# Effects of Neighborhood Characteristics on the Mortality of Black Male Youth: Evidence From Gautreaux

by

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# EFFECTS OF NEIGHBORHOOD CHARACTERISTICS ON THE MORTALITY OF BLACK MALE YOUTH: EVIDENCE FROM GAUTREAUX

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**Abstract:** We analyze the effects of neighborhood characteristics on the mortality of black male youth in families relocated through the Gautreaux program, a residential mobility program implemented in Chicago in 1976. While we find significant evidence of neighborhood self-selection by families participating in Gautreaux, we nonetheless find evidence that certain placement neighborhood characteristics were associated with lower male youth mortality rates after controlling for household and origin neighborhood characteristics. Placement neighborhood characteristics related to human capital and work were more important predictors of male youth mortality than characteristics related to race, poverty, or family composition.

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# 1. Introduction

There is now widespread acceptance among health economists and health services researchers that the impact of medical care on population health is fairly modest when compared to other contributing factors, such as health behaviors, genetic endowment, and social and environmental factors (e.g., McGinnis and Foege, 1993; Lurie et al., 2003). In particular, a large literature based on observational evidence documents strong correlations between the characteristics of places and health outcomes, including all-cause mortality, self-reported health status, incidence of specific diseases, mental illness, incidence of injury, and adverse birth outcomes.<sup>3</sup> The general finding in this literature is that residents of disadvantaged neighborhoods suffer worse health outcomes than those in more advantaged neighborhoods, and that these differences cannot be fully explained by variation in individual-level characteristics.

If the correlations between neighborhood characteristics and health outcomes represent causal relationships, it suggests that housing policies can have important implications for individual health. Moreover, it suggests that residential segregation by income, class, or race could be a contributing factor to the well-documented gradient between health and socioeconomic status (e.g., Deaton, 2001). Unfortunately, issues of omitted variable bias cast doubt on the causal interpretation often applied to the observed correlations. Residential location is largely a matter of household choice, and the determinants of this choice are, at best, imperfectly observed by researchers. As a result, one cannot be sure if associations between neighborhood characteristics and health outcomes gleaned from observational studies represent a causal

<sup>&</sup>lt;sup>3</sup> Pertinent citations include: Haan et al. (1987), Lynch et al. (1998), Waitzman and Smith (1998a, 1998b), Ross et al. (2000), and Bosma et al. (2001) for all-cause mortality; Malmstrom et al. (1999) and Subramanian et al. (2001) for self-reported health status; Armstrong et al. (1998), LeClere et al. (1998), Casper et al. (1999), Diez-Roux et al. (2001), Zierler at al. (2000), Barr et al. (2001), and Acevedo-Garcia (2001) for incidence of specific diseases; Aneshensel and Sucoff (1996), Yen and Kaplan (1999), and Ross (2000) for mental illness; Durkin et al. (1994), Reading et al. (1999), and Cubbin et al. (2000) for incidence of injury; Collins and David (1997), Matteson et al. (1998), and Gorman (1999) for adverse birth outcomes.

relationship, omitted variable bias, or some combination of the two. Reviewing the literature on neighborhood effects on children outcomes, Jencks and Mayer note that "...the most fundamental problem confronting anyone who wants to estimate neighborhoods' effects on children is distinguishing between neighborhood effects and family effects... This means that children who grow up in rich neighborhoods would differ to some extent from children who grow up in poor neighborhoods even if neighborhoods had no effect whatever" (1990, page 119).

The problem of omitted variable bias potentially explains the more modest neighborhood health effects documented in studies of the Moving to Opportunity (MTO) demonstration projects, which have operated in five cities since 1994.<sup>4</sup> Under MTO, low-income public housing families were randomly assigned to either the control group or one of two intervention groups offering housing vouchers to move to neighborhoods with lower poverty rates. Recent analyses of MTO participants indicate the neighborhood effects on health are less comprehensive than suggested by observational studies. Kling et al. (2004) find that adults in the experimental group demonstrate significantly better mental health and significantly lower obesity levels than control group adults, but find no significant differences in four other aspects of physical health (general health, asthma, physical limitations, and hypertension). Looking at the health of MTO youth, Kling and Liebman (2004) find that female youth in the experimental group experienced improvements in mental health and were less likely to engage in risky activities, with no significant improvements in physical health. However, male youth in the experimental group were *more* likely to engage in risky activities (e.g., alcohol and tobacco use) and more likely to

<sup>&</sup>lt;sup>4</sup> In MTO, the "experimental" group received housing vouchers that could only be used to lease housing in census tracts with 1990 poverty rates of less than 10 percent. The "Section 8" group received standard Section 8 vouchers with no constraints on the relocation area. The random assignments led to substantial variation in neighborhood characteristics across the three groups, with experimental families generally residing in census tracts having better socioeconomic characteristics and control families residing in tracts with poorer socioeconomic characteristics. See Goering, Feins, and Richardson (2002) for a detailed description of the MTO experiments and a review of findings current to its publication date.

experience serious physical injuries requiring medical attention. In sum, the MTO results suggest a more modest role for the impact of neighborhoods on health, one largely constrained to effects on mental health, and indicate that the health effect of "better" neighborhoods on poor male youth may in fact be negative.

Against this backdrop, we contribute to the existing literature by investigating the link between neighborhood characteristics and the mortality of black male youth who participated in the Gautreaux Assisted Housing Program, a predecessor to MTO that operated in Chicago from 1976 to 1998. Gautreaux was designed with the intention of moving black public housing residents into city and suburban neighborhoods where the black population was less than 30 percent. While Gautreaux was not a planned social experiment, analysts have referred to placements under Gautreaux as "quasi-random" due to elements of randomness in the way participants were matched to available rental units (e.g., Rosenbaum, 1992; Popkin et al., 1993; Rosenbaum, 1995; Rosenbaum and DeLuca, 2000; Rosenbaum and Rubinowitz, 2001; DeLuca and Rosenbaum, 2003). If placements were truly random, occurring without regard to family characteristics and preferences, Gautreaux provides an ideal opportunity for investigating the impact of neighborhood characteristics on health (and other) outcomes.

Our focus on the mortality of black male youth was directed by both statistical issues and real-world relevance. Since our outcome measure is derived from administrative records (state death certificates), we are able to overcome potential problems of attrition bias that plagued early analyses of Gautreaux (e.g., Rosenbaum, 1992; Popkin et al., 1993; Rosenbaum, 1995). Moreover, black male youth have notoriously high mortality rates.<sup>5</sup> As a statistical matter, the larger number of mortalities among this group allows for greater power in our empirical analysis.

<sup>&</sup>lt;sup>5</sup> The national mortality rate for black males ages 15 to 24 was 180.6 per 100,000 in 2001, more than 67 percent higher than the rate for white males in the same age group (Arias et al., 2003).

The mortality outcomes of male youth also hold particular interest given the estimated negative effect that "better" neighborhoods had on the male youth in MTO.

Our analysis focuses on identifying the neighborhood characteristics that are most strongly related to post-placement mortality, independent of family characteristics. Colinearity of neighborhood characteristics impedes our attempts to measure the marginal contribution of individual neighborhood characteristics. Nevertheless, the information we provide could be useful to policymakers attempting to structure voucher programs to encourage relocations to neighborhoods possessing bundles of characteristics that facilitate better outcomes (health or otherwise). Understanding which neighborhood characteristics lead to better health outcomes could also assist in formulating hypotheses about the underlying mechanisms through which neighborhoods matter.

