Clark University Clark Digital Commons

International Development, Community, and Environment

Faculty Works by Department and/or School

5-1-2022

Multiple Metals in Children's Deciduous teeth: Results from a Community-Initiated Pilot Study

Alexa Friedman School of Public Health

Julia Anglen Bauer School of Public Health

Christine Austin Icahn School of Medicine at Mount Sinai

Timothy Downs Clark University

Yorghos Tripodis School of Public Health

See next page for additional authors Follow this and additional works at: https://commons.clarku.edu/faculty_idce

Part of the Environmental Studies Commons

Repository Citation

Friedman, Alexa; Bauer, Julia Anglen; Austin, Christine; Downs, Timothy; Tripodis, Yorghos; Heiger-Bernays, Wendy; White, Roberta; Arora, Manish; and Claus Henn, Birgit, "Multiple Metals in Children's Deciduous teeth: Results from a Community-Initiated Pilot Study" (2022). *International Development, Community, and Environment*. 115.

https://commons.clarku.edu/faculty_idce/115

This Article is brought to you for free and open access by the Faculty Works by Department and/or School at Clark Digital Commons. It has been accepted for inclusion in International Development, Community, and Environment by an authorized administrator of Clark Digital Commons. For more information, please contact larobinson@clarku.edu, cstebbins@clarku.edu.

Authors

Alexa Friedman, Julia Anglen Bauer, Christine Austin, Timothy Downs, Yorghos Tripodis, Wendy Heiger-Bernays, Roberta White, Manish Arora, and Birgit Claus Henn

This article is available at Clark Digital Commons: https://commons.clarku.edu/faculty_idce/115

ARTICLE OPEN Multiple metals in children's deciduous teeth: results from a community-initiated pilot study

Alexa Friedman^{1™}, Julia Anglen Bauer^{1,2}, Christine Austin³, Timothy J. Downs⁴, Yorghos Tripodis⁵, Wendy Heiger-Bernays¹, Roberta F. White^{1,6}, Manish Arora³ and Birgit Claus Henn¹

© The Author(s) 2021

BACKGROUND: Characterizing retrospective exposure to toxicants during multiple early-life developmental periods is challenging, yet critical for understanding developmental effects.

OBJECTIVE: To characterize early-life metal exposure using deciduous teeth in a community concerned about past exposures. **METHODS:** Naturally shed teeth were collected from 30 children ages 5–13 years who resided in Holliston, Massachusetts since conception. We estimated weekly prenatal and postnatal (up to 1 year of age) exposure to 12 metals by measuring dentine concentrations using laser ablation-inductively coupled plasma-mass spectrometry. Multivariable linear mixed models were used to explore sociodemographic, dietary, and behavioral correlates of dentine metal concentrations.

RESULTS: Temporal trends in dentine levels differed by metal. Source of milk during the first year of life was associated with dentine barium (Ba) levels, where being fed predominantly breastmilk was associated with 39% (95% CI: –57%, –13%) lower dentine Ba compared to predominantly formula use. Females had higher prenatal and postnatal dentine Mn and Pb, compared to males (e.g., % difference, postnatal Mn: 122% (17%, 321%); postnatal Pb: 60% (95% CI: –8%, 178%)).

SIGNIFICANCE: Deciduous teeth provide retrospective information on dose and timing of early-life metals exposure at high resolution. We demonstrate their utility in a community-based study with known past contamination of drinking water. **IMPACT STATEMENT:** We conducted a community-initiated pilot study in a community concerned with historical exposure to multiple metals. Using deciduous teeth, a novel noninvasive biomarker, we characterized early-life exposure to 12 metals in approximately weekly increments during sensitive developmental periods, thus demonstrating the utility of this biomarker in communities concerned with past exposures.

Keywords: Metals; Early-life exposure; Biomonitoring; Child exposure/health

Journal of Exposure Science & Environmental Epidemiology (2022) 32:408-417; https://doi.org/10.1038/s41370-021-00400-x

INTRODUCTION

Critical windows of susceptibility, also referred to as critical windows of exposure, are periods during development in which exposures to specific toxicants have a greater effect on a health outcome compared to the same exposure during other periods [1]. During development, the brain undergoes unique changes in morphology and connectivity, making gestation and infancy critical periods during which exposure to toxicants often have adverse effects on neurodevelopment [2, 3]. Furthermore, protective regulatory mechanisms such as the blood–brain barrier are not fully formed, making the fetus and infant particularly susceptible to overexposure to toxicants [4, 5]. Increasing evidence points to heterogeneity in the health effects of metals depending on timing of exposure [5, 6]. Thus, it is important to characterize metal exposure during multiple developmental periods, rather than at a single time point.

Measuring retrospective exposure, particularly during critical periods such as in utero and early childhood, presents a challenge in environmental epidemiology studies. While estimates of past exposure, such as historic public drinking water or air monitoring data, are sometimes available that coincide with the critical windows of interest, these environmental measures have greater error compared to internal biomarkers for measuring individuallevel exposure, given that they are further removed from the target tissue dose [7]. Traditional biomarkers of prenatal and earlylife exposure (e.g., maternal or cord blood) are typically collected less frequently, are limited in the information they provide (i.e., may represent shorter exposure windows), and are subject to exposure misclassification (i.e., do not reflect direct exposure to the fetus). Collection of other biospecimens (e.g., hair, nails, urine) from infants and young children can be logistically difficult and would be required at multiple time points after birth, as these biospecimens represent relatively short windows of exposure.

Received: 14 June 2021 Revised: 21 October 2021 Accepted: 22 October 2021 Published online: 8 November 2021

¹Department of Environmental Health, Boston University School of Public Health, Boston, MA, USA. ²Department of Epidemiology, Geisel School of Medicine, Dartmouth College, Lebanon, NH, USA. ³Department of Environmental Medicine and Public Health, Icahn School of Medicine at Mount Sinai, New York, NY, USA. ⁴Department of International Development, Community, and Environment, Clark University, Worcester, MA, USA. ⁵Department of Biostatistics, Boston University School of Public Health, Boston, MA, USA. ⁶Department of Neurology, Boston University School of Medicine, Boston, MA, USA. ^{See}email: lexf@bu.edu

The use of deciduous, or naturally shed, baby teeth presents an opportunity to assess retrospective early-life exposure to toxicants in a highly temporally resolved manner and thus allows for estimation of exposure in a noninvasive sample during relevant and sensitive developmental windows [8, 9]. Metals accumulate in tooth dentine beginning in the second trimester of pregnancy and tooth mineralization occurs over time, spanning the prenatal and early childhood periods [8, 9]. At birth, the neonatal line, a histological feature, is formed in the tooth dentine, allowing researchers to characterize metal exposure during the prenatal, postnatal, and early childhood periods with temporal precision [8, 9]. Furthermore, a single tooth provides high-resolution repeated measures of exposure that increases the amount of data per individual and avoids the logistical challenges of collecting repeated biospecimens, which is necessary when examining critical windows of susceptibility using other biomarkers.

