

Integrating social and genomic landscapes to reduce cancer outcome disparities

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Structural racism is a critical social determinant of health.

It is a current public health issue.

It is a result of injustice.



Non-Small Cell Lung Cancer (NSCLC) Outcome Disparities

- Non-Hispanic Black/African American individuals develop NSCLC 5 years earlier than non-Hispanic White individuals.
- African Americans have higher NSCLC incidence and mortality rates than their non-Hispanic white counterparts.

- Black women in the US who never smoked have a higher incidence of NSCLC compared with non-smokers of European and Asian descent.
- Additionally, Black women who never smoked have higher mortality from NSCLC when compared to never smoking women of other races.

 As a result of structural racism in the US, Black communities have disproportionately higher exposure to adverse neighborhood-level factors, many of which are linked to lung cancer risk.

Yang R, Cheung MC, Byrne MM, et al. Do racial or socioeconomic disparities exist in lung cancer treatment? *Cancer*. 2010;116(10):2437-2447. DeSantis CE, Miller KD, Goding Sauer A, Jemal A, Siegel RL. Cancer statistics for African Americans, 2019. *CA Cancer J Clin*. 2019;69(3):211-233. Lee Y-C, Calderon-Candelario RA, Holt GE, Campos MA, Mirsaeidi M. State-Level Disparity in Lung Cancer Survival in the United States. *Frontiers in Oncology*. 2020;10(1449). American Cancer Society. Cancer Facts & Figures for African Americans 2019-2021.



Residential Segregation and risk of lung cancer



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- Established in 2001, the Southern Community Cohort Study (SCCS) is a prospective cohort of more than 80,000 individuals from 12 southern states.
- Participants:
 - 71,644 individuals previously recruited to SCCS were included in the analysis
- Data collection
 - Outcome: Incident lung cancer cases (via linkage to state cancer registries & National Death Index)
 - Exposure: Isolation Index (ranging from 0 to 1), with higher scores indicating a greater degree of isolation. The census block calculations were based on Census 2010 SF1 P3 data tables linked to participants' addresses that were provided at baseline.
 - Covariates: Demographics, Smoking Status, Secondhand Smoke Exposure
- Statistical Method: Parametric G computation, Mediation Analysis

The distribution of the Isolation Index within the SCCS catchment (12 states)



Demographic characteristics of the Southern Community Cohort Study

| | Overall, | NHW, | AA, | |
|--|-------------------------|-------------------------|-------------------------|----------------------|
| | N = 71,634 ¹ | N = 20,736 ¹ | N = 50,898 ¹ | p-value ² |
| Lung cancer cases | 1,727 (2.4%) | 566 (2.7%) | 1,161 (2.3%) | <0.001 |
| Isolation Index | 0.65 (0.26, 0.90) | 0.15 (0.04, 0.39) | 0.81 (0.55, 0.94) | <0.001 |
| PM _{2.5} (ug/ml) | 10.88 (9.86, 12.02) | 10.44 (9.35, 11.90) | 11.02 (10.09, 12.04) | <0.001 |
| (missing) | 325 (0.5%) | 195 (0.9%) | 130 (0.3%) | |
| Sex | | | | <0.001 |
| Female | 42,032 (59%) | 12,561 (61%) | 29,471 (58%) | |
| Male | 29,602 (41%) | 8,175 (39%) | 21,427 (42%) | |
| Smoking Status | | | | <0.001 |
| Current | 30,092 (42%) | 8,120 (39%) | 21,972 (43%) | |
| Former | 15,725 (22%) | 5,673 (27%) | 10,052 (20%) | |
| Never | 25,817 (36%) | 6,943 (33%) | 18,874 (37%) | |
| Age | 50 (45, 57) | 52 (46, 59) | 50 (45, 56) | <0.001 |
| Educational Attainment | | | | <0.001 |
| Less than 9 years | 5,687 (7.9%) | 1,674 (8.1%) | 4,013 (7.9%) | |
| HS or below college | 43,534 (61%) | 11,191 (54%) | 32,343 (64%) | |
| College and above | 22,372 (31%) | 7,861 (38%) | 14,511 (29%) | |
| Not Reported | 41 (<0.1%) | 10 (<0.1%) | 31 (<0.1%) | |
| Household Income Attainment | | | | <0.001 |
| Less than \$15,000 | 40,004 (56%) | 9,831 (47%) | 30,173 (59%) | |
| At least \$15,000 but less than \$25,000 | 15,147 (21%) | 3,862 (19%) | 11,285 (22%) | |
| At least \$25,000 but less than \$50,000 | 9,578 (13%) | 3,337 (16%) | 6,241 (12%) | |
| \$50,000 and more | 6,007 (8.4%) | 3,418 (16%) | 2,589 (5.1%) | |
| Not Reported | 898 (1.3%) | 288 (1.4%) | 610 (1.2%) | |
| Second-hand Smoke Exposure at home | | | | <0.001 |
| No | 45,145 (63%) | 13,005 (63%) | 32,140 (63%) | |
| Yes | 24,026 (34%) | 6,843 (33%) | 17,183 (34%) | |
| Not Reported | 2,463 (3.4%) | 888 (4.3%) | 1,575 (3.1%) | |
| Second-hand Smoke Exposure at other places | | | | <0.001 |
| No | 42,411 (59%) | 12,729 (61%) | 29,682 (58%) | |
| Yes | 26,453 (37%) | 7,002 (34%) | 19,451 (38%) | |
| Not Reported | 2,770 (3.9%) | 1,005 (4.8%) | 1,765 (3.5% | |