Our results indicate that claims of "quasi-randomness" in the Gautreaux placement process are overstated. Characteristics of a family's placement neighborhood (Census tract) were found to be significantly related to both family characteristics and characteristics of the family's intake neighborhood. The correlation between the intake and placement neighborhood characteristics indicates that household preferences likely affected the characteristics of one's placement neighborhood. These preferences may be correlated with determinants of black male youth mortality, and we attempt to control for these preferences with a rich set of baseline data collected at the time of enrollment in Gautreaux.

We find evidence that certain neighborhood characteristics affect the mortality rates of male youth participating in Gautreaux. Specifically, male youth mortality rates decline significantly with increases in the percent of adults with a college degree, percent of labor force that is employed, and percent of workers in white collar professions. In contrast, we find no

robust associations between the mortality rate of male youth and the following placement tract characteristics: placement in the city (vs. suburbs), percent non-white, poverty rate, percent of households receiving government assistance, and percent of families headed by a female. It appears then that black male youth mortality rates are most greatly affected by neighborhood characteristics related to human capital and work. This contrasts with a community-level analysis which finds that the local poverty rate and percent of households receiving government assistance most strongly predict the black male youth mortality rate in Chicago community areas.

Notably, the results related to human capital and work are robust to the inclusion of additional covariates capturing characteristics of intake neighborhoods. This is an important finding since the characteristics of one's intake neighborhood should, to some extent, capture variance in families' tastes for residing in different kinds of neighborhoods. If self-selection bias were driving our estimates, our estimates should have been attenuated by the inclusion of intake neighborhood characteristics.

The remainder of this paper is structured as follows. Section 2 provides background on the Gautreaux program. Section 3 describes the dataset constructed for this analysis. Section 4 presents the empirical results including evidence of neighborhood selection by Gautreaux participants. Section 5 discusses the implications of these findings and concludes. The Data Appendix includes additional details on our data construction process.

#### 2. Background

The Gautreaux Assisted Housing Program resulted from a consent decree originating from a 1966 housing discrimination lawsuit against the Chicago Housing Authority (CHA) and the U.S. Department of Housing and Urban Development (HUD). The suit alleged that black

public housing residents were denied opportunities to live in integrated areas in the Chicago metropolitan area. In 1976, a U.S. district court decreed that HUD set aside 7000 Section 8 slots to assist families in the plaintiff class to move to metropolitan area neighborhoods with black populations of less than 30 percent.<sup>6</sup> In 1981, this was amended to allow relocations into revitalizing minority neighborhoods (Davis, 1993).

The Gautreaux program was administered by the Leadership Council for Metropolitan Open Communities, a private, not-for-profit agency sponsored by local leadership organizations and charged with addressing housing segregation in Chicago. From Gautreaux's inception until 1989, the Leadership Council employed a full-time real estate staff that played the primary role in locating landlords willing to participate in the program (Keels et al., 2003). As units were located, they were offered to families "on the basis of their rank order on the waiting list, regardless of any expressed preferences for city or suburban locations" (Popkin et al., 1993). Popkin et al. noted that although "participants are allowed to refuse two housing offers for any reason without jeopardizing their assistance, 95 percent accept the first offer they receive because it is uncertain that there will be any others." These observations are noteworthy since they suggest apartments identified by the real estate staff were assigned without regard to family preferences, although participating families were also permitted to search for their own units at least as early as the mid-1980s (Keels et al., 2003).

By 1990, the rental housing market was strong enough that the Leadership Council eliminated its real estate staff (Keels et al., 2003). Participating families were largely responsible

<sup>&</sup>lt;sup>6</sup> The Section 8 program, now known as Housing Choice Vouchers, is a federal housing assistance program providing vouchers that can be used to rent housing in the private rental market with a tenant contribution towards rent of about 30 percent of monthly income. Under Section 8, HUD determines the "fair market rent" (FMR) in cities and towns. For Section 8 "certificates," HUD subsidies rent up to the FMR rent ceiling. For Section 8 "vouchers," which over time have become the predominant form of assistance, the FMR determines HUD's contribution to the rent. The value of the voucher would typically be the difference between the FMR and 30 percent of household monthly income, without a specific ceiling on rent for the unit.

for identifying their own units from this time forward. As a result, previous analyses of Gautreaux have generally focused on placements occurring before 1990 on the assumption that pre-1990 placements were exogenous with respect to family characteristics or neighborhood preferences. In contrast, a similar argument could not be made about post-1990 placements.

In our sample period of 1976 to 1994, Gautreaux assisted a relatively homogenous group of low-income Chicago residents in relocating to a wide variety of neighborhoods throughout the Chicago metropolitan area. The individual characteristics associated with these location choices are discussed in detail in section 4.

# 3. Data Description

#### 3.1 Sample of Male Youth in Gautreaux

Data on the families participating in Gautreaux were created by the Leadership Council and provided by the U.S. Department of Housing and Urban Development for the purpose of this study. These data included participants' date of intake and placement, intake and placement addresses, identifying information for each member in the participating household (name, sex, date-of-birth, and social security number), as well as additional characteristics of the family.<sup>7</sup> Intake and placement addresses were geocoded to determine the Census tract of residence at intake and placement. Data from the 1980 and 1990 Censuses were then merged to the household records and used to construct characteristics of the intake and placement neighborhood for each family.

As our analysis focuses on the mortality outcomes of the male youth in Gautreaux, we restricted our sample to families containing at least one male age 25 or younger at the date of

<sup>&</sup>lt;sup>7</sup> A complete description of the data creation and verification steps is provided in the Data Appendix, but omitted here for brevity.

placement, dropping any males without a recorded date-of-birth. The resulting dataset consists of 3580 male youth in 2474 families who were relocated under Gautreaux before 1995. The number of families placed by Gautreaux was initially quite low, but increased substantially in 1983 (shown in Appendix Table A1). From that time forward, the number of placements per year held fairly constant at an average of 196 per year for families containing a male youth.

Table 1 presents summary statistics of household and individual characteristics for the dataset of male youth. About 72 percent of all male youth resided in households headed by an unmarried female with another 17 percent recorded as headed by a married female. The head of household was generally quite young (mean age of 30.1) and only 23 percent of household heads were working at intake. Of those working, earnings were generally low, averaging only \$7166 in 1979 dollars (\$18,162 in 2003 dollars). Total monthly incomes in households without a working head were even lower, suggesting annual total incomes averaging \$2988 (\$7572 in 2003 dollars).<sup>8</sup> The number of bedrooms requested, determined by the Leadership Council based on the sex and age composition of the family, was 2.7 on average, and the mean age of the male youth at placement was 8.4 years old.

Table 2 summarizes the census tract characteristics of the intake and placement addresses for the male youth. Although the years of intake and placement vary, Table 2 uses 1980 Census data for all locations to facilitate comparison with the entire Cook County population given in the third column.<sup>9</sup> Not surprisingly, substantial differences exist between the intake and placement neighborhoods. It is noteworthy that the judicial intent behind the program appears to have been satisfied. Gautreaux families moved from overwhelmingly minority neighborhoods

<sup>&</sup>lt;sup>8</sup> Total monthly household income was not consistently recorded for families with a working head. In our regression models, total income is only included as an interaction with an indicator for having a non-working head.

