Childhood exposure to non-persistent endocrine disruptors, glucocorticosteroids, and neurodevelopment: A study based on the parametric g-formula

Abstract

Evidence suggests that endocrine disrupting chemicals (EDCs) may perturb the hypothalamic-pituitary-adrenocortical (HPA) axis, which has a major role in brain development. We aimed to evaluate the effects of childhood exposure to organophosphate pesticides, phenols, and phthalate metabolites, on urinary glucocorticosteroids and inattention measures in children using data from the Human Early-Life Exposome (HELIX) cohort. We used the parametric g-formula to estimate effects between EDCs, glucocorticosteroids, and hit reaction time standard error (HRT-SE), a measure of efficiency from the Attention Network Test (ANT), and tested for possible effect modification by sex. We observed a positive marginal contrast (MC) for exposure increases from the 10th to the 90th percentile for methyl-paraben (MC: 0.042 and 95% confidence interval (CI): (0.013, 0.071)), and the phthalate metabolites oxo-MiNP (MC: 0.023 and 95% CI: (0.003, 0.044)), oh-MiNP (MC: 0.039 and 95% CI: (0.001, 0.076)), and MEHP (MC: 0.036 and 95% CI: (0.008, 0.063)), on HRT-SE. Several EDCs were also associated with a positive MC for cortisone, cortisol, and corticosterone production. Increased levels of the glucocorticosteroids had no effect on HRT-SE, although we found a possible effect modification by sex. Our results suggest that multiple EDCs might interfere with inattentiveness outcomes in children and with the homeostasis of the HPA axis.

The prevalence of several neurodevelopmental disorders has increased in the pediatric population (1), and multiple environmental pollutants may play a role in the increased rates of these disorders (2). Multiple endocrine disrupting chemicals (EDCs), ubiquitous chemicals present in many every-day products and diet, are capable of interfering with the endocrine system, and have shown associations with childhood neurodevelopment and behavior (3–17). Although both pregnancy and early infancy are crucial stages of (neuro)development, most of the available literature is focused on the effects of prenatal exposure to EDCs on child neurodevelopment (2).

One group of EDCs that may have a deleterious effect on neurodevelopment is the organophosphate pesticides (OP pesticides), although the few studies assessing exposure during childhood and through the use of biomarkers suffered from a series of limitations, including a small sample size (2). Exposure to phthalates and their metabolites during childhood and early adolescence has been associated with several adverse neurodevelopmental outcomes, but these studies were limited to few phthalate metabolites and small study populations (2). The effects of exposure to bisphenol A (BPA) during childhood on cognitive functions are still unclear (2).

Moreover, little is known about the biological mechanisms of action (2). There is some toxicological evidence, however, that exposure to certain EDCs, specifically phthalates, might interfere with the hypothalamic-pituitary-adrenocortical (HPA) axis and might interact with the glucocorticoid receptor (18–20). The HPA axis, which can be activated by stress, is responsible for the production of glucocorticosteroids. The brain, and its proper functioning, is a potential target, due to the presence of receptors for these hormones (19,21). Glucocorticosteroids are necessary for brain maturation, although their under- or over-production might interfere with its normal development and ultimately lead to long-term impaired functioning (20,21).

Taken together, these results suggest that the negative influence of exposure to certain EDCs on neurodevelopmental outcomes might be mediated, at least partially, by disruption of the HPA axis' homeostasis. In the present study, we thus estimated associations between 1) non-persistent EDCs and attention, 2) non-persistent EDCs and glucocorticosteroids, and 3) glucocorticosteroids and attention, using the parametric g-formula and marginal contrasts (MCs), in children of a large cohort in Europe.

