

Supporting Information

Lead Distribution in Urban Soil in a Medium-Sized City: Household-Scale Analysis

Emmanuel Obeng-Gyasi ^{1,2*}

Javad Roostaei ³

Jacqueline MacDonald Gibson ³

1 Department of Built Environment, North Carolina A&T State University, Greensboro, NC
27411

2 Environmental Health and Disease Laboratory, North Carolina A&T State University,
Greensboro, NC 27411

3 Department of Environmental and Occupational Health, Indiana University-Bloomington,
Bloomington, IN 47405

*Corresponding Author

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1. Publically available data used to create curated dataset

Information Category	Variable Description	Values	Source
House Characteristics	House age	Continuous (decades)	Guilford County Tax Department [1]
	Property value	Continuous (\$100,000s)	Guilford County Tax Department[1]
	Tax value	Continuous (\$100,000s)	Guilford County Tax Department[1]
Census Block Characteristics	Race/ethnicity	% Black, % Hispanic/Latino, % White	Census 2010, U.S. [2]
	Median household income (adjusted for 2018)	Continuous (\$100,000s)	Census 2010, U.S.[2]
Land use/land cover	Proximity to major roadways	Continuous (km)	TIGER, 2015[3]
	Population density	Continuous (people/km ²)	Census 2010, U.S.[2]
	Land cover	Categorical (e.g., developed, forest, grassland)	LANDFIRE 2010 [4]
	Urban/rural status	Categorical	TIGER, 2017[5]
Soil characteristics	Soil symbol	Categorical	Web Soil Survey, 2003 [6]
	Soil organic matter content	Continuous (kg/m ²)	S.S.U.R.G.O. Soil Organic Matter [7]
	% silt	Continuous	S.S.U.R.G.O. Percent Soil Silt [8]
	% sand	Continuous	S.S.U.R.G.O. Percent Soil Sand [9]
	% clay	Continuous	S.S.U.R.G.O. Percent Soil Clay[10]
	pH	Continuous	S.S.U.R.G.O. Soil pH [11]

2. Conditional probability distribution for % Black.

Table S2. Conditional Probability Distribution for % Black					
Soil Pb > 100 ppm	House Value	House Age	<=0.355 (1/3)	<=0.727 (2/3)	>0.727 (3/3)
0	<=1.292 (1/3)	<=4.2 (1/3)	3.0821	17.2668	79.6510
		<=7.9 (2/3)	19.1297	14.9119	65.9584
		>7.9 (3/3)	32.1180	22.3717	45.5103
	<=2.859 (2/3)	<=4.2 (1/3)	99.9681	0.0016	0.0302
		<=7.9 (2/3)	95.1616	0.0012	4.8372
		>7.9 (3/3)	70.5748	22.8479	6.5773
	>2.859 (3/3)	<=4.2 (1/3)	99.9630	0.0185	0.0185
		<=7.9 (2/3)	32.2802	33.3743	34.3455
		>7.9 (3/3)	99.9918	0.0041	0.0041
1	<=1.292 (1/3)	<=4.2 (1/3)	0.8982	14.3464	84.7554
		<=7.9 (2/3)	15.1104	12.2234	72.6662
		>7.9 (3/3)	8.9816	15.7471	75.2713
	<=2.859 (2/3)	<=4.2 (1/3)	33.3333	33.3333	33.3333
		<=7.9 (2/3)	58.9596	0.0095	41.0310
		>7.9 (3/3)	81.2367	9.2646	9.4987
	>2.859 (3/3)	<=4.2 (1/3)	33.3332	33.3332	33.3336
		<=7.9 (2/3)	0.2107	0.2114	99.5779
		>7.9 (3/3)	99.9641	0.0160	0.0199

3. Conditional probability distribution for % Soil Clay

Table S3. Conditional Probability Distribution for % Soil Clay			
Soil Pb > 100 ppm	<=26.14 (1/3)	<=33.125 (2/3)	>33.125 (3/3)
0	12.3010	84.4437	3.2553
1	0.9530	99.0453	0.0017