<sup>&</sup>lt;sup>9</sup> The Chicago MSA consists of six counties. Cook County is the most populous of these and encompasses the City of Chicago.

into neighborhoods that were more white (on average) than Cook County as whole. The majority of these moves were outside of the Chicago city limits; however, it is notable that 10 percent of the participants were already residing in the suburbs prior to participating in the program. Differences between intake and placement neighborhoods are also evident in terms of education level, fraction of workers in white collar jobs, unemployment rate, income level, poverty rate, rate of government assistance, and fraction of families headed by a female. On each measure, we observe families moving from neighborhoods with characteristics indicative of economic deprivation into neighborhoods with average characteristics that resemble those for Cook County as a whole. As might be expected, the various characteristics of placement neighborhoods were highly correlated (shown in Appendix Table A2).

#### 3.2 Mortalities of Male Youth

Mortalities among the sample of male youth were identified through age 35 using the National Death Index (NDI), a national computerized index of death record information maintained by the National Center for Health Statistics (NCHS). Identifying information (name, date-of-birth, and social security number) for the sample was submitted to the NCHS and matched against the NDI to identify potential mortalities. Death certificates were obtained directly from the State vital statistics offices to verify mortalities in cases where matches against the NDI were inconclusive.<sup>10</sup>

<sup>&</sup>lt;sup>10</sup> We had anticipated some difficulty in identifying mortalities in cases with less than perfect matches against the NDI, but individual inspection comparing information on the death certificates (e.g., birthdate, name of spouse, address) against the Gautreaux records left little doubt which of the NDI matches were "true" and which were not. Nonetheless, the number of mortalities identified in the sample is potentially understated. It is well-known that matching against the NDI typically misses some percentage of actual mortalities, with higher error rates for blacks. Comparing NDI match results against a dataset of cancer patients with known mortality outcome, Calle and Terrell (1993) found that black male mortalities were correctly identified 95 percent of the time that a social security number was available and 86 percent of the time that no social security number was available, compared to 97

In all, 60 deaths were observed in our sample, with 53 of these occurring over the ages of 13 through 30. The implied annual mortality rates for our sample are a full order of magnitude higher than the national mortality rate for black male youth over this period.<sup>11</sup> Of the 60 deaths, more than half (32) were the result of homicide. Another 11 were the result of an automobile (9) or other accident. Thus, the variation in mortalities across neighborhoods analyzed in the following section primarily reflects variation in the risk of violent or accidental death as opposed to variation in exposure to environmental hazards or access to health care.

#### 4. Empirical Analysis

#### 4.1 Neighborhood Selection Analysis

Most previous analyses of the outcomes of Gautreaux participants regarded neighborhood placements as essentially random, at least during the period in which the Leadership Council employed a full time real estate staff to assist with placements (before 1990).<sup>12</sup> To test this assertion, we estimated the following OLS regression model over our sample of families containing at least one male youth:

# (1) $PlacePctWhite_f = \alpha_{yr} + \beta IntakePctWhite_f + \delta X_f + e_f$

percent and 87 percent for the sample as a whole. In our sample of Gautreaux male youth, 30 percent were missing social security numbers.

<sup>&</sup>lt;sup>11</sup> Calculating mortality rates as number of deaths divided by total person-years of post-placement observation time, the mortality rate was 1500 per 100,000 for those age 35 and younger and 2400 per 100,000 for those age 13 through 30. The national average mortality rate for black males ages 15 to 24 over the 1980s was 192.8 per 100,000 (NCHS, 2003).

<sup>&</sup>lt;sup>12</sup> An exception is Keels et al. (2003), who report changes in program administration around 1990 and find a number of correlations between family and placement neighborhood characteristics despite their restricted focus on pre-1990 placements. Both mother's age and number of children were found to be significantly correlated with characteristics of the placement neighborhood, and numerous characteristics of families' intake (pre-placement) neighborhoods were found to be significantly correlated with placement neighborhood characteristics.

where  $PlacePctWhite_f$  captures the percent of white residents in a family's placement tract, *IntakePctWhite\_f* captures the percent of white residents in a family's intake tract, and  $X_f$ represents a vector of family characteristics. Regression intercepts were allowed to vary by year of placement. In these regressions, as well as all that follow, the intake and placement tract variables were constructed to capture tract characteristics in the year of placement, interpolated (for years 1981 to 1989) and extrapolated (for years prior to 1980 and after 1990) based on data from the 1980 and 1990 Censuses.<sup>13</sup>

The results of this analysis are presented in Table 3. Columns 1 and 2 estimate the model with and without inclusion of the family covariates. As shown, the percent white in the family's intake tract is a significant determinant of the percent white in the placement tract – a finding that is robust to the inclusion of the family covariates. *PlacePctWhite* also increases significantly for families headed by a married female and those owning cars, and has a significant convex relationship with number of bedrooms requested.

The fact that car ownership and number of bedrooms requested affect placement comes as little surprise, as the Leadership Council likely collected such data to assist housing counselors in finding suitable housing for Gautreaux families. This finding indicates the importance of controlling for such household characteristics when analyzing the effect of placement neighborhood characteristics on participant outcomes, as they potentially affect male youth mortality rates.

The characteristics of families' intake neighborhoods are the clearest revelation of residential preferences we have for participating families. If placements were truly made without respect to families' preferences, we would expect no relationship between the percent white in the intake tract and the percent white in the placement tract. Instead, our results strongly suggest

<sup>&</sup>lt;sup>13</sup> Alternative results using 1980 Census tract characteristics were nearly identical to those reported here.

that participating families self-selected into placement neighborhoods where they felt more comfortable.

Given changes that occurred to the Gautreaux program over time, we re-estimated our model separately for families relocating before and after 1990 to investigate whether the determinants of neighborhood placement changed substantially when the real estate staff was eliminated. The results in columns 3 and 4 of Table 3 provide no evidence that self-selection into "whiter" neighborhoods was less prevalent in the pre-1990 period. In fact, just the opposite appears to be true, with the coefficient on *IntakePctWhite* significant and large in the pre-1990 regression, and insignificant and small in the post-1990 regression.

Similar analyses were conducted for each of the other placement neighborhood characteristics, with the coefficients on the corresponding intake tract characteristics presented in Table 4. These results are largely consistent with those in Table 3. Using the full sample, we find that the intake neighborhood characteristic is a significant predictor of the corresponding placement neighborhood characteristic in six of eight cases, the exceptions being percent of workers in white collar jobs and mean family income. When the analyses were conducted separately for pre- and post-1990 placements, we generally find larger coefficients on the intake characteristic in the pre-1990 period. Only in the case of percent white collar is the intake coefficient significantly larger in the post-1990 regression.

#### 4.2 Estimation Model for Mortality Analysis

We analyzed the effect of placement neighborhood characteristics on the post-placement mortality rates of male youth using the following Cox Proportional Hazard specification:

(2) 
$$\lambda(Age_i, X_i) = exp(X_i\beta) \lambda_0(Age_i)$$

where  $\lambda_0(Age_i)$  represents the (nonparametric) baseline mortality hazard at a particular age and the vector  $\beta$  captures the proportional effect of each covariate on the baseline mortality rate. Each Cox regression includes a single placement neighborhood characteristic. Placement neighborhood characteristics were modified when necessary so that higher values correspond to more-advantaged placement neighborhoods. Thus, the estimated  $\beta$ s capture the proportional effect of an "improvement" in the neighborhood characteristic on the post-placement mortality rate.

