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Overall, this presentation will contextualize for members of the SACIM advisory committee how our *Public Health Exposome* framework is used to identify important associations between chemical and non-chemical stressor exposures and chronic disease outcomes in vulnerable populations using both data-driven and hypothesis driven methods.

The short talk will demonstrate, using *Public Health Exposom*e datasets (1.0-4.0) how to *use data driven, computational and hypothesis driven* analytics to *discover* new scientific insights into associations between the built, natural, physical and social environments, adverse health outcomes and population-level outcomes. The *PHE* framework offers a new exposure science approach for conducting risk trajectory assessments that can be used to assess the effects of multiple, interactive, and cumulative chemical and non-chemical stressor exposures on negative health outcomes.

By curating large amounts of disparate, heterogeneous data, the *PHE* approach provides environmental public health, epidemiologists and chronic disease researchers with the tools to develop, target, and evaluate current and past public health programs and policies.



Department of Health and Human Services Secretary's Advisory Committee on Infant Mortality (SACIM)

Session: Environmental Contributions to Infant and Maternal Health

Tuesday January 26, 2021 12:30pm-1:30pm

> Individual, Community and Population Level Environmental-Associated Attributes on Adverse Pregnancy Outcomes in High-Risk Census Tracts in Ohio

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Department of Neuroscience College of Medicine



Secretary's Advisory Committee on Infant Mortality

Conflict of Interest Statement

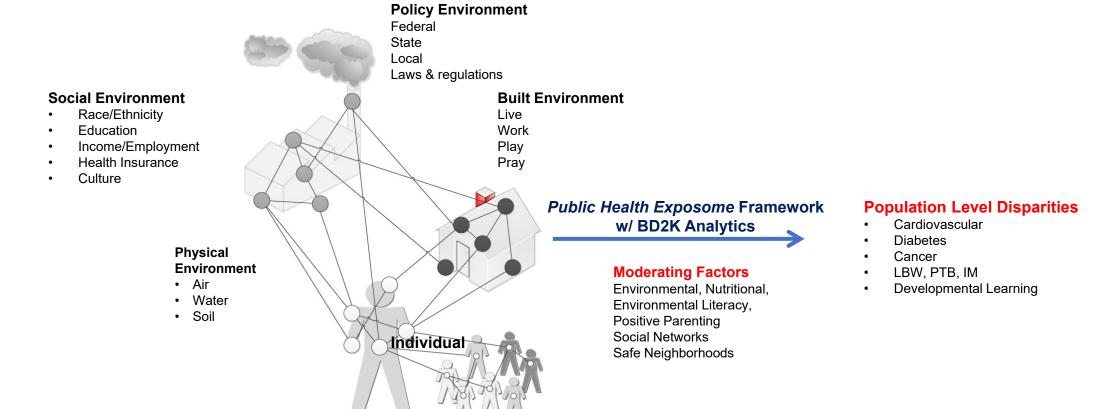
The author declares no conflict of interest



Columbus, OH has the second worst disparity in life expectancy at birth by census tract

www.immappler.com/osudehs

Place matters with regard to health care disparities and disparate health outcomes



Exposure to Chemical & Non-Chemical Stressors

Behaviors

Smoking Alcohol Drugs Diet/Nutrition Consumer Products

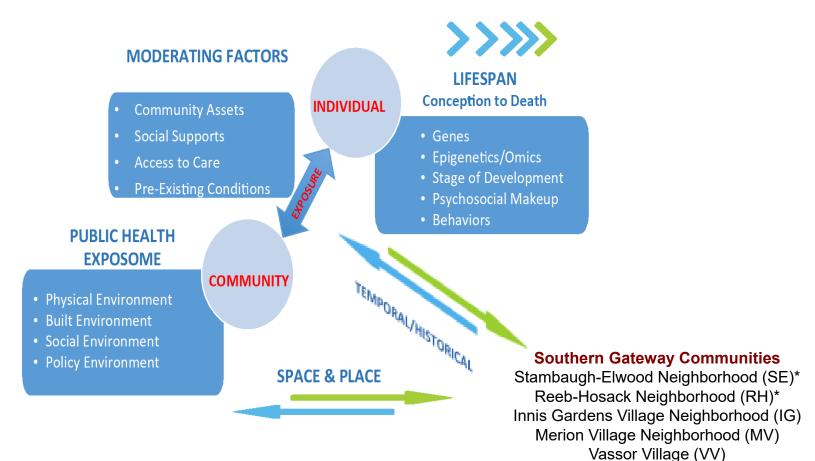
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Disparate Health Outcomes