Note:

¹n (%); Median (IQR) ²Pearson's Chi-squared test; Wilcoxon rank sum test

Risk ratio of estimated 17-year cumulative risk of lung cancer under different threshold compared with natural course

Parametric g-computation is a novel causal inference method that can be used to estimate the effect of a policy, intervention, or treatment. Unlike standard regression approaches, it can be used to adjust for time-varying confounders that are affected by prior exposures.

| | African American | Non-Hispanic White |
|--------------------------------|-------------------------|--------------------------|
| REF | REF | REF |
| Threshold value | Incidence ratio | Incidence ratio (DE% CI) |
| | (95% CI) | |
| 0.90 | 0.9928 (0.9862, 0.9983) | 0.9997 (0.9991, 1.0001) |
| 0.65 | 0.9508 (0.9059, 0.9904) | 0.9959 (0.9866, 1.0037) |
| 0.26 | 0.8765 (0.7617, 0.9882) | 0.9892 (0.9494, 1.0386) |
| Percentage Reduction each year | | |
| (%) | | |
| 1 | 0.9804 (0.9534, 0.9996) | 0.9973 (0.9831, 1.0124) |
| 5 | 0.928 (0.8364, 0.9998) | 0.9944 (0.9415, 1.0549) |

Note: 1. All models were adjusted by time-varying variable **PM**_{2.5} exposure and time-fixed variables sex, enrollment age, education attainment, house income, ever smoker, second-hand smoke exposure at home and at other places.

In the hypothetical treatment, we lowered the isolation index by a fixed percentage or to the threshold value for those above the threshold to estimate the risk of lung cancer in less segregated scenarios.



Cumulative Incidence Ratio of Lung Cancer and 95% CI **Comparing Different Strategies to Lower Isolation Index to Natural Course among non Hispanic white individuals**



Hypothetical Intervention

- Reduction to Threshold at 0.90 (Third Quartile)
- Reduction to Threshold at 0.67 (Median)
- Reduction to Threshold at 0.26 (First Quartile)
- 1% Annual Reduction
- 5% Annual Reduction

Xiao....Erhunmwunsee. In Submission.

Mediation Analysis

Directed Acyclic Graph (DAG) depicting the causal relationships between isolation index and lung cancer incidence. Age and sex were considered as baseline confounders.



Estimated Proportion Mediated Through Candidate Mediators for the Association between Isolation Index and Lung Cancer Incidence in <u>Black/African American</u> individuals



Study Conclusion

- Lower residential segregation significantly decreased lung cancer risk in Black/African American individuals but not in non-Hispanic white individuals.
- Structural racism, driving segregation, likely impacts lung cancer risk through smoking and air pollution exposure.
- These findings suggest the need for policy and research interventions addressing structural racism to reduce lung cancer risk and promote equity in population health.

Race and Ethnicity-based Disparities in Air Pollution Exposure

Racial Groups' Exposure vs. Contribution to Air Pollution

Black and Hispanic individuals in the U.S. are exposed to higher levels of fine particulate matter ($PM_{2.5}$), on average, than white individuals yet consume less of the goods and services that cause such pollution. Black people, on average, experience the highest absolute pollution levels of the groups studied, whereas Hispanic people are exposed to the highest levels relative to their consumption.



POLLUTION EXPOSURE BY POPULATION (2003–2015)



Source: Christopher W. Tessum et al., "Inequity in consumption of goods and services adds to racial-ethnic disparities in air pollution exposure," Proceedings of the National Academy of Sciences (March 2019).

