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Manganese exposure and working memory-related brain activity in smallholder farmworkers in Costa Rica: Results from a pilot study

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Abstract

Main sources of manganese (Mn) in the general population are diet and drinking water. Mn is also found in ethylene bisdithiocarbamate (EBDC) fungicides used in agriculture or emitted into the air by ferromanganese plants and welding fumes, which can be additional environmental and occupational sources of exposure. High occupational Mn exposure has been linked with motor, behavioral, and cognitive impairment, but its effects on neural function remain poorly understood. We conducted a functional neuroimaging study in a sample of 48 farmworkers in Zarcero County, Costa Rica, an agricultural region where EBDC fungicides are sprayed. We measured Mn concentrations in farmworkers' toenails ($n = 40$ farmworkers) and hair ($n = 33$ farmworkers), and recorded brain activity in the dorsolateral prefrontal cortex during a letter-retrieval working memory task using functional near-infrared spectroscopy (fNIRS). We estimated exposure-outcome associations using multivariable linear regression models adjusted for age and education

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Competing financial interest declaration

The authors declare they have no actual or potential competing financial interests.

Appendix A. Supplementary data

Supplementary data to this article can be found online at <https://doi.org/10.1016/j.envres.2019.04.006>.

level. Geometric mean (geometric standard deviation) toenail and hair Mn concentrations were 0.40 µg/g (3.52) and 0.24 µg/g (3.54), respectively. We did not find strong evidence that Mn concentrations were associated with working memory-related brain activity in this sample of farmworkers; we also found null associations between working memory task accuracy and brain activity. However, our small sample size may have limited our ability to detect small effect sizes with statistical precision. Our study demonstrates that fNIRS can be a useful and feasible tool in environmental epidemiology for examining the effects of toxicants, like Mn, on neural function. This may prove to be important for elucidating neuropathological pathways that underlie previously reported associations of elevated Mn exposure with neurotoxic effects.

Keywords

Manganese; Mancozeb; Pesticides; Farmworkers; Neuroimaging; Functional near-infrared spectroscopy; Working memory; Costa Rica

1. Introduction

Manganese (Mn) is a naturally-occurring element that is found ubiquitously in the environment. Though an essential nutrient for healthy cellular functioning, Mn can be neurotoxic at high levels (Agency for Toxic Substances and Disease Registry, 2012). Main sources of Mn for the general population are diet, such as nuts and tea, and drinking water (Agency for Toxic Substances and Disease Registry, 2012). Mn is also emitted into the air by ferromanganese plants (Bowler et al., 2015) and welding fumes (Chang et al., 2010), and is found in ethylene bisdithiocarbamate (EBDC) fungicides, such as mancozeb and maneb, which can contaminate drinking water (van Wendel de Joode et al., 2016). Previous occupational studies have found increased urinary levels of Mn (Canossa et al., 1993) and ethylenethiourea (ETU) (Runkle et al., 2013), the main metabolite of EBDCs, among farmworkers following mancozeb applications on agricultural fields. Another study found increased blood serum levels of Mn in farmworkers exposed to mancozeb compared to unexposed workers (Rocha et al., 2015). Environmental studies in communities living near agricultural fields have also found that closer residential proximity to agricultural use of EBDC fungicides was associated with increased Mn levels in pregnant women's hair (Mora et al., 2014), prenatal dentin from children's shed teeth (Gunier et al., 2013), and home dust samples (Gunier et al., 2014). Exposure to Mn from EBDC fungicides is therefore a particular concern among farmworkers and individuals living in proximity to agricultural fields.

Elevated Mn exposure has been linked with motor (Perl and Olanow, 2007), behavioral (Bouchard et al., 2007b; Donaldson, 1987), and cognitive impairment (Al-Lozi et al., 2017; Bowler et al., 2007), primarily in occupational studies of welders exposed to Mn from welding fumes. To our knowledge, there has been only one occupational study of Mn exposure in adult farmworkers, which reported higher prevalence of headache, fatigue, nervousness, memory complaints, and sleepiness in workers exposed to the EBDC fungicide maneb compared to unexposed workers (Ferraz et al., 1988). Much of the evidence for the impact of Mn exposure on cognitive abilities comes from studies of prenatal and early-life

exposures (Coetzee et al., 2016). Though developmental exposure likely affects the brain differently than exposure during adulthood (Rice and Barone, 2000), these studies provide additional support that overexposure to Mn has an adverse impact on the brain.

Functional neuroimaging techniques, such as functional magnetic resonance imaging (fMRI) and functional near-infrared spectroscopy (fNIRS), measure localized changes in cerebral blood flow related to brain activity at the neural level and have the potential to elucidate the neuropathological pathway through which chemical exposures affect the brain (Boas et al., 2014; Horton et al., 2014). While fMRI is considered the gold standard in functional neuroimaging due to its high spatial resolution, fNIRS is emerging as a convenient and low-cost alternative, especially when working in remote regions (Baker et al., 2017). Although fNIRS has a lower signal-to-noise ratio than fMRI, the two methods have been found to correlate highly across a variety of cognitive tasks (Cui et al., 2011).

To date, few published studies have examined the association between occupational Mn exposure and brain activity using functional neuroimaging. A recent fNIRS case study of a 55-year-old man in Singapore, who was likely occupationally exposed to Mn at previous workplaces, had elevated urinary concentrations of Mn and decreased activation of the frontal lobe during a verbal fluency test compared to a healthy comparison subject (Ho et al., 2018). In addition, one fMRI study found increased brain activity of the prefrontal cortex during a verbal working memory task (Chang et al., 2010), while another found decreased brain activity in the same region during an executive function task (Seo et al., 2016) in Mn-exposed welders compared to un-exposed controls in Korea.

In the present study, we examined whether elevated Mn exposure was associated with brain activity in a sample of farmworkers in Zarcero County, Costa Rica, a region where the Mn-containing fungicide mancozeb is the second most widely used agricultural pesticide (Ramírez et al., 2016). We hypothesized that higher Mn concentrations, as measured in hair and toenails, would be associated with altered brain activation patterns in the prefrontal cortex related to working memory.