Due to the high degree of colinearity among our placement tract characteristics and the relatively low "failure" (i.e., mortality) rate, attempts to measure the marginal contribution of individual neighborhood characteristics proved unsuccessful. Our analysis detects the neighborhood characteristics that are the most strongly related to post-placement mortality, but cannot determine the independent contribution of each characteristic.

Our empirical strategy reflects the findings of our selection analysis, which indicate that placement neighborhood characteristics under Gautreaux were independent of neither the families' characteristics nor the characteristics of the families' intake neighborhoods. These results strongly caution against analyzing the effects of placement neighborhood on subsequent outcomes as if placements were randomly assigned. Failure to control for observed family characteristics will lead to biased estimates of the neighborhood effects on male youth mortality to the extent that such characteristics affect both neighborhood placement and male youth mortality rates. We deal with this issue in a straightforward way by controlling for family characteristics in our empirical model.

The fact that placement neighborhood characteristics are, in part, determined by intake neighborhood characteristics presents a more difficult challenge. This finding points to some

degree of self-selection by Gautreaux families into neighborhoods possessing characteristics they prefer. Unobserved preferences for certain neighborhood types potentially affect male youth mortality rates through mechanisms other than neighborhood choice, leading to bias even after controlling for family characteristics.

While we cannot directly control for unobserved neighborhood preferences, we do observe the characteristics of families' intake neighborhoods. The intake neighborhood characteristics are assumed to be reasonable, if noisy, proxies for unobserved neighborhood preferences. This assumption appears justified given the predictive power of intake neighborhood characteristics on placement neighborhood characteristics. By additionally controlling for the characteristics of the intake neighborhood, we can therefore absorb *some* of the variance in mortality rates that is related to unobserved preferences for different neighborhood types. If the estimated neighborhood effects on mortality are affected by inclusion of intake neighborhood characteristics, it suggests that prior estimates suffer from self-selection bias. Nor does the inclusion of intake characteristics fully alleviate such bias, since the intake characteristics are only noisy proxies for households' neighborhood preferences. However, if the estimates are robust to the inclusion of the intake neighborhood characteristics, this strongly suggests the estimates do *not* suffer from self-selection bias to any substantial degree.

In interpreting the results in this paper, it is important to keep in mind that we focus on the *placement* neighborhood and its effects on male youth mortality. After living in one's placement community for one year, Gautreaux families were free to relocate without restrictions and still retain their housing voucher. As such, the actual neighborhood of residence could have changed over the period of analysis, especially if Gautreaux families felt uncomfortable in their original placement neighborhoods (Clark, 1991). For interpreting our findings, this is an

important consideration. For instance, a weak association between mortality rates and the percent white in placement neighborhoods might result if families placed in predominantly white tracts were less likely to remain. Even if such relocations are prevalent, our findings are relevant for policy makers because policies that influence where assisted families move are probably more politically feasible than policies that force families to stay in assigned neighborhoods.

Moreover, evidence suggests that initial Gautreaux placements had an enduring effect on the neighborhoods Gautreaux families resided in many years later. Analyzing a random sample of 1506 Gautreaux families an average of 14 years after placement, DeLuca and Rosenbaum (2003) find that families continued to live in neighborhoods with characteristics surprisingly similar to the original placement neighborhoods. The only neighborhood characteristic that changed substantially from placement was the percent black, though families on the whole remained in neighborhoods that were more racially integrated than they did prior to moving. DeLuca and Rosenbaum also find that the percent black in placement neighborhoods was strongly predictive of the percent black in the families' most recent neighborhoods, even after controlling for household and intake neighborhood characteristics. In the same vein, Keels et al. (2003) find strong correlations between the racial composition and income levels of families' placement neighborhoods and their most recent neighborhoods.

#### 4.3 Results for Mortality Analysis

Two versions of our mortality hazard model were estimated, following the male youth from time of placement to time of mortality or censoring. All observations are censored if the person was still alive as of 12/31/1999 (the latest date on which mortalities could be identified). The first version of our model follows males (post-placement) through age 35. Since post-

placement mortalities were concentrated over the ages 13 through 30 (53 of 60), the second version follows males over this age range.

Table 5 presents estimates of the mortality hazard model through age 35. Each cell in each column presents the coefficient of interest from a separate Cox regression. As shown in column 1, each of the placement tract characteristics is significantly related to post-placement mortality rates when no other covariates are included. However, after including family characteristics as covariates (column 2), only three of the placement tract characteristics remain (weakly) significant predictors of mortality: percent with college degree, percent white collar and employment rate. In the cases of percent with college degree and percent white collar, a one percentage point increase is associated with about a two percent decrease in the mortality rate. A one percentage point increase in the employment rate is associated with a 2.8 percent decrease in the mortality rate.

We test the robustness of these estimates to unobserved preferences for neighborhood type in column 3 by including additional covariates capturing characteristics of the intake neighborhood. These covariates include a dummy variable for suburban intake neighborhoods and second-order (quadratic) controls for the eight other intake neighborhood characteristics. The three significant findings are robust to the inclusion of the intake characteristics, even growing slightly in magnitude, suggesting that these results are not driven by unobserved variation in neighborhood preferences. The effect on the remaining estimates is also minimal.

Since previous research has concentrated on placements occurring before 1990, we restrict our sample to pre-1990 placements in column 4. Doing so modestly attenuates most of the estimated coefficients, while the sample size reduction substantially reduces the precision of the estimates.

Table 6 reports similar estimates for males followed over the ages 13 through 30. These results provide somewhat stronger evidence that neighborhood characteristics affected postplacement mortality rates of the male youth. Excluding all other covariates (see column 1), we estimate significant coefficients for percent with college degree, percent white collar, and employment rate, and weakly significant coefficients for mean family income and percent on government assistance. In each case, the estimates are robust to the inclusion of family characteristics (column 2) and intake characteristics (column 3), even growing modestly in magnitude.<sup>14</sup> Again, the robustness of these estimates to the inclusion of the intake characteristics strongly suggests that they are not merely artifacts of self-selection bias, but that neighborhood characteristics do in fact affect post-placement mortality. Restricting the sample to males placed before 1990 again attenuates most of these estimates modestly, but the coefficient on the percent white collar remains weakly significant.

Since the majority of observed mortalities in our sample were due to homicide, we also investigated the effect of placement neighborhood characteristics on post-placement homicide rates. Specifically, we re-estimated our original version of equation (2) treating non-homicide mortalities as random censoring events. The main results from this analysis are included as Appendix Table A3. We find that the effect magnitudes are slightly larger across all characteristics in homicide model relative to the all-cause mortality model. The most noteworthy results pertain to the estimated effect of mean family income, which roughly doubles in magnitude relative to the all-cause mortality estimates.

