



DNA methylation changes associated with prenatal mercury exposure: A meta-analysis of prospective cohort studies from PACE consortium

Manuel Lozano^{a,b,*,1}, Paul Yousefi^{c,d,1}, Karin Broberg^{e,f}, Raquel Soler-Blasco^b, Chihiro Miyashita^g, Giancarlo Pesce^h, Woo Jin Kimⁱ, Mohammad Rahman^j, Kelly M. Bakulski^k, Line S. Haug^l, Atsuko Ikeda-Araki^{g,m}, Guy Huel^h, Jaehyun Parkⁿ, Caroline Relton^{c,d}, Martine Vrijheid^{o,p,q}, Sheryl Rifas-Shiman^j, Emily Oken^j, John F. Dou^k, Reiko Kishi^g, Kristine B. Gutzkow^l, Isabella Annesi-Maesano^r, Sungho Won^{n,s}, Marie-France Hivert^{j,t}, M. Daniele Fallin^u, Marina Vafeiadi^v, Ferran Ballester^{b,o,w}, Mariona Bustamante^{o,p,q,2}, Sabrina Llop^{b,o,2}

^a Preventive Medicine and Public Health, Food Sciences, Toxicology and Forensic Medicine Department, Universitat de València, Valencia, Spain

^b Epidemiology and Environmental Health Joint Research Unit, FISABIO–Universitat Jaume I–Universitat de València, Valencia, Spain

^c MRC Integrative Epidemiology Unit, University of Bristol, Bristol, United Kingdom

^d Population Health Sciences, Bristol Medical School, University of Bristol, Bristol, United Kingdom

^e Unit of Metals and Health, Institute of Environmental Medicine, Karolinska Institute, Stockholm, Sweden

^f Division of Occupational and Environmental Medicine, Lund University, Lund, Sweden

^g Center for Environmental and Health Sciences, Hokkaido University, Hokkaido, Japan

^h INSERM UMR1018, Université Paris-Saclay, UVSQ, Centre for Epidemiology and Public Health (CESP), Villejuif, France

ⁱ Department of Internal Medicine and Environmental Health Center, Kangwon National University, Chuncheon, South Korea

^j Division of Chronic Disease Research Across the Lifecourse, Department of Population Medicine, Harvard Medical School and Harvard Pilgrim Health Care Institute, Boston, MA, United States

^k School of Public Health, University of Michigan, Ann Arbor, MI, USA

^l Norwegian Institute of Public Health, Division of Climate and Environment, Oslo, Norway

^m Faculty of Health Sciences, Hokkaido University, Hokkaido, Japan

ⁿ Interdisciplinary Program of Bioinformatics, College of Natural Sciences, Seoul National University, Seoul, South Korea

^o Spanish Consortium for Research on Epidemiology and Public Health (CIBERESP), Madrid, Spain

^p ISGlobal, Barcelona, Spain

^q Universitat Pompeu Fabra, Barcelona, Spain

^r INSERM UMR1302, Montpellier University, Institut Desbrest d'Épidémiologie et de Santé Publique (IDESP), Montpellier, France

^s Department of Public Health Sciences, Seoul National University, Seoul, South Korea

^t Diabetes Unit, Massachusetts General Hospital, Boston, MA, United States

^u Bloomberg School of Public Health, Johns Hopkins University, Baltimore, MD, USA

^v Department of Social Medicine, School of Medicine, University of Crete, Heraklion, Greece

^w School of Nursing, Universitat de València, Valencia, Spain

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ABSTRACT

Mercury (Hg) is a ubiquitous heavy metal that originates from both natural and anthropogenic sources and is transformed in the environment to its most toxicant form, methylmercury (MeHg). Recent studies suggest that MeHg exposure can alter epigenetic modifications during embryogenesis. In this study, we examined associations between prenatal MeHg exposure and levels of cord blood DNA methylation (DNAm) by meta-analysis in up to seven independent studies ($n = 1462$) as well as persistence of those relationships in blood from 7 to 8 year-old children ($n = 794$). In cord blood, we found limited evidence of differential DNAm at cg24184221 in *MED31* ($\beta = 2.28 \times 10^{-4}$, p -value = 5.87×10^{-5}) in relation to prenatal MeHg exposure. In child blood, we identified

* Corresponding author. Preventive Medicine and Public Health, Food Sciences, Toxicology and Forensic Medicine Department, Universitat de València, Av. Vicent Andrés Estellés s/n, 46100, Burjassot, Spain.

E-mail address: manuel.lozano@uv.es (M. Lozano).

¹ These authors share co-first authorship.

² These authors share co-senior authorship.

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differential DNAm at cg15288800 ($\beta = 0.004$, p-value = 4.97×10^{-5}), also located in *MED31*. This repeated link to *MED31*, a gene involved in lipid metabolism and RNA Polymerase II transcription function, may suggest a DNAm perturbation related to MeHg exposure that persists into early childhood. Further, we found evidence for association between prenatal MeHg exposure and child blood DNAm levels at two additional CpGs: cg12204245 ($\beta = 0.002$, p-value = 4.81×10^{-7}) in *GRK1* and cg02212000 ($\beta = -0.001$, p-value = 8.13×10^{-7}) in *GGH*. Prenatal MeHg exposure was associated with DNAm modifications that may influence health outcomes, such as cognitive or anthropometric development, in different populations.

1. Introduction

Mercury (Hg) is a ubiquitous environmental toxicant that originates from both natural and anthropogenic sources (United Nations, 2018). Most of the inorganic Hg present in the atmosphere comes from point sources such as mining operations or industrial activities (Hintelmann, 2010). Atmospheric inorganic Hg is deposited in the earth surface and transformed to the organic form, methylmercury (MeHg), by the action of some bacteria present in the aquatic sediments (Parks et al., 2013). MeHg is accumulated and biomagnified through the food chain, reaching the highest concentrations in big, oily, predatory fishes and marine mammals (Hintelmann, 2010). Seafood consumers around the world have recorded high mercury concentrations linked to this consumption (Sheehan et al., 2014). Total Hg (THg) in hair and THg in blood are both validated biomarkers of MeHg intake (80% and 90% of THg is considered MeHg, respectively (Llop et al., 2017)) and correlated with seafood consumption in general human populations (Clarkson and Magos, 2006; Berglund et al., 2005).