2. Methods

2.1. Study participants and procedures

We conducted this cross-sectional study of 48 farmworkers from 14 smallholder horticultural farms [farms < 20 ha that operate as family businesses and use mainly family labor (FAO, 2012)] in Zarcero County, Costa Rica, between July and August of 2016. Zarcero is considered the “salad bowl” of Costa Rica because of the large amount and diversity of crops grown in the area. Notably, this is also the location where organic farming practices in the country originated (Rodríguez Miranda and Paniagua Guerrero, 1994).

We selected a convenience sample of participants from the Pesticide Use in Tropical Settings (PESTROP) study cohort, which is a study of 300 farmworkers aimed at assessing agricultural pesticide exposure and their potential health effects. Detailed methods for the PESTROP study have been described elsewhere (Fuhrimann et al., 2019). Sample size for the current study was limited by the availability of fNIRS equipment and technical staff. We

included farmworkers from organic farms ($n = 26$) and conventional farms ($n = 22$) to ensure that there would be sufficient variability in pesticide exposure. We identified smallholder conventional farms using random Global Positioning System (GPS) points, and certified organic farms from a list provided by the organic farmworkers' association. Eligible participants for this study were farmworkers on a conventional or organic farm within the study area and were ≥ 18 years of age. No participants self-reported a diagnosis of a psychiatric disorder or use of psychopharmacologic medications.

We assessed the 48 participants over the course of two study visits. At the first visit, trained research staff administered a structured questionnaire to gather information on sociodemographic characteristics, occupational history, current or past disease status, and computer literacy (i.e., whether they have ever used a computer or played video games). fNIRS data were also collected on the first visit. The second visit occurred about a month later [mean (SD), 29.7 (2.7) days]. We collected hair and toenail samples during the second visit in order to give us time to remind the participants to refrain from cutting their hair and clipping their toenails. Despite the gap in time between fNIRS and biological sample collection, hair and toenail Mn concentrations reflect Mn exposure over the past month and a seven- to 12-month period, respectively, thus capturing exposure at the time of and before outcome assessment (Gil et al., 2011; Laohaudomchok et al., 2011).

All study materials and procedures were approved by the Human Subjects Committee of the Universidad Nacional in Costa Rica (UNA-CECUNA-ACUE-04–2016) and the Ethical Board of the Ethikkommission Nordwest-und Zentralschweiz in Switzerland (EKNZ-UBE, 2016–00771). Written informed consent was obtained from all study participants at enrollment.

2.2. Hair and toenail Mn measurement

We measured Mn concentrations in farmworkers' hair and toenails. We collected hair samples from 33 (69%) participants (15 participants did not have enough hair to collect a sample). Using stainless steel scissors, we cut 20–30 strands of hair from the occipital region, approximately 2 mm from the scalp. We collected toenail samples from 40 (83%) participants (toenails of 8 participants were too short to safely acquire a sample). Prior to collection, participants were asked to wash their feet with soap and water and then clip their toenails with clean stainless-steel nail clippers. We stored hair and toenail samples in sterile plastic bags at room temperature until they were shipped to the Federal University of Bahia, Brazil for analysis.

To limit contamination, hair samples were cleaned using a technique detailed elsewhere (Eastman et al., 2013). Briefly, the nearest cm from the scalp of hair was sonicated for 20 min in 1% Triton, rinsed five times with ultra-pure water (Milli-Q, Millipore-Merck), sonicated for ten minutes in 1 N ultra-pure nitric acid, rinsed once with a 1 N ultra-pure nitric acid, and then rinsed five times with ultra-pure water. Approximately 10 mg of hair was digested with 2 mL of concentrated spectroscopic grade nitric acid in a microwave digester oven. The digested material was then diluted to 10 mL with ultra-pure water. Hair samples, certified reference material (Human hair IAEA-085), and reagent blanks were analyzed twice using graphite furnace atomic absorption spectrometry with Zeeman

background correction. Toenail samples were analyzed for Mn using the same procedure described for hair samples.

The analytical limit of detection (LOD) of both hair and toenail Mn concentrations was 0.05 $\mu\text{g/g}$ with precision ranging between 2.6% and 7.6%. For participants with two measurements above the LOD, we took the average. For participants with only one measurement above the LOD ($n = 3$ for hair), we used that single value. For participants whose measurements were both below the LOD ($n = 3$ for hair, $n = 3$ for toenail), we imputed their Mn concentration as $\text{LOD}/\sqrt{2}$ (Lubin et al., 2004).

2.3. fNIRS data collection and preprocessing

We measured brain activity during a letter-retrieval working memory task (Sternberg, 1969) with a portable fNIRS device (NIRSport, NIRx Medical Technologies, LLC). Details of fNIRS methods utilized in this study have been described elsewhere (Baker et al., 2017). Briefly, we projected near-infrared light with wavelengths of 760 nm and 850 nm into the cortex of each participant's brain, and recorded samples of data at a rate of 7.81 Hz. We attached eight sources and eight detectors to a mesh cap using the international 10/20 system, resulting in 18 channels configured to record brain activity from the left and right dorsolateral prefrontal cortex. We grouped the 18 channels into eight functional regions of interest (ROIs), four in each brain hemisphere (Fig. 1). The dorsolateral prefrontal cortex is a region known to be involved in working memory based on previous fNIRS and fMRI studies of healthy adults (Rypma and D'Esposito, 1999; Sato et al., 2013) and it is also known to be affected by Mn exposure (Chang et al., 2010; Seo et al., 2016).