We also estimated alternative versions of equation (2) to investigate potential nonlinearity in the neighborhood effects on all-cause mortality. For each placement tract

<sup>&</sup>lt;sup>14</sup> The coefficient on the percent not receiving government assistance just misses significance at the 10 percent level when intake characteristics are included, but is nonetheless stronger than in the previous two models.

characteristic, the continuous covariate was replaced with "high" and "low" indicator variables, corresponding to the upper and lower third of the distribution for that characteristic in our sample. The main results from this analysis are included as Appendix Table A4. Significant coefficients were only estimated for the "high" category of percent with college degree, percent white collar, and percent not receiving government assistance, while no significant coefficients were estimated for the "low" category indicators. These results suggest that relocations to substantially better neighborhoods led to substantial reductions in mortality rates, while relocations to modestly better neighborhoods led to fairly modest reductions, if any.

Together, these results provide compelling evidence that relocating to more-advantaged neighborhoods reduced post-placement mortality rates for male youth participating in Gautreaux. It is important to reiterate that the estimates presented here do not indicate the independent effect of a given placement characteristic, as neighborhoods that are more advantaged along one dimension are generally more advantaged along a number of dimensions. Nonetheless, we can conclude that certain neighborhood characteristics (e.g., percent with college degree, percent white collar, and employment rate) are associated with significant and substantial reductions in male mortality, and these associations do not appear to be driven by selection bias.

# 4.4 Community Level Predictors of Mortality

Conflicting results from recent MTO studies notwithstanding, it may come as no surprise that relocating to a "better" neighborhood decreases the mortality rate of poor black male youth. Have we learned anything particularly noteworthy? One way to answer this question is to determine whether our analysis provides different implications with respect to the predictors of black male youth mortality than could be gleaned from a simple community-level analysis.

We therefore analyzed the relationships between black male youth mortality rates in Chicago and the community characteristics in which they lived, looking over a similar period of time as our Gautreaux analysis. Mortality rates by census tract are unfortunately not available, but mortality rates within Chicago "community areas" could be estimated using mortality count data from the Illinois Center for Health Statistics.<sup>15</sup> Five-year mortality rates were generated by community area separately for black males ages 29 and younger in 1980 and for black males ages 15 through 29 in 1980. Identical Census tract characteristics as those used in the Gautreaux analysis were aggregated to the community area level to create analogous community area characteristics. We then regressed each of the estimated mortality rates on each community area characteristic in OLS regressions.

The results of our community area analysis are presented in Table 7. The proportional effect implied by each OLS coefficient is reported in brackets for comparability to the proportional hazard coefficients reported in Tables 5 and 6. For each neighborhood characteristic, the community area analysis produces stronger and more significant associations with black male youth mortality rates than those based on our Gautreaux sample. In the case of local poverty rates, the association with black male youth mortality rates is three to four times greater in the community area analysis, with large differences also observed for employment rate, mean family income, percent on government assistance and percent of families femaleheaded. Judging by the reported t-statistics, the community area analysis suggests that the local poverty rate and percent receiving government assistance are the most significant predictors of black male youth mortality. The estimates for percent with college degree and percent white collar, while statistically significant, are two of the weakest predictors of black male youth mortality. These results strike an important contrast with the findings from our Gautreaux

<sup>&</sup>lt;sup>15</sup> Details are provided in the Data Appendix.

analysis. The community area analysis suggests that the most important neighborhood predictors of black male youth mortality are related to neighborhood poverty levels, while our Gautreaux analysis suggests that the most important neighborhood predictors are related to human capital and work.

# 5. Conclusion

Despite assertions that placements under Gautreaux were "quasi-random," we find substantial evidence consistent with significant self-selection. Characteristics of a family's placement neighborhood were found to be significantly related to both family characteristics and characteristics of the family's intake neighborhood. Moreover, the relationship between intake and placement neighborhood characteristics appears to be no weaker during the period that the Leadership Council employed a full-time real estate staff to identify available units. These findings suggest that neighborhood effects estimated under previous analyses should be interpreted with caution, as estimated effects potentially suffer from omitted variable bias resulting from the self-selection of participating families into neighborhoods.

Nonetheless, it is clear that Gautreaux had a substantial effect on the neighborhood characteristics of participating families. While Gautreaux may not have been a "quasi-random experiment," it does appear to have induced wide variation in neighborhood characteristics for participating families. After controlling for a rich set of individual characteristics, we find that neighborhood characteristics related to human capital and work are significantly associated with the mortality rate of black male youth in Gautreaux. Importantly, these findings are robust to the inclusion of flexible controls for characteristics of one's intake neighborhood, which is a

reasonable proxy for a family's residential preferences. Based on the use of this proxy, the associations we document do not appear to be driven to any great extent by self-selection bias.

Our finding that placements in "better" neighborhoods reduced male youth mortality in Gautreaux stands in contrast to recent analyses of neighborhood effects on poor male youth who participated in MTO. Kling and Liebman (2004) document a negative effect of relocating to a better neighborhood on the physical health of male youth, and a positive effect on the likelihood of engaging in risky behaviors (e.g., alcohol, tobacco, and marijuana use). Kling, Ludwig, and Katz (2004), while finding a short-term reduction in the number of violent arrests among male youth relocating to better neighborhoods, find an increase in non-violent arrests and self-reported behavioral problems. MTO and Gautreaux were implemented in different cities and at different times, so we cannot rule out the possibility that findings from our analysis (or, for that matter, the MTO analyses) are specific to location and time period. Yet, aside from the short-term reduction in violent arrests, these findings might have led one to expect increased mortality rates among Gautreaux male youth relocating to better neighborhoods. Instead, we find the opposite. Even if moving to better neighborhoods leads to increased behavioral problems and more injuries, it is nonetheless possible that such neighborhoods shield poor black male youth from mortality risks specific to homicides or accidents, as about three quarters of the observed deaths in our Gautreaux sample were due to homicides (53 percent) and accidents (18 percent).

Our findings are also notable for what they say about which neighborhood characteristics are the most important determinants of mortality rates for black male youth. Specifically, we find that neighborhood characteristics relating to human capital and work are most strongly associated with post-placement mortality rates, while neighborhood poverty rates, racial composition, and female headship rates demonstrate negligible, insignificant associations. This

stands in contrast to our analysis of black male mortality rates across Chicago community areas which identified the local poverty rate as the strongest predictor of mortality.

Since the first evaluations of Gautreaux appeared more than a decade ago, there has been increased attention on the role that housing policy can play in improving outcomes for families receiving housing assistance, particularly with regard to policies compelling families to reside in neighborhoods possessing certain characteristics. In contrast to the goals of Gautreaux (relocating black families to "whiter" neighborhoods) and MTO (relocating families to lower poverty neighborhoods), our analysis indicates that directing families to neighborhoods with stronger human capital and labor force characteristics would be more successful at reducing mortality among black male youth. While this is only one outcome that policy makers have to consider, it is nonetheless an important one. Additional research in this vein can hopefully better illuminate which neighborhood characteristics deserve the most attention in developing housing programs for the poor.