1 Methods

1.1 Study population and design

The Human Early-Life Exposome (HELIX) project aims to characterize early-life exposures and their potential association with endogenous biomarkers and health outcomes (22). It consists of six existing population-based birth cohort studies across Europe: BiB (Born in Bradford, UK) (23), EDEN (Study of determinants of pre- and postnatal developmental, France) (24), INMA (Environment and Childhood, Spain) (25), KANC (Kaunas Cohort, Lithuania) (26), MoBa (The Norwegian Mother and Child Cohort Study, Norway) (27), and Rhea (Mother-Child Cohort in Crete, Greece)

(28). The HELIX subcohort of 1,301 mother-child pairs was fully characterized for the external and internal exposome, including exposure and omics biomarkers during childhood (29). Eligibility criteria for inclusion in the HELIX subcohort included:
a) age 6-11 years, with a preference for 7-9 years; b) availability of sufficient stored pregnancy blood and urine samples; c) availability of complete address history from first to last follow-up; d) no serious health problems, which might affect the results of the clinical testing. Ethical permission was obtained from the relevant authorities in the corresponding country.

68 1.2 Variables

1.2.1 Endocrine disrupting chemicals

Children were assessed between December 2013 and February 2016, and assessments included neurological testing and urine collection. Urine samples of the night before and the first morning void on the day of the visit were combined to provide a more reliable exposure assessment. Non-persistent EDCs assessed in the urine samples included phthalate metabolites, phenols, and organophosphate (OP) pesticide metabolites. A list of the environmental chemicals determined in urine samples and used for the present study is given in Table S1. Briefly, we analyzed a total of 7 phenols (bisphenol A (BPA), ethyl-paraben (ETPA), methyl-paraben (MEPA), n-butyl-paraben (BUPA), oxybenzone (OXBE), propyl-paraben (PRPA), triclosan (TRCS)), 6 non-specific organophosphate 78 pesticide metabolites (diethyl dithiophosphate (DEDTP), diethyl phosphate (DEP), diethyl thiophosphate (DETP), dimethyl dithiophosphate (DMDTP), dimethyl phosphate 81 (DMP), dimethyl thiophosphate (DMTP)), and 10 phthalate metabolites (mono benzyl phthalate (MBzP), monoethyl phthalate (MEP), mono-2-ethyl 5-carboxypentyl phtha-82 late (MECPP), mono-2-ethylhexyl phthalate (MEHP), mono-2-ethyl-5-hydroxyhexyl phthalate (MEHHP), mono-2-ethyl-5-oxohexyl phthalate (MEOHP), mono-4-methyl-7-hydroxyoctyl phthalate (oh-MiNP), mono-4-methyl-7-oxooctyl phthalate (oxo-MiNP), mono-iso-butyl phthalate (MiBP), mono-n-butyl phthalate (MnBP)) originating from 6 distinct phthalate parent compounds. The laboratory protocols for the analysis are described elsewhere (30).

9 1.2.2 Glucocorticosteroids

Urine samples of the night before the day of the visit were used to measure levels of the glucocorticosteroids. These included glucocorticosteroids, glucocorticosteroid metabolites, glucocorticosteroid precursors, glucocorticosteroid precursor metabolites, androgens, and androgen metabolites. A list of the glucocorticosteroids determined in urine samples and used for the present study is given in Table S2.

To assess the levels of glucocorticosteroids and their metabolites, LC-MS/MS analysis was applied at the Applied Metabolomics Research Group, IMIM (Hospital del Mar Medical Research Institute). The laboratory protocols for the analysis are described elsewhere (31,32).