We selected an appropriately sized cap for each participant by measuring their head circumference; some participants (20%) also wore a dark overcap to cover the sources and detectors to decrease noise introduced by sunlight. Participants wore the fNIRS cap while seated in front of a laptop that presented the task stimuli (Fig. S1). The Sternberg letter-retrieval working memory task required participants to memorize a list of seven or eight letters that were displayed for 2 s (Encoding), hold them in their memory (Maintenance), and then determine whether a single letter was part of the previous list or not (Recall) (Sternberg, 1969). During Recall, participants pressed a button on the keyboard to indicate their response (yes or no), and reaction time and accuracy were recorded. The task consisted of 30 trials, with a jittered inter-trial interval with a mean of 4 s where participants passively viewed a fixation cross. Participants were asked to relax, remain still, and look at the fixation cross for 30 s at the beginning and end of the task (Rest).

We quality checked fNIRS data using software developed by Cui et al. (2010) and preprocessed data using a pipeline (Brigadoi et al., 2014) involving the Homer 2 package in Matlab (Brigadoi et al., 2014; Cui et al., 2010; Huppert et al., 2009). Briefly, we converted raw data to optical density prior to being corrected for motion-related artifacts using a wavelet-based correction procedure (Hosseini et al., 2017). Next, we band-pass filtered the data between 0.01 Hz and 0.5 Hz (Cui et al., 2010). Finally, we converted the preprocessed data into time series of oxygenated hemoglobin (HbO) and deoxygenated hemoglobin (HbR) concentrations using the modified Beers-Lambert law (Wyatt et al., 1986).

After preprocessing, we employed a general linear model (GLM) approach to assess task-related cortical responses related to each component of the task (i.e., Encoding, Maintenance, Recall, and Rest) within each recording channel (Schroeter et al., 2004). Due to a hypothesized difference in cognitive demands elicited by the Encoding and Recall phases of our task (Anderson et al., 2000), we made a contrast between the T-values estimated for these conditions within the GLM procedure. We then performed a functional localization procedure by selecting the channel with the greatest contrast value within each of the eight functional ROIs for use in group-level analyses (Fig. 1) (Hosseini et al., 2017). This procedure allows for individual participant variation in the task-responsive channels and underlying brain regions, and reduces the risk of committing Type II errors due to averaging across non-responsive channels. For consistency, we conducted the localization procedure first on the HbO data, then selected the same eight channels for the HbR data.

2.4. Statistical analysis

We assessed the relationship between toenail and hair Mn concentrations in farmworkers who provided both samples using a Spearman correlation test. To test for potential selection bias, we compared distributions of sociodemographic and occupational characteristics among all farmworkers included in our analyses ($n = 48$) with the subsets who provided hair ($n = 33$) and toenail samples ($n = 40$), using Wilcoxon rank-sum or χ^2 tests. We assessed bivariate associations of Mn exposures with farmworker characteristics using Spearman correlation or Wilcoxon rank-sum tests.

We modeled brain activation (HbO and HbR) at all eight ROIs and accuracy of the working memory task (percentage of correct trials) as continuous outcomes. We used one-sample t -tests to determine whether there was significant brain activation in each ROI in response to the working memory task among the entire sample of 48 participants. We examined bivariate associations of brain activity with socio-demographic and occupational characteristics using two-sample t -tests, analyses of variance (ANOVA), or Pearson correlation tests. We also assessed the association between task accuracy and brain activity at each ROI using linear regression models.

We estimated associations of toenail and hair Mn concentrations with brain activity in each ROI using linear regression models. We also estimated associations of toenail and hair Mn concentrations with accuracy on the Sternberg task. Toenail and hair Mn concentrations were strongly right-skewed, with few farmworkers having higher concentrations, so we \log_2 -transformed them to improve the linear fit of the model. Covariates associated with Mn exposure and cognition in previous studies [i.e., age at testing and education level (6th grade vs. 7–11th grade)] (Damalas and Koutroubas, 2017; de Azeredo Passos et al., 2015; Oulhote et al., 2014; Reuter-Lorenz and Cappell, 2008), including previous fMRI studies (Chang et al., 2010; Seo et al., 2016), were included in the models *a priori*.

We examined the impact of other potential confounders in sensitivity analyses using linear regression models. In separate analyses, we excluded females ($n = 2$), left-handed participants ($n = 2$), and those with self-reported neurological disorders (i.e., fibromyalgia and epilepsy) ($n = 2$), because these subgroups are known to have different patterns of brain activation (Cosgrove et al., 2007; Gur et al., 1982; Staud, 2011; Zhang et al., 2010). We also

excluded farmworkers who performed the task poorly (accuracy < 50%) ($n = 3$) because we were unsure if their poor performance was due to inattention to the task. Given that people drinking from non-aqueduct sources might be exposed to elevated Mn levels due to external contamination of their water sources (e.g., from agricultural EBDC spraying) (van Wendel de Joode et al., 2016) or naturally-occurring Mn found in groundwater (Agency for Toxic Substances and Disease Registry, 2012), we excluded participants who did not drink water from an aqueduct at home ($n = 2$). We reran our models adjusting for household poverty level and computer literacy, separately, to determine if there was residual confounding after adjusting for education level. Missing household poverty data ($n = 3$) was imputed using predictions from a linear regression model of income per person per household per month on years worked in agriculture and years of education. Lastly, we included hair and toenail Mn concentrations in the same multivariable models to estimate their independent associations with brain activity, among the sub-sample that provided both hair and toenail samples ($n = 32$).

We performed all statistical analyses in RStudio version 1.1.419. We controlled for Type I error using the Benjamini-Hochberg False Discovery Rate (FDR) at $p < 0.05$, except for tests not involving fNIRS outcomes. We assessed for significant interaction effects at $p < 0.20$.

3. Results

3.1. Sociodemographic characteristics, Mn concentrations, and working memory

Participants included in the study were mostly male (96%), right-handed (94%), born in Costa Rica (71%), educated at or below the 6th grade level (65%), living above the poverty level (73%), and drank water from an aqueduct at home (96%) (Table 1). Notably, we did not find meaningful differences in sociodemographic characteristics between all study participants ($n = 48$) and those who provided hair samples ($n = 33$) or toenail samples ($n = 40$) (Table 1).