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### **Data Appendix**

#### A1. The Gautreaux Dataset

Electronic and paper files pertaining to all Gautreaux participants were created by the Leadership Council and provided by the U.S. Department of Housing and Urban Development for the purpose of this study. Existing electronic datasets created by the Leadership Council contained participants' dates of intake and placement, addresses (intake and placement), and identifying information for each member in the participating household (name, sex, date-of-birth, and social security number). The data in these computerized files were verified against the original paper files for accuracy. In addition, the following additional variables were constructed from the paper files:

- Marital status (from intake sheet)
- Number of bedrooms required (intake sheet)<sup>16</sup>
- Automobile ownership (intake sheet)
- Employment status (intake sheet)
- Total monthly income (intake sheet)
- Annual employment income (from HUD Form 50059<sup>17</sup>)

The verification of the electronic data and construction of additional variables was performed under contract by Microsystems, Inc. of Evanston, IL. In all, the original Gautreaux dataset consisted of 5374 families with 5393 recorded relocation events. Dropping participants with multiple recorded placements (19 relocation records<sup>18</sup>) and restricting the sample to those placed

<sup>&</sup>lt;sup>16</sup> Calculated by Leadership Council staff based on the age and sex composition of the household.

<sup>&</sup>lt;sup>17</sup> Also known as the Owner's Certification of Compliance with HUD's Tenant Eligibility and Rent Procedures.

<sup>&</sup>lt;sup>18</sup> A total of 17 families were recorded as having two Gautreaux-related relocations and another family was recorded as having three relocations.

between 1976 and 1994 (to allow for sufficient follow-up time) left a remaining sample of 5256 participating families, each with a single relocation record.

Intake and placement addresses were geocoded using Etak® Geocoding Software to determine address latitude and longitude and 1990 Census tract. The longitude and latitude of each address were then used to determine the 1980 Census tract containing the address. This task was accomplished using ArcView® geographic software and a geographic (GIS) dataset of the 1980 Chicago MSA census tract lines provided by the Joseph R. Regenstein Library and the University of Chicago.<sup>19</sup> Eight records were dropped, either for a missing intake address (1) or an intake zip outside of IL (7). Another 87 records were dropped because of missing placement addresses (86) or placement zips outside of IL (1). Finally, another 111 families were dropped because their intake or placement addresses could not be successfully matched to addresses in the Etak® database. For 289 intake addresses and 532 placement addresses, matching the address to an address in the Etak® database required making a small modification to the address, usually a spelling correction or small adjustment to the street address number.

In 156 cases, the placement tract was identical to the intake tract, and in 104 of these the intake and placement addresses were identical. Since it seems unlikely that participating in Gautreaux affected the placement tract in which these families resided, all 156 were dropped, reducing the sample to 4895 participating families. For the current analysis, we kept only families containing a male age 25 or younger at the date of placement, leaving a sample of 2474 families with 3580 male youth.

<sup>&</sup>lt;sup>19</sup> Available at www.lib.uchicago.edu/e/su/maps/chigis.html.

#### A2. Estimated Community Area Mortality Rates

At our request, the Illinois Center of Health Statistics provided count data for the number of mortalities among black male youth over the years 1981 to 1985 in 65 Chicago community areas. Data were not available for another 12 community areas. The community areas consisted of 12.4 census tracts, on average. The mortality counts were constructed in two ways. *Mortality\_0\_29* was constructed by summing mortalities for black males age 29 or younger in 1980. *Mortality\_15\_29* was constructed by summing mortalities for black males ages 15 through 29 in 1980. These variables were used as the numerators in our community area mortality rate estimates.

To construct the denominator for these estimates, we used population count data from the 1980 Census. The count of black males under age 14 residing in each community area could be directly calculated by summing over the relevant census tract variables. The count of black males ages 15 through 29 was inferred by assuming that, within each tract, blacks comprised the same fraction of males ages 15 to 29 as for males ages 5 to 14.<sup>20</sup> Dividing *Mortality\_0\_29* by the estimated number of black males ages 0 through 29 residing in the community area provided an estimate of the five-year mortality rate for this group. Dividing *Mortality\_15\_29* by the estimated number of black males ages 15 through 29 provided a similar mortality rate estimate for older black male youth. Given that these estimates ignore mobility over the years between 1980 and 1985, and given the necessity of estimating population counts for the older youth, these mortality rate calculations should only be interpreted as estimates.

<sup>&</sup>lt;sup>20</sup> Population counts by age are not as finely disaggregated for individual racial groups in the Census data, but are given in five-year spans by gender.

Characteristic	Percent / Mean (sd)
Family headed by married female	16.8 %
Family headed by married male	10.0 %
Family headed by single male	1.3 %
Age of family head	30.1 (7.2)
Family head working	23.2 %
Annual employment income if head working (1979 \$s)	7166 (2907)
Total monthly income if head not working (1979 \$s)	249 (91)
Family owns car	22.8 %
Number of persons in family	3.6 (1.3)
Bedrooms requested	2.7 (0.7)
Placement age of male youth	8.4 (6.0)

# Table 1 Family and Individual Characteristics

Notes: sd = standard deviation. Sample consists of male youth age 25 or younger at placement (N=3580).

	Percent / Mean (sd)			
Tract Characteristic	Intake Address	Placement Address	Cook County	
In suburban tract	10.2 %	62.9 %	43.2 % <sup>a</sup>	
Percent white, non-hispanic	13.6 (25.8)	67.5 (33.5)	63.6 (38.5)	
Percent adults w/ college degree	7.1 (8.5)	18.6 (12.5)	16.0 (14.4)	
Percent workers white collar	32.1 (9.4)	41.2 (12.6)	40.8 (14.2)	
Percent labor force employed	81.6 (9.4)	92.4 (5.4)	91.5 (6.5)	
Mean family income (1979 \$1000s)	15.6 (6.9)	25.1 (8.1)	25.9 (10.5)	
Percent non-elderly in poverty	38.1 (23.3)	13.2 (14.5)	13.7 (15.2)	
Percent HHs on gov't assistance	35.6 (22.9)	9.5 (12.0)	11.1 (14.1)	
Percent families female-headed	54.6 (22.8)	23.3 (18.7)	24.6 (19.6)	

# Table 2 **1980 Census Tract Characteristics**

Notes: sd = standard deviation. Statistics for intake and placement address based on sample of all male youth age 25 or younger at placement (N=3580). Statistics for Cook County based on entire county population. <sup>a</sup> Tract counted as suburban if any part of tract is located outside of the Chicago municipality boundaries.

	Dependent Variable = Percent White Race (placement)			
	Full Sample	Full Sample	Pre-1990	Post-1990
$\mathbf{D}_{1}$	.10**	.09**	.14**	.04
Percent white (intake)	(4.44)	(3.85)	(3.61)	(1.53)
Head married female		5.10**	6.97**	2.62
fiead married female		(3.85)	(3.10)	(1.36)
Head married male		1.38	1.87	.02
field married male		(.59)	(.60)	(.00)
Head single male		-2.94	-6.84	2.52
field single male		(57)	(97)	(.51)
Bedrooms required		-14.94**	-14.01*	-8.93
Bearbonis required		(-2.51)	(-1.70)	(87)
Bedrooms required sqrd		2.64**	2.76**	.98
Dearoonis required sqru		(2.50)	(1.98)	(.51)
Owns car		6.61**	9.44**	1.75
Owns car		(4.49)	(4.42)	(.99)
Head works		9.86	18.43	-24.90
fiead works		(.43)	(.57)	(81)
Log earnings		-1.61	-4.31	3.60
Log carnings		(78)	(-1.54)	(1.35)
Log income		.01	-2.16	.91
		(.00)	(51)	(.24)
Age and family size	No	Yes	Yes	Yes
Placement year	Yes	Yes	Yes	Yes
R-squared	.214	.237	.228	.204
F test on individual Xs		<.001	<.001	.003
Ν	2474	2474	1468	1006