4. Conditional probability distribution for distance to major roads

Table S4. Conditional Probability Distribution for Distance to Major Road					
Soil Pb > 100 ppm	% Soil Clay	% Black	<=500 (1/3)	<=1000 (2/3)	>1000 (3/3)
0	<=26.14 (1/3)	<=0.355 (1/3)	20.8351	42.7072	36.4577
		<=0.727 (2/3)	0.4203	99.2242	0.3555
		>0.727 (3/3)	31.3593	68.6379	0.0028
	<=33.125 (2/3)	<=0.355 (1/3)	85.8547	4.7081	9.4372
		<=0.727 (2/3)	67.5059	26.8051	5.6890
		>0.727 (3/3)	51.7586	32.7260	15.5154
	>33.125 (3/3)	<=0.355 (1/3)	0.0046	0.0046	99.9907
		<=0.727 (2/3)	1.3442	97.3116	1.3442
		>0.727 (3/3)	0.0810	99.8486	0.0703
1	<=26.14 (1/3)	<=0.355 (1/3)	0.0580	99.8957	0.0462
		<=0.727 (2/3)	8.1538	84.7843	7.0619
		>0.727 (3/3)	0.0605	99.9055	0.0339
	<=33.125 (2/3)	<=0.355 (1/3)	97.6485	0.7468	1.6046
		<=0.727 (2/3)	54.4774	40.7198	4.8028
		>0.727 (3/3)	52.4837	39.8081	7.7083
	>33.125 (3/3)	<=0.355 (1/3)	38.8742	30.5629	30.5629
		<=0.727 (2/3)	33.3568	33.3529	33.2902
		>0.727 (3/3)	32.7118	35.2556	32.0326

5. Conditional probability distribution for house age

Table S5. Conditional Probability Distribution for House Age				
Soil Pb > 100 ppm	% Soil Clay	<=4.2 (1/3)	<=7.9 (2/3)	>7.9 (3/3)
0	<=26.14 (1/3)	84.9419	14.4348	0.6234
	<=33.125 (2/3)	10.7233	62.6876	26.5891
	>33.125 (3/3)	35.0795	64.9075	0.0130
1	<=26.14 (1/3)	0.0585	57.7211	42.2203
	<=33.125 (2/3)	11.3061	49.9981	38.6958
	>33.125 (3/3)	31.9229	33.1380	34.9390

6. Conditional probability distribution for house value

Table S6. Conditional Probability Distribution for House Value					
Soil Pb > 100 ppm	House Age	% Soil Clay	<=1.292 (1/3)	<=2.859 (2/3)	>2.859 (3/3)
0	<=4.2 (1/3)	<=26.14 (1/3)	30.8065	69.1921	0.0013
		<=33.125 (2/3)	87.8019	12.1959	0.0022
		>33.125 (3/3)	0.0134	33.3330	66.6536
	<=7.9 (2/3)	<=26.14 (1/3)	99.9198	0.0722	0.0080
		<=33.125 (2/3)	80.7578	19.2419	0.0003
		>33.125 (3/3)	21.9710	78.0223	0.0067
	>7.9 (3/3)	<=26.14 (1/3)	99.5870	0.2053	0.2077
		<=33.125 (2/3)	63.8219	20.7697	15.4085
		>33.125 (3/3)	33.3338	33.3331	33.3331
1	<=4.2 (1/3)	<=26.14 (1/3)	33.3333	33.3333	33.3333
		<=33.125 (2/3)	99.9967	0.0017	0.0017
		>33.125 (3/3)	33.3333	33.3333	33.3333
	<=7.9 (2/3)	<=26.14 (1/3)	86.2229	0.1853	13.5918
		<=33.125 (2/3)	95.8487	4.1245	0.0268
		>33.125 (3/3)	35.6089	32.1506	32.2405
	>7.9 (3/3)	<=26.14 (1/3)	99.9075	0.0463	0.0462
		<=33.125 (2/3)	94.1360	2.8316	3.0324
		>33.125 (3/3)	31.4267	36.4627	32.1106

7. Conditional probability distribution for median household income.

Table S7. Conditional Probability Distribution for Median Household Income						
Soil Pb > 100 ppm	House Value	Distance to Major Road	% Black	<=0.255 (1/3)	<=0.47 (2/3)	>0.47 (3/3)
0	<=1.292 (1/3)	<=500 (1/3)	<=0.355 (1/3)	87.5412	6.4845	5.9743
			<=0.727 (2/3)	69.0671	5.9874	24.9455
			>0.727 (3/3)	55.0038	44.9960	0.0002
		<=1000 (2/3)	<=0.355 (1/3)	0.0616	99.8768	0.0616
			<=0.727 (2/3)	0.0013	99.9973	0.0013
			>0.727 (3/3)	46.8164	53.1833	0.0003
	>1000 (3/3)	<=0.355 (1/3)	0.0016	46.8451	53.1533	
		<=0.727 (2/3)	0.0064	99.9872	0.0064	
		>0.727 (3/3)	24.2970	75.7022	0.0007	
	<=2.859 (2/3)	<=500 (1/3)	<=0.355 (1/3)	1.2226	58.5122	40.2652
			<=0.727 (2/3)	0.0044	99.9912	0.0044
			>0.727 (3/3)	0.0281	99.9438	0.0281