Prenatal exposure to Hg has been associated with impaired foetal growth (Murcia et al., 2016a; Ballester et al., 2018a; Drouillet-Pinard et al., 2010) and adverse birth outcomes, such as low placental weight (Murcia et al., 2016b; Al-Saleh et al., 2014), newborn's anthropometry (Murcia et al., 2016b; Gustin et al., 2020), and length of gestation (Ballester et al., 2018b; Dallaire et al., 2013). Additionally, perinatal and early childhood exposure to MeHg have been associated with adverse outcomes later in life, such as postnatal growth (Murcia et al., 2016b; Kim et al., 2011). Regarding effects in children's neuropsychological development, consistent results have been observed at high levels of exposure (Karagas et al., 2012; Grandjean et al., 2014; Sharma et al., 2019); however, at low-moderate levels the results were heterogeneous (Ha et al., 2017). No clear pattern has been observed among the limited number of studies that assessed the association between early exposure to mercury and cardiovascular effects (Gallego-Viñas et al., 2019), although recent studies showed some evidence (Farzan et al., 2021; Ying Chan et al., 2021; Zhang et al., 2021).

There are several mechanisms of MeHg toxicity suggested, involving several biological processes. These processes include increased lipid peroxidation, reactive oxygen species (ROS) generation and glutathione (GSH) depletion *in vivo* and *in vitro* (Crespo-López et al., 2009), reduced cell membrane integrity (Polunas et al., 2011), altered cell signalling (Worth et al., 2001), mitochondrial impacts (Dreiem et al., 2005), altered DNA repair (Pieper et al., 2014), immunomodulatory impacts (Li et al., 2014), affected regulation of Ca^{2+} (Aschner et al., 2007), and changed DNA methylation (DNAm), as well as other epigenetics marks (Farina et al., 2011; Cardenas et al., 2017a; Khan et al., 2019). As a consequence of the epigenetics changes, several genes involved in response to oxidative stress, stress response, metabolism, transport, gene regulation, inflammatory response, apoptosis, and hormone regulation, have been associated with differential expression in human cells exposed to MeHg (Yang et al., 2020). Also, some research has suggested that these perturbations during embryogenesis can establish new DNAm patterns that may persist during foetal development and childhood (Khan et al., 2019; Perera and Herbstman, 2011a).

To date, studies assessing the association between prenatal exposure to MeHg and DNAm are scarce. As far as we are aware, only four studies have been conducted relating prenatal Hg and epigenome-wide DNAm

changes in cord blood with sample sizes between 138 and 321 (Cardenas et al., 2015, 2017a, 2017b; Bakulski et al., 2015). These studies have identified methylation changes in specific CpG sites in relation to Hg exposure. Among them, only one study evaluated the persistence of these epigenetic changes, observing that DNAm at the Paraoxonase 1 gene (*PON1*) in cord blood found at birth persisted until early childhood and was attenuated in mid-childhood blood (Cardenas et al., 2017b).

The overall aim of this study was to investigate the association between prenatal MeHg exposure and DNAm in cord blood, as well the persistence of these associations in blood from 7 to 8 years-old children. To do this, we performed a fixed effects meta-analysis of up to seven independent studies that are members of the Pregnancy And Childhood Epigenetics (PACE) consortium (Felix et al., 2018) and/or the Human Early Life Exposome (HELIX) study (Maitre et al., 2018). We also aimed to gain insights into the potential biological and health-related impacts of these associations by performing functional enrichment. This study represents the largest examination to date of prenatal MeHg associations with cord and child blood DNAm in human populations and provides novel insights of MeHg toxicity through the fetal period and childhood.

2. Materials and methods

2.1. Participating cohorts

Cohorts that are members of the PACE consortium were identified for participation in the meta-analysis if they had existing prenatal total mercury (THg) measures (in cord blood, hair, or maternal blood), DNAm data quantified in cord or child blood via the Illumina Infinium HumanMethylation450 BeadChip or Infinium MethylationEPIC BeadChip arrays, and if they had information on covariates (see below). The cohorts that participated in the epigenome-wide association study (EWAS) of cord blood were: Avon Longitudinal Study of Parents and Children (ALSPAC) (Golding et al., 2001), Hokkaido Study on Environment and Children's Health, Sapporo cohort (SAPPORO-HOKKAIDO) (Kishi et al., 2011), Environment and Childhood Project (INMA) (Guxens et al., 2012), KOREAN Exposome (Park et al., 2020), and Project VIVA (VIVA) (Oken et al., 2015). Human Early Life Exposome study (HELIX) (Maitre et al., 2018) included three other on-going European cohorts with child blood DNAm data, and for this particular study we analysed data from: INMA (Guxens et al., 2012), Mother, Father and Child Cohort Study (MoBa) (Magnus et al., 2016), and the Mother-Child Cohort in Crete (RHEA) (Chatzi et al., 2017). ALSPAC (Golding et al., 2001), as well as the cohorts taking part the HELIX study, participated in the EWAS of child blood methylation data at ages 7–8 years. Only the largest ethnicity group in each cohort was considered to maintain the homogenous effect assumption (Hong et al., 2016). Characteristics for individuals of the included cohorts and covariates definitions are shown in Table 1. See Supplementary Methods file for more details on design and study population, collection of samples, DNAm data acquisition, and mercury and covariates measurements in each cohort.

2.2. Mercury measurements

Cord blood THg concentrations were defined as the exposure variable for each cohort (Table 1). In order to make THg concentrations from

cohorts with measurements taken in maternal hair or maternal blood comparable to those performed in cord blood, maternal hair and blood THg levels were transformed according to conversion factors established by the U.S. Environmental Protection Agency in a comprehensive review of 21 studies cross-tissue studies (Stern and Smith, 2003). The cross-study central estimate for the ratio of cord blood to maternal blood identified was 1.7. Further, human hair-mercury concentrations (in µg/g) were observed to average about $250 \times$ whole-blood mercury concentrations (in µg/mL) (ater Quality Cri, 2001). These ratios were used to convert to concentrations measured in maternal whole-blood or hair in the participant cohorts to cord blood levels, accordingly. Cord blood THg concentrations were log₂-transformed to avoid skewed distributions. The analytical methods used for measurements of THg in each cohort are described in the **Supplementary Methods file**.