 Table 3

 Association of Percent White in Placement and Origin Neighborhoods

Notes: Sample includes Gautreaux families containing males age 25 or younger at placement. OLS coefficients reported for full sample of families (N=2474) and separately for households placed before and after 1990. Tract data is based on 1980 and 1990 Censuses. Log earnings set to zero for households with non-working head. Log income set to zero for households with working head and censored from below at \$160/month for others. Results omitted for the following covariates: indicator for censored log income; age of household head (cubic); family size (quadratic); and set of indicators for placement year. *F test* reports p-value for test of joint significance for covariates other than intake tract characteristics and placement year indicators. Robust t-statistics reported in parentheses. \* = p-value <.10. \*\* = p-value <.05

			Depende	nt Variable (Place	ement Tract Charac	teristic)		
	Suburban Tract	Percent w/ College Degree	Percent White Collar	Employment Rate	Mean Family Income	Poverty Rate	Percent HHs on Gov't Assistance	Percent Families Female-Headed
				Panel A: Full S	ample (N=2724)			
Intake Tract Characteristic	1.24** (5.63)	.09** (3.14)	.02 (1.14)	.02** (2.49)	.01 (.55)	.05** (4.72)	.04** (4.16)	.07** (4.68)
R-squared	.335	.130	.145	.258	.140	.265	.252	.218
			<u>Pa</u>	nel B: Pre-1990 F	lacements (N=1468	<u>3)</u>		
Intake Tract Characteristic	1.70** (5.91)	.07 (1.60)	02 (.56)	.04** (2.71)	.12 (.39)	.07** (4.34)	.06** (4.47)	.12** (4.93)
R-squared	.195	.166	.177	.213	.160	.208	.206	.207
			Par	nel C: Post-1990 ]	Placements (N=100	<u>6)</u>		
Intake Tract Characteristic	.25 (.66)	.11** (2.86)	.06** (2.03)	.01 (.58)	.01 (.38)	.02** (2.03)	.00 (.23)	.02 (.95)
R-squared	.477	.073	.084	.248	.067	.249	.223	.158

Table 4
Association of Placement and Origin Neighborhood Characteristics

Notes: Panels A, B, and C correspond to equation 1 as used for Table 3 in columns 2, 3, and 4 respectively -- with each entry in this table based on a separate model estimated using a different placement/origin tract characteristic instead of the fraction white used in Table 3. Sample includes Gautreaux households containing males age 25 or younger at placement. Tract data is based on 1980 and 1990 Censuses. Suburban tract results report coefficients from logit regression (and pseudo R-squared). All other models report OLS coefficients. Robust t-statistics reported in parentheses. \*= p-value <.05

Placement Tract Covariate	1	2	3	4
Suburban address	.547**	.907	.907	.923
	(2.34)	(.36)	(.35)	(.27)
	[-487]	[-451]	[-444]	[-379]
Percent white, non-hispanic	.993*	.998	.998	.999
	(1.83)	(.64)	(.61)	(.25)
	[-488]	[-451]	[-444]	[-379]
Percent w/ college degree	.972**	.979*	.978**	.984
	(2.59)	(1.95)	(1.99)	(1.39)
	[-486]	[-449]	[-442]	[-378]
Percent white collar	.972**	.980*	.979*	.984
	(2.67)	(1.81)	(1.81)	(1.30)
	[-486]	[-449]	[-442]	[-379]
Percent labor force employed	.955**	.972*	.971*	.979
	(3.08)	(1.67)	(1.68)	(1.10)
	[-486]	[-449]	[-443]	[-379]
Mean family income (1979 \$1000s)	.966**	.982	.982	.986
	(2.22)	(1.31)	(1.31)	(.99)
	[-487]	[-450]	[-443]	[-379]
100 - Poverty rate	.983**	.994	.994	.995
	(2.48)	(.81)	(.78)	(.58)
	[-487]	[-450]	[-444]	[-379]
100 - Percent on government assistance	.976**	.988	.988	.991
	(2.75)	(1.27)	(1.23)	(.91)
	[-486]	[-450]	[-443]	[-379]
100 - Percent families female-headed	.988** (2.06) [-488]	.995 (.90) [-450]	.995 (.91) [-444]	.996 (.66) [-379]
Sample size	3580	3580	3580	2137
HH covariates included	NO	YES	YES	YES
Intake tract covars included	NO	NO	YES	YES
Pre-1990 placements only	NO	NO	NO	YES

 Table 5

 Effect of Placement Tract Characteristics on Post-Placement Mortality Rates, Ages 0-35

Notes: Each cell in this table is based on results from a separate estimation of equation 2 (i.e., only one placement tract characteristic was included in each regression). Post-placement mortality rates estimated through age 35 under Cox Proportional Hazard specification. The effect on the log of the hazard rate is reported for the covariate of interest, with z-statistics in parentheses and log-likelihood for the regression in brackets. Sample consists of males age 25 or younger at placement. Tract data is based on 1980 and 1990 Censuses. *HH covariates* include controls for sex and marital status of head (indicators), age of head (cubic), bedrooms requested (quadratic), family size (quadratic), car ownership (indicator), head working (indicator), log employment income (if head working), log total income (if head non-working), placement age (quadratic), and date of placement (quadratic). *Intake tract covariates* include (quadratic) controls for percent non-white, percent with less than college degree, percent workers in white collar jobs, employment rate, mean family income, non-elderly poverty rate, percent households receiving public assistance, and percent households headed by a female, and an indicator for suburban intake address. Column 4 excludes males who were placed after 1989. \* = p-value <.10. \*\* = p-value <.05.

Placement Tract Covariate	1	2	3	4
Suburban address	.723	.786	.780	.787
	(1.17)	(.82)	(.82)	(.74)
	[-394]	[-381]	[-373]	[-312]
Percent white, non-hispanic	.995	.995	.995	.996
	(1.32)	(1.23)	(1.21)	(.79)
	[-394]	[-381]	[-372]	[-311]
Percent w/ college degree	.975**	.974**	.973**	.980
	(2.18)	(2.19)	(2.22)	(1.60)
	[-392]	[-379]	[-370]	[-310]
Percent white collar	.974**	.975**	.974**	.978*
	(2.26)	(2.11)	(2.14)	(1.66)
	[-392]	[-379]	[-370]	[-310]
Percent labor force employed	.964**	.963**	.962**	.972
	(2.19)	(2.12)	(2.12)	(1.46)
	[-392]	[-380]	[-371]	[-311]
Mean family income (1979 \$1000s)	.972*	.972*	.971*	.977
	(1.79)	(1.67)	(1.71)	(1.31)
	[-392]	[-380]	[-371]	[-311]
100 - Poverty rate	.989	.989	.988	.990
	(1.50)	(1.37)	(1.38)	(1.12)
	[-393]	[-381]	[-372]	[-311]
100 - Percent on government assistance	.984*	.984*	.983	.986
	(1.71)	(1.66)	(1.63)	(1.25)
	[-393]	[-380]	[-372]	[-311]
100 - Percent families female-headed	.992 (1.32) [-394]	.991 (1.37) [-381]	.991 (1.37) [-372]	.993 (1.06) [-311]
Sample size	2850	2850	2850	2072
HH covariates included	NO	YES	YES	YES
Intake tract covars included	NO	NO	YES	YES
Pre-1990 placements only	NO	NO	NO	YES

 Table 6

 Effect of Placement Tract Characteristics on Post-Placement Mortality Rates, Ages 13-30

Notes: Each cell in this table is based on results from a separate estimation of equation 2 (i.e., only one placement tract characteristic was included in each regression). Post-placement mortality rates estimated over ages 13 through 30 under Cox Proportional Hazard specification. The effect on the log of the hazard rate is reported for the covariate of interest, with z-statistics in parentheses and log-likelihood for the regression in brackets. Otherwise, all notes for Table 5 apply. \* = p-value <.10. \*\* = p-value <.05.