Retrospective biomarkers that can measure levels of multiple contaminants are particularly useful in settings where it is necessary to quantify internal levels of numerous known prior exposures. For example, regulated (e.g., Pb, having an Action Level under the Safe Drinking Water Act) and unregulated (e.g., Mn, with only a nonenforceable guideline in drinking water) metals have been detected in public drinking water supplies in the US and globally at levels that may pose a public health risk [10-12]. Increasing evidence links exposure to metals in drinking water with decrements in neurobehavioral outcomes in children [11] but the levels of unregulated contaminants, like Mn, in drinking water that are considered safe, particularly for vulnerable subpopulations like children, are unknown [11, 13]. Some limitations of previous epidemiological studies of metals in drinking water include the lack of a consistent biomarker across studies and the inability to measure past exposure during the most relevant exposure windows [11]. Thus, the application of the tooth biomarker may be particularly useful in the context of known past contamination and in community-based studies, in which sample sizes are often small, there may be multiple contaminants of concern, and it is rarely possible to reconstruct personal exposures accurately [14].

We conducted a community-initiated pilot study in the suburban town of Holliston, Massachusetts (MA), USA. In Holliston, the community relies on two local aguifers for nearly 100% of their drinking water, which are susceptible to landfill and industrial contamination and contain naturally elevated levels of Mn and other metals, as evidenced by episodic discolored residential tap water that has occurred for years [15]. This study was conducted in response to residents' concerns about early-life exposure to metals and their children's health. The study aims to assess children's exposure during critical periods of development, with regular bidirectional communication with community members. By estimating exposure to multiple metals during sensitive life stages (in utero through 1 year of life) using deciduous teeth as a novel, high-resolution biomarker of retrospective exposure, we conducted an exploratory analysis to examine demographic, behavioral, and water consumption factors as correlates of dentine metal concentrations.

MATERIALS AND METHODS Study area and recruitment

Participants were part of the Assessing Children's Environmental Exposures (ACHIEVE) study, a community-initiated pilot research study in Holliston, MA, USA. Mother-child pairs were recruited through local newspapers, posting of brochures on town bulletins, community Facebook pages, and word of mouth. Eligibility criteria included: being a resident of Holliston, MA, at time of enrollment; having lived in Holliston during pregnancy with participating child; having a child between 5 and 13 years old at time of enrollment who had lost or were losing teeth; and being willing to donate their child's shed tooth. If multiple children in a household were eligible, one child per household was included in the study, selected at random.

Eligible participants were informed about the study and written consent was obtained from mothers prior to participation. Of 35 mother-child pairs who expressed interest in the study, 5 were ineligible because the child was either outside of the eligible age range (n = 2) or did not have a deciduous tooth to donate (n = 3). A total of 30 mother-child pairs were enrolled between 2017 and 2018, 29 of whom donated a tooth prior to analysis in 2018. Home visits were conducted to collect deciduous teeth and administer questionnaires to mothers. Information was obtained via questionnaire on participant sociodemographic characteristics, drinking water consumption patterns, use of filters for drinking water, sources of milk during infancy, and parent-reported learning and behavioral disorders. The research study protocol and all study materials were approved by the Institutional Review Board at the Boston University School of Public Health.

Metals in deciduous teeth

One deciduous tooth was collected per child during the home visit. Molars and incisors that had been shed prior to or during enrollment were collected and stored at room temperature before being shipped to the Senator Frank R. Lautenberg Health Sciences Laboratory at the Icahn School of Medicine at Mount Sinai for analysis of metals content. Teeth that had defects or high levels of attrition (i.e., excessive wear and tooth surface loss) (n = 1) were unable to be analyzed and were thus excluded. Analytic methods for measurement of dentine metal concentrations have been validated and described previously in detail [8, 16, 17]. Using the neonatal line formed at birth, incremental markings on the teeth akin to growth rings in trees are used to assign temporal sampling points (about every 7-10 days). Using laser ablation-inductively coupled plasma-mass spectrometry (LA-ICP-MS), signal intensities (i.e., values) of the following 12 metals were measured: Mn, Pb, barium (Ba), chromium (Cr), cobalt (Co), copper (Cu), lithium (Li), magnesium (Mg), molybdenum (Mo), strontium (Sr), tin (Sn), and zinc (Zn). The panel of metals represents the standard panel that can be reliably measured by LA-ICP-MS in the tooth matrix. Calcium (Ca) was also measured to account for individual mineral density variation within and between participants and metal values were normalized to Ca ion values (e.g., ⁵⁵Mn:⁴³Ca ratio for manganese). The metal value in the gas blank was subtracted from the metal values measured in each tooth prior to normalizing to Ca. Tooth metal values that are less than levels measured in the blank (and thus are negative values) represent levels below the limit of detection (LOD). Detection frequency was above 97% for all metals except Co and Mo (78% and 89%, respectively) (Supplementary Table 1). Given the relatively low percentage of values below the LOD [18], samples below the LOD were set to the metal's lowest measured level divided by square root of 2 (Supplementary Table 1). To allow for a comparison of dentine metal levels between this study and other populations, an external standard correction was used to account for differences between laboratories and analytical methods. The certified reference material NIST 610 was applied to the dentine metals data for external correction. Laboratory technicians were blinded to participant information.

