women: the Cross-Cultural Activity Participation Study. J Womens Health Gend Based Med 1999;8(6):805-13. [PubMed: 10495261]
21. LaMonte MJ, Durstine JL, Addy CL, Irwin ML, Ainsworth BE. Physical activity, physical fitness, and Framingham 10-year risk score: the cross-cultural activity participation study. J Cardiopulm Rehabil 2001;21(2):63-70. [PubMed: 11314285]
22. Henderson KA, Ainsworth BE. A synthesis of perceptions about physical activity among older African American and American Indian women. Am J Public Health 2003;93(2):313-7. [PubMed: 12554592]
23. Ainsworth, BE.; LaMonte, M.; Drowatzky, K. Evaluation of the CAPS typical week physical activity survey (TWPAS) among minority women. Community Prevention Research in Women's Health Conference; Bethesda, MD. 2000.
24. Cervero R, Kockelman K. Travel demand and the 3Ds: Density, diversity and design. Transportation Research D 1997;2(3):199-219.
25. Cervero, R. America's suburban centers : the land use-transportation link. Boston: Unwin Hyman; 1989.
26. Frank, LD.; Pivo, G. Relationships Betwen Land Use and Travel Behavior in the Puget Sound Region. Seattle, WA: Washington State Transportation Center; 1994.
27. Echeverria SE, Diez-Roux AV, Link BG. Reliability of self-reported neighborhood characteristics. J Urban Health 2004;81(4):682-701. [PubMed: 15466849]
28. Moudon AV, Lee C, Cheadle AD, Garvin C, Rd DB, Schmid TL, et al. Attributes of environments supporting walking. Am J Health Promot 2007;21(5):448-59. [PubMed: 17515010]
29. Rundle A, Roux AV, Free LM, Miller D, Neckerman KM, Weiss CC. The urban built environment and obesity in New York City: a multilevel analysis. Am J Health Promot 2007;21(4 Suppl):32634. [PubMed: 17465178]
30. de Vries SI, Bakker I, van Mechelen W, Hopman-Rock M. Determinants of activity-friendly neighborhoods for children: Results from the SPACE study. American Journal of Health Promotion 2007;21(4):312-316. [PubMed: 17465176]
31. Lee C, Moudon AV. The 3Ds + R: Quantifying land use and urban form correlates of walking. Transportation Research Part D: Transport and Environment 2006;11(3):204-215.
32. Rodriguez DA, Brown AR, Torped PJ. Portable global positioning units to complement accelerometry-based physical activity monitors. Med Sci Sports Exerc 2005;37(11):S572-581. [PubMed: 16294120]
33. Raftery, AE. Bayesian model selection in social research. In: Marsden, PV., editor. Sociological methodology. Oxford, Eng.: Blackwell Publishers; 1995. p. xxviip. 500
34. Cressie N. Change of support and the modifiable areal unit problem. Geographical Systems 1996;3:159-180.



Figure 1.
Adjusted predicted probability and $95 \%$ CI of walking to places relative to no walking by percentile of neighborhood density and \% land area devoted to retail uses, Multi-Ethnic Study of Atherosclerosis (MESA), 2000-2002 ( $n=5529$ ) $\dagger \ddagger$
Note: Walking to places measure categorized into Level 1 (none), Level 2 ( $>0$ and $<150 \mathrm{~min} /$ wk ), and Level 3 ( $\geq 150 \mathrm{~min} / \mathrm{wk}$ ). Level 1 is the reference category. Adjustment factors are age, gender, education, race/ethnicity, family income, and proportion of 400 m buffer from home accessible via roads. Robust SEs with clustering on each site are shown.

## Table 1

Selected individual-level characteristics of participants included in the analyses, Multi-Ethnic Study of Atherosclerosis (MESA), 2000-2002 ( $n=5529$ )