Three additional markers, total cortisol production, total cortisone production, and total corticosterone production, were computed based on the following: cortisol 100 production as the sum of cortisol and its metabolites (20 -dihydrocortisol (20aDHF), 20 -dihydrocortisol (20bDHF), 5,20 -cortol (5a20acortol), 5,20 -cortol (5a20bcortol), 102 5 -tetrahydrocortisol (5aTHF), 5, 20 -cortol (5b20acortol), 5, 20 -cortol (5b20bcortol), 103 5-dihydrocortisol (5bDHF), 5-tetrahydrocortisol (5bTHF), 6-hydroxycortisol 104 (60HF)), cortisone production as the sum of cortisone and its metabolites (20dihydrocortisone (20aDHE), 20 -dihydrocortisone (20bDHE), 5 -tetrahydrocortisone 106 (5aTHE), 5,20-cortolone (5b20acortolone), 5,20-cortolone (5b20bcortolone), 107 5-tetrahydrocortisone (5bTHE), 6-hydroxycortisone (6OHE)), and corticosterone 108 production as the sum of 11-dehydrocorticosterone (A), 17-deoxycortolone (17-DO-cortolone), 5-tetrahydrocorticosterone (5aTHB), 5-tetrahydrocorticosterone 110 (5bTHB). 111

1.2.3 Neurodevelopment

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Neurodevelopmental outcomes were assessed with standardized, non-linguistic, and culturally blind computer tests, including the Attention Network Test (ANT) (33), which provides a measure of efficiency in three different components of attention: alerting, orienting, and executive attention. The tests were administered in a standardized way, and with minimal interference from the field workers. Further information can be found in (29). The outcome of interest for the present study is the hit reaction time standard error (HRT-SE) (34), a measure of response speed consistency throughout the test. A high HRT-SE indicates highly variable reaction times, and is considered a measure of inattentiveness.

1.2.4 Confounders

For each research question, defined by a specific type of exposure and outcome, the minimal set of covariates for inclusion in the analyses was selected on the basis of a directed acyclic graph (DAG) built with DAGitty (35) and ggdag (36). The sets of covariates were selected to estimate the total effect of the exposure on the outcome. For effect estimation of the EDCs on glucocorticosteroids and of glucocorticosteroids on HRT-SE, these sets were also sufficient to estimate direct effects. Sample-specific creatinine values were used to adjust for possible dilution effects. Further, each minimal adjustment set was augmented with precision covariates, defined as the set of parents variable of the outcome that are not parents of the exposure. The adjustment sets are provided in the Supplementary Material as text files compatible with DAGitty. Codebooks for the used covariates, by research question, are provided in Supplementary Tables Table S3, Table S4, Table S5.

1.3 Statistical methods

1.3.1 Data pre-processing

Concentrations of the glucocorticosteroids were classified as quantifiable, below the limit 137 of quantification (LOQ), possible interference or out of range, and not detected. For 138 each metabolite, we computed the fraction of values below the LOQ and not detected, both within each cohort and overall. We proceeded to impute these values using half 140 the value of the corresponding LOQ, for those metabolites that had less than 30% of 141 missings within each cohort and 20% of missings overall. Information about the lower limit of quantification (LLOQ) for the glucocorticosteroids is provided in Table S6. The remaining missing values were imputed using kNN from the VIM R package (37), 144 for those metabolites that had less than 40% of remaining missings within each cohort and 30% of remaining missings overall. We used 5 nearest neighbors. We natural log-transformed them to improve model fit, assessed with posterior predictive checks. To do so, replicated data were simulated with the fitted models and compared to 148 the observed data. We used the check_predictions function from the performance 149 R package using the default arguments (38). Values of total cortisol, cortisone, and 150 corticosterone production were expressed in nanograms per millilitre (ng/ml). 151

Concentrations of the non-persistent EDCs were classified as quantifiable, below the 152 limit of detection (LOD), possible interference or out of range, and not analysed. Concentrations below the LOD were singly imputed using a quantile regression approach for the imputation of left-censored missing data, as implemented in the impute.QRILC 155 function from the imputeLCMD R package (39). Information about the lower limits of 156 detection can be found in (30). Chemicals with more than 70% of observations below 157 the LOD were not considered in the present study. Remaining missing values were 158 imputed similarly using kNN. Values of the chemicals were expressed in μ grams per 159 litre ($\mu g/L$). 160

Missing values in the clinical outcome were imputed similarly using kNN. We natural log-transformed these to improve model fit, assessed with posterior predictive checks. Values of the clinical outcome were expressed in milliseconds (ms).