2.3. Profiling of DNA methylation

Cord blood and child blood DNAm in each respective cohort were assessed with the Infinium Human-Methylation450 array (Illumina, San Diego, CA USA) except in KOREAN exposome cohort which used the MethylationEPIC BeadChip array (Illumina, San Diego, CA USA). Raw methylation data was processed within each cohort following their preferred pipeline and normalization method. However, all pipelines considered sample and probe quality control checks. Technical batch effect correction was addressed as decided by each cohort. Methylation data is expressed as the beta value, that goes from 0 (unmethylated) to 1 (completely methylated). See **Supplementary Methods file** for extra details. DNAm extreme outliers (<25th percentile – 3*IQR or >75th percentile + 3*IQR across all the samples) were trimmed out before running the EWAS. Cell type composition in cord blood was estimated using the Bakulski reference panel (Bakulski et al., 2016), while child cell type proportions were calculated with the Salas reference panel (Gervin et al., 2019).

2.4. Epigenome-wide association study (EWAS)

Within each cohort, robust linear regression from the *mass* package (Venables and Ripley, 2002) was used to account for potential heteroscedasticity. The outcome variables were normalized DNAm beta values at each CpG (at birth or childhood) and the exposure variable was prenatal log₂-transformed cord blood equivalent THg measures (log₂Hg). Models were adjusted for maternal age (years), parity (number of deliveries), education (up to primary, secondary, university), smoking during pregnancy (yes/no), fish consumption (mean daily servings), child sex, as well as cellular heterogeneity, which reflects the differentiation of epigenetic status among cells. A second set of models was run in each cohort also adjusting for maternal fish consumption (servings/week) since it is the main Hg source from diet and its content in nutrients interacting with Hg. Effect size was reported as the difference in percentage units in DNAm for each log₂Hg increased unit. In linear regression models with a log₂ transformed exposure, a doubling of the exposure is associated with a difference in the DNAm determined by the regression coefficient. Positive regression coefficients indicate hypermethylation and negative regression coefficients indicate hypomethylation.

2.5. Fixed effects meta-analysis

Summarized results from each model in each cohort (regression coefficient for log₂Hg), standard error (SE) and p-values for each CpG), were sent to the leading team to carry out parallel quality control and meta-analyses in two independent centres. Quality control in received results from cohorts involved several steps. First, the absence of single nucleotide polymorphisms (SNP) and cross hybridizing probes was confirmed by using the same proposed protocol (Chen et al., 2013). Then, probes were excluded if they lacked 'cg' or 'ch' naming, were not available on both the Infinium Human-Methylation450 and MethylationEPIC BeadChip arrays, were technical probes, were duplicated, were CpH probes, or were annotated to sex chromosomes. Also, outcomes with NAs or SE > 0.1 were excluded for the following analyses.

Table 1
Characteristics of the study participants in the included cohorts.

Cohort	Units	INMA	KOREA	VIVA	SAPPORO-HOKKAIDO	ALSPAC	MoBa	RHEA
Country		Spain	Korea	United States	Japan	United Kingdom	Norway	Greece
Main ethnicity								
European	%	90		76		100	95.8	100
Asian	%		100	3.3	100		2.8	
African	%			8.6				
Other	%			11.8			1.4	
Prenatal THg matrix		Cord blood	Maternal blood	Maternal blood	Maternal hair	Maternal blood	Maternal blood	Maternal blood
Cord THg*	GM (CI95%), µg/L	8.70 (8.24, 9.19)	5.33 (5.19, 5.47)	5.74 (5.16, 6.39)	9.30 (6.18–12.42)	2.01 (0.79, 4.89)	6.02 (5.72, 6.35)	7.13 (6.71, 7.59)
N children with cord THg + cord blood DNA methylation	N	304	329	338	268	223	No	No
N children with blood THg + blood DNA methylation	N	182	No	No	No	312	192	197
Maternal age	Mean (SD), years	30.4 (4.1)	30.4 (3.6)	32.7 (4.9)	30.1 (5.0)	29.4 (4.3)	32.8 (3.7)	30.8 (4.8)
Parity	% nulliparous	37.1	56.5	49.7	46.3	49.3	52.8	60.0
Child sex	% male	51.2	48.0	52.1	45.5	47.1	53.7	55.5
Maternal education								
Up to primary	%	26.8	22.2	5.6	3.3	8.1	0	4.6
Secondary	%	42.4	16.4	22.3	41.0	68.6	20.1	55.8
University	%	30.7	61.4	71.9	55.5	23.3	79.9	39.6
Smoking during pregnancy	%, yes	29.2	10.9	11.5	16.4	17.9	4.4	21.2
Fish consumption	Mean (SD), servings/week	5.0 (2.3)	4.2 (4.1)	0.2 (0.2)	3.5 (5.0)	0.2 (0.2)	5.9 (7.9)	1.2 (0.9)
Correlation with Cord log ₂ THg	Spearman coefficient	0.30	0.16	0.46	0.22	0.31	0.31	0.18

GM: geometric mean; THg: total mercury; * Hg cord blood (µg/L) = 1.7*Hg maternal blood (µg/L); Hg in whole blood (µg/mL) = 250* maternal hair (µg/g).

CpGs associated with Hg (unadjusted p -value $< 10^{-5}$) were annotated by using the *IlluminaHumanMethylation450kanno.ilmn12.hg19* package (Hansen, 2016) and only those associated with a gene were retained. CpGs not retained in at least 3 cohorts were also filtered out. Inflation in the distribution of observed p -values was assessed by quantile–quantile plot and lambda value (Supplemental Figure S1 for DNAm cord blood cohorts and Supplemental Figure S2 for DNAm child blood cohorts). Quality control parameters of the models run in each cohort prior to meta-analysis are shown in Supplemental Table S1.