Potential correlates of dentine metal concentrations

The following demographic, dietary, and behavioral characteristics were considered as potential correlates of dentine metal concentrations: child sex, birth order, age (continuous, in years), public versus private drinking water source, filter use during pregnancy, tooth type (incisors versus molars), maternal water consumption habits during pregnancy, maternal anemia during pregnancy, infant formula use, and breastfeeding. For water consumption habits during pregnancy, mothers reported their frequency of use of filtered water for food preparation, filtered water for making coffee/tea, and bottled water. Mothers reported duration of breastfeeding (<3 months, 3-6 months, 6-9 months, 9 months-1 year, >1 year), ever use of formula in infant's first year, infant's age at first use of formula, and percentage of milk in infant's first year that was formula (<10%, 10-<50%, 50%, >50-<100%, 100%). Information on breastfeeding duration and percentage of milk that was formula in infant's first year were combined to estimate the predominant source of milk in infant's first year (breastmilk, formula, or mix). Given the small sample size for some of these groups, the following correlates are presented in supplementary tables only: well type, filtered water use for food preparation, filtered water use for coffee/tea preparation, bottled water use, and breastfeeding (ever). For temporality reasons, source of milk was evaluated as a correlate of postnatal levels of dentine metals only.

Table 1. Sociodemographic characteristics of participating mother–child pairs (n = 28).

Child	N (%) or mean (range)
Sex	
Male	18 (64)
Female	10 (36)
Age, years	8.8 (5.8–14.5)
Has siblings	26 (93)
Birth order	
First	13 (46)
Second or higher	15 (54)
Requires special services at school	9 (32)
Has an individualized education program	8 (29)
Learning disability ^a	6 (21)
Attention deficit hyperactive disorder ^a	1 (4)
Autism spectrum disorder ^a	4 (14)
Family has moved since pregnancy (within Holliston)	5 (18)
Breastfed, ever	25 (89)
Duration of breastfeeding	
<3 months	5 (20)
3–6 months	4 (16)
6–9 months	3 (12)
9 months-1 year	3 (12)
>1 vear	10 (40)
Formula use, ever	21 (75)
Percent of milk that was formula in first year of life	(/
<10	1 (5)
10-<50	4 (19)
50	4 (19)
>50-100	4 (19)
~100	8 (38)
Source of water for formula preparation	
Tap water (unfiltered)	8 (38)
Tap water (filtered)	12 (57)
Bottled water	0 (0)
Missing	1 (5)
Predominant source of milk in first year of life	
Formula ^b	11 (39)
Breastmilk ^c	11 (39)
Mix of breastmilk and formula ^d	6 (21)
Tooth type	0 (21)
Incisor	24 (86)
Molar	4 (14)
Mother	N (%)
Race/ethnicity	
Non-Hispanic white	26 (93)
Other, multiracial	2 (7)
Employed outside home during preanancy	25 (89)
Worked in Holliston during pregnancy	1 (4)
Anemic during pregnancy ^e	
Yes	8 (29)
No	19 (68)
Don't know	1 (4)

^aParent-reported physician diagnosis.

^bPredominantly formula defined as maternal report of being breastfed less than 6 months and consuming \geq 50% formula during first year of life.

^cPredominantly breastmilk defined as maternal report of being breastfed longer than 6 months and consuming less than 50% formula during first year of life.

^dMix of breastmilk and formula defined as maternal report of being breastfed for less than 6 months and consuming less than 50% formula during first year of life OR maternal report of being breastfed for longer than 6 months and consuming \geq 50% formula during first year of life.

^eEver told by physician during pregnancy.

Table 2. Drinking water characteristics and consumption patterns during pregnancy (n = 28).

	N (%)
Household water source	
Public water supply	25 (89)
Private well	3 (11)
Has filtration system	
Yes	14 (50)
Point of entry (basement)	2 (14)
Point of use (sink, pitcher)	12 (86)
No	14 (50)
Use of filtered water for food preparation	
Always	3 (11)
Rarely/sometimes	4 (14)
Never	21 (75)
Use of filtered water for coffee/tea preparation	
Always	6 (21)
Rarely/sometimes	6 (21)
Never	16 (59)
Bottled water use	
Always	2 (7)
Rarely/sometimes	17 (61)
Never	9 (32)

Statistical analyses

Summary statistics were calculated, and distributions were examined for all variables (Tables 1 and 2). Dentine metal levels, measured as a ratio of metal to calcium (i.e., metal:Ca), represent approximately weekly measurements of exposure for each participant from the second trimester of pregnancy through 1 year of age. For summary statistics only, we averaged the fine-resolution tooth metal measurements within each subject for each of two exposure periods: prenatal (second trimester to birth) and postnatal (birth through 1 year of age) (Supplementary Table 2).

To investigate correlates of dentine metal levels, we used a multivariable linear mixed model with the fine-resolution dentine metal values (approximately weekly measurements) as the dependent variable. We examined correlates separately for each developmental period, given the potential for distinct associations in these two different windows. Thus, two sets of models were fit: one for the prenatal period and one for the postnatal period (i.e., weekly measurements from the second trimester until birth as the dependent variable in prenatal models; from birth to 1 year of age in postnatal models). Dentine metal values were right skewed; we log-transformed metal values to reduce the influence of extreme values and to meet the normality of residuals assumption for linear regression. A subject-specific random intercept accounted for within-subject correlation of repeated weekly measures of dentine metal values. All models were adjusted for child sex. Percent difference (%D) in dentine metal value per unit increase in the correlate was calculated by exponentiating the beta coefficient, subtracting 1, and then multiplying by 100 (i.e., (et $^{eta} - 1) \times$ 100)) (Tables 3-5 and Supplementary Tables 3-14). In a sensitivity analysis, we computed associations between correlates and tooth levels truncated to postnatal week 20, given the reduced number of sampling points that could be collected from teeth in our sample after 20 weeks post birth (Supplementary Table 14).

All statistical analyses were conducted using R 3.5.2 and SAS 9.4 (SAS Institute Inc.).

RESULTS

Participant characteristics

A total of 28 children with complete questionnaire information and tooth metals data were included in the final analysis. Participating mothers were mostly white (93%) and had lived in the same home in Holliston, MA, since pregnancy (82%) (Table 1).