Geometric mean (GM) (geometric standard deviation, GSD) toenail and hair Mn concentrations were 0.40 $\mu\text{g/g}$ (3.52) and 0.24 $\mu\text{g/g}$ (3.54), respectively (Table 2). Toenail Mn concentrations ranged from 0.04 to 7.45 $\mu\text{g/g}$, and hair Mn concentrations ranged from 0.04 to 9.45 $\mu\text{g/g}$ (Table S1). We found that toenail and hair Mn concentrations trended positively among the 32 participants who provided both toenail and hair samples, but this correlation was not statistically significant [Spearman correlation coefficient (r_s) = 0.21, $p = 0.25$]. Toenail Mn concentrations were negatively associated with age ($r_s = -0.36$, $p = 0.02$) and years worked in agriculture ($r_s = -0.33$, $p = 0.04$; data not shown). Farmworkers born in Nicaragua had higher toenail Mn concentrations (GM = 0.85, GSD = 2.87; $p = 0.03$) compared to those born in Costa Rica (GM = 0.31, GSD = 3.44; Table 2), which could be confounded by age since farmworkers born in Nicaragua were significantly younger [median = 22 years, interquartile range (IQR) = 4.8; $p < 0.001$] than those from Costa Rica (median = 43.7 years, IQR = 24.5). We also observed higher toenail Mn concentrations in workers from organic farms (GM = 0.56, GSD = 3.24; $p = 0.04$) than those from conventional farms (GM = 0.24, GSD = 3.46), but similar hair Mn concentrations in both groups (Table 2). Hair Mn

concentrations were not associated with any other sociodemographic or occupational characteristics.

Among all study participants ($n = 48$), there was significant brain activation across all ROIs using HbO, but not using HbR (Fig. 2, Tables S2–S3). Additionally, there was significant brain deactivation in R2 using HbR. In bivariate analyses, age, years worked in agriculture, and type of farm were associated with HbO at some ROIs (Table S2); education level was associated with HbR at some ROIs (Table S3). These associations were null after correcting for multiple comparisons, except for the associations between type of farm and HbO at the most medial (L2, R2) and posterior (L4, R4) ROIs and the association between education level and HbR at R4.

3.2. Associations of working memory task performance with brain activity

Farmworkers performed the working memory task with a median accuracy of 67% (IQR = 11%) and a mean (SD) reaction time of 1.5 s (0.5 s). For each unit increase in HbO, there was a 0.3–0.5% increase in working memory task accuracy at all ROIs (Table S4). The positive associations between HbO and accuracy were strongest at the most lateral ROIs (L3, R3) and the right posterior ROI (R4), but they were not statistically significant after FDR correction. HbR was not associated with accuracy, neither before nor after FDR correction.

3.3. Associations of Mn concentrations with brain activity

We observed mostly null associations of toenail and hair Mn concentrations with brain activity (HbO and HbR) in our unadjusted (Table S3; Figs. S2–S5) and adjusted (Table 3) linear regression models. There were no statistically significant associations after adjusting for multiple comparisons with FDR correction. Nevertheless, associations between toenail Mn concentrations and HbO at all eight ROIs showed a negative trend, after controlling for age and education level (Table 3). More specifically, brain activity decreased with every two-fold increase in toenail Mn concentrations, with the strongest association observed at the most anterior ROI in the right hemisphere (R1) ($\beta = -1.5$, 95% CI: $-3.4, 0.5$). Associations between toenail Mn concentrations and HbR showed a positive trend, after controlling for age and education level (Table 3).

Associations between hair Mn concentrations and HbO in left ROIs also showed a positive trend; however, a negative trend was observed in right ROIs (Table 3). Associations between hair Mn concentrations and HbR were slightly positive in left anterior (L1) and bilateral posterior (L4, R4) ROIs and negative elsewhere.

We found null associations of toenail ($\beta = -1.2$, 95% CI: $-4.1, 1.6$) and hair Mn concentrations ($\beta = 0.9$, 95% CI: $-2.3, 4.2$) with working memory task accuracy, after adjusting for age and education level (data not shown).

3.4. Sensitivity analysis

Effect estimates for toenail (Table S6) and hair (Table S7) Mn concentrations after excluding females ($n = 2$), left-handed farm-workers ($n = 2$), poor performers ($n = 3$), participants with neurological diseases ($n = 2$, fibromyalgia, epilepsy), and farmworkers with water sources

other than an aqueduct ($n = 2$) generally stayed the same. Similarly, when poverty level and computer literacy were added to the models, coefficients did not change meaningfully (Tables S6–S7). Lastly, when toenail and hair Mn concentrations were added simultaneously to the same multivariable models, effect estimates remain unchanged (Table S8).

4. Discussion

In a pilot study of smallholder farmworkers in Costa Rica, we did not find strong evidence that elevated Mn exposure, measured in toe-nails and hair, was associated with alterations in cortical brain activation during a working memory task. Overall, patterns of brain activation in relation to Mn were weak and inconsistent. We found that toenail Mn concentrations trended negatively with brain activity, concurrently with both HbO and HbR, suggesting that past Mn exposure may be weakly related to inefficient recruitment of the dorsolateral prefrontal cortex; however, our small sample size impeded our ability to measure subtle associations with precision. Higher hair Mn concentrations, on the other hand, were associated with a mixed pattern of brain activation across brain hemispheres.

Our study demonstrates the capacity to measure impacts of chemical exposures and metal toxicity on cognitive ability at the neural level using functional neuroimaging. These measures are potentially more sensitive than studies of neuropsychological test scores in detecting the neural consequences of environmental insults. For example, an elevated exposure to a neurotoxicant such as Mn could induce damage to the brain which results in neural compensation, where brain regions “work harder” and become overactivated in order to perform on tests within a normal range (Reuter-Lorenz and Cappell, 2008). Functional neuroimaging also provides an opportunity to study how elevated exposures to Mn affect neural pathways (de Water et al., 2017) and the function and structure of brain regions (Ho et al., 2018).