|  | $n$ | \% | VIF ${ }^{a}$ |
| :---: | :---: | :---: | :---: |
| Age group (years) |  |  |  |
| 45-54 | 1654 | 29.9 | NA |
| 55-64 | 1588 | 28.7 | 2.6 |
| 65-74 | 1588 | 28.7 | 2.5 |
| 75-84 | 699 | 12.6 | 2.4 |
| Gender |  |  |  |
| Female | 2856 | 51.7 | 1.0 |
| Race/ethnicity |  |  |  |
| Non-Hispanic Caucasian | 2217 | 40.1 | NA |
| Asian-Chinese | 659 | 11.9 | 2.3 |
| Non-Hispanic black | 1432 | 25.9 | 1.6 |
| Hispanic | 1221 | 22.1 | 1.9 |
| Education completed |  |  |  |
| Less than high school | 881 | 15.9 | NA |
| High school graduate/GED | 999 | 18.1 | 1.9 |
| College | 2595 | 46.9 | 2.8 |
| Graduate/professional school | 1054 | 19.1 | 2.6 |
| Family income (thousands) |  |  |  |
| Less than 20 | 1207 | 21.8 | NA |
| 20-<40 | 1474 | 26.7 | 1.8 |
| 40-<75 | 1520 | 27.5 | 2.1 |
| $\geq 75$ and more | 1328 | 24.0 | 2.5 |
| Outcomes |  |  |  |
| Walking to places (min/wk) |  |  |  |
| 0 | 779 | 14.1 |  |
| <150 | 2253 | 40.8 |  |
| $\geq 150$ | 2497 | 45.2 |  |
| Walking for exercise ( $\mathrm{min} / \mathrm{wk}$ ) |  |  |  |
| 0 | 1918 | 34.7 |  |
| $<90$ | 1800 | 32.6 |  |
| $\geq 90$ | 1811 | 32.8 |  |

[^1]Id!us
Objective and self-reported land use/intensity characteristics around the home of participants included in analyses, Multi-Ethnic Study of Atherosclerosis
(MESA), 2000-2002 ( $n=5529$ )

|  | $n$ | \% | Median | M | SD | Min | Max |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Objective/derived measures (200m buffer unless noted) |  |  |  |  |  |  |  |
| Density (hundreds of people/hectare) | 5529 | - | 0.41 | 1.53 | 2.55 | 0.00 | 15.20 |
| \% parcel area devoted to retail use |  |  |  |  |  |  |  |
| $1{ }^{\text {st }}$ quartile ( $=0$ ) | 2269 | 41.04 |  |  |  |  |  |
| 2 nd quartile (>0 and <1.43) | 494 | 8.93 |  |  |  |  |  |
| 3 rd quartile ( $\geq 1.43$ and <10.61) | 1384 | 25.04 |  |  |  |  |  |
| $4^{\text {th }}$ quartile $(\geq 10.61)$ | 1382 | 25.00 |  |  |  |  |  |
| Entropy ${ }^{a}$ |  |  |  |  |  |  |  |
| $1^{\text {st }}$ quartile (<0.022) | 1383 | 25.01 |  |  |  |  |  |
| 2 nd quartile ( $\geq 0.022$ and $<0.26$ ) | 1382 | 25.00 |  |  |  |  |  |
| 3 rd quartile $\geq 0.26$ and $<0.54$ ) | 1382 | 25.00 |  |  |  |  |  |
| $4^{\text {th }}$ quartile ( $\geq 0.54$ ) | 1382 | 25.00 |  |  |  |  |  |
| Proportion of 400 m buffer from home accessible via roads ( $0-1$ ) | 5529 | - | 0.51 | 0.47 | 0.15 | 0.00 | 0.73 |
| Self-reported measures |  |  |  |  |  |  |  |
| Easy to walk to places ${ }^{b}$ |  |  |  |  |  |  |  |
| $1=$ Strongly disagree | 119 | 2.15 |  |  |  |  |  |
| 2=Disagree | 683 | 12.35 |  |  |  |  |  |
| $3=$ Neutral (neither agree nor disagree) | 317 | 5.73 |  |  |  |  |  |
| 4=Agree | 3342 | 60.44 |  |  |  |  |  |
| 5=Strongly agree | 1068 | 19.32 |  |  |  |  |  |
| Stores within walking distance (20 min) ${ }^{\text {b }}$ |  |  |  |  |  |  |  |
| $1=$ Strongly disagree | 274 | 4.96 |  |  |  |  |  |
| $2=$ Disagree | 902 | 16.31 |  |  |  |  |  |
| $3=$ Neutral (neither agree nor disagree) | 132 | 2.39 |  |  |  |  |  |
| 4=Agree | 3186 | 57.62 |  |  |  |  |  |
| 5=Strongly agree | 1035 | 18.72 |  |  |  |  |  |
| Availability of institutional uses (schools, YMCA/YWCAs) within walking distance ( 20 min ) |  |  |  |  |  |  |  |
| $0=$ No | 2093 | 37.85 |  |  |  |  |  |
| $1=\mathrm{Yes}$ | 3436 | 62.15 |  |  |  |  |  |