		Prenatal Ba		Postnatal Ba		
				i ostilutur bu		
	Ν	β (95% CI)	% Difference (95% CI)	β (95% Cl)	% Difference (95% Cl)	
Child sex						
Male	18	ref	ref	ref	ref	
Female	10	0.1 (-0.2, 0.5)	15 (–14, 55)	0.1 (-0.2, 0.5)	13 (–21, 60)	
Child age, continuous (years)	28	0.02 (-0.1, 0.1)	2 (-5, 8)	0.01 (-0.1, 0.1)	2 (-6, 10)	
Birth order						
Second or higher	15	ref	ref	ref	ref	
First	13	0.1 (-0.3, 0.4)	7 (-22, 47)	-0.01 (-0.4, 0.4)	-1 (-32, 45)	
Tooth type						
Incisor	24	ref	ref	ref	ref	
Molar	4	0.1 (-0.3, 0.5)	10 (–27, 66)	0.5 (-0.5, 0.6)	5 (-36, 70)	
Anemic while pregnant						
No	19	ref	ref	ref	ref	
Yes	8	-0.1 (-0.4, 0.3)	-7 (-32, 29)	0.1 (-0.4, 0.5)	5 (–29, 54)	
Use of filter during pregnancy						
Yes	14	ref	ref	ref	ref	
No	14	0.1 (-0.2, 0.4)	6 (-20, 42)	0.2 (-0.2, 0.5)	22 (-13, 70)	
Ever use formula ^{a,b}						
No	7			ref	ref	
Yes	21			0.6 (0.2, 0.9)	79 (27, 152)	
Predominant source of milk during infancy						
Infant formula ^c	11			ref	ref	
Breastmilk ^d	11			-0.5 (-0.9, -0.1)	-39 (-57, -13)	
Mix of breastmilk and formula ^e	6			-0.1 (-0.6, 0.3)	-14 (-44, 32)	

Table 3. Correlates of log-transformed prenatal and postnatal dentine Ba levels (as ¹³⁸Ba:⁴³Ca) from sex-adjusted linear mixed models.

^aPrenatal correlate of breastfeeding and formula variables not analyzed since correlates occur after tooth Ba was measured.

^bApplies to index (participating) child only.

^cPredominantly formula fed defined as maternal report of being breastfed less than 6 months and consuming ≥50% formula during first year of life.

^dPredominantly breastfed defined as maternal report of being breastfed longer than 6 months and consuming less than 50% formula during first year of life. ^eMix of breastmilk and formula defined as maternal report of being breastfed for less than 6 months and consuming less than 50% formula during first year of life OR maternal report of being breastfed for longer than 6 months and consuming less than 50% formula during first year of life.

Of the 26 children with siblings, nearly half were first-born (n = 11; 42%). About one-third of children required special services at school (n = 9, 32%), nearly all of whom had an individualized education plan (n = 8). Most mothers resided in homes serviced with water from a public drinking water (groundwater) source during pregnancy (89%) (Table 2). Fifty percent of participants had some type of water filtration system in their homes, including point of use (e.g., sink attachment or pitcher filter) and point of entry (e.g., whole house filter) systems.

Prenatal and early postnatal values of dentine metals

We measured 12 metals in dentine but focus results on Ba, Mn, and Pb, given the historical evidence of Mn in Holliston drinking water [15], the known neurotoxicity of Mn and Pb, the interests of community members, and prior findings of tooth Ba as a dietary marker [19]. The total number of measurements of dentine metals values per participant varied, with a mean (range) of 36 (19–70) measurements. Levels and ranges of dentine Ba remained similar between the prenatal and postnatal period (Fig. 1). In the prenatal period, median (25th, 75th percentile) dentine Ba (as ¹³⁸Ba:⁴³Ca) was 0.62 (0.49, 0.71), and in the early postnatal period, the median was 0.64 (0.53, 0.94) (Supplementary Table 2). Levels of dentine Mn were highest in the early prenatal period (second trimester) and declined steadily until birth, with a slower decline and increased variability in the postnatal period. In the prenatal period, median (25th, 75th percentile) dentine Mn (as ⁵⁵Mn:⁴³Ca) was 0.25 (0.19, 0.29), while in the early postnatal period, the median was

0.06 (0.04, 0.09). Like Ba, ranges of dentine Pb remained similar between prenatal and postnatal periods. In the prenatal period, median (25th, 75th percentile) dentine Pb (as 208 Pb: 43 Ca) was 0.01 (0.01, 0.02), and in the early postnatal period, the median was 0.01 (0.01, 0.02).

Correlates of dentine metals values

Direction and magnitude of associations between correlates and dentine metals values varied by metal. Being fed predominantly breastmilk, compared to predominantly infant formula, was associated with 39% (95% CI: -57%, -13%) lower levels of dentine Ba $[\beta = -0.5 (95\% \text{ Cl}: -0.9, -0.1)]$; being fed a mix of breastmilk and formula, compared to predominantly formula, was associated with 14% (-44%, 32%) lower dentine Ba levels [B = -0.1 (95% Cl: -0.6, 0.3)] (Table 3). Similarly, ever use of formula, compared to never use, was associated with higher dentine Ba (%D: 79%; 95% CI: 27%, 152%). For dentine Mn, child sex was the strongest correlate: female sex was associated with 13% (95% Cl: -16%, 52%) higher prenatal and 122% (17%, 321%) higher postnatal tooth Mn values, compared to males (Table 4). Females, compared to males, also had higher levels of Ba and Pb in both the prenatal [%D Ba: 15% (95% CI: -14%, 55%); %D Pb: 40% (95% CI: -9%, 117%)] and postnatal [%D Ba: 13% (95% Cl: -21%, 60%); %D Pb: 60% (95% Cl: -8%, 178%)] periods (Table 5), though estimates were imprecise. Associations between other correlates and dentine Ba, Mn, and Pb were weaker and less precise (Tables 3–5; Supplementary Tables 3 and 4). Time trends in dentine metals values also appeared to



Weeks Since Birth

Fig. 1 Dentine Ba, Mn, and Pb metal levels from early second trimester (20 weeks before birth) until 1 year of age (52 weeks), as In metal:⁴³Ca ratio. Dots represent individual dentine metal measurements for 28 participants, with a range of 19–70 measurements per participant. Vertical line at week 0 indicates birth. Values below the LOD were imputed as minimum measured value/sqrt(2). Line represents Loess smoother. a) Dentine metal levels for all participants; b) Dentine metal levels stratified by child sex.

differ by sex for Li and Zn, while values of Co, Cr, Cu, Mo, Mg, and Sn differed little by sex and were less variable over time (Fig. 2 and Supplementary Table 2). Correlates were not appreciably associated with other metals (Co, Cr, Cu, Li, Mo, Mg, Sn, Sr, Zn) (Supplementary Tables 5–13). There were no appreciable differences in findings from the truncated data set compared to the full data set; thus, we included all data in main analyses (Supplementary Table 14).