Credit: Melissa Thomas Baum, Buckyball Design; Source: "Inequity in Consumption of Goods and Services Adds to Racial-Ethnic Disparities in Air Pollution Exposure," by Christopher W. Tessum et al., in *Proceedings of the National Academy of Sciences USA*, Vol. 116, No. 13; March 26, 2019

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PM_{2.5} exposure and risk of TP53 mutation

CANCER EPIDEMIOLOGY, BIOMARKERS & PREVENTION | RESEARCH ARTICLE

The Association between Polluted Neighborhoods and *TP53*-Mutated Non-Small Cell Lung Cancer

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TP53 mutations



TP53 is a tumor suppressor whose mutation not only leads to lung cancer but leads to lung cancer with poor survival.

| Study | Overall survival | | % |
|--|---|---------------------|-------|
| D | | HR (95% CI) | Weig |
| Lee SY 2015 | | 1.38 (0.73, 2.61) | 3.32 |
| Molina-Vila MA 2014 | the second se | 1.45 (0.95, 2.22) | 7.48 |
| Ma XL 2013 | | 1.08 (0.86, 1.37) | 24.86 |
| Scoccianti C 2012 | | 0.95 (0.64, 1.40) | 8.80 |
| Chien WP 2010 | | 1.16 (0.87, 1.55) | 16.16 |
| Regina S 2009 | | 1.50 (1.02, 2.50) | 6.71 |
| Kosaka T 2009 | | 1.47 (0.69, 3.14) | 2.35 |
| Ludovini V 2008 | | - 2.30 (0.80, 6.60) | 1.21 |
| Tsao MS 2007 | | 1.15 (0.75, 1.77) | 7.31 |
| Ahrendt SA 2003 | | 1.56 (1.00, 2.40) | 7.03 |
| Bria E 2015 | | 1.36 (0.24, 7.26) | 0.46 |
| Division B 1999 | | - 2.21 (0.78, 6.23) | 1.25 |
| Huang CL 1997 | | 1.34 (0.76, 2.37) | 4.17 |
| Ohno A 1997 | | 2.02 (0.75, 5.44) | 1.37 |
| Vega FJ 1997 | | 1.46 (0.60, 3.55) | 1.71 |
| Top B 1995 | | 2.35 (0.65, 8.51) | 0.81 |
| Mitsudomi T 1995 | | 1.18 (0.60, 2.30) | 2.99 |
| Kashii T 1994 | | 2.00 (0.88, 4.55) | 2.00 |
| Overall (I-squared = 0.0%, p = 0.807) (z = 3.89, p = 0.000) |) 🔷 | 1.26 (1.12, 1.41) | 100.0 |
| NOTE: Weights are from random effe | cts analysis | | |
| | 05 1 15 | | |
| Gu, J et al. (2016) | 0.0 2 2.0 | | |

In a meta-analysis of NSCLC survival studies, *TP53* mutated patients had a 1.26 hazard ratio for mortality compared to TP53 wildtype.

- **Participants: Retrospective cohort:** All adult COH patients with a primary NSCLC diagnosis from 2015-2018
- Data collection:

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- EPA EJ Screen
 - We used patient addresses to determine environmental exposures to PM_{2.5}, ozone, traffic & community demographic data from the EPA environmental justice screen.

TP53 Gene

Medical Record Abstraction (MRA)

• We abstracted demographic, clinical and smoking data from the EMR

Statistical Method: Multiple Logistic Regression

Adjusted odds ratios of TP53 mutations



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#: Adjusted for metrics of neighborhood-level sociodemographic (i.e. percent minority population and educational attainment less than high school education) and smoking where appropriate

Conclusion: The frequency of TP53 mutations in NSCLC patients was significantly higher in those who lived in areas with higher pollution levels.

Why do African Americans develop more lethal lung cancers at earlier ages than NHW Americans?



Detroit Research on Cancer Survivors (ROCS) Mapping Study

Geospatial Measures of the Built and Social Environment: Variable Data Dictionary – Version 1 –









Last updated: 29-Jun-2019

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Associated datasets: rocs_r1k_vars_v1_20190629.csv rocs_t10_vars_v1_20190629.csv

- or biopsios (Stago 1-11 NSCI C
- Tumor biopsies (Stage 1-II NSCLC) and matched blood from AA cancer survivors in Metropolitan Detroit and Los Angeles



Top: Isolation index for AA population compared to other populations computed with 2010 US Census data.

Bottom: $PM_{2.5}$ air pollution from 2015 Environmental Protection Agency EJScreen tool

Pilot WES analysis: residential segregation may be correlated with higher exonal mutational burden



r = 0.32 (p = 0.05, isolation index) r = -0.4 (p = 0.02, financial income) r = -0.32 (p = 0.051, education)

Variable correlation using principal component analysis. Tumor mutation count is positively associated with isolation and negatively associated with financial income. Education is negatively associated with smoke_years. Smoke_years = smoking pack years; Smoke_dx = smoking frequency at time of diagnosis.



The Impact of Racism Related Socio-Environmental Factors on African American NSCLC Mutational Signatures

Significance

Black individuals have higher exposure to air pollution, have lower access to job opportunities, well funded schools, appropriate housing, and safe spaces for recreation, and experience increased racial discrimination that could have consequences for their health and lung cancer development.