${ }^{a}$ Entropy was calculated among residential, institutional, retail and office uses using the formula presented by Cervero and Kockelman. ${ }^{24}$ For parcels with mixed uses, if they contained any retail uses they were considered as retail use. Those having any office uses (but no retail) were considered as office uses. Any institutional uses (but no retail or office uses) were considered institutional uses. Higher values represent a more even proportion of area devoted to each land use.
${ }^{b}$ Measured with a Likert-like scale ranging between 1 and 5 , with $1=$ strongly agree and $5=$ strongly disagree. Scale shown in table and used in analyses is reversed so that higher values mean more support for walking, consistent with the objective measures.

## Table 3

Adjusted OR ( $95 \% \mathrm{CI}$ ) of walking to places (in three levels) associated with neighborhood land use and density variables, Multi-Ethnic Study of Atherosclerosis (MESA), 2000-2002 ( $n=5529$ )

|  | Models for each exposure separately ${ }^{\text {a,b }}$ |  | Full model with all exposures included ${ }^{\dagger *}$ |  |
| :---: | :---: | :---: | :---: | :---: |
|  | Level 2 vs Level 1 | Level 3 vs Level 1 | Level 2 vs Level 1 | Level 3 vs Level 1 |
| Objective/derived measures | OR (95\% CI) | OR (95\% CI) | OR (95\% CI) | OR (95\% CI) |
| Density (hundreds of people/hectare) | 1.31 (1.14,1.51) | 1.41 (1.21,1.65) | 1.28 (1.12,1.46) | 1.34 (1.16,1.55) |
| \% parcel area devoted to retail use $1^{\text {st }}$ quartile | ref | ref | ref | ref |
| 2nd quartile | 1.15 (0.81,1.64) | 1.09 (0.67,1.78) | 1.05 (0.80,1.37) | 0.93 (0.69,1.25) |
| 3 rd quartile | 1.44 (0.94,2.20) | 1.68 (0.92,3.06) | 1.19 (1.02,1.38) | 1.22 (1.02,1.46) |
| $4^{\text {th }}$ quartile | 1.81 (1.12,2.93) | 2.57 (1.28,5.15) | 1.44 (1.19,1.76) | 1.73 (1.26,2.38) |
| Entropy |  |  |  |  |
| $1^{\text {st }}$ quartile | ref | ref | ref | ref |
| 2nd quartile | 0.84 (0.42,1.66) | 0.62 (0.30,1.27) | 1.27 (0.86,1.87) | 1.13 (0.78,1.62) |
| 3 rd quartile | 0.76 (0.40,1.43) | 0.53 (0.25,1.12) | 1.05 (0.80,1.37) | 0.82 (0.60,1.13) |
| $4^{\text {th }}$ quartile | 1.26 (0.71,2.24) | 1.36 (0.63,2.96) | 0.96 (0.67,1.37) | 0.90 (0.58,1.39) |
| Self-reported/perceived measures |  |  |  |  |
| Easy to walk to places | 1.13 (1.03,1.24) | 1.26 (1.06,1.50) | 1.05 (0.97,1.13) | 1.07 (0.97,1.19) |
| Stores within walking distance | 1.13 (0.98,1.30) | 1.29 (1.07,1.55) | 1.03 (0.93,1.14) | 1.09 (1.01,1.18) |
| Availability of institutional uses | 1.06 (0.83,1.35) | 1.18 (0.87,1.60) | 1.01 (0.80,1.28) | 1.08 (0.82,1.42) |

