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data for a diverse and equitable future

The Child Opportunity Index 2.0

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The Heller School

FOR SOCIAL POLICY AND MANAGEMENT



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Inequality of Neighborhood Opportunity

- Children are growing up in vastly different neighborhood environments
- Based on 28 indicators of child-related neighborhood features, the Child Opportunity Index 2.0 (COI) captures multiple dimensions of neighborhood opportunity in a single aggregate metric
- The COI allows you to
 - Quantify the effect of neighborhoods on children's outcomes
 - Compare neighborhoods, and patterns of neighborhood inequality (for example, by race/ethnicity) across US and over time
 - Explore (potentially policy-amenable) mechanisms

Based on COI 1.0 (2014)

• Examples of academic research using the COI:

- Roubinov et al. "Family Socioeconomic Status, Cortisol, and Physical Health in Early Childhood: The Role of Advantageous Neighborhood Characteristics." *Psychosomatic Medicine*, 2018
- Beck et al. "The Child Opportunity Index and Disparities in Pediatric Asthma Hospitalizations." *Journal of Pediatrics*, 2017
- Kersten et al. "Neighborhood Child Opportunity and Individual-Level Pediatric Acute Care Use and Diagnoses." *Pediatrics*, 2018

• Other users

- Departments of Public Health
- Children's Hospitals
- State (e.g., housing) and local (e.g., child welfare) agencies
- Community organizations

Child Opportunity Index (COI) vs. Opportunity Atlas

Child Opportunity Index

- Census-tract level composite index based on 28 indicators covering three domains
 - Education
 - Health and Environment
 - Social and Economic
- Focus on measuring contemporary features of neighborhoods theorized to influence healthy child development
- Neighborhood conditions as of 2010 and 2015

Opportunity Atlas (Chetty et al. 2018)

- Census-tract level indicators of longterm outcomes associated with growing up in different neighborhoods
 - Household income rank
 - Marital status
 - Incarceration
- Effects of neighborhoods as they were 15-20 years ago
- No information about features of neighborhoods generating these effects

The Child Opportunity Index 2.0

- Goal: Measure multiple neighborhood features related to healthy child development, choosing input over proxy/outcome measures whenever possible
- COI 2.0 composite Index based on **28 neighborhood-level indicators** grouped into three domains
 - Education
 - Health & Environment
 - Social & Economic
- Comparable data for all census tracts in 2010 and 2015

Education Domain

Context

- Adult educational attainment. Percent with college degree or higher. American Community Survey (ACS).
- College enrollment. Percent enrolled in college, Ages 18-24. ACS.
- School poverty rates (not yet included). Percent students eligible for free- and reduced-price lunch. NCES.

Early Childhood Education

- ECE centers of any type within a five-mile radius. Own data collection from state and federal sources.
- NAEYC accredited ECE centers within a five-mile radius. Own data collection from state and federal sources.
- ECE Enrollment. Percent 3- and 4-year olds enrolled in nursery school, preschool, or kindergarten. ACS.

Outcomes (not yet included)

- Fourth-grade reading proficiency. Own data collection plus GreatSchools data.
- Fourth-grade math proficiency. Own data collection plus GreatSchools data.
- High school graduation rate. Own data collection plus GreatSchools data.

Health and Environment Domain

Health Care Access

• Health insurance coverage. Percent population aged 0-64 with health insurance coverage. ACS.

Healthy Environments

- Access to healthy food. Percent household without vehicle access living more than 0.5 miles from the nearest supermarket. USDA.
- Access to green space. Percent developed imperviousness. CDC.
- Walkability. EPA Walkability Index.
- Housing vacancy rates. Percent of housing units that are vacant. ACS.

Toxic Exposures

- Heat exposure. Days with maximum temperatures above 90F. CDC.
- Exposure to toxic substances. RSEI Index. EPA.
- Exposure to superfund sites. EPA.
- Microparticle concentration. PM 2.5. CDC.
- Ozone concentration. CDC.

Social & Economic Domain

Family structure

• Single parenthood. Percent families with a single parent. ACS.