Morbidity/Mortality Immune System/ **Immuno-suppression** Neuro-cognitive developmental delay Longevity and other Chronic Diseases Omics Metabolomics Transciptomics Microbiomics Epigenomics Genomics

Public Health Exposome framework



Hungarian Village (HV) Near East Neighborhoods (43203)

Supervised and unsupervised clustering, parametric and nonparametric, combinatorial algorithms and paraclique analysis

Spatial and Temporal Aligned Data

	SOU	THERN COMM	IUNITY COH	ORT STUD	Y	PUBLIC HEALTH EXPOSOME		
Timeline 2002 2003	Enrollment Demographics, smoking hx, medial hx, health	Biological <u>Samples</u>	Medicare & Medicaid Claims Data	State Cancer <u>Registry</u>	SS Death Index Files	Natural <u>Environment</u>	Built <u>Environment</u>	Social <u>Environment</u>
2004	insurance, Family	Blood		<u></u>		Daily gridded data	Road Networks	BLS/Unemployment
2005	medical Hx,	Urine	2002	2002	2002	PM2.5 (3km grid) Min Temp (1 km grid)	Manufacturing, mining and construction,	home values, housing stock, rental units, vacancy, household turnover,
2006	Emotional/social support, environment,	Buccal Swabs	2003	2003	2003	Max Temp (1 km grid)	energy, transit service,	school enrollment, educational
2007	work history, usual	Buccui Siruss	2004	2004	2004	Heat Index (1km grid)	broadband internet	attainment, per capita income, family
2008	eating habits		2005	2004	2004	PM10 (12 km) S02 (12 km)	availability, home sales, housing prices, disaster	incomes, household incomes, aggregate income by type, incomes by age for
2009			2005	2005	2005	N02 (12 km)	declarations, Locations	older households, income inequality,
2005			2000	2000	2000	Ozone (12km)	of hospitals and critical	people in poverty, families in poverty,
2010	Survey Wave 1		2007	2007	2007	Solar Radiation (12km)	access hospitals; Medically Underserved	population by ethnicity, age, sex, people with disabilities, total population,
1 1	Demographics, smoking					Formaldehyde	Areas; Counts and rates	foreign born population, predominant
2011	status, health insurance, activity, cancer		2009	2009	2009	(12km)	of health resources,	foreign born population, household
2012	screening, pain		2010	2010	2010		business and residential	characteristics, families, veterans,
	Survey Wave 2		2011	2011	2011	<u>Annual</u> Land Cover/Land	vacancy, households receiving housing	homeowner characteristics, renter characteristics, affordability and cost
2013	Demographics, health		2012	2012	2012	Use, weather	subsidies, rental rates,	burdens, unemployment, employment,
2014	insurance, how often		2013	2013	2013	conditions, oil & gas	housing affordability,	commute to work, vehicles per
2015	moved, household makeup, ACEs, medical					production, farm-	museums and libraries,	household, home heating fuel types,
	history, prescriptions,					land, watershed, disaster risk.	health care facilities, housing quality, home	healthcare uninsurance and healthcare insurance, Manufacturing, mining and
	racial discrimination		2014	2014	2014	elevation, water	ownership, public	construction, Opportunity Insights,
	Survey Wave 3					bodies, sensitive	transit, childcare access,	Residential segregation, health risk
	Demographics, smoking		2015	2015	2015	lands, toxic release	supermarket access,	behavior, opioid prescriptions, life
	status, Medical hx,		2016	2016	2016	inventory, Air quality, brownfields, safe	food deserts, mental health treatment	expectancy, social vulnerability index, Medicare/Medicaid, immigration FBI
2016	prescription meds,					drinking water	facilities, locations of	uniform crime reports, bank failures,
2017	access to care, health literacy, health status					superfund sites,	drug and alcohol	food insecurity rates, child food
	Survey Wave 4		2017	2017	2017	hazardous waste	treatment facilities,	insecurity, percent of insecure eligible
	Demographics, smoking,	Stool	2018	2018	2018	cleanup locations,	locations of	for National Nutrition Assistance, and
2018	cancer screening,		2019	2019	2019	toxic substances, lead blood levels,	buprenorphine physicians, SNAP Retail	food-budget shortfall , loans, religion, migration, social needs index, school
2010	medications, household,		2015	2013	2015		Locations, farmers	performance,, SSI, voter turnout, voter
2019	activities, health status,						markets,	turnout, Occupations,
	emotions							