DISCUSSION

In this community-initiated pilot study, we characterized retrospective exposure to multiple metals during critical developmental periods using deciduous teeth as a biomarker of prenatal and postnatal exposure. This effort built off our previous work to address community concerns about historical exposures to neurotoxic metals [15]. These data demonstrate the feasibility of employing naturally shed teeth to understand past exposures in a community with known exposure through drinking water, but where retrospective exposure information on an individual level was otherwise not obtainable. Temporal trends of dentine metal values differed by metal. Dentine Mn levels decreased from the second trimester until birth whereas dentine Ba slightly increased and Pb remained more constant throughout the prenatal period and early life. We also found that dentine Ba may reflect dietary practices related to milk consumption during early life and that dentine levels of both Pb and Mn differ by child sex, with females having higher levels than males, although estimates were imprecise.

The observed decrease in dentine Mn from the second trimester to the first year of life has been reported in other studies and is likely related in part to the physiologic need for Mn as an essential nutrient to support healthy growth in early development [20-22]. The prenatal period is a time of rapid growth and development of the fetus, during which the demand for Mn may be greatest [21]. This is compatible with previous studies that have reported increases in maternal blood Mn during pregnancy [23-25], which supports the notion of a biological role of Mn during gestation. During gestation, exposure to Mn is more tightly regulated as the placenta may protect the fetus from direct effects of Mn overexposure [26], whereas after birth, the placenta no longer regulates Mn levels that are transported to the fetus. While development continues, the relative demand for Mn may be lower than in the prenatal period. The observed increase in variability in the postnatal period may be related to both differential exposures in the postnatal versus prenatal environments, such as direct exposure to Mn in drinking water, as well as biological changes, such as varied absorption of Mn in the gut in the postnatal period compared to the prenatal period [27, 28].

In this study, Ba levels increased slightly from the prenatal to postnatal periods. An increase in Ba levels after birth is expected, as transfer of Ba from mother to fetus is restricted by the placenta in the prenatal period [27], but after birth, increasing Ba levels likely reflect consumption of breastmilk and/or formula [19]. One previous study found that ¹³⁸Ba:⁴³Ca distributions in teeth accurately reflect the dietary transition from mother's milk to other sources during the weaning process and concluded that

		Prenatal Mn		Postnatal Mn	
	N	β (95% CI)	% Difference (95% Cl)	β (95% CI)	% Difference (95% CI)
Child sex					
Male	18	ref	ref	ref	ref
Female	10	0.1 (-0.2, 0.4)	13 (–16, 52)	0.8 (0.1, 1.5)	122 (17, 321)
Child age, continuous (years)	28	-0.1 (-0.1, -0.02)	-8 (-13, -2)	-0.1 (0.3, 0.04)	-11 (-23, 3)
Birth order					
Second or higher	15	ref	ref	ref	ref
First	13	0.3 (-0.1, 0.6)	39 (-4, 85)	0.3 (-0.5, 1.0)	30 (-34, 156)
Tooth type					
Incisor	24	ref	ref	ref	ref
Molar	4	-0.4 (-0.8, -0.02)	-34 (-55, -4)	0.04 (-0.5, 0.6)	5 (-36, 70)
Anemic while pregnant					
No	19	ref	ref	ref	ref
Yes	8	0.3 (-0.1, 0.6)	31 (-5, 80)	-0.2 (-0.9, 0.6)	–15 (–59, 75)
Use of filter during pregnancy					
Yes	14	ref	ref	ref	ref
No	14	0.2 (-0.1, 0.5)	20 (–9, 59)	0.3 (-0.4, 1.0)	37 (-30, 168)
Ever use formula ^{a,b}					
No	7			ref	ref
Yes	21			-0.1 (-0.9, 0.7)	-11 (-57, 88)
Predominant source of milk during infancy					
Infant formula ^c	11			ref	ref
Breastmilk ^d	11			0.3 (-0.5, 1.0)	29 (-38, 170)
Mix of breastmilk and formula ^e	6			0.3 (-0.6, 1.2)	34 (-44, 222)

Table 4.	Correlates of loc	q-transformed	prenatal and	postnatal d	dentine Mn	levels (as	5 ⁵⁵ Mn: ⁴³ Ca	a) from sex-ad	djusted linear	mixed models.
----------	-------------------	---------------	--------------	-------------	------------	------------	--------------------------------------	----------------	----------------	---------------

^aPrenatal correlate of breastfeeding and formula variables not analyzed since correlates occur after tooth Mn was measured.

^bApplies to index (participating) child only.

^cPredominantly formula fed defined as maternal report of being breastfed less than 6 months and consuming ≥50% formula during first year of life.

^dPredominantly breastfed defined as maternal report of being breastfed longer than 6 months and consuming less than 50% formula during first year of life. ^eMix of breastmilk and formula defined as maternal report of being breastfed for less than 6 months and consuming less than 50% formula during first year of life OR maternal report of being breastfed for longer than 6 months and consuming ≥50% formula during first year of life.

¹³⁸Ba:⁴³Ca ratios in teeth could be used to assess dietary transitions from predominantly breastmilk to predominantly infant formula or solid food intake [19]. In that study, concentrations of ¹³⁸Ba:⁴³Ca were higher in individuals who reported formula use compared to breastfeeding [19], which is consistent with our findings. While there is limited evidence that Ba is neurotoxic, toxicological evidence has shown that Ba acts as a competitive potassium channel antagonist leading to decreased potassium in blood plasma [29]. Given that many metals have been shown to cause increased intracellular Ca [30, 31], and Cagated potassium channels regulate intracellular Ca levels [32], Ba may play an important role in the joint or interactive effects of multiple metals.

The use of deciduous teeth as a biomarker of exposure is a novel technique that is rapidly evolving; as such, few studies have measured metals with similar fine-scale resolution and with the same analytic technique as in our study. Using externally corrected values, we were able to compare trends between the ELEMENT cohort, a prospective birth cohort in Mexico City where no specific environmental source of Mn exposure was identified, and our ACHIEVE study [21]. Dentine Mn levels and trends over time were similar between the two cohorts. Furthermore, few studies have examined correlates of metals in early life [21, 33–38], and of those, only a handful have looked at correlates of tooth metals [21, 37, 38], given the novelty of the tooth biomarker. In the Center for the Health Assessment of Mothers and Children of Salinas (CHAMACOS) cohort in Salinas Valley, CA, authors found that application of Mn-containing fungicides, take-home occupational variables (e.g., storing farm shoes inside the home), and maternal smoking were associated with higher levels of tooth Mn levels in the prenatal period [37]. In an urban Los Angeles, CA community residing near a battery smelter, maternal education, child sex, proximity to freeways, breastfeeding practices, smoking, and working in a Pb-exposed occupation were associated with soil and tooth levels of Pb in early life [38]. In the ELEMENT study, mother's age at birth was associated with dentine Pb, but not dentine Mn, while child's sex, maternal education, and maternal report of smoking were not associated with either Mn or Pb levels [21].