Our findings are not consistent with previous functional neuroimaging studies of welders that found associations of elevated Mn exposure with altered brain activation in the prefrontal cortex (Chang et al., 2010; Seo et al., 2016). A study in Korea found that Mn-exposed welders ($n = 23$) with similar accuracy in their performance on a verbal working memory task as the unexposed workers ($n = 21$) had significantly greater activity in the prefrontal cortex and a more widespread pattern of activity across the brain (Chang et al., 2010). In contrast, another study in Korea found that Mn-exposed welders ($n = 53$) performed worse on an executive function test and had less activation of the bilateral superior frontal cortex (part of the prefrontal cortex) compared to unexposed workers ($n = 44$) (Seo et al., 2016). In these studies, both increased and decreased activation of the prefrontal cortex are suggestive of neural dysfunction, and the distinction may depend on cognitive demand (Seo et al., 2016; Tomasi et al., 2007). Elevated Mn exposure may lead to inefficient engagement of neural resources (i.e., higher brain activation) in a task with lower cognitive demands [e.g., working memory task (Chang et al., 2010)], but this compensatory mechanism may no longer be effective in tasks with higher cognitive demands [e.g., executive function test (Seo et al., 2016) and verbal fluency test (Ho et al., 2018)], leading to equivalent or lower activation of brain regions.

Lower Mn exposure levels in our farmworker population compared with levels observed in two studies of welders (Chang et al., 2010; Seo et al., 2016), due to differences in exposure routes and background levels, could explain our null findings (United States Environmental Protection Agency, 2005). However, direct comparison of Mn exposure levels is not possible given that the studies of welders measured Mn in blood and we measured Mn in hair and toenails. Notably, hair and toenail Mn concentrations in our study were lower than those reported in previous occupational and environmental studies (Table S9) (Grashow et al., 2014; Hariri et al., 2018; Hassani et al., 2016; Mora et al., 2014; Ohgami et al., 2018; Reiss et al., 2016; Rodrigues et al., 2015; Rolle-McFarland et al., 2018; Ward et al., 2017), though it is unclear if these differences are real or due to variations in the cleaning procedures used to prepare the biological samples for analysis.

We used different tasks in our study, compared with studies of welders, which could explain our inconsistent findings. The Sternberg task that we used in our study assesses working memory using a letter-retrieval format. This is different than the tasks used in the welding studies, which included an N-back task that requires constant updating of memory (Chang et al., 2010) and the Wisconsin Card Sort Task that involves cognitive flexibility and executive control (Seo et al., 2016). Finally, our sample sizes differed slightly; one study had a similar sample size to ours (23 Mn-exposed welders and 21 controls) (Chang et al., 2010), but the other had a larger sample size (53 Mn-exposed welders and 44 controls) (Seo et al., 2016). Our small sample size may have limited our ability to detect subtle associations of elevated Mn exposure with brain activation.

In our pilot study, we did not find associations of hair and toenail Mn concentrations with working memory task accuracy. This could be due to our small sample size or to the fact that the working memory task that we used, while designed for optimal fNIRS data collection and analysis, was not a standardized neuropsychological test. Likewise, a previous study in Korea did not find differences in working memory task accuracy between Mn-exposed welders and the comparison group (Chang et al., 2010).

We observed higher toenail Mn concentrations in organic farm-workers and comparable hair Mn concentrations between organic and conventional farmworkers, which highlights the complexity of Mn sources. Mn is found in the EBDC fungicide mancozeb, which is the second most widely used pesticide in conventional farms in Zarcero County, our study area (Ramírez et al., 2016), but it is also found in fertilizers that are used in organic farms if deficiency of Mn in the soil is documented (Baker, 2009). Additionally, since the main sources of Mn for the general population are drinking water and food (Agency for Toxic Substances and Disease Registry, 2012), we do not know for certain how much agricultural sources contributed to Mn concentrations observed in our sample of farmworkers. Furthermore, this did not impede our ability to assess brain activity across a gradient of Mn exposure, as we had sufficient variability in the exposure based on the distributions of Mn concentrations in our sample. Future research is needed to determine how much agricultural sources, whether from EBDC fungicides or fertilizers, contribute to Mn exposure levels in farmworkers.

While analyzing Mn concentrations in two biological matrices is a strength of our study, we cannot conclude which biomarker is more valid for characterizing long-term cumulative Mn exposure. Currently, there is no consensus on which biomarker of Mn most reliably reflects internal dose (Eastman et al., 2013; Skröder et al., 2017; Smith et al., 2007). Previous occupational studies have primarily used blood and urine, which are suitable for capturing short-term and recent exposures (hours to days) (Chang et al., 2010; Laohaudomchok et al., 2011; Smith et al., 2007). Given the mounting evidence that Mn accumulates in the brain over periods of exposure (Bowler et al., 2017; Guilarte, 2013; Zaiyang et al., 2014), biomarkers that reflect exposures over longer time intervals, such as hair and toenails, might be useful. While hair has been used in epidemiologic studies and is believed to reliably reflect Mn in the body from exposures over the past month (Bouchard et al., 2007a; Gil et al., 2011), toenails are a relatively new biomarker that reflect internal dose of Mn from seven to 12 months earlier (Laohaudomchok et al., 2011). More research is needed in order to determine which biomarker provides the best estimate of long-term cumulative exposure.

While our study has some notable strengths, including the novelty of conducting an epidemiologic field study with neuroimaging among a farmworker population, it also has some limitations. First, our small sample size limited our ability to estimate potentially subtle Mn-related associations with brain activity with precision. Second, we utilized a convenience sampling scheme to select farmworkers based on the availability of fNIRS equipment and technical staff, meaning our sample may not be representative of the entire farmworker population in our study area. Third, while farmworkers were reminded to refrain from cutting their toenails and hair two to four weeks prior to collection, some had forgotten and were unable to safely provide samples. We believe it is unlikely that selection bias strongly impacted our results as we did not find meaningful differences in farmworker characteristics between the subsets of participants who provided hair or toenail samples and all participants included in this study ($n = 48$). Future research could improve sample collection efforts by giving more reminders or allowing participants an allotted time frame within which they can provide a sample. Another limitation includes selection bias due to the healthy worker effect. For example, since we were unable to capture in our sampling scheme farmworkers who may have left their occupation due to illness related to elevated Mn exposure, we may have underestimated the effect that elevated Mn has on working memory-related brain activity. Lastly, in our study, we did not assess participants' intelligence, which may be a potential confounder of the exposure-outcome associations of interest; however, we adjusted our main analyses for education level, which has been used as a proxy for intelligence (Deary and Johnson, 2010).