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Table 1. Summary ofsocio-demographic andhealth indicators inSouthern Gatewayneighborhoods by zip-code vs Franklin County,Columbus City, and theState of Ohio.

¹ 2000 Census ^{1c} 2010 Census,

² 2014 American Community
Survey. Sampling estimations have (±95%MOE)

{^a Inflation adjusted 2014 dollars,

^b According to income in the last 12 months},

³ Franklin County HealthMap 2016,

⁴ Columbus Public Health – CPH Epi Program

- * values must be interpreted carefully.

Source	43206	43207	43209	Franklin	Columbus	Ohio
Population	21,864 ^{1c}	45,144 ¹ °	27,228 ^{1c}	1,163,414 ^{1c}	787,033 ^{1c}	11,536,5041
•	22,162±979 ²	47,943±161 ²	27,934±782 ²	1,197,592±NA ²	811,943 ± 129 ²	11,560,380±NA ⁴
Race / ethnicity						
Percent of African American	43.9 ¹ ° 44.3±2.6 ²	26.2 ¹ °	25.8 ¹ °	21.2 ¹⁰	28 ^{1c} 27.80±0.3 ²	12.21
population	44.3±2.6 2.3 ^{1c}	25.9±2.1 ² 3.4 ^{1c}	27±2 ² 2.8 ^{1c}	21.30±0.2 ² 4.8 ^{1c}	27.80±0.3 5.6 ^{1c}	12.20±0.1
Percent of Latino population	2.3	4.5±1.2 ²	2.8 2.9±1 ²	4.8 4.9±NA ²		3.1"
Education	2.4±1.4 ²	4.0±1.2	2.9±1	4.9±NA	5.70±0.2 ²	3.30±0.12
	4.4 ¹	7.5	2.8	3.41	3.9 ¹	3.6
Education < 9 th grade	4.4±1.6 ²	6.8±1.5 ⁴	1.7±0.6 ²	3.2 ±0.2	3.80±0.3 ²	3.20±0.1
	30.6 ¹	39.6	18.5	27.1	27.3	36.1
Education up to high school	27.9±2.6 ²	42.3±2 ²	17.9±2 ²	25.5±0.4 ²	26.10±0.5 ²	34.50±0.1
Deskalas da esa	15.8 ¹	4.1 ¹	27.1 ¹	21.2 ¹	19.9 ¹	13.7
Bachelor degree	21.2±2.2 ²	6.2±0.9 ²	28.4±1.8 ²	23.40±0.3 ²	21.80±0.5 ²	16.10±0.1
Graduate education	9.2 ¹	1.4 ¹	21	10.7 ¹	9.2	7.5
	12.3±1.9 ²	2.3±0.5 ²	23.6±1.8 ²	13.40±0.2 ²	11.50±0.3 ²	9.50±0.1
Employment and income	1			-1	1	
Unemployed individuals >16	4.5	3.6	3.3	3 ¹	3.5	3.2
years in civilian labor force	9.4±1.4 ²	8.5±1.3 ²	4.3±0.8 ²	5.60±0.2 ²	6.20±0.3 ²	5.80±0.1
Median Household income	34,794 ¹	34,287	46,016 ¹	42,734 ¹	37,8971	40,956
(US dollars)	41,717±2,244 ^{2a}	39,634±2,455 ^{2a}	53,924±3,918 ^{2a}	51,890±447 ^{2a}	44,774±464 ^{2a}	48,849±162
Percent of families below the	18.3 ¹	12.7 ¹	10.2 ¹	8.2 ¹	10.8 ¹	7.8
poverty level	24.7±4.1 ^{2b}	19.7±2.8 ^{2b}	11.8±2.4 ^{2b}	13.20±0.5 ^{2b}	17.40±0.7 ^{2b}	11.70±0.1 ²
Health Insurance	84.8±2.2 ²	00.4.0.42	00.0.4.42	87.60±0.3 ²	0E C 10 42	89.10±0.1
Insured to health care % Chronic Health Disease – Perc		83.1±2.1 ²	90.6±1.4 ²	87.60±0.3	85.6±0.4 ²	89.10±0.1