In our data, the levels of Mn and Pb tooth levels varied by child sex and this difference was more prominent in the postnatal period. There is both epidemiological and toxicological evidence suggesting that females, compared to males, may have increased Mn absorption [28, 39-41]. Furthermore, a recent study of US adults reported significantly higher blood Mn levels in females compared to males [40], suggesting there may be potential differences in Mn absorption or metabolism between females and males. One hypothesis for the difference between females and males may be related to iron (Fe) status because women are more likely to be iron deficient [28, 42, 43]. Mn and Fe share common

Table 5.	Correlates of log-transformed	prenatal and pos	stnatal dentine Pb levels	(as ²⁰⁸ Pb: ⁴³ Ca) from :	sex-adjusted linear mixed models.

5	•	•	. ,	,		
		Prenatal Pb		Postnatal Pb		
	N	β (95% CI)	% Difference (95% CI)	β (95% CI)	% Difference (95% CI)	
Child sex						
Male	18	ref	ref	ref	ref	
Female	10	0.3 (-0.1, 0.8)	40 (–9, 117)	0.5 (-0.1, 1.1)	60 (-8, 178)	
Child age, continuous (years)	28	0.001 (-0.1, 0.1)	-0.1 (-9, 10)	-0.05 (-0.2, 0.1)	-5 (-16, 8)	
Birth order						
Second or higher	15	ref	ref	ref	ref	
First	13	-0.1 (-0.6, 0.4)	-10 (-43, 42)	0.1 (-0.7, 0.5)	9 (–50, 65)	
Tooth type						
Incisor	24	ref	ref	ref	ref	
Molars	4	0.1 (-0.6, 0.7)	7 (-42, 99)	0.03 (-0.5, 1.1)	36 (–38, 197)	
Anemic while pregnant						
No	19	ref	ref	ref	ref	
Yes	8	0.3 (-0.1, 0.8)	41 (–11, 125)	0.5 (-0.2, 1.1)	57 (–13, 185)	
Use of filter during pregnancy						
Yes	14	ref	ref	ref	ref	
No	14	0.02 (-0.4, 0.5)	2 (-34, 57)	0.1 (-0.5, 0.7)	7 (–39, 87)	
Ever use formula ^{a,b}						
No	7			ref	ref	
Yes	21			-0.03 (-0.7, 0.7)	-3 (-49, 87)	
Predominant source of milk during infancy						
Infant formula ^c	11			ref	ref	
Breastmilk ^d	11			0.1 (-0.6, 0.7)	10 (-41, 104)	
Mix of breastmilk and formula ^e	6			0.6 (-0.2, 1.3)	74 (–16, 264)	

^aPrenatal correlate of breastfeeding and formula variables not analyzed since correlates occur after tooth Pb was measured.

^bApplies to index (participating) child only.

^cPredominantly formula fed defined as maternal report of being breastfed less than 6 months and consuming ≥50% formula during first year of life.

^dPredominantly breastfed defined as maternal report of being breastfed longer than 6 months and consuming less than 50% formula during first year of life. ^eMix of breastmilk and formula defined as maternal report of being breastfed for less than 6 months and consuming less than 50% formula during first year of life.

absorption and transport pathways [44, 45] and increased Mn absorption may be due to lower Fe levels among females and/or upregulation of these shared mechanisms of Mn and Fe gastrointestinal uptake [46, 47]. Whether similar mechanisms are at play among infants to impact dentine Mn levels is unknown.

Our pilot study demonstrates the feasibility of obtaining retrospective data on a large panel of metals to address community concerns about past exposures. The tooth biomarker is particularly useful in settings where past exposures that occurred in early life are of interest and shed baby teeth are readily available. On the other hand, the tooth biomarker is less useful in scenarios that require immediate exposure information, such as crisis management, and/or where children are too young to shed teeth. As a pilot study, the sample size is small; therefore, there is limited statistical power to detect associations between correlates and tooth metals. However, up to 70 measurements of metal values were obtained from each tooth, yielding repeated outcome measurements for each participant, which increases statistical power. Our study also demonstrates that teeth allow for the direct examination of fetal and infant metal levels, rather than using surrogates of prenatal exposure (e.g., maternal blood) or biomarkers of current or recent childhood exposure (e.g., hair, toenails, blood). While it is unclear which portion of dentine metal levels may reflect endogenous versus exogenous sources, previous epidemiologic studies have found correlations between metals in environmental matrices and dentine levels [37, 38, 48]. Furthermore, a study in rats found that tooth Mn levels were

strongly correlated with oral dose of Mn as well as with blood and brain Mn [16], suggesting that teeth capture exogenous oral exposure to Mn. The rate of special services required at school was high among participants of this pilot study (32.1%) compared to the US national rate (14.0%) [49] and to the rate within Holliston for the 2020–2021 academic year (20.6%) [50]. It is possible that parents who suspected that their children were exposed to metals in early life and whose children require special services in school were more likely to enroll in this study than parents of children without special services. However, given that tooth metal values were unknown at the time of enrollment and that we did not estimate associations between metals and use of special services, selection bias should not impact findings of the current study. We also lack information on potential key covariates including duration of pregnancy (i.e., gestational age) and other dietary sources. In addition, there is potential for misclassification of this self-reported covariate information, though this misclassification is likely to be nondifferential with respect to tooth metal levels because participants were unaware of their children's tooth metal levels.

Public health recommendations to decrease exposure to environmental contaminants are often targeted toward protecting the most vulnerable (i.e., those more likely to be exposed) and susceptible (i.e., those more likely to experience an adverse effect) populations. Although it is well documented that infants and children are both vulnerable and susceptible to toxic exposures [1, 2, 5], understanding the precise timing of toxic exposures that

Dentine Metal levels (as metal:43Ca))



Weeks Since Birth

Fig. 2 Dentine metal levels as In metal:⁴³Ca ratio from early second trimester (20 weeks before birth) until 1 year of age (52 weeks after birth), stratified by child sex. Dots represent individual dentine metal measurements for 28 participants, with a range of 19–70 measurements per participant. Vertical line at week 0 indicates birth. Values below the LOD were imputed as minimum measured value/sqrt (2). Line represents Loess smoother.

lead to greater adverse effects will better inform interventions to decrease exposure during critical developmental windows. In this community-initiated pilot study, deciduous teeth provided the ability to assess exposure retrospectively and noninvasively to multiple metals with high temporal resolution. Deciduous teeth may serve as a useful tool for communities that have experienced historic environmental exposures.

