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### **Supplemental Material**

### A Suspect Screening Method for Characterizing Multiple Chemical Exposures among a Demographically Diverse Population of Pregnant Women in San Francisco

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**Figure S2.** Overview of 455 suspect environmental organic acids (EOAs) detected in 75 serum samples by retention time and mass, colored by matched chemical class.

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Additional file- Code and data zip Document

# **Supplemental Tables**

**Table S1.** A list of compounds that correspond to multiple chemical classes per chemicalformula in our environmental organic acid (EOA) database

Chemical formula (n=9)	Compound name (n=25)	Chemical class	# of chemical classes per formula		
C10H12O2	Carbofuran	Phenolic pesticides	2		
	Eugenol	Phenols	_		
C12H10N2O	4-(Phenylazo)phenol	Phenols	2		
	Fenazox	Acidic pesticides	_		
C12H7Br3O2	4-(2,4,6-Tribromo-phenoxy)phenol	Phenols	2		
	Monohydroxy tribromodiphenyl ether	OH-BDEs	_		
C12H7Cl3O2	2,4,4'-Trichloro-2'-hydroxyphenyl ether	Phenols	2		
	Hydroxy trichlorobiphenyl	OH-PCBs	_		
C13H15N3O3	Imazapyr	Acidic pesticides	2		
	Pyrolan metabolite	Predicted pesticide metabolites	-		
C6H4Cl2O	1,4-Dichlorobenzene metabolite	Predicted pesticide metabolites	2		
	2,3-Dichlorophenol	Phenols	_		
	2,4-Dichlorophenol	Phenols	_		
	2,5-Dichlorophenol	Phenols	_		
	2,6-Dichlorophenol	Phenols	_		
	3,4-Dichlorophenol	Phenols	_		
C8H8O3	2,4-Dihydroxyphenone	Phenols	2		
	Methyl paraben	Phenols	_		
	Phenoxyacetic acid	Acidic pesticides	_		
C9H10O3	Dioxacarb artifact	Phenolic pesticides	2		
	Ethyl-p-hydroxybenzoate (Ethyl paraben)	Phenols	_		
C12H10O	2-Phenylphenol	Phenolic pesticides	3		
	3-Phenylphenol	Phenols	_		
	4-Phenylphenol	Phenols	_		
	Biphenyl metabolite	Predicted pesticide metabolites	_		

Formula, RT	Matched chemical names	s <b>Race</b> (n=67) <sup>a</sup>		Educ	ation (n=71)	Income (n=72)		
		Raw P	Adjusted P	Raw P	Adjusted P	Raw P	Adjusted <i>I</i>	
C6H4Cl2O, 4.067	1,4-Dichlorobenzene metabolite	< 0.001	< 0.001	< 0.001	< 0.001	< 0.001	< 0.001	
	2,3-Dichlorophenol							
	2,4-Dichlorophenol							
	2,5-Dichlorophenol							
	2,6-Dichlorophenol							
	3,4-Dichlorophenol							
C6HF13O3S, 5.058	Perfluorohexanesulfonic acid	< 0.001	< 0.001	0.025	0.115	0.004	0.079	
С9Н6ОЗ, 1.204	4-Hydroxycoumarin	0.079	0.536	0.003	0.046	0.566	0.965	
C14H18O4, 3.397	Monohexyl phthalate	0.508	0.900	0.006	0.046	0.290	0.965	
	Monoisohexyl phthalate							
C14H21NO2S, 0.787	Prosulfocarb metabolite	0.558	0.900	0.006	0.046	0.346	0.965	
C15H20O4, 3.594	Monoheptyl phthalate	0.668	0.906	0.003	0.046	0.198	0.918	
	Monoisoheptyl phthalate							
C16H18N2O4, 4.207	Difenoxuron metabolite	0.656	0.906	0.004	0.046	0.802	0.984	
C15H20O4, 3.876	Monoheptyl phthalate	0.725	0.906	0.006	0.046	0.895	0.984	
	Monoisoheptyl phthalate							
C20H33NO2, 8.198	Fenpropimorph metabolite	0.764	0.910	0.002	0.046	0.277	0.965	
C13H15N3O3, 0.858	Imazapyr	1	1	0.003	0.046	0.837	0.984	
	Pyrolan metabolite							
C6H4N2O5, 1.579	2,4-Dinitrophenol	0.019	0.466	0.016	0.102	0.003	0.079	
C16H22O4, 5.139	Mono (2-ethylhexyl) phthalate	0.228	0.659	0.048	0.160	0.005	0.079	
	Monoisooctyl phthalate							
	Monooctyl phthalate							
C11H14O3, 5.074	Butyl paraben	0.320	0.686	0.264	0.447	0.005	0.079	