Table S7. Conditional Probability Distribution for Median Household Income

Soil Pb > 100 ppm	House Value	Distance to Major Road	% Black	<=0.255 (1/3)	<=0.47 (2/3)	>0.47 (3/3)		
		<=1000 (2/3)	<=0.355 (1/3)	6.7805	0.0010	93.2185		
			<=0.727 (2/3)	32.6967	34.6066	32.6967		
			>0.727 (3/3)	99.9862	0.0073	0.0066		
		>1000 (3/3)	<=0.355 (1/3)	0.0010	0.0010	99.9981		
			<=0.727 (2/3)	33.3333	33.3333	33.3333		
			>0.727 (3/3)	33.3333	33.3333	33.3333		
	>2.859 (3/3)	<=500 (1/3)	<=0.355 (1/3)	0.0014	61.5918	38.4069		
			<=0.727 (2/3)	33.3333	33.3333	33.3333		
			>0.727 (3/3)	33.2172	33.5655	33.2172		
		<=1000 (2/3)	<=0.355 (1/3)	33.3333	33.3333	33.3333		
			<=0.727 (2/3)	32.2405	35.5190	32.2405		
			>0.727 (3/3)	33.1919	35.4458	31.3622		
		>1000 (3/3)	<=0.355 (1/3)	0.0062	0.0062	99.9877		
			<=0.727 (2/3)	33.3333	33.3333	33.3333		
			>0.727 (3/3)	33.3333	33.3333	33.3333		
		1	<=1.292 (1/3)	<=500 (1/3)	<=0.355 (1/3)	61.2146	21.0772	17.7082
					<=0.727 (2/3)	38.2179	33.6993	28.0829
					>0.727 (3/3)	39.5146	60.4852	0.0002
<=1000 (2/3)	<=0.355 (1/3)			0.0154	99.9692	0.0154		
	<=0.727 (2/3)			18.5190	81.4798	0.0011		
	>0.727 (3/3)			69.2191	30.7807	0.0002		
>1000 (3/3)	<=0.355 (1/3)			0.0287	99.9426	0.0287		
	<=0.727 (2/3)			0.0097	99.9806	0.0097		
	>0.727 (3/3)			0.0013	99.9976	0.0012		
<=2.859 (2/3)	<=500 (1/3)		<=0.355 (1/3)	15.1664	25.2752	59.5585		
			<=0.727 (2/3)	0.0616	99.8768	0.0616		
			>0.727 (3/3)	0.0079	99.9843	0.0077		
	<=1000 (2/3)		<=0.355 (1/3)	99.8768	0.0616	0.0616		
			<=0.727 (2/3)	33.0162	33.9675	33.0162		
			>0.727 (3/3)	99.8862	0.0690	0.0448		
	>1000 (3/3)		<=0.355 (1/3)	33.3333	33.3333	33.3333		
			<=0.727 (2/3)	32.3804	35.2391	32.3804		
			>0.727 (3/3)	33.3333	33.3333	33.3333		
>2.859 (3/3)	<=500 (1/3)	<=0.355 (1/3)	0.0053	60.4762	39.5185			
		<=0.727 (2/3)	33.3333	33.3333	33.3333			
		>0.727 (3/3)	66.9164	16.5418	16.5418			
	<=1000 (2/3)	<=0.355 (1/3)	33.3333	33.3333	33.3333			
		<=0.727 (2/3)	33.3320	33.3359	33.3320			
		>0.727 (3/3)	0.0758	99.8535	0.0706			

Table S7. Conditional Probability Distribution for Median Household Income						
Soil Pb > 100 ppm	House Value	Distance to Major Road	% Black	<=0.255 (1/3)	<=0.47 (2/3)	>0.47 (3/3)
		>1000 (3/3)	<=0.355 (1/3)	33.3333	33.3333	33.3333
			<=0.727 (2/3)	33.2223	33.5553	33.2223
			>0.727 (3/3)	33.3333	33.3333	33.3333