	Age Range of Mortality Rate Variable		
Covariate	Ages 0-29 in 1980	Ages 15-29 in 1980	
Percent white, non-hispanic	00002 (.85) [1.00]	00007 (1.38) [.99]	
Percent w/ college degree	00010* (1.90) [.99]	00025** (2.85) [.97]	
Percent white collar	00013** (2.49) [.98]	00032** (3.46) [.96]	
Percent labor force employed	00037** (4.03) [.94]	00084** (5.02) [.91]	
Mean family income (1979 \$1000s)	000003** (3.54) [.96]	000006** (3.98) [.94]	
100 - Poverty Rate	00017** (5.70) [.97]	00035*** (6.32) [.96]	
100 - Percent on government assistance	00017** (4.97) [.97]	00036** (5.89) [.96]	
100 - Percent families female-headed	00012** (3.79) [.98]	00026** (4.21) [.97]	
Sample size	56	56	

# Table 7Correlates of Five-Year Mortality Rates in Chicago Community Areas,<br/>Black Males Ages 0-29 and 15-29 in 1980

Notes: Each cell in this table reports results from a separate, univariate OLS regression model (i.e., only one placement tract characteristic was included in each regression). The dependent variable is a community area's five-year mortality rate for black males over the age ranges specified (see text for details). Of the original 65 community areas in Chicago, nine were dropped due to black male youth population equal to zero in 1980. Regressions are weighted by the count of black males in the community area used in calculating the mortality rate. Robust t-statistics are in parentheses. Implied proportional mortality risk associated with one unit increase in covariate is reported in brackets. \* = p-value <.1. \*\* = p-value <.05.

<b>Placement Year</b>	Male Youth (count)	Households (count)
1976-1979	44	37
1980	18	15
1981	45	32
1982	52	39
1983	483	315
1984	360	248
1985	323	213
1986	253	172
1987	190	135
1988	147	103
1989	222	159
1990	197	136
1991	247	176
1992	322	243
1993	431	274
1994	246	177
Total	3580	2474

Table A1Gautreaux Placements

	Suburban Placement	Percent White Race	Percent w/ College Deg.	Percent White Collar	Employment Rate	Mean Family Income	100 - Poverty Rate	100 - Percent on Govt Asst.
Percent White Race	.78							
Percent with College Degree	.24	.53						
Percent White Collar	.25	.51	.89					
Employment Rate	.69	.86	.61	.54				
Mean Family Income	.37	.62	.71	.68	.59			
100 - Poverty Rate	.78	.86	.50	.48	.89	.59		
100 - Percent HHs on Govt Assistance	.72	.86	.54	.49	.92	.57	.94	
100 - Percent families Female-Headed	.72	.88	.46	.36	.87	.57	.89	.89

Table A2Placement Tract Characteristic Correlations

Notes: All correlations are significant with p-values < .0001.

	Homicide Ra	ate Age Range
Placement Tract Covariate	Ages 0-35	Ages 13-30
Suburban address	.631	.594
	(1.15)	(1.23)
	[-226]	[-197]
Percent white, non-hispanic	.994	.992
· •	(1.18)	(1.34)
	[-226]	[-197]
Percent w/ college degree	.964**	.964**
	(2.10)	(2.00)
	[-224]	[-195]
Percent white collar	.973*	.972*
	(1.68)	(1.67)
	[-225]	[-196]
Percent labor force employed	.960*	.955**
	(1.79)	(1.99)
	[-225]	[-196]
Mean family income (1979 \$1000s)	.953*	.946**
•	(1.91)	(2.03)
	[-224]	[-195]
100 - Poverty rate	.989	.984
	(1.03)	(1.39)
	[-226]	[-197]
100 - Percent on government assistance	.984	.979
-	(1.22)	(1.57)
	[-226]	[-196]
100 - Percent families female-headed	.990	.988
	(1.29)	(1.44)
	[-226]	[-197]
Sample size	3580	2850

 Table A3

 Effect of Placement Tract Characteristics on Post-Placement Homicide Rates

Notes: Each cell in this table is based on results from a separate estimation of equation 2 (i.e., only one placement tract characteristic was included in each regression), with non-homicide mortalities treated as random censoring events. Results based on Cox Proportional Hazard specification estimated over the age range specified. The effect on the log of the hazard rate is reported for the covariate of interest, with z-statistics in parentheses and log-likelihood for the regression in brackets. *HH covariates* and *Intake tract covariates* included in all models (see Table 5 notes). \* = p-value <.10. \*\* = p-value <.05.

		Mortality Ra	ate Age Range
Characteristic	Covariates	Ages 0-35	Ages 13-30
Percent white	Lowest third	1.122	1.339
	Highest third	(.34) 1.018 (.05)	(.81) 1.017 (.04)
Percent w/ college degree	Lowest third	.783	.807
	Highest third	(.84) .349** (2.58)	(.70) .305** (2.62)
Percent white collar	Lowest third	1.052	1.252
	Highest third	(.18) .330** (2.46)	(.73) .371** (2.04)
Percent labor force employed	Lowest third	1.023	1.086
	Highest third	(.07) .671 (1.02)	(.26) .546 (1.37)
Mean family income	Lowest third	1.023	1.135
	Highest third	(.07) .538 (1.59)	(.39) .429* (1.89)
100 - Poverty Rate	Lowest third	1.153	1.274
	Highest third	(.42) 1.142 (.42)	(.68) .952 (.12)
100 - Percent on govt asst.	Lowest third	.610	.662
	Highest third	(1.63) .397** (2.43)	(1.29) .362** (2.35)
100 - Percent female-headed	Lowest third	1.371	1.471
	Highest third	(.93) 1.079 (.21)	(1.10) .993 (.02)
Sample Size		3580	2850

# Table A4 Effect of Placement Tract Characteristics on Post-Placement Mortality Rates Non-Linear Estimates

Notes: Results for each pair of lowest third/highest third indicators are based on separate estimation of equation 2. "Lowest third" indicator is set equal to 1 if placement tract characteristic is in bottom third of observed distribution. "Highest third" indicator is set equal to 1 if placement tract characteristic is in top third of observed distribution. Results based on Cox Proportional Hazard specification estimated over the age range specified. The effect on the log of the hazard rate is reported for each indicator covariate, with z-statistics in parentheses. *HH covariates* and *Intake tract covariates* included in all models (see Table 5 notes). \* = p-value <.10. \*\* = p-value <.05.