Diabetes/told they have	8.0 ⁴	13.7 ⁴	5.4 ⁴	4.0 ³ & 10.1 ⁴		
diabetes %	(1.3, 14.7)	(5.4, 22.0)	(0.7, 10.1)			6.0
Obesity /overweight or obese	(1.3, 14.7) 51.2 ⁴	(3.4, 22.0) 69.8	58.8	(8.8, 11.4) 20.0 ³ & 64.1 ⁴		
%	(32.6, 69.8)	(59.5, 80.2)	(41.6, 76.0)	(61.9, 66.4)		22.0
	(02.0, 03.0) 5.9 ⁴	16.64	7.4	9.64		
Current Asthma %	(0.0, 11.7)	(9.0, 24.2)	(0.0, 16.2)	(8.3, 10.9)		
Tobacco use/currently smoke	34.9*	34.6*	18.24	13.0 ³ & 22.1 ⁴		
%	(17.6, 52.2)	(23.7, 45.4)	(1.4, 35.0)	(20.1, 24.2)		29.0
Ever Told had Depressive	16.24	28.64	18.9 ⁴	20.8 ⁴		
Disorder %	(4.4, 28.1)	(18.3, 38.8)	(6.2, 31.7)	(18.9, 22.6)		
Pregnancy and Birth Outcom	ies					
Total Number of Births	779"	1,274	734	38,053 ⁴		
Low Birth Weight %	11.9 ⁴	11.6 ⁴	9.7 ⁴	9.0 ⁴		
Preterm Births %	13.1 ⁴	12.6 ⁴	10.6 ⁴	10.5 ⁴		
Teenage Mothers %	4.1 ⁴	2.7*	0.1 ⁴	1.5		
Infant Mortality Rate (2010-4)	10.9 ⁴	12.5 ⁴	*	8.4⁴		
Health promotion and diseas		I	_ 4	1		I
Walk Score®	70 ⁴	n/a	26 ⁴	*	40 ⁴	
Food Imbalance %	14.8 ⁴	36.74	61.2 ⁴	23.9 ⁴		
Sexually transmitted infectio			005 500 54	0.444 (700.6)4		1
Chlamydia	$386(1,741.7)^4$	$502(1,047.1)^4$	$205(733.9)^4$	9,441 (788.3) ⁴		
Gonorrhea	174 (785.1) ⁴	178 (371.3) ⁴	76 (272.1) ⁴	3,265 (272.6) ⁴		
Leading causes of death (cas Heart Disease	94; 169.6 (137.1,	341; 232.5	143; 125,1	5,623; 173.5	1	1
I ICAI L DISCASC	94, 169.6 (137.1, 207.6) ⁴	(207.6,257.4) ⁴	$(103.9, 146.3)^4$	$(168.9, 178.1)^4$		
	101; 169.9	317; 209.9	135; 130.7	5,729; 172.3		
Cancer	(135.3, 204.5) ⁴	(186.6,233.2) ⁴	(108.0,153.4) ⁴	(167.7, 176.8) ⁴		
	27; 54.5	83; 58.4	49; 44.1	1,361; 43.3		
Stroke	(35.9, 79.3) ⁴	(46.5, 72.4) ⁴	(32.6, 58.3) ⁴	(41.0, 45.6) ⁴		
Chronic Lower Respiratory	42, 74.4	130; 89.5	26; 23.5	1,539; 48.3		
Disease	(53.6, 100.6) ⁴	(74.0, 105) ⁴	(15.4, 34.5) ⁴	(45.8, 50.8) ⁴		
	19; 32.6*	60; 41.1	11; 11.0*	868; 26.1		
Diabetes	(19.6, 50.8) ⁴	(31.4, 53) ⁴	(5.5, 19.7) ⁴	$(24.3, 27.9)^4$		
Accident/Unintentional Injury	37; 56.4	108; 75.4	27; 29.2	1,485; 41.6		
Accident/Onintentional Injury	(39.7, 77.7) ⁴	(61.0, 89.7) ⁴	(19.3, 42.5) ⁴	(39.5, 43.8) ⁴		
Homicide	17; 24*	33; 24.5	8; 10.2*	305; 8.1		
	(14.0, 38.5) ⁴	(16.8, 34.3) ⁴	(4.4, 20.2) ⁴	(7.2, 9.0) ⁴		
Suicide	12; 18.2*	26; 18.4	11; 12.3*	427; 11.7		
	(9.4, 31.9) ⁴	(12.0, 27.0) ⁴	(6.1, 22.0) ⁴	(10.6, 12.8) ⁴		