8. Conditional probability distribution for soil PH.

Table S8. Conditional Probability Distribution for Soil pH						
Soil Pb > 100 ppm	House Age	% Black	Median Household Income	<=5.316 (1/3)	<=5.974 (2/3)	>5.974 (3/3)
0	<=4.2 (1/3)	<=0.355 (1/3)	<=0.255 (1/3)	0.0154	0.0154	99.9692
			<=0.47 (2/3)	0.0123	99.9753	0.0123
			>0.47 (3/3)	29.1667	12.5003	58.3329
		<=0.727 (2/3)	<=0.255 (1/3)	0.0066	0.0066	99.9868
			<=0.47 (2/3)	0.0154	0.0154	99.9692
			>0.47 (3/3)	25.0013	0.0051	74.9936
		>0.727 (3/3)	<=0.255 (1/3)	0.0011	0.0011	99.9978
			<=0.47 (2/3)	0.0011	36.6785	63.3203
			>0.47 (3/3)	33.3112	33.3112	33.3775
	<=7.9 (2/3)	<=0.355 (1/3)	<=0.255 (1/3)	5.8830	0.0007	94.1163
			<=0.47 (2/3)	0.0007	86.1203	13.8790
			>0.47 (3/3)	48.3143	29.2136	22.4721
		<=0.727 (2/3)	<=0.255 (1/3)	11.2597	0.0017	88.7385
			<=0.47 (2/3)	0.0016	0.0016	99.9969
			>0.47 (3/3)	0.0069	0.0069	99.9863
		>0.727 (3/3)	<=0.255 (1/3)	6.6250	3.6808	89.6942
			<=0.47 (2/3)	0.0003	7.1915	92.8082
			>0.47 (3/3)	32.8888	32.8888	34.2224
	>7.9 (3/3)	<=0.355 (1/3)	<=0.255 (1/3)	7.8797	0.0016	92.1187
			<=0.47 (2/3)	0.0010	1.5480	98.4511
			>0.47 (3/3)	0.0019	0.0019	99.9963
		<=0.727 (2/3)	<=0.255 (1/3)	0.0943	0.0026	99.9032
			<=0.47 (2/3)	0.0022	0.0022	99.9956
			>0.47 (3/3)	0.0154	0.0154	99.9692
>0.727 (3/3)		<=0.255 (1/3)	22.6011	0.0012	77.3978	
		<=0.47 (2/3)	0.0017	0.0017	99.9967	
		>0.47 (3/3)	33.2736	33.2736	33.4528	
1	<=4.2 (1/3)	<=0.355 (1/3)	<=0.255 (1/3)	0.0616	0.0616	99.8768
			<=0.47 (2/3)	33.3333	33.3333	33.3333
			>0.47 (3/3)	33.3333	33.3333	33.3333

Table S8. Conditional Probability Distribution for Soil pH							
Soil Pb > 100 ppm	House Age	% Black	Median Household Income	<=5.316 (1/3)	<=5.974 (2/3)	>5.974 (3/3)	
		<=0.727 (2/3)	<=0.255 (1/3)	0.0308	0.0308	99.9383	
			<=0.47 (2/3)	0.0103	0.0103	99.9794	
			>0.47 (3/3)	25.0019	0.0077	74.9904	
		>0.727 (3/3)	<=0.255 (1/3)	0.0015	0.0013	99.9972	
			<=0.47 (2/3)	0.0013	0.0013	99.9974	
			>0.47 (3/3)	33.2787	33.2787	33.4426	
	<=7.9 (2/3)	<=0.355 (1/3)	<=0.255 (1/3)	0.0015	0.0015	99.9969	
			<=0.47 (2/3)	0.0034	0.0034	99.9932	
			>0.47 (3/3)	7.6941	92.3035	0.0024	
		<=0.727 (2/3)	<=0.255 (1/3)	43.9992	0.0025	55.9983	
			<=0.47 (2/3)	0.0023	0.0023	99.9953	
			>0.47 (3/3)	0.0103	0.0103	99.9794	
		>0.727 (3/3)	<=0.255 (1/3)	23.8443	0.0005	76.1552	
			<=0.47 (2/3)	0.0003	0.0003	99.9994	
			>0.47 (3/3)	32.2442	32.2442	35.5116	
		>7.9 (3/3)	<=0.355 (1/3)	<=0.255 (1/3)	30.8422	0.0027	69.1551
				<=0.47 (2/3)	0.0036	23.5305	76.4659
				>0.47 (3/3)	0.0123	0.0123	99.9753
	<=0.727 (2/3)		<=0.255 (1/3)	51.3205	0.0062	48.6733	
			<=0.47 (2/3)	0.0015	0.0015	99.9971	
			>0.47 (3/3)	0.0103	0.0103	99.9794	
	>0.727 (3/3)		<=0.255 (1/3)	9.7722	0.0005	90.2273	
			<=0.47 (2/3)	0.0005	0.0005	99.9989	
			>0.47 (3/3)	33.0829	33.0829	33.8343	