[^2]
## Table 4

Adjusted OR ( $95 \% \mathrm{CI}$ ) of walking for exercise (in three levels) associated with neighborhood land use and density variables, Multi-Ethnic Study of Atherosclerosis (MESA), 2000-2002 ( $n=5529$ )

|  | Models for each exposure separately ${ }^{\text {a,b }}$ |  | Single model with all exposures included ${ }^{\dagger \ddagger}$ |  |
| :---: | :---: | :---: | :---: | :---: |
|  | Level 2 vs Level 1 | Level 3 vs Level 1 | Level 2 vs Level 1 | Level 3 vs Level 1 |
| Objective/derived measures | OR (95\% CI) | OR (95\% CI) | OR (95\% CI) | OR (95\% CI) |
| Density (hundreds of people/hectare) | 1.00 (0.98,1.01) | 1.09 (1.08,1.11) | 1.00 (0.97,1.02) | 1.06 (1.04,1.09) |
| \% parcel area devoted to retail use $1^{\text {st }}$ quartile | ref | ref | ref | ref ref |
| 2nd quartile | 0.96 (0.83,1.12) | 1.16 (0.90,1.50) | 0.95 (0.81,1.11) | 1.05 (0.83,1.33) |
| 3 rd quartile | 1.05 (0.90,1.22) | 1.34 (1.07,1.69) | 1.04 (0.88,1.24) | 1.08 (0.90,1.30) |
| $4^{\text {th }}$ quartile | 0.98 (0.87,1.10) | 1.49 (1.06,2.10) | 0.97 (0.83,1.12) | 1.07 (0.86, 1.33 ) |
| Entropy |  |  |  |  |
| $1^{\text {st }}$ quartile | ref | ref | ref | ref ref |
| 2nd quartile | 1.10 (0.89,1.37) | 0.79 (0.62,1.01) | 1.15 (0.96,1.38) | 1.00 (0.90,1.11) |
| 3 rd quartile | 1.03 (0.74,1.43) | 0.82 (0.62,1.07) | 1.06 (0.76,1.47) | 0.98 (0.82,1.16) |
| $4^{\text {th }}$ quartile | 1.05 (0.87,1.27) | 1.29 (1.08,1.54) | 1.06 (0.82,1.37) | 1.19 (1.05,1.34) |
| Self-reported/perceived measures |  |  |  |  |
| Easy to walk to places | 1.12 (1.07,1.18) | 1.30 (1.20,1.41) | 1.14 (1.08,1.20) | 1.23 (1.14,1.32) |
| Stores within walking distance | 1.04 (0.95,1.13) | 1.18 (1.07,1.29) | 0.99 (0.90,1.09) | 1.02 (0.96,1.08) |
| Availability of institutional uses | 1.08 (0.98,1.18) | 1.18 (1.05,1.32) | 1.06 (0.97,1.15) | 1.08 (0.95, 1.23) |

[^3]
[^0]:    Address correspondence and reprint requests to: Daniel A. Rodríguez, PhD, Department of City and Regional Planning, CB 3140 New East, 319, Chapel Hill, NC 27599-3140. danrod@unc.edu.
    No financial disclosures were reported by the authors of this paper.
    Publisher's Disclaimer: This is a PDF file of an unedited manuscript that has been accepted for publication. As a service to our customers we are providing this early version of the manuscript. The manuscript will undergo copyediting, typesetting, and review of the resulting proof before it is published in its final citable form. Please note that during the production process errors may be discovered which could affect the content, and all legal disclaimers that apply to the journal pertain.

[^1]:    ${ }^{a}$ VIF stands for variance inflation factor, a measure of colinearity among variables. Percentages do not add to 100 due to rounding.

[^2]:    ${ }^{a}$ Walking to places measure categorized into level 1 (none), level $2(>0$ and $<150 \mathrm{~min} / \mathrm{wk})$, and level $3(\geq 150 \mathrm{~min} / \mathrm{wk})$.
    ${ }^{b}$ Adjustment factors are age, gender, education, race/ethnicity, family income, and proportion of 400 m buffer from home accessible via roads. Robust SEs with clustering on each site are shown. All objective measures are calculated for a 200 m radius around each participant's home. Bolded coefficients are significant at a $95 \%$ level of confidence.

[^3]:    ${ }^{a}$ Walking for exercise or leisure measure categorized into level 1 (none), level 2 ( $>0$ and $<90 \mathrm{~min} / \mathrm{wk}$ ), and level $3(\geq 90 \mathrm{~min} / \mathrm{wk})$.
    ${ }^{b}$ Adjustment factors are age, gender, education, race/ethnicity, family income, and proportion of 400 m buffer from home accessible via roads. Robust SEs with clustering on each site are shown. All objective measures are calculated for a 200 m radius around each participant's home. Bolded coefficients are significant at a $95 \%$ level of confidence.