**Table S2.** Raw and adjusted *P* values of suspect environmental organic acids (EOAs) by demographic characteristics, serum samples from pregnant women at delivery (N=75)

Note: Only compounds with detection frequency less than 60 were considered in this analysis. Compounds with detection frequency greater than or equal to 60 were analyzed based on their relative concentration. We further limited this analysis to compounds that were detected in at least 20% of participants with non-missing values for race/ethnicity, education, income, and nativity (U.S.-born status), resulting in 75, 70, 74, and 81 suspect EOAs being included for each demographic comparison respectively. *P*-values were obtained using a Fisher's exact test. We calculated adjusted *p*-values to correct for multiple comparisons for each demographic comparison using the Benjamini–Hochberg procedure (i.e., the false discovery rate method). None of the suspect EOAs differed by nativity due to the limited number of participants who answered this question (n=44) and thus results for nativity were not included in this table.

<sup>a</sup>Analysis was performed on a sample restricted to non-Hispanic whites, Latinas, and Asians only due to small sample sizes of non-Hispanic African Americans and other races.

<b>Formula</b>	RT <sup>a</sup>	DF <sup>a</sup>	Sel <sup>b</sup>	Confirmed	Selected compound for validation	CAS RN	HPV <sup>c</sup>	<b>ToxCast</b> <sup>d</sup>	TSCA <sup>e</sup>	<b>RT</b> <sub>Standard</sub>
C10H12O	3.498	1		No	Estragole	140-67-0		$\checkmark$	$\checkmark$	NP
	3.823	1		No						
	4.144	29	$\checkmark$	No						
	4.348	1		No						
C10H12O2	1.499	1		No	Eugenol	97-53-0		$\checkmark$	$\checkmark$	NP
	3.887	10		No						
	4.072	36	$\checkmark$	No						
	4.543	3		No						
C10H14O	3.815	2		No	2-tert-Butylphenol	88-18-6		$\checkmark$		5.6
	4.029	2		No	4-sec-Butylphenol	99-71-8		$\checkmark$		5.4
	4.246	43	$\checkmark$	No						
C10H14O2	2.19	1		No						
	2.403	1		No	4-Butoxyphenol	122-94-1			$\checkmark$	5.4
	2.926	2		No					N	5.4
	4.029	70	√(A)	No						
C11H14O2	4.008	2		No	Methyl eugenol	93-15-2				
	4.38	2		No				$\checkmark$	$\checkmark$	NP
	4.629	3		No						
	5.129	63	√(A)	No						
C12H18O2	0.831	2		No	4-Hexyloxyphenol					
	3.985	9		No		18979-55-0		$\checkmark$	$\checkmark$	5.8
	4.767	58	$\checkmark$	No				v	N	5.8
	5.27	2		No						
C13H20O2	1.113	1		No						
	3.863	11		No		13037-86-0				
	4.331	21	$\checkmark$	No	4-Heptyloxyphenol					6.2
	4.793	19		No						
	5.276	21		No						
C14H22O	4.321	5		No	2,6-Di-tert-butylphenol	128-39-2		$\checkmark$	$\checkmark$	7.25
	4.433	9		No						
	4.788	17		No						
	5.066	33		No						

**Table S3.** Selected chemical formula, suspect features from the sample, and the corresponding candidate chemicals for confirmation analysis