(Cifuentes et al., 2019)

Sociodemographic Variables

#	Variable Name	Units	Color
1	"population"	Total count	Yellow
2	"minority population"	Total count	Tan
3	"low-income population"	Total count	YellowGreen
4	"less than high school population (>25y) population"	Total count	Red
5	"households in linguistic isolation"	Total count	Brown
6	"under5 population"	Total count	LightYellow
7	"over64 population"	Total count	Dandelion

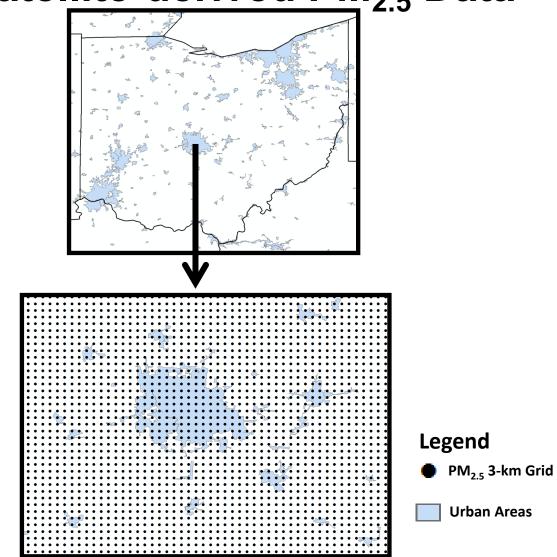
Environmental Variables

#	Variable Name	Units	Color
8	"pre-1960 housing (lead indicator)"	Total count	Fuchsia
9	"traffic proximity and volume"	Count of vehicles (average annual daily traffic) at major roads within 500 meters, divided by distance in kilometers (km)	MidnightBlue
10	"Proximity to major direct dischargers to water"	Count of NPDES major facilities within 5 km, divided by distance	Cyan
11	"Proximity to National Priorities List (NPL) sites"	Count of proposed and listed NPL sites within 5 km, divided by distance	Blue
12	"Proximity to Risk Management Plan (RMP) facilities"	Count of facilities within 5 km, divided by distance	Gray65
13	"Proximity to Treatment Storage and Disposal (TSDF) facilities"	Count of major TSDFs within 5 km, divided by distance	PineGreen
14	"Ozone level in air"	Summer seasonal average of daily maximum 8-hour concentration in air (ppb)	White
15	"PM2.5 level in air"	Annual average (μg/m 3)	Gray30