9. Conditional probability distribution for soil sampling location

Table S9. Conditional Probability Distribution for Soil Sampling Location				
Soil Pb > 100 ppm	House Value	Dripline	Streetside	Yard
0	<=1.292 (1/3)	13.4721	16.1778	70.3501
	<=2.859 (2/3)	18.4386	19.0152	62.5462
	>2.859 (3/3)	3.6152	23.4434	72.9414
1	<=1.292 (1/3)	26.2730	23.7631	49.9639
	<=2.859 (2/3)	36.3835	31.0676	32.5490
	>2.859 (3/3)	99.8632	0.0695	0.0673

10. Box plot of distribution of soil Pb data at three sampled locations

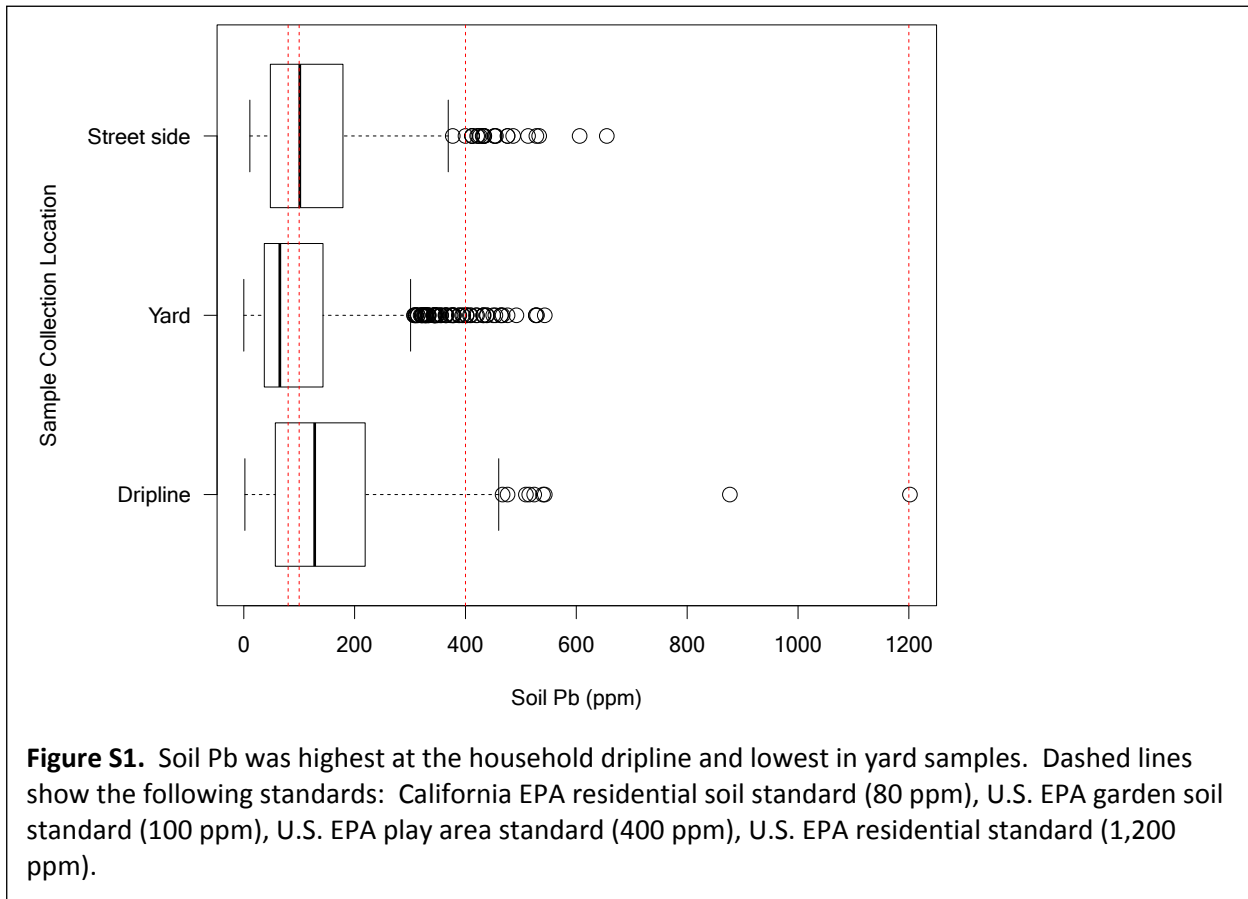


Figure S1. Soil Pb was highest at the household dripline and lowest in yard samples. Dashed lines show the following