Following quality control, all cohort-specific results of the cord blood (with and without adjustment for fish consumption) and child blood (with and without adjustment for fish consumption) analyses were included in four inverse variance-weighted fixed-effects meta-analyses using the multivariate genome-wide-association meta-analysis (GWAMA) tool (Mägi and Morris, 2010). Full meta-analyses were followed by a leave-one-out analyses to assess heterogeneity modifications (by means of I2 random-effects tests, considering low heterogeneity $< 25\%$ (Higgins et al., 2003)), as well as differences in Asian cohorts, due to the ethnicity differences (Table 1). Significant changes in meta-analyses results were not observed. Given DNAm patterns across the genome are known to be correlated (Strimmer, 2008), we used the false discovery rate (FDR) procedure to account for multiple testing rather than the more stringent Bonferroni adjustment which assumes independent effects across all CpG sites. CpG sites with FDR < 0.1 were considered differentially methylated. CpGs with unadjusted p -values $< 10^{-5}$ were also retained for enrichment analyses. Forest plots to assess the effect of each differentially methylated CpG were obtained by using the *meta* library. Shadow meta-analyses were conducted independently at the University of Bristol, to verify results.

2.6. Enrichment analyses

To identify plausible pathways associated with THg exposure, functional enrichment analysis was performed for genes where CpGs were observed to be associated with THg in the meta-analyses using the arbitrary cut-off of $p < 10^{-5}$. Gene ontology tests were carried out using the *gometh* function of *missMethyl* package (Phipson et al., 2016), which maps CpGs to genes, take into account the differing number of probes per gene, performs a hypergeometric test and corrects for multiple-testing with FDR for each gene ontology category.

3. Results

3.1. Study population

Table 1 shows the characteristics of participants in the included cohorts. Five cohorts contributed to the cord blood EWAS representing a total of 1462 samples. This included 865 from children of European ancestry (ALSPAC, INMA, VIVA cohorts) and 597 from children of Asian ancestry (HOKKAIDO, KOREA cohorts). Four cohorts contributed to the child blood EWAS (794 samples, 739 of them with fish consumption), all of them of primarily European ancestry (ALSPAC, INMA, MoBa, RHEA cohorts). Only two cohorts (INMA and ALSPAC) contributed data to both the cord blood and child blood studies. Geometric mean cord blood Hg concentrations for the participating cohorts ranged from 2.01 to 9.30 $\mu\text{g/L}$, where the Japanese cohort showed the highest THg concentrations, followed by the Mediterranean cohorts (INMA and RHEA). Maternal fish consumption was highest in the MoBa cohort, followed by INMA, showing low correlation with cord blood Hg concentrations across cohorts (Dormann et al., 2013). Maternal age at delivery was on average between 29.4 and 32.8 years. The percentage of firstborn children also varied across cohorts, ranging from 37.1 to 60%. Maternal education was coded similarly across the cohorts, with a low percentage of highly educated mothers in ALSPAC and INMA (23.6–30.7%) and highest in VIVA and MoBa (71.9–79.9%). Maternal smoking during pregnancy varied across cohorts, with the most prevalent self-report in

INMA (29.2%) and RHEA (21.2%), and the least prevalent in MoBa (4.4%).

3.2. EWAS meta-analysis

Up to 373,251 CpGs were evaluated in each meta-analysis modeling the associations between prenatal MeHg exposure and DNAm. Table 2 summarizes the statistics of the four performed meta-analyses (two for cord blood, with and without adjustment for maternal fish consumption, and two more for child blood, with and without adjustment for maternal fish consumption). Five American, Asian, and European studies contributed to the meta-analyses linking prenatal MeHg exposure to cord blood DNAm, including ALSPAC, SAPPORO-HOKKAIDO, INMA, KOREA, and VIVA cohorts, whereas four European cohorts (ALSPAC, INMA, MoBa, and RHEA) participated in the meta-analyses relating prenatal MeHg exposure to child blood DNAm at age 7–8. Generally, models showed low heterogeneity. The quantile–quantile plots did not reveal inflation in the distribution of observed p -values (lambdas ranged from 0.869 to 0.974) (Supplemental Figure S3).

Results for differentially methylated sites ($P_{\text{meta}} < 10^{-5}$) in each model are shown in Supplemental Tables S2 to S5. Among them, two differentially methylated CpGs (Table 3) found in child blood DNAm had p -values more extreme than the FDR adjusted p -value threshold (≤ 0.1): The first was cg12204245, located in G protein-coupled receptor kinase 1 (*GRK1*), where a doubling of THg was observed to be associated with 0.2% higher DNAm ($\beta = 0.002$, p -value = 4.81×10^{-7}). A similar effect estimate was observed when adjusting for maternal fish consumption ($\beta = 0.002$, p -value = 1.31×10^{-7}). The second was cg02212000, in the gamma-glutamyl hydrolase (*GGH*) gene, which was only observed to be differentially methylated in the model without fish consumption ($\beta = -0.001$, p -value = 8.13×10^{-7}). Two more CpGs, cg24184221 and cg15288800 located in Mediator Complex Subunit 31 (*MED31*), showed nominal association between prenatal MeHg concentrations and DNA methylation in both cord blood ($\beta = 2.28 \times 10^{-4}$, p -value = 5.87×10^{-5} adjusted for fish) and child blood ($\beta = 0.004$, p -value = 4.97×10^{-5} adjusted for fish). Figs. 1–3 show the direction and weights of the effect by cohort of each CpG on DNAm: 1) hypermethylation of cg12204245 (*GRK1*), as well as cg24184221 and cg15288800 (*MED31*); and 2) hypomethylation of cg02212000 (*GGH*). The observed direction of effect for each cohort was consistent for all differentially methylated CpGs.

The results identified at cg02212000, cg24184221, and cg15288800 were located in genes previously linked to inorganic and organic Hg compounds (*GGH*, *MED31*, and *MED31* respectively) (Supplemental Table S6b). In addition, other CpGs differentially methylated at the $P_{\text{meta}} < 10^{-5}$ level (see Supplemental Tables S2 to S5) were identified both in models with and without fish consumption adjustment and their associated genes were also related to Hg compounds in previous studies (Supplemental Tables S6a and b).