A limitation of most fNIRS recording devices is the inability to decouple neurovascular responses, used to infer functional brain activity, and hemodynamic activity from non-cortical sources (e.g., skin blood flow changes and global blood pressure changes) from fNIRS signal recordings (Caldwell et al., 2016; Scholkmann et al., 2014). An emerging solution to this problem is the inclusion of "short-channels" to record physiological signals that can be used as additional regressors in the GLM approach used to estimate brain activation (Tachtsidis and Scholkmann, 2016). Short-channels function the same as typical fNIRS recording channels, but have a much smaller distance between source and detector, which creates a shallower photon path and enables measurement of oxygen fluctuations

from scalp blood. While our fNIRS device was not equipped with short-channels, the GLM approach that we used is robust and should not be highly influenced by extraneous interference when noise is spatially constant. Because our optode coverage was symmetrical and limited to the bilateral prefrontal cortex, noise from scalp blood flow was likely to be detected similarly across all fNIRS recording channels. We are therefore confident that any unexpected influences of scalp blood flow on our outcomes was minimal.

Lastly, we had a dominantly male sample with only two females, thus limiting the generalizability of our findings to women and ability to measure sex-dependent effects. Previous neuroimaging studies of Mn-exposed welders were also limited to men (Chang et al., 2010; Seo et al., 2016). Given the evidence of neurobiological differences between sexes (Cosgrove et al., 2007), higher Mn concentrations found in women (Oulhote et al., 2014), and sex-dependent effects of Mn concentrations on cognition in children (Bouchard et al., 2017), future studies should ensure that females are sufficiently represented in their sample using a stratified sampling scheme. While this may be difficult to accomplish in occupational populations that are predominantly male, efforts should be made in the study design to ensure the inclusion of females.

5. Conclusions

We did not find strong evidence that elevated Mn exposure was associated with working memory-related brain activity in this pilot study of smallholder farmworkers. We demonstrate that conducting a functional neuroimaging study using fNIRS in the field with a farm-worker population is feasible and may be a useful tool for future environmental and occupational epidemiologic studies with larger sample sizes. Measuring cognitive ability at the neural level with functional neuroimaging has potential for detecting adverse effects of chemical exposures that may not otherwise be detected with neuropsychological tests or behavior rating scales due to, for example, compensation of other neural resources. The ability to conveniently measure brain activity with fNIRS also has important public health implications for assessing the neurobehavioral effects of chemical exposures that may have subtle effects on the brain.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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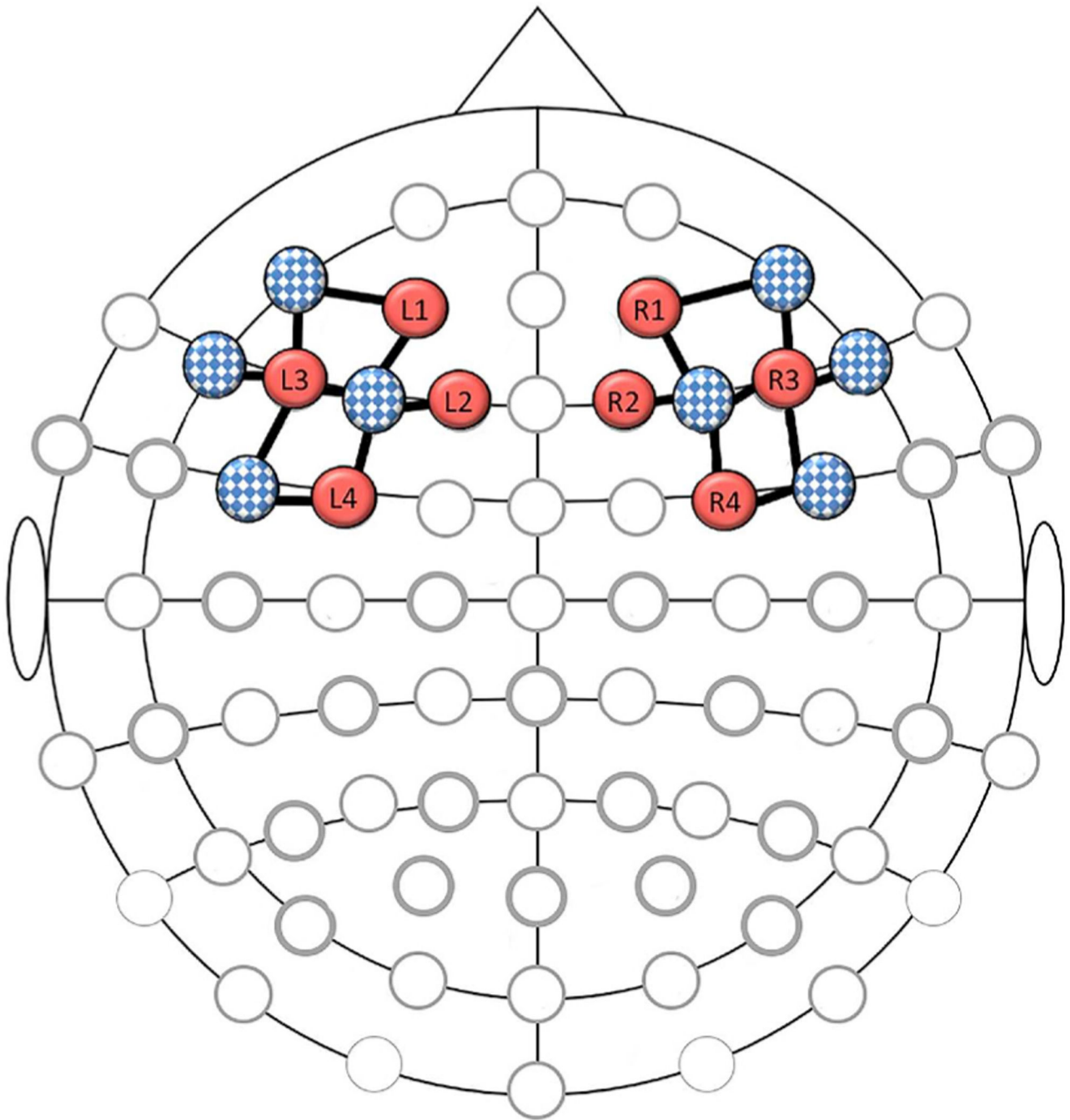