Innovation in methodology: Machine learning for the network used the 'Hill Climbing' with BIC criterion of the 'bnlearn' package in R software. Links were 69-accounting for 32.85% density and an average degree of 9.2. Post-hoc values of arrows (links) are p values based on linear conditional correlation, and line widths are highest for the lowest p values. Automatic visualization accounted for the relative value of the links (obtained by transforming p values by log-transformation and normalization/truncation from 5 to 1) by the VOS mapping algorithm followed by an energy-based algorithm, that located more connected nodes in the center of the graph. (**Cifuentes et al., 2019**)

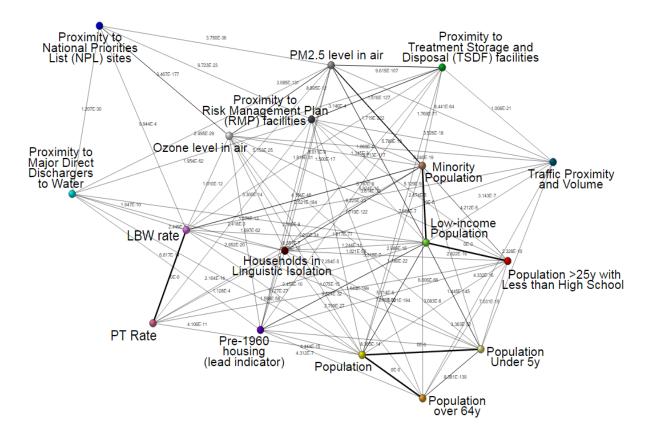
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Satellite-derived PM_{2.5} Data

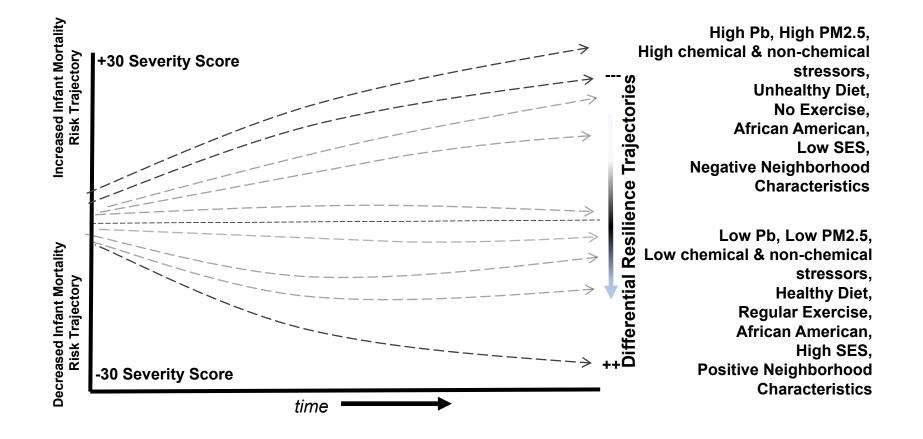


Slide Prepared by: Dr. Mohammad Al-Hamdan USRA at NASA/MSFC mohammad.alhamdan@nasa.gov

Columbus, OH GLOBAL SIGNIFICANCE, LOCAL IMPACT Bayesian network inferred from USEPA EJSCREEN database and ODH data to demonstrate latent associations between environmental and socio-demographic variables with PTB and LBW within 88-counties in Ohio