REFERENCES

- 1. Selevan SG, KimmelA CA, Mendola P. Identifying critical windows of exposure for children's health. Environ Health Perspect. 2000;108:5.
- Meredith RM, Dawitz J, Kramvis I. Sensitive time-windows for susceptibility in neurodevelopmental disorders. Trends Neurosci. 2012;35:335–44.

- Stiles J, Jernigan TL. The basics of brain development. Neuropsychol Rev. 2010;20:327–48.
- 4. Grandjean DP. Neurobehavioural effects of developmental toxicity. Lancet Neurol. 2014;13:9.
- 5. Wright RO. Environment, susceptibility windows, development and child health. Curr Opin Pediatr. 2017;29:211–7.
- Bauer JA, Fruh V, Howe CG, White RF, Claus Henn B. Associations of metals and neurodevelopment: a review of recent evidence on susceptibility factors. Curr Epidemiol Rep. 2020;7:237–62.
- Weisskopf MG, Webster TF. Trade-offs of personal vs. more proxy exposure measures in environmental epidemiology. Epidemiol Camb Mass. 2017;28:635–43.
- Arora M, Bradman A, Austin C, Vedar M, Holland N, Eskenazi B, et al. Determining fetal manganese exposure from mantle dentine of deciduous teeth. Environ Sci Technol. 2012;46:5118–25.

- 9. Arora M, Hare D, Austin C, Smith DR, Doble P. Spatial distribution of manganese in enamel and coronal dentine of human primary teeth. Sci Total Environ. 2011;409:1315–9.
- DeSimone L, Hamilton PA. Quality of water from domestic wells in principal aquifers of the United States 1991–2004. 2009. https://pubs.usgs.gov/circ/ circ1332/includes/circ1332.pdf (Accessed 18 Apr 2020).
- 11. Iyare PU. The effects of manganese exposure from drinking water on school-age children: a systematic review. NeuroToxicology. 2019;73:1–7.
- McMahon PB, Belitz K, Reddy JE, Johnson TD. Elevated manganese concentrations in United States groundwater, role of land surface-soil-aquifer connections. Environ Sci Technol. 2019;53:29–38.
- Rodrigues EG, Bellinger DC, Valeri L, Sharif O, Hasan I, Quamruzzaman Q, et al. Neurodevelopmental outcomes among 2-to 3-year-old children in Bangladesh with elevated blood lead and exposure to arsenic and manganese in drinking water. Environ Health. 2016;15:44. https://doi.org/10.1186/s12940-016-0127-y.
- Pekkanen J, Pearce N. Environmental epidemiology: challenges and opportunities. Environ Health Perspect. 2001;109:1–5.
- Claus Henn B, Ogneva-Himmelberger Y, Denehy A, Randall M, Cordon N, Basu B, et al. Integrated assessment of shallow-aquifer vulnerability to multiple contaminants and drinking-water exposure pathways in Holliston. Mass Water Switz. 2017;10:1–22.
- 16. Austin C, Richardson C, Smith D, Arora M. Tooth manganese as a biomarker of exposure and body burden in rats. Environ Res. 2017;155:373–9.
- 17. Arora M, Hare DJ. Tooth lead levels as an estimate of lead body burden in rats following pre- and neonatal exposure. RSC Adv. 2015;5:67308–14.
- Lubin JH, Colt JS, Camann D, Davis S, Cerhan JR, Severson RK, et al. Epidemiologic evaluation of measurement data in the presence of detection limits. Environ Health Perspect. 2004;112:1691–6.
- Austin C, Smith TM, Bradman A, Hinde K, Joannes-Boyau R, Bishop D, et al. Barium distributions in teeth reveal early life dietary transitions in primates. Nature. 2013;498:216–9.
- Bauer JA, Claus Henn B, Austin C, Zoni S, Fedrighi C, Cagna G, et al. Manganese in teeth and neurobehavior: sex-specific windows of susceptibility. Environ Int. 2017;108:299–308.
- Claus Henn B, Austin C, Coull BA, Schnaas L, Gennings C, Horton MK, et al. Uncovering neurodevelopmental windows of susceptibility to manganese exposure using dentine microspatial analyses. Environ Res. 2018;161:588–98.
- Horton MK, Hsu L, Claus Henn B, Margolis A, Austin C, Svensson K, et al. Dentine biomarkers of prenatal and early childhood exposure to manganese, zinc and lead and childhood behavior. Environ Int. 2018;121:148–58.
- Arbuckle TE, Liang CL, Morisset A-S, Fisher M, Weiler H, Cirtiu CM, et al. Maternal and fetal exposure to cadmium, lead, manganese and mercury: the MIREC study. Chemosphere. 2016;163:270–82.
- Kopp RS, Kumbartski M, Harth V, Brüning T, Käfferlein HU. Partition of metals in the maternal/fetal unit and lead-associated decreases of fetal iron and manganese: an observational biomonitoring approach. Arch Toxicol. 2012;86:1571–81.
- Zota AR, Ettinger AS, Bouchard M, Amarasiriwardena CJ, Schwartz J, Hu H, et al. Maternal blood manganese levels and infant birth weight. Epidemiology. 2009;20:367–73.
- Claus Henn B, Bellinger DC, Hopkins MR, Coull BA, Ettinger AS, Jim R, et al. Maternal and cord blood manganese concentrations and early childhood neurodevelopment among residents near a mining-impacted superfund site. Environ Health Perspect. 2017;125:067020. https://doi.org/10.1289/EHP925.
- Krachler M, Rossipal E, Micetic-Turk D. Concentrations of trace elements in sera of newborns, young infants, and adults. Biol Trace Elem Res. 1999;68:121–35.
- Agency for Toxic Substances and Disease Registry. Toxicological profile for manganese. Zotero. 2012; https://www.atsdr.cdc.gov/toxprofiles/tp151.pdf. (Accessed 14 Dec 2019).
- Agency for Toxic Substances and Disease Registry. Toxicological profile for barium and barium compounds. 2007; https://www.atsdr.cdc.gov/toxprofiles/tp24. pdf. (Accessed 14 Feb 2021).
- Agency for Toxic Substances and Disease Registry. Toxicological profile for lead. 2020; https://www.atsdr.cdc.gov/toxprofiles/tp13.pdf. (Accessed 12 Feb 2021).
- von Stackelberg K, Guzy E, Chu T, Claus Henn B. Exposure to mixtures of metals and neurodevelopmental outcomes: a review. Risk Anal. 2015;35:971–1016.
- 32. Vergara C, Latorre R, Marrion NV, Adelman JP. Calcium-activated potassium channels. Curr Opin Neurobiol. 1998;8:321–9.
- Rodrigues EG, Kile M, Dobson C, Amarasiriwardena C, Quamruzzaman Q, Rahman M, et al. Maternal-infant biomarkers of prenatal exposure to arsenic and manganese. J Expo Sci Environ Epidemiol. 2015;25:639–48.
- Röllin HB, Kootbodien T, Theodorou P, Odland JØ. Prenatal exposure to manganese in South African coastal communities. Environ Sci Process Impacts. 2014;16:1903–12.
- Ljung KS, Kippler MJ, Goessler W, Grandér GM, Nermell BM, Vahter ME. Maternal and early life exposure to manganese in rural Bangladesh. Environ Sci Technol. 2009;43:2595–601.