Fig. 1. The functional near-infrared spectroscopy (fNIRS) optode configuration over the dorsolateral prefrontal cortex used in our study. Using the international 10/20 system, we configured eight sources (solid red circles) and eight detectors (checked blue circles) to make 18 unique channels (bold black lines), creating eight regions of interest (ROIs)—four in the left hemisphere (L1–L4) and four in the right hemisphere (R1–R4). (For interpretation of the references to color in this figure legend, the reader is referred to the Web version of this article.)

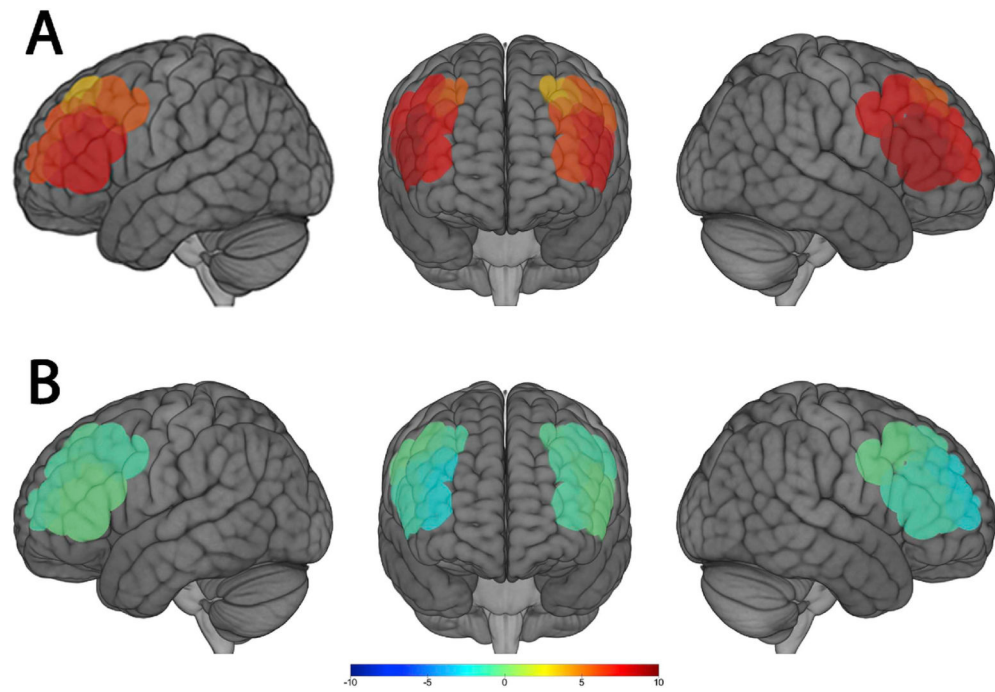


Fig. 2. Group mean estimates of brain activity across the eight regions of interest (ROIs) in response to the letter-retrieval working memory task ($n = 48$). Colors represent T-scores with warm colors indicating positive values and cool colors indicating negative values. (A) Brain activation using oxygenated hemoglobin concentrations (HbO). (B) Brain activation using deoxygenated hemoglobin concentrations (HbR).

Characteristics of farmworkers with functional neuroimaging from the Pesticide Use in Tropical Settings (PESTROP) study, Zarcero County, Costa Rica, 2016.

Table 1

Characteristics	All participants (n = 48)		Participants with toenail samples (n = 40)		Participants with hair samples (n = 33)	
	n (%)	n (%)	n (%)	n (%)	n (%)	p-value ^a
Age ^b						0.42
18–29	21 (43.8)	17 (42.5)	11 (33.3)			
30–49	13 (27.1)	11 (27.5)	10 (30.3)			
50	14 (29.1)	12 (30.0)	12 (36.4)			
Sex						1.00
Female	2 (4.2)	2 (5.0)	2 (6.1)			
Male	46 (95.8)	38 (95.0)	31 (93.9)			
Education level						0.90
6th grade	31 (64.6)	25 (62.5)	20 (60.6)			
7–11th grade	17 (35.4)	15 (37.5)	13 (39.4)			
Country of birth						0.23
Costa Rica	34 (70.8)	30 (75.0)	28 (84.8)			
Nicaragua	14 (29.2)	10 (25.0)	5 (15.2)			
Poverty status						0.98
< Poverty line	13 (27.1)	11 (27.5)	8 (24.2)			
> Poverty line	35 (72.9)	29 (72.5)	25 (75.8)			
Handedness						0.68
Right	45 (93.7)	38 (95.0)	32 (97.0)			
Left	2 (4.2)	2 (5.0)	1 (3.0)			
Unknown	1 (2.1)	0 (0)	0 (0)			
Computer literacy ^c						0.87
Yes	27 (56.2)	26 (65.0)	20 (60.6)			
No	21 (43.8)	14 (35.0)	11 (39.4)			
Years worked in agriculture ^b						0.90
14	19 (39.6)	16 (40.0)	11 (33.3)			

Characteristics	All participants (n = 48)		Participants with toenail samples (n = 40)		Participants with hair samples (n = 33)	
	n (%)	n (%)	n (%)	p-value ^a	n (%)	p-value ^a
15–29	14 (29.2)	12 (30.0)	10 (30.3)		12 (36.4)	
30	15 (31.2)	12 (30.0)				
Type of farm				0.74		0.94
Conventional	22 (45.8)	16 (40.0)	14 (42.4)			
Organic	26 (54.2)	24 (60.0)	19 (57.6)			
Drinking water source				0.98		0.68
Aqueduct	46 (95.8)	38 (95.0)	32 (97.0)			
Spring	1 (2.1)	1 (2.5)	1 (3.0)			
Other	1 (2.1)	1 (2.5)	0 (0)			

^aGroups were compared using Wilcoxon rank-sum tests for continuous variables and Chi-squared tests for categorical variables.