Formula	RT <sup>a</sup>	DF <sup>a</sup>	Sel <sup>b</sup>	Confirmed	Selected compound for validation	CAS RN	HPV <sup>c</sup>	<b>ToxCast</b> <sup>d</sup>	TSCA <sup>e</sup>	<b>RT</b> <sub>Standard</sub>
	5.153	40		No						
	5.283	38		No						
	6.719	74	$\sqrt{(A)}$	Yes <sup>f</sup>	2,4-Di-tert-butylphenol (2,4,-DTBP)	96-76-4	$\checkmark$	$\checkmark$		6.75
				Yes <sup>f</sup>	4-tert-Octylphenol	140-66-9	$\checkmark$	$\checkmark$		6.5
C15H22O3	3.791	1		No						
	4.537			No						
	5.132	64		Yes	3,5-Di-tert-Butylsalicylic acid	19715-19-6				5.3
C16H26O2	4.191	6		No						
	4.545	3		No	4-tert-Octylphenol monoethoxylate	2315-67-5				NP
	4.779	5		No	solution	2313-07-3				INF
	6.153	61	$\sqrt{(A)}$	No						
C6H4N2O5	0.579	8		No						
	1.579	52	$\sqrt{(A)}$	Yes	2,4-Dinitrophenol (2,4-DNP)	51-28-5	$\checkmark$	$\checkmark$		1.6~2.0
C6H6O2	0.942	33		No						
	1.352	39		Yes	Pyrocatechol	120-80-9				1.49
	2.364	2		No						
C7H8O	0.893	3		No	2-Methylphenol	95-48-7	$\checkmark$	$\checkmark$		4.2
	1.75	1		No	4-Methylphenol	106-44-5	$\checkmark$	$\checkmark$		4.4
	1.999	70		No						
	3.239	1		No						
	3.587	1		No						
	4.357	1		No						
C8H8O2	1.039	54		No						
	1.555	1		No						
	2.489	2		No						
	3.027	17		No						
	3.422	6		Yes <sup>g</sup>	2-Hydroxyacetophenone	118-93-4		$\checkmark$		3.3
				Yes <sup>g</sup>	3'-Hydroxyacetophenone	121-71-1				3.3
	4.051	15		No						
	5.024	6		No						
C8H8O3	1.187	15		No						
	1.931	66	$\sqrt{(A)}$	No						
	2.393	2		No	Phenoxyacetic Acid	122-59-8		$\checkmark$	$\checkmark$	0.86
	3.888	35		No						
	4.273	1		No						

Formula	RT <sup>a</sup>	DF <sup>a</sup>	Sel <sup>b</sup>	Confirmed	Selected compound for validation	CAS RN	HPV <sup>c</sup>	<b>ToxCast</b> <sup>d</sup>	<b>TSCA</b> <sup>e</sup>	<b>RT</b> <sub>Standard</sub>
C9H6O3	0.927	1		Yes	4-Hydroxycoumarin	1076-38-6				0.8
	1.204	20	$\sqrt{(A)}$	No						

Abbreviations: EOA, environmental organic acid; DF, detection frequency; RT, retention time (mean); HPV, high production volume; RT<sub>standard</sub>, retention time of the corresponding reference standard obtained from the QTOF validation analysis; NP, not present.

Note: confirmed compounds are highlighted in blue. Information on each suspect EOA (unique combination of formula and mean RT) is listed in the first four columns. The columns that were shaded in purple contain information on the selected candidate compound(s) for validation. There can be multiple candidate compounds being selected for validation and we will compare the  $RT_{standard}$ , accurate mass and MS/MS spectral pattern of a reference standard to that of each of the suspects with the same formula. We confirmed the presence of the suspect EOA if it has the same RT, mass, and MS/MS spectral pattern as that of the corresponding reference standard.

<sup>a</sup>RT (mean) and DF for suspect EOAs detected in our samples.

<sup>b</sup>Suspect EOA selected initially for compound confirmation process. "(A)" annotates compounds that were chosen at the first round because of their high detection (DF $\geq$ 60) and showing potential demographic differences in relative concentration based on raw *p*-values < 0.1 (Supplementary Figure S3) or in detection frequency based on adjusted *p*-values < 0.1 (Supplementary Table S4). Compounds without annotation were chosen at subsequent rounds according to their rank order of detection frequency.

<sup>c</sup>Chemicals being manufactured and/or imported into the US with an aggregate volume of 1 million to 10 million pounds/year, according to the US HPV list by US Environmental Protection Agency (2004).

<sup>d</sup>Toxicity ForeCaster (ToxCast<sup>TM</sup>) Data: Chemical information database, available at:

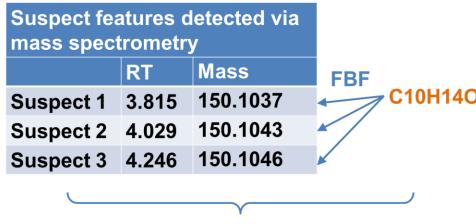
 $ftp://newftp.epa.gov/comptox/High\_Throughput\_Screening\_Data/DSSTox\_Oct\_2015$ 

eThe Toxic Substances Control Act (TSCA) Chemical Substance Inventory, available at: https://www.epa.gov/tsca-inventory

<sup>f</sup>4-tert-Octylphenol has RT very close to 2,4,-DTBP and is currently biomonitored by NHANES. Thus, it is not counted towards confirmed novel compounds.