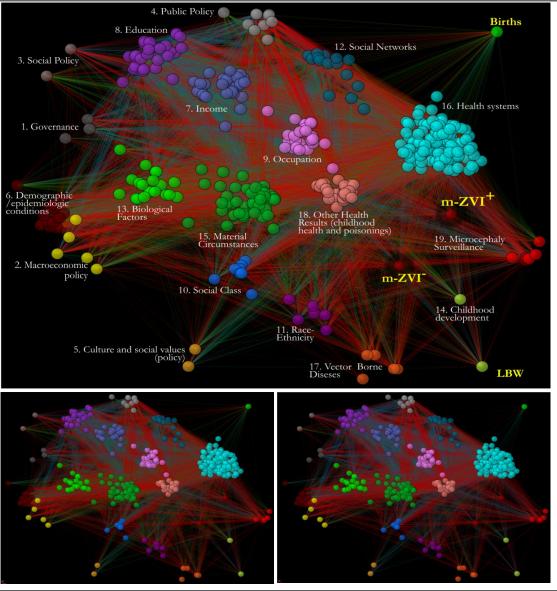
Modeling the complexity of relationships among social determinants of health and environmental variables/factors. In this model, we included 7-socioeconomic variables and 8-environmental variables that were reported for 9,232 census blocks in Ohio. All variables were continuous. The model predicts that the socioeconomic variables low income (green), minority (tan), and under age 5 (light yellow) together with environmental variables PM 2.5 level in air (gray), proximity to facilities with a risk management plan (Gray65), and proximity to direct discharges in water (cyan) are associated with LBW and PTB . (Cifuentes et al., 2019)



Graphical representation of a Population-level model that estimates the cumulative risk trajectories for adverse Maternal and Child Health outcomes resulting from exposures to chemical and non-chemical stressors. The model depicts how baseline incidence of Maternal and Child Health indicators (PTB, LBW and IM) in vulnerable census tracts interacts with chemical and non-chemical stressor exposures. This example anticipates that negative Maternal and Child Health (PTB, LBW, IM) trajectory tracks with high PM_{2.5} exposures, high exposures to environmental toxicants, poor diet, lack of exercise, low socioeconomic status and negative neighborhood characteristics. The model also depicts resilience trajectories as compensatory mechanisms (positive or negative) toward mitigating adverse Maternal and Child Health outcomes. (Cifuentes et al., 2019)

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(Cifuentes et al., 2020)

ExWAS-based determination of ZVD context networks

Context networks derived from PHE framework and BD2K analytics demonstrate associations of multiple determinant factors with Zika Virus Disease incidence in Brazil's municipalities during the 2016 first semester outbreak. Groups of variables within each determinant factor have different colors according to Table S1 in supplementary data.

Four colors show positive strongest (dark blue) and strong (green) and negative strongest (dark red) and strong (light red) partial correlations among variables/nodes. A, shows the full network, including labels. B, corresponds to the threshold network by graphlet optimally far from random network. C, corresponds to threshold network clustering coefficient-based optimally far from random network.