Participant Journey

Recruitment To-Date:

38 patients have completed the survey

22 patients have completed the survey, MRF, and ICF

Obtain Tumor

Sample

3

Participant

Recruitment

Unite US

Comprehensive

Survey

2

African American/Black and Non-Hispanic White patients will be contacted and asked to participate in the study (verbal consent).

Those who consent will complete a 30minute survey that includes questions regarding social determinants of health, residential history, and discrimination.

Participants who complete study activities from part 1 will be asked to complete an informed consent form and HIPAA authorization (medical release form) to obtain lung cancer surgery tumor samples.

If participants suggest urgent social needs, they may be referred, upon consent, to community organization Unite Us

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How does understanding tumor evolution advance our ability to detect and treat cancer?



Goal - to use the genomes to model timing in clonal cancer evolution

- Help establish trajectories of molecular events that define tumor developmental cycle
- Identify and target more aggressive clonal lineages
- · Characterize shared and unique molecular characteristics of each patient's tumor



Overview of Geometric Deep Learning (GDL) Analysis Workflow



Figure 1. Urban form, environmental risk, and structural racism project workflow.



Figure 3. Correlation coefficients among SDOH variables, Model embedding, control variable, and health outcome (in dividual histologic grade).

Interpreting GDL Model Outputs with NSCLC Tumor Grades and SDOH

Table **1**. *p*-values for Pearson and Spearman correlations methods among SDOH variables, model embedding, control variable, and health outcome (histologic grade).

| | Histologic Grade | |
|------------------------|------------------|----------|
| | Pearson | Spearman |
| ADI | 0.574 | 0.667 |
| HPI | 0.263 | 0.261 |
| Poverty | 0.160 | 0.182 |
| Walkability | 0.763 | 0.847 |
| ResNet-152_Fac1 | 0.891 | 0.773 |
| ResNet-152_Fac2 | 0.965 | 0.961 |
| InfoGraph_Fac1 | 0.879 | 0.937 |
| InfoGraph_Fac2 | 0.054* | 0.101 |
| S ² CL_Fac1 | 0.902 | 1.000 |
| S ² CL_Fac2 | 0.072* | 0.050** |
| Ever Smoker | 0.055* | 0.048** |

A total of 27 pathological stage I-III NSCLC patients who underwent surgical resection without neoadjuvant therapy at COH between 2013 and 2021, were linked to nearby SDOH metrics (by residential census tract) and the nearest satellite tile. The control variable for NSCLC (*ever_smoker*) was also compared.

GDL models may be better at either representing several elements of the environment as one measure (complexity), or at measuring latent features that are not found in SDOH factors.

Conceptual Model of Structural Discrimination and Cancer Health



Conceptual model of structural discrimination as a fundamental cause, operating through risk factors and consequences, of cancer inequities



- Our proposed intervention assesses the multilevel impact of structural discrimination (I.e., at individual, interpersonal, and community levels) on receipt of guideline concordant care and uses a culturally tailored application to reduce burden of these barriers.
- Our pragmatic RCT will enroll recently diagnosed NSCLC patients and test a technology that
 - assesses multilevel SDOH
 - \circ addresses social needs
 - tracks participants along their treatment journey
 - alerts providers and navigators when milestones are not met
 - and educates on empowerment and health equity advocacy
- We will determine if use of a digital, bot enabled, multilevel NSCLC navigation intervention influences receipt of the first course of stage-specific treatment as recommended by NCCN guidelines.
- Our primary endpoint is whether patients receive the first course of stage-specific treatment as recommended by NCCN guidelines.
- Our secondary endpoints are time to first therapy, time to genomic testing, receipt of molecular profiling prior to treatment for stage II-IV disease, enrollment in biomarker driven trials, self-activation and selfreported satisfaction.

Summary: Social context and genomic outcomes must be integrated so that there is understanding of the biological impact of SDOH. This understanding can support risk assessment, precision medicine and treatment efforts.

- 1. Normalize comprehensive individual and neighborhood level social driver/determinant screening for each patient in conjunction with tumor and other clinical and outcome metrics
- 2. Recognize what high social risk for our respective and **collective** catchment means – what areas are "hotspots" for aggressive biology and poor outcomes?
 - Collectively conduct a comprehensive assessment of the burden of cancer across neighborhoods
- 3. Collectively work with legislatures to pass equity focused policy that improves the health of neighborhoods –i.e., social determinant focused
- 4. Support individuals from these high-risk areas with automatic social work referral and evaluation, navigation, transportation vouchers, telehealth opportunities and financial aid – i.e., social needs focused
- 5. Promote community-based education and awareness in high-risk areas regarding cancer risk, prevention, early detection, and treatment

Research Team

City of Hope

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COH Health Equity Pilot Award

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