The site cg10555307, annotated within catenin delta 2 (*CTNND2*), showed hypomethylation in ALSPAC and INMA, and hypermethylation in SAPPORO-HOKKAIDO, KOREA and VIVA cohorts in the cord blood methylation model without fish consumption adjustment, but hypermethylation in all cohorts in the adjusted model for fish consumption. Also, cg17452301 in PWWP domain containing 2B (*PWWP2B*), and cg19374305 in dynein axonemal heavy chain 7 (*DNAH7*), showed hypermethylation in child blood methylation models in all cohorts (ALSPAC, INMA, MoBa, and RHEA). In these cases, associations did not persist between cord and child blood models.

Functional enrichment analyses among the top CpG sites ($P_{\text{meta}} < 10^{-5}$) did not show robust results because of the lower insufficient probes and genes by identified pathway after correction for multiple testing (FDR ≈ 1) in any model (Supplemental Table S7).

Table 2
Summarized statistics of multivariate genome-wide-association meta-analysis.

Model	Lambda	Sample (N)	Cohorts (N)	Cohorts (names)	QCed CpGs	I ² index (mean)	CpGs BN ≤ 0.1 (N)	CpGs FDR≤0.1 (N)	CpGs P _{meta} < 10 ⁻⁵ (N)	Annotated Genes for CpGs P _{meta} < 10 ⁻⁵ (N)
Cord blood model adjusted for covariates, without maternal fish consumption	0.894	1462	5	ALSPAC, SAPPORO-HOKKAIDO, INMA, KOREA, VIVA	373,251	0.1563	0	0	41	31
Cord blood model adjusted for covariates, with maternal fish consumption	0.869	1462	5	ALSPAC, SAPPORO-HOKKAIDO, INMA, KOREA, VIVA	373,250	0.1438	0	0	28	25
Child blood model adjusted for covariates, without maternal fish consumption	0.945	794	4	ALSPAC, INMA, MOBA, RHEA	373,183	0.1443	0	2	56	44
Child blood model adjusted for covariates, with maternal fish consumption	0.974	739	4	ALSPAC, INMA, MOBA, RHEA	373,183	0.1408	1	1	60	46

BN: Bonferroni test; FDR: false discovery rate test; I² heterogeneity index; P_{meta}: unadjusted p-value.

Table 3
Prenatal MeHg exposure and DNA methylation. Meta-analysis of epigenome-wide association study including highlighted CpG sites with a P_{meta}<10⁻⁵.

Model	CpG site	Beta	SE	p-value	I ²	Studies	Sample	Effects	FDR ^a	Chr.	Position	UCSC RefGene Name	Location
Child blood DNAm – Without fish	cg02212000	-0.0008	0.0002	8.13E-07	0	4	794	-	0.1011	chr8	63951669	<i>GGH</i>	TSS200
Child blood DNAm – With fish	cg02212000	-0.0008	0.0002	3.65E-06	0	4	739	-	0.4540	chr8	63951669	<i>GGH</i>	TSS200
Cord blood DNAm – With fish	cg24184221	0.0002	0.0001	5.87E-05	0	5	1462	++++	1.0000	chr17	6,555,443	<i>MED31</i> ; <i>C17orf100</i>	Exon
Child blood DNAm – With fish	cg15288800	0.0036	0.0009	4.97E-05	0.3014	4	739	++++	0.5133	chr17	6,555,742	<i>MED31</i> ; <i>C17orf100</i>	3' UTR
Child blood DNAm – Without fish	cg12204245	0.0020	0.0004	4.81E-07	0.6585	4	794	++++	0.0898	chr13	114,321,214	<i>GRK1</i>	TSS1500
Child blood DNAm – With fish	cg12204245	0.0022	0.0004	1.31E-07	0.4678	4	739	++++	0.0489	chr13	114,321,214	<i>GRK1</i>	TSS1500

Shown are the 4 highlighted CpGs ordered by p-value. Results presented per 1 µg/L increase in prenatal MeHg exposure (cord blood total Hg concentration or child total Hg concentration). Column heads: Beta: regression coefficient; SE: standard error for regression coefficient; p-value: unadjusted p-value for the regression coefficient; I²: heterogeneity statistics; Studies: number of studies involved; Sample: sample size in the model; Effects: direction of effect across cohorts included in the statistical model (ALSPAC, INMA, MoBa, and RHEA): Hg exposure during pregnancy was associated with increased (+) or decreased (-) methylation, or missing (?) result; FDR: false discovery rate; Chr: chromosome; Position: chromosomal position based on NCBI human reference genome; UCSC RefGene Name: UCSC annotated gene.

All models were adjusted for maternal age, parity, education, smoking during pregnancy, and child sex, and cellular heterogeneity.

Mapped from the array to the hg19 genome provided by Illumina. Location of differentially methylated sites has been added according to the IlluminaHumanMethylation450kanno.ilmn12.hg19 R package.

TSS: Transcription Start Site; UTR: untranslated region.

^a Epigenome-wide significance threshold (FDR p ≤ 0.1).