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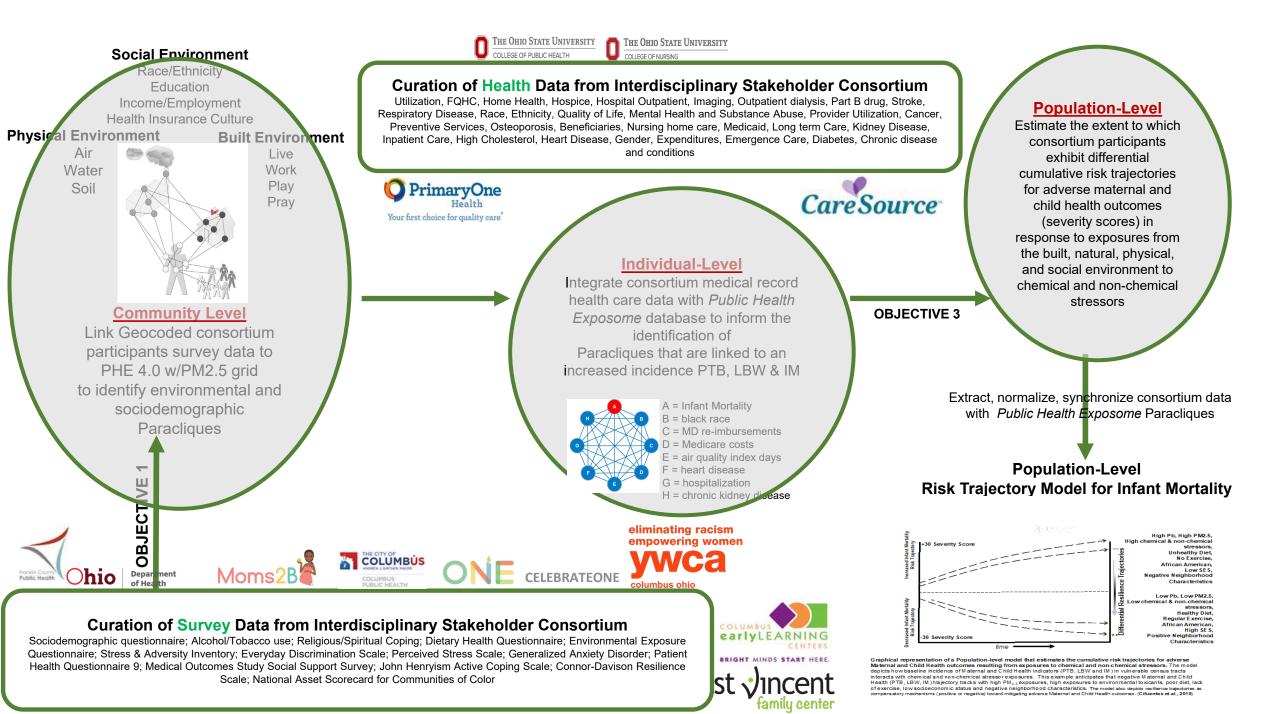
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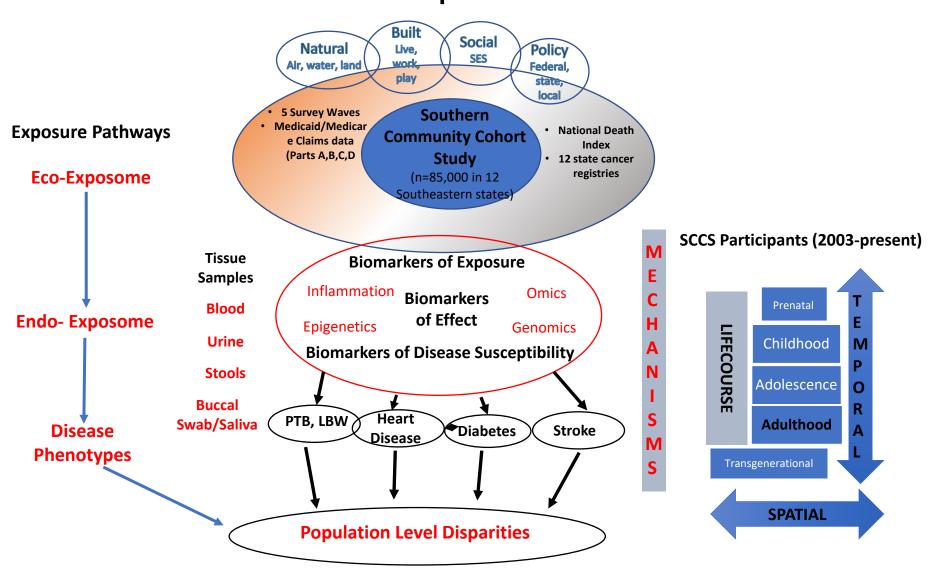
F. Close and S. Stokes

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Nancy Lurie Marks Foundation & Simons Foundation Autism Research Initiative





ExWAS Approach to Understanding Environmental Input to Chronic Disease: A Conceptual Model