^bModeled as continuous variable when testing for group differences.

^cDefined as ever used a computer of played video games.

Table 2

Bivariate associations of manganese (Mn) concentrations ($\mu\text{g/g}$) with characteristics of farmworkers, Zarcerro County, Costa Rica, 2016.

Characteristics	Toenail Mn ($n = 40$) ^d		Hair Mn ($n = 33$) ^b	
	GM (GSD)	<i>p</i> -value ^c	GM (GSD)	<i>p</i> -value ^c
All	0.40 (3.52)		0.24 (3.54)	
Age ^d		0.02		0.64
18–29	0.76 (3.07)		0.21 (4.32)	
30–49	0.25 (2.93)		0.18 (3.08)	
50	0.24 (3.57)		0.34 (3.35)	
Sex ^e				
Female	0.33 (1.73)		0.19 (10.57)	
Male	0.40 (3.63)		0.24 (3.42)	
Education level		0.62		0.13
6th grade	0.36 (3.93)		0.29 (2.92)	
7–11th grade	0.48 (2.91)		0.18 (4.51)	
Country of birth		0.03		0.06
Costa Rica	0.31 (3.44)		0.21 (3.53)	
Nicaragua	0.85 (2.87)		0.55 (2.78)	
Poverty status		0.35		0.60
Poverty line	0.25 (3.55)		0.35 (6.14)	
> Poverty line	0.48 (3.43)		0.21 (2.87)	
Handedness ^e				
Right	0.36 (3.41)		0.24 (3.61)	
Left	2.20 (1.27)		0.24 (NA)	
Years worked in agriculture ^d		0.04		0.81
14	0.77 (3.17)		0.32 (4.40)	
15–29	0.25 (3.30)		0.15 (2.38)	
30	0.26 (3.17)		0.29 (3.72)	
Type of farm		0.04		0.93
Conventional	0.24 (3.46)		0.25 (3.50)	

Characteristics	Toenail Mn (<i>n</i> = 40) ^a		Hair Mn (<i>n</i> = 33) ^b	
	GM (GSD)	<i>p</i> -value ^c	GM (GSD)	<i>p</i> -value ^c
Organic	0.56 (3.24)		0.24 (3.69)	
Drinking water source ^e				
Aqueduct	0.40 (3.62)			
Spring	0.26 (NA)		0.24 (3.61)	
Other	0.70 (NA)		0.18 (NA)	
Days between fNIRS and toenail/hair sample collection ^d		0.12		0.71
< 30	0.61 (3.67)		0.32 (5.40)	
30	0.26 (2.95)		0.20 (2.45)	

Abbreviations: fNIRS, functional near-infrared spectroscopy; GM, geometric mean; GSD, geometric standard deviation; LOD, limit of detection; NA, not applicable.

^a37 farmworkers (92.5%) had toenail Mn concentrations above the LOD (0.05 µg/g).

^b30 farmworkers (90.1%) had hair Mn concentrations above the LOD (0.05 µg/g).

^cWe estimated bivariate associations using Spearman correlation tests for continuous variables and Wilcoxon rank-sum tests for categorical variables.

^dBivariate associations assessed using continuous variable.

^eBivariate association not assessed due to small sample size.

Adjusted coefficients (β) and (95% CI) in fNIRS oxygenated (HbO) and deoxygenated hemoglobin (HbR) per two-fold increase in toenail ($n = 40$) and hair ($n = 33$) Mn concentrations ($\mu\text{g/g}$) in farmworkers, Zarcero County, Costa Rica, 2016.

Table 3

ROI	Toenail Mn		Hair Mn	
	HbO	HbR	HbO	HbR
L1	-1.0 (-2.9, 0.9)	0.2 (-1.5, 1.9)	0.4 (-1.9, 2.6)	0.2 (-1.5, 2.0)
L2	-0.6 (-2.2, 1.0)	0 (-1.8, 1.8)	0.3 (-1.6, 2.2)	-0.2 (-2.3, 1.9)
L3	-1.0 (-2.8, 0.8)	0.7 (-0.9, 2.2)	0.9 (-1.2, 2.9)	-0.2 (-1.9, 1.5)
L4	-0.7 (-2.5, 1.1)	0.6 (-0.8, 1.9)	0.7 (-1.4, 2.8)	0.1 (-1.5, 1.7)
R1	-1.5 (-3.4, 0.5)	0.6 (-0.8, 1.9)	-0.5 (-2.9, 1.8)	-0.1 (-1.5, 1.3)
R2	-0.3 (-2.0, 1.4)	-0.2 (-1.5, 1.1)	-0.3 (-2.2, 1.7)	-0.8 (-2.2, 0.6)
R3	-1.0 (-2.8, 0.8)	0.9 (-0.9, 2.6)	-0.1 (-2.2, 2.0)	-0.8 (-2.6, 0.9)
R4	-0.7 (-2.7, 1.4)	0.3 (-0.9, 1.5)	-0.1 (-2.4, 2.2)	0.2 (-1.2, 1.5)

Abbreviations: CI, confidence interval; fNIRS, functional near-infrared spectroscopy; ROI, region of interest; L, left hemisphere; Mn, manganese; R, right hemisphere; HbO, oxygenated hemoglobin; HbR, deoxygenated hemoglobin.

Models adjusted for age and education level.

* Unadjusted $p < 0.05$.

[†] FDR-corrected $p < 0.05$.