4. Discussion

This study represents so far the largest-scale epigenome-wide meta-analysis evaluating the association between prenatal MeHg exposure and DNAm in new-borns and children aged 7–8 years old. The combined results showed evidence for associations of prenatal MeHg exposure during pregnancy with differential methylation in *MED31* at both time points during child development, suggesting that methylation levels in *MED31* may be perturbed in response to *in utero* MeHg exposure in a

manner that persists into early childhood. *MED31* is widely expressed in the human body (www.proteinatlas.org (Uhlén et al., 2015)), and is involved in lipid metabolism and RNA Polymerase II transcription function (Beadle et al., 2018). We also identified a link between prenatal MeHg exposure and child blood DNA methylation of *GRK1*, encoding the protein rhodopsin kinase *GRK1*, mainly expressed in the retina and involved in retina function (Fan et al., 2010); and *GGH*, widely expressed in the body and related to glutathione metabolism and innate immune system pathways (Gibson et al., 2011). How methylation of

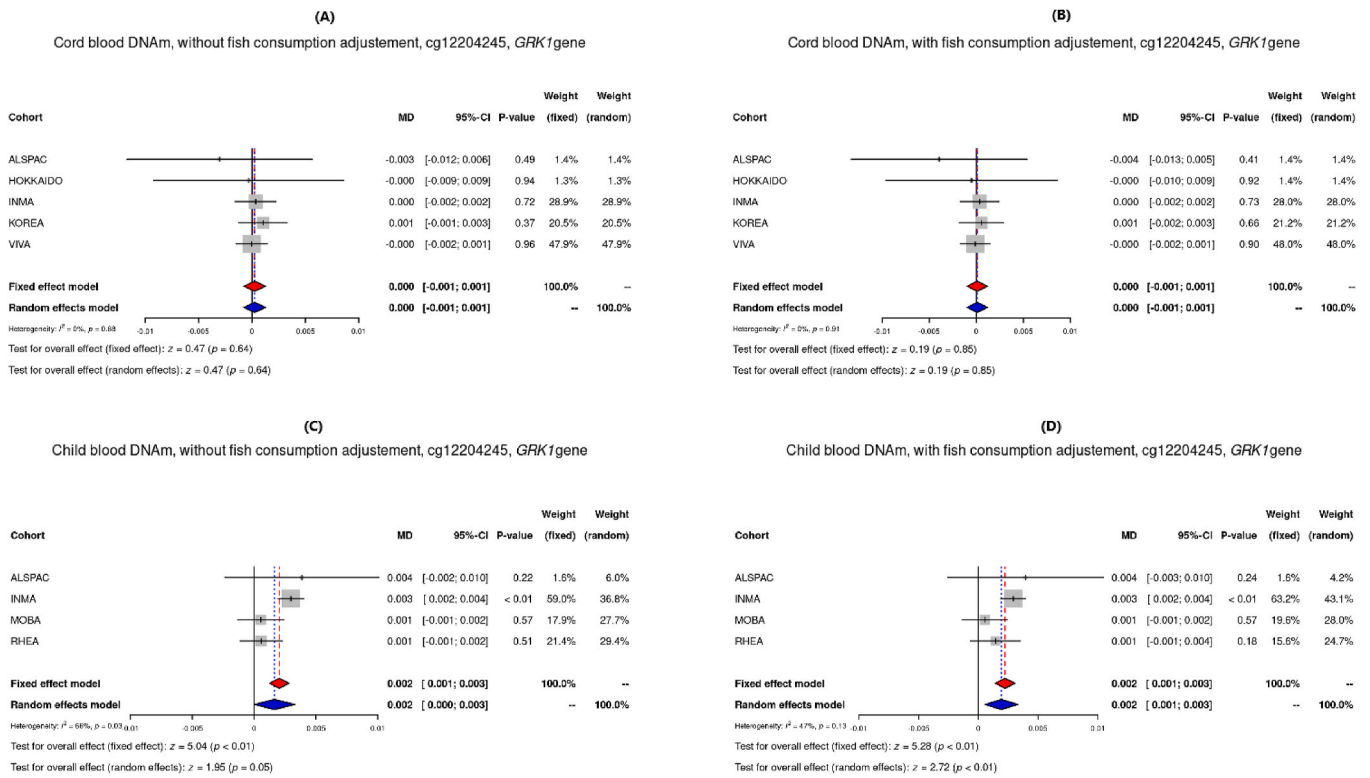


Fig. 1. Forest plots of DNAm of the CpG site cg12204245 in *GRK1* from models adjusted for maternal age, parity, education, smoking, child sex and cellular heterogeneity, for cord blood without and with adjustment for fish consumption (A and B), and child blood without and with adjustment for fish consumption (C and D).