Economic Opportunities

- Prime-age unemployment rate. Percent unemployed in active civilian labor force, ages 25-54. ACS.
- **Prime-age employment to population ratio.** Percent population ages 25-54 employed in civilian labor force. ACS.
- Percent with long commute. Percent employed traveling 60 minutes or more to workplace. ACS.

Economic Resources

- **Poverty rate.** Percent population living in families/households below 100% of the FPL. ACS.
- **Public assistance rate**. Percent population receiving SNAP benefit. ACS.
- **High skill employment.** Percent employees in professional, technical, and managerial occupations. ACS.
- Median household income, in 2017 US Dollars. ACS.
- \rightarrow Combined into *economic resources* index using principal component analysis.

Index Construction

- Spatial indicators calculated at block-level and aggregated to census tract level
- All indicators standardized using 2010 national means and standard deviations
- Sign-reversed (if applicable) and top-/bottom-coded at four standard deviations above/below mean
- Aggregated to domain scores using weights that are a hybrid of
 - Unity weights. Each indicator counts equally within each domain
 - Empirical weights calculated from the bivariate correlation between 2010 indicator values and tract-level outcome data from the Opportunity Atlas and the CDC 500 Cities Project
- Domain scores averaged into aggregate COI score using similar approach

Weighting and Predictive Validity

• Unity weights: Each indicator is equally important

- Least bad solution if you have no idea what weights should be (Haggerty and Land)
- "Empirical weights" a function of how well indicators predict outcomes (→ predictive validity)
 - Need: Average causal effect for 28 indicators
 - Have: Bivariate correlation between every indicator and tract-level SES and health outcomes in representative/recent data
- Hybrid weights: Average of empirical and unity weights
 - Shrinks large weights and inflates small empirical weights
 - Guards against bias in empirical weight estimates

Outcomes for Constructing Weights

- Tract-level adult outcome data from 500 Cities and Opportunity Atlas
- Socio-economic long-term outcomes from Opportunity Atlas (Chetty et al.)
 - Mean household income rank at age 35 for individuals with parents at the median of the parent income distribution
 - **Probability of living in a low poverty census tract** at age 35 for individuals with parents at the median of the parent income distribution
- Summary health outcomes from 500 Cities Project (CDC, RWJF)
 - Mental health not good for 14 or more days among adults aged 18 years and older
 - **Physical health** not good for 14 or more days among adults aged 18 years and older

Hybrid Weights

1. Calculate hybrid weight for indicator j as $w_j = (rho_j + 1) / 2$

- a. Calculate bivariate correlation (Pearson's rho) with each of the four outcomes and all 2010 indicator z-scores.
- b. Average rhos for each indicator j across outcomes
- c. Rescale averaged rhos within domains so that their sum equals the number of indicators in the respective domain (= rho_i)

2. Sensitivity analyses

- a. Re-estimate correlations with county fixed effects and controlling for economic resources and population density
- b. Relative magnitudes of hybrid weights within domains quite robust



Hybrid Weights (Preliminary Results): Education Domain



Hybrid Weights (Preliminary Results): Health and Environment Domain



Opportunity Atlas Life Expectancy (CDC USALEEP) 500 Cities



2015 data, only outcomes not used for constructing weights

OA indicators: HH income rank (p25), HH in low poverty neighborhood (p25), in top 20% of HH income distribution (p25, p50)

500 Cities indicators: Obesity, diabetes, smoking, limited physical activity, asthma

Average correlation coefficients (Preliminary Results)



2015 data, only outcomes not used for constructing weights

OA indicators: HH income rank (p25), HH in low poverty neighborhood (p25), in top 20% of HH income distribution (p25, p50)

500 Cities indicators: Obesity, diabetes, smoking, limited physical activity, asthma

Empirical weights = rescaled average bivariate correlations

Summary

- COI 2.0 captures multidimensional neighborhood effects
- COI 2.0 is highly correlated with adult SES and health indicators
- Provides current information on specific neighborhood features that shape opportunities for children
- Next steps
 - Data/visualizations to be launched on redeveloped website, summer 2019
 - Sign up for our mailing list on diversitydatakids.org for updates