- 36. de Assis Araujo MS, Figueiredo ND, Camara VM, Froes Asmus CIR. Maternal-child exposure to metals during pregnancy in Rio de Janeiro city, Brazil: The Rio Birth Cohort Study of Environmental Exposure and Childhood Development (PIPA project). Environ Res. 2020;183:109155.
- Gunier RB, Bradman A, Jerrett M, Smith DR, Harley KG, Austin C, et al. Determinants of manganese in prenatal dentin of shed teeth from CHAMACOS children living in an agricultural community. Environ Sci Technol. 2013;47:11249–57. https://doi.org/10.1021/es4018688.
- Johnston J, Franklin M, Roh H, Austin C, Arora M. Lead and arsenic in shed deciduous teeth of children living near a lead-acid battery smelter. Environ Sci Technol. 2019;53:6000–6.
- Balachandran RC, Mukhopadhyay S, McBride D, Veevers J, Harrison FE, Aschner M, et al. Brain manganese and the balance between essential roles and neurotoxicity. J Biol Chem. 2020;295:6312–29.
- Oulhote Y, Mergler D, Bouchard MF. Sex- and age-differences in blood manganese levels in the U.S. general population: National Health and Nutrition Examination Survey 2011-2. Environ Health. 2014;13:87.
- Zheng W, Kim H, Zhao Q. Comparative toxicokinetics of manganese chloride and methylcyclopentadienyl manganese tricarbonyl (MMT) in Sprague-Dawley rats. Toxicol Sci J Soc Toxicol. 2000;54:295–301.
- Mirza FG, Abdul-Kadir R, Breymann C, Fraser IS, Raher A. Impact and management of iron deficiency and iron deficiency anemia in women's health. Expert Rev Hematol. 2018;11:727–36. https://doi.org/10.1080/17474086.2018.1502081.
- 43. Fitsanakis VA, Zhang N, Garcia S, Aschner M. Manganese (Mn) and iron (Fe): interdependency of transport and regulation. Neurotox Res. 2010;18:124–31.
- Tholin K, Sandström B, Palm R, Hallmans G. Changes in blood manganese levels during pregnancy in iron supplemented and non supplemented women. J Trace Elem Med Biol. 1995;9:13–17.
- 45. Yoon M, Schroeter JD, Nong A, Taylor MD, Dorman DC, Andersen ME, et al. Physiologically based pharmacokinetic modeling of fetal and neonatal manganese exposure in humans: describing manganese homeostasis during development. Toxicol Sci. 2011;122:297–316.
- Aschner JL, Aschner M. Nutritional aspects of manganese homeostasis. Mol Asp Med. 2005;26:353–62.
- Wolff NA, Garrick MD, Zhao L, Garrick LM, Ghio AJ, Thévenod F. A role for divalent metal transporter (DMT1) in mitochondrial uptake of iron and manganese. Sci Rep. 2018;8:211. https://doi.org/10.1038/s41598-017-18584-4.
- Gunier RB, Mora AM, Smith D, Arora M, Austin C, Eskenazi B, et al. Biomarkers of manganese exposure in pregnant women and children living in an agricultural community in California. Environ Sci Technol. 2014;48:14695–702.
- National Center For Education Statistics Students With Disabilities. 2021. https:// nces.ed.gov/programs/coe/indicator/cgg (Accessed 28 May 2021).
- Massachusetts Department of Education: Holliston (2020-1). 2020. https://profiles. doe.mass.edu/profiles/student.aspx?orgcode=01360505&orgtypecode=6 (Accessed 28 May 2021).

ACKNOWLEDGEMENTS

We are grateful to all the participants of Holliston and their families for taking part in this study. We thank the staff of the ACHIEVE study including Mayah Burgess, Ursula Svoboda, and Chang Chen.

AUTHOR CONTRIBUTIONS

AF: conceptualization, writing—original draft, preparation, methodology, formal analysis. JAB: conceptualization, writing—review and editing, formal analysis. CA: data curation, resources, writing—review and editing. TJD: conceptualization, methodology, writing—review and editing. YT: supervision, writing—review and editing. WH-B: supervision, writing—review and editing. RFW: supervision, writing—review and editing. BCH: conceptualization, methodology, supervision, funding acquisition, writing—review and editing.

FUNDING

The research described in this paper was funded in part by NIEHS grants: T32ES014562 (AF), F31 ES029010 (JAB); Boston University School of Public Health Early Career Catalyst Award (BCH); NICHD grant R00HD087523 (CA).

COMPETING INTERESTS

The authors declare no competing interests.

416

All reported studies/experiments with human or animal subjects performed by the authors have been previously published and complied with all applicable ethical standards (including the Helsinki Declaration and its amendments, institutional/ national research committee standards, and international/national/institutional guidelines).

ADDITIONAL INFORMATION

Supplementary information The online version contains supplementary material available at https://doi.org/10.1038/s41370-021-00400-x.

Correspondence and requests for materials should be addressed to Alexa Friedman.

Reprints and permission information is available at http://www.nature.com/ reprints

Publisher's note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons license, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons license, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons license and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this license, visit http://creativecommons. org/licenses/by/4.0/.

© The Author(s) 2021