<sup>g</sup>2-Hydroxyacetophenone or 3'-Hydroxyacetophenone being isomers with very close structures and cannot be distinguished by RT solely in the current LC-QTOF/MS analysis

### **Supplemental Figures**



## Data processing step:

- Find-by-formula (FBF) algorithm to generate mass matches
- Identify suspect features by grouping mass matches based on retention time (RT)

## Suspect prioritization:

- Detection frequency
- Associational analysis with demographics

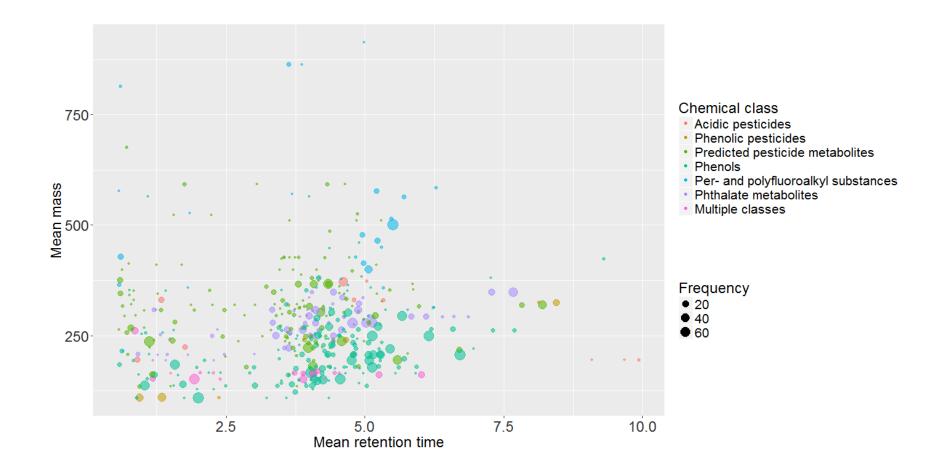
Suspect candidates with formula C10H14O in the EOA database

- 2-(1,1-Dimethylethyl)phenol
- 2-sec-Butylphenol
- 4-Butylphenol
- 4-sec-Butylphenol
- 4-tert-Butylphenol

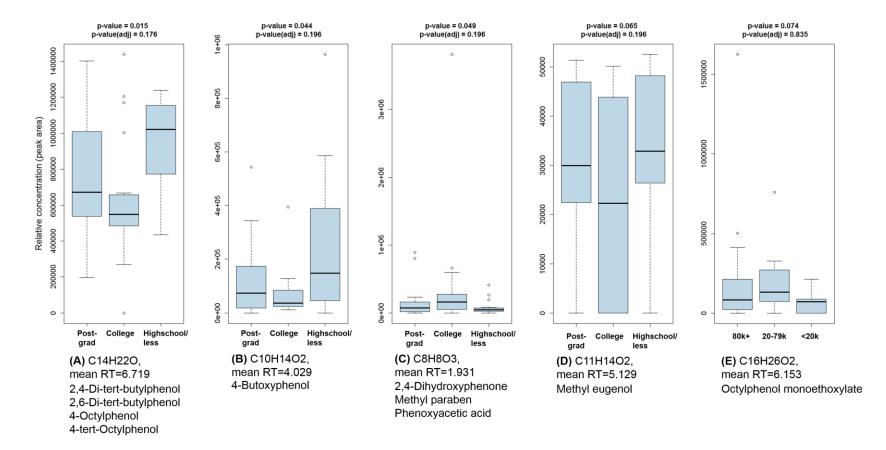
# Suspect prioritization:

Literature and database search to obtain additional information on these suspect candidates

**Figure S1.** Illustration of many (suspect features)-to-many (chemicals) matching. When isomers are present, we could detect multiple chemical features via high-resolution mass spectrometry, indicated by the same (allowing for small measurement error) mass and different retention time. Each of these features can be matched to multiple suspect candidates with the same chemical mass (*i.e.*, formula) included in our EOA database (with equal probability). The exact match between a specific suspect feature and its chemical identity will need to be confirmed using synthetic reference standards.



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