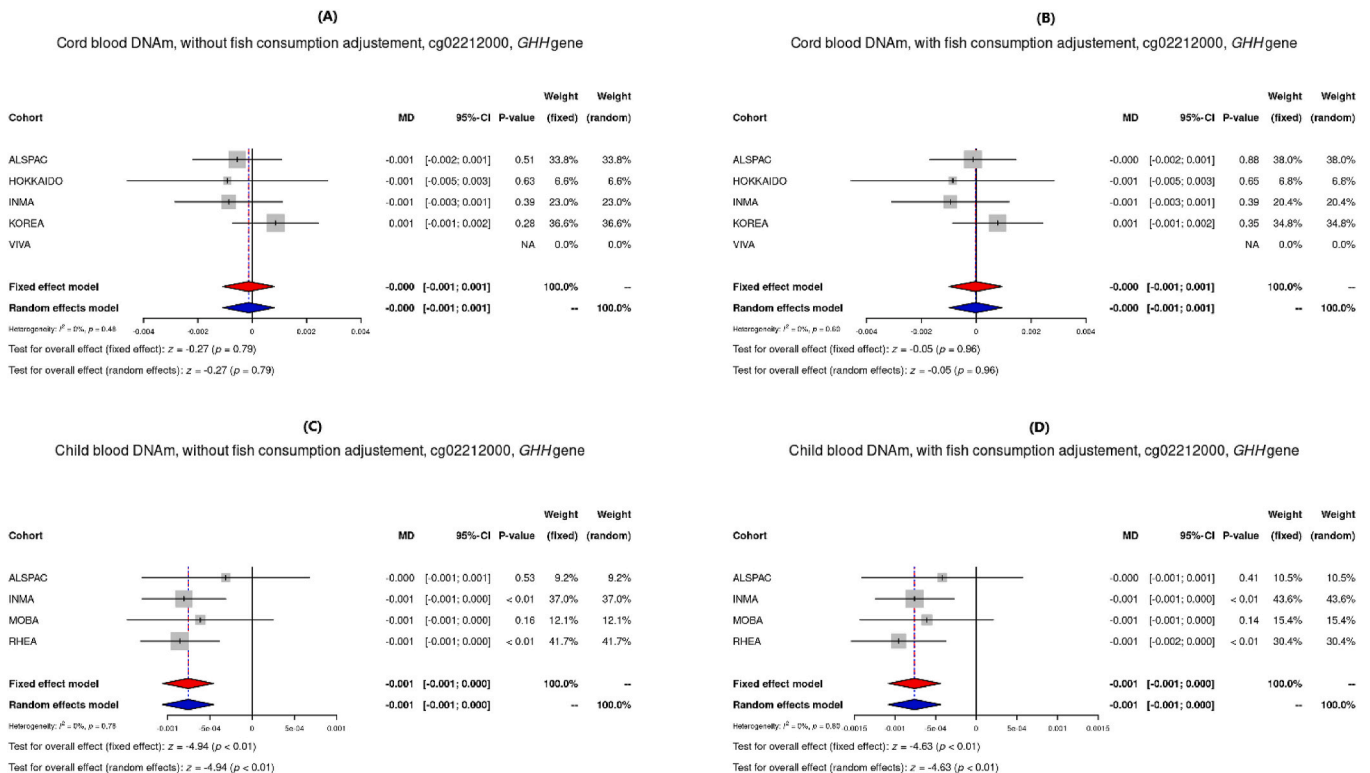


Fig. 2. Forest plots of DNAm of the CpG site cg02212000 in *GGH* from models adjusted for maternal age, parity, education, smoking, child sex and cellular heterogeneity, for cord blood without and with adjustment for fish consumption (A and B), and child blood without and with adjustment for fish consumption (C and D).

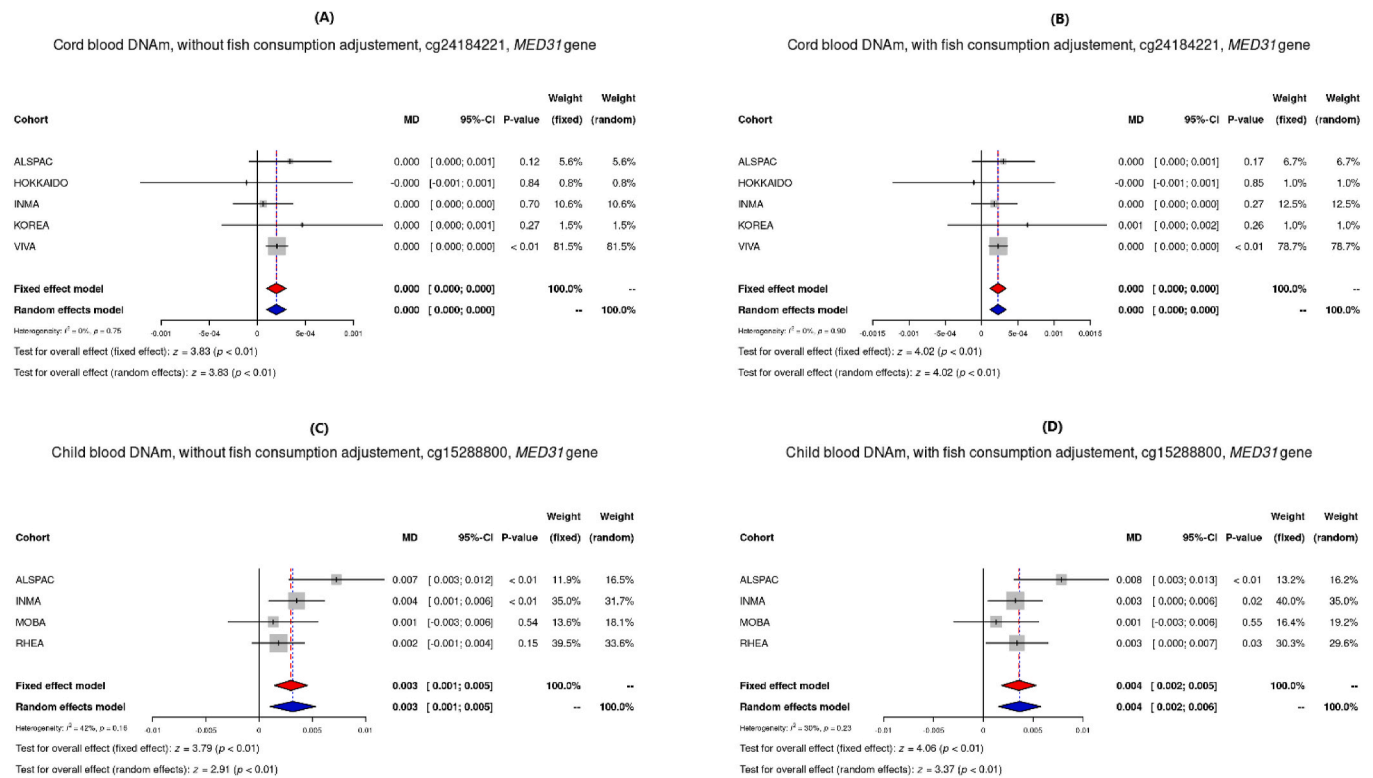


Fig. 3. Forest plots of DNAm of the CpG sites in *MED31* from models adjusted for maternal age, parity, education, smoking, child sex and cellular heterogeneity, for cord blood without and with adjustment for fish consumption for cg24184221 site (A and B), and child blood without and with adjustment for fish consumption for cg15288800 site (C and D).

these genes is linked to MeHg toxicity warrants further functional studies.