standards: California EPA residential soil standard (80 ppm), U.S. EPA garden soil standard (100 ppm), U.S. EPA play area standard (400 ppm), U.S. EPA residential standard (1,200 ppm).

11. Total influence of each variable in the model in figure 2 on the probability that soil Pb will exceed 100 ppm.

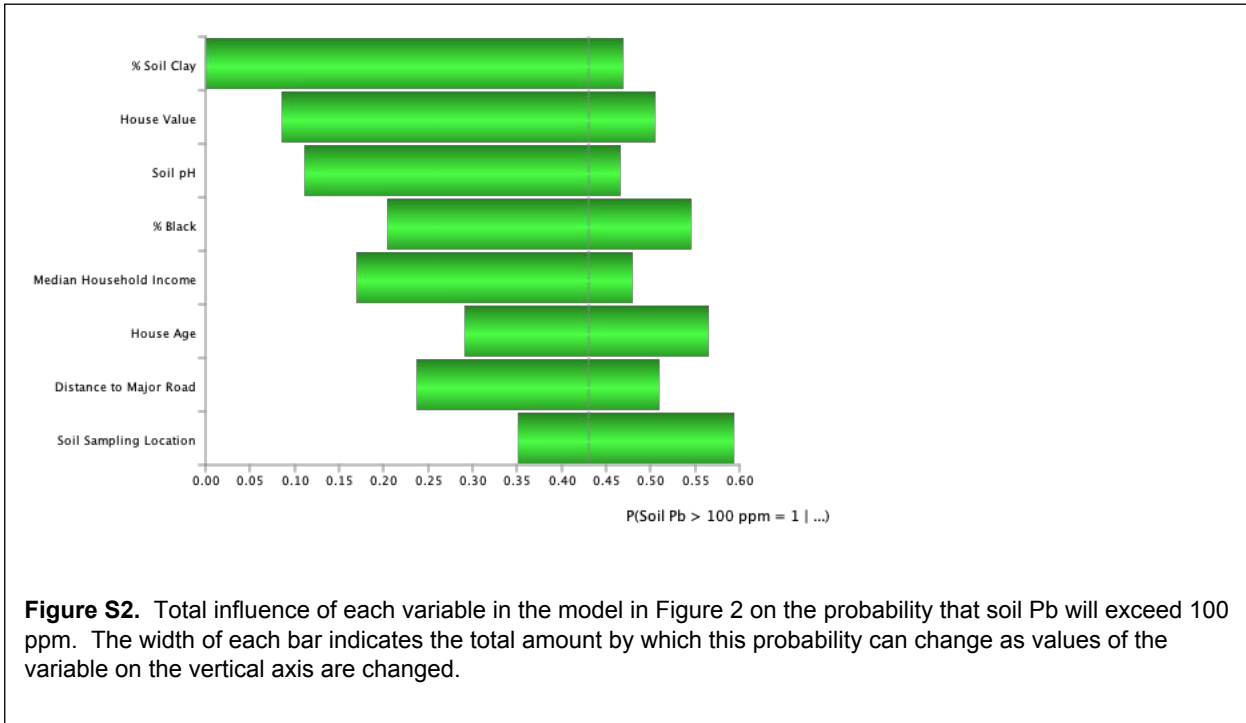


Figure S2. Total influence of each variable in the model in Figure 2 on the probability that soil Pb will exceed 100 ppm. The width of each bar indicates the total amount by which this probability can change as values of the variable on the vertical axis are changed.

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