Differential expression of *MED31* and *GGH* have been previously related to exposure to inorganic and organic Hg compounds (Comparative Toxicogenomics Database: www.ctdbase.org (Grondin et al., 2021)). In zebrafish, increasing mercury chloride concentrations were associated with a decrease in *MED31* expression in the liver (Ung et al., 2010). In rats, 4-hydroxymercuribenzoate induced decreased *GGH* activity, resulting in an increased hydrolysis of folic acid (Shafizadeh and Halsted, 2007). Additionally, methylmercuric chloride was related to decreased expression of *GGH* in human embryonic stem cells (Waldmann et al., 2017). These studies showed increased gene expression in response to exposure which could be consistent with the hypomethylation we observed in CpG within these genes (see Figs. 2 and 3). The differentially methylated CpG site cg12204245 in *GRK1* perhaps represents a novel target gene in the context of MeHg exposure. However, *GRK6*, a paralog of the *GRK1*, has been related *in vitro* to methylmercuric chloride human exposure resulting in dose-dependent increased expression of *GRK6* (Waldmann et al., 2017). We identified other previously Hg-associated genes with persistent differential methylation, such as *CTNND2* and *PWWP2B*, where expression has been shown to be decreased in association with mercuric bromide, p-chloromercuribenzoic acid, phenylmercuric acetate and methylmercuric chloride in human cells studies (Waldmann et al., 2017; Rempel et al., 2015; Shinde et al., 2017). Both genes showed general consistent hypermethylation in the affected CpGs sites in our models, which seems to be consistent with these previous studies. Conversely, *DNAH7*, which also showed hypermethylation in all our cohorts, has been previously related to an increased expression due to MeHg exposure in fish (Klaper et al., 2006).

Some studies have characterized DNAm changes in cord and child blood relative to prenatal MeHg exposure. These studies observed a differentiated DNAm in cord (Cardenas et al., 2017a, 2017b; Bakulski

et al., 2015) as well as child blood (Cardenas et al., 2017a, 2017b). The period of foetal development has been shown to be specially sensitive to toxicants exposure, likely because of the dramatic DNAm changes and epigenomic remodelling that takes place early during embryogenesis, giving rise to differentiated cells and tissues with specific DNAm patterns (Perera and Herbstman, 2011a). The ability of MeHg to cross the placenta during development makes it a candidate toxicant for the disruption of foetal programming events that could propagate through different germ layers during embryogenesis and contribute to postnatal health consequences. The specific mechanisms of these effects remain unclear, but it has been proposed that DNAm may act as a response mechanism to MeHg exposure or a long-term mediator of MeHg-associated effects (Cediel Ulloa et al., 2021). However, studies evaluating the persistence of these changes into childhood are scarce (Vaiserman, 2015). Assessing the persistence of these epigenetic modifications is critical as DNAm is a dynamic process that can drift with age (Acevedo et al., 2015). Work by Cardenas et al. in the US-based Project Viva study previously evaluated the persistence of these changes in 321 cord blood samples followed-up in blood samples taken at 10 years of age, finding that higher DNAm levels of the *PON1* region were associated with lower cognitive test scores in early childhood for both sexes (Cardenas et al., 2017b).

A challenge for our observational analysis was to evaluate the potentially confounding influence of fish consumption on our effect of interest, the association between MeHg exposure and altered patterns of DNAm (Perera and Herbstman, 2011b). Fish consumption showed low correlation (Dormann et al., 2013) with cord blood THg concentrations across cohorts in the present study, but it can be a source of other pollutants apart from Hg, such as polychlorinated biphenyls (PCBs), for which synergic effects of both compounds have been suggested (Ballester et al., 2018b; Boucher et al., 2010). Additionally, fish is a source of nutrients, including selenium or poly-unsaturated fatty acids (PUFA), which have been purported to be protective against the toxic effects of

MeHg (Ralston and Raymond, 2018; Ginsberg et al., 2015). Comparing multivariate models adjusted and not adjusted for fish consumption allows identification of genes independently affected by MeHg exposure, such as *GRK1* and *GGH* observed in this study. Other studies have included the variable fish consumption in the multivariate models of DNAm MeHg-association analysis. Cardenas et al. (2017b) included adjustments for mean weekly fish intake during pregnancy in its single-cohort study assessing the persistent DNAm associated with prenatal MeHg exposure, but did not consider the contrast between models with and without adjustment for fish consumption.

The main strength of this study is the large sample size achieved by analysing data from all cohorts and combining the results in a meta-analysis allowing to identify only robust results. By using identical analysis protocols and harmonized script across all cohorts we have reduced bias due to heterogeneity. Shadow replication of meta-analysis results has minimized the possibility of coding errors. Also, the inclusion of different THg concentrations and fish consumptions make results more generalizable to other populations. To avoid the violation of the homogeneous effect assumption across studies only the largest ethnic group in each cohort was included. However, including different cohorts with different main ethnicities allowed to check the homogeneity of the epigenetic MeHg effects.

Our study also has some limitations. The most important is that only INMA and ALSPAC cohorts participated with prospective cord-child blood DNAm data. Also, although the sample size was large, some cohorts could not participate in the meta-analyses, such as KANC cohort from HELIX study because it had no fish consumption data. Moreover, most cord blood THg concentrations from different cohorts were obtained by means of transformation factors from maternal hair or blood according to literature. On the other hand, loci and genes identified in cord and child DNAm were, although with limited power, associated with pathways that are critical to foetal growth and development: vascular permeability to maintain physiological tissue homeostasis, astrocyte activation and microtubule nucleation that play a crucial role in orchestrating neural development by coordinating synapse formation and function (Sloan and Barres, 2014; Sánchez-Huertas et al., 2016), as well as titin binding, involved in muscular development (Letourneau and Wright, 2018). Therefore, further experimental research is needed for understanding the functional effects of MeHg-related epigenetic effects of the identified genes in the present study.

5. Conclusions

We have conducted the largest epigenome-wide meta-analysis to date evaluating the association between prenatal Hg exposure and DNAm in new-borns and 7-year-old children. This study adds some evidence that *MED31* could serve as a potential target of MeHg exposure, providing a potential epigenetic signature of *in utero* exposure which persists into early childhood, independently of fish consumption and other possible confounders. DNAm modifications leading to functional genomic changes could help explain heterogeneous findings observed for prenatal mercury exposure and health outcomes such as cognitive or anthropometric development in different populations. Our study also contributes to further understanding of potential underlying mechanisms of the negative health effects of MeHg exposure by highlighting the implications of DNAm in several genes involved in growth and cell cycle processes during foetal development.

Declaration of competing interest

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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INMA

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Project Viva

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RHEA

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Appendix A. Supplementary data

Supplementary data to this article can be found online at <https://doi.org/10.1016/j.envres.2021.112093>.

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