Missing values in the covariates were imputed similarly using kNN. Categorical covariates were imputed using the maxCat function, which chooses the level with the most occurrences. Creatinine values were expressed in grams per litre (g/L).

1.3.2 Estimation of balancing weights

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To reduce the effect of measured confounders on the exposure-outcome association, stabilized balancing weights were estimated using the energy method available in the WeightIt R package (40). This methods estimates weights by minimizing an energy statistic related to covariate balance (41), thus avoiding the need to specify a parametric model. Weights below the 0.1 and above the 0.9 quantiles were trimmed. Trimming might lead to decreased covariate balance and potentially change the estimand, but can also decrease the variability of the weights. Covariate balance was assessed using

functionalities provided by the cobalt R package (42). Specifically, we used *Love* plots to visualize covariate balance before and after adjusting.

1.77 1.3.3 G-computation

We estimated MCs with the parametric g-formula, a method of standardization. The 178 parametric g-formula involves the following steps: 1) fit a outcome model including 179 both covariates and balancing weights; 2) create two new datasets identical to the original one but with the exposure shifted according to a user-specified intervention 181 set by a deterministic function of the observed exposure levels; 3) use the outcome 182 model to compute adjusted predictions in the two counterfactual datasets; 4) compute the difference between the means of the adjusted predictions in the counterfactual 184 datasets. The causal parameter of interest was thus specified as the difference in the 185 expected counterfactual outcomes under the shifted exposure levels $(\mathbb{E}[Y^{d_1}] - \mathbb{E}[Y^{d_2}])$. 186 In order for this parameter to be identified, the usual causal identifiability conditions 187 (no unmeasured confounding, positivity, and consistency) are required. Since these conditions are likely not satisfied, we focused on the estimation of a statistical estimand 189 that is as close as possible to the causal parameter of interest. 190

We fit the outcome model using the glm function and a Gaussian family with identity link from base R. The exposure variable was modeled using natural cubic splines with 3 degrees of freedom, to more flexibly capture the average dose-response function (ADRF).

To estimate the MCs, we used the avg_comparisons function from the marginaleffects R package (43). The two counterfactual datasets were obtained by setting the exposures levels to 90th percentile (d_1) and the 10th percentile (d_2) , for each cohort separately. The MCs were computed using the estimated balancing weights above. Robust standard errors were computed with the sandwich R package, using cohort as variable indicating clustering of observations (44,45). For each outcome, we report the results as differences between MCs.

The R code to reproduce analyses and results is available online (https://github.com/loren-zoFabbri/paper-helixSC-neuro).

1.3.4 Effect-modification analysis

We tested for possible effect-modification by sex. To do so, balancing weights were estimated separately for each level of the sex variable, and an interaction term between the exposure and sex was included in the outcome model. Similarly, the MCs were aggregated separately for each level of sex. We further tested for significance of the difference between the MCs of females and males.

Results $\mathbf{2}$

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Table 1 and Table S7 provide descriptive statistics for the outcome and covariates for the HELIX subcohort and for each cohort, respectively. Of the 1,301 children of the HELIX subcohort, 1,297 had measurements of the non-persistent EDCs. Measurements of the glucocorticosteroids were available for 1,004 children, of which 980 were matched to the HELIX subcohort. Measurements of both non-persistent EDCs and glucocorticosteroids were available for 976 children of the subcohort. A flowchart describing the sample size for each research question is presented in Figure S1. The sample consisted of 55% girls. The median HRT-SE was 300 ms (interquartile range (IQR), 231-368), with lower median values for EDEN, MOBA, and INMA, corresponding to the cohorts with older children. At the time of visit, the median age of the children was 8.06 years. The children were mostly Caucasian (90%), and the largest minority were of Pakistani origin (6.2%).

Levels of unprocessed non-persistent EDCs, after imputation of values below the LOD, 223 and glucocorticosteroids, are presented in Table 2, Table 3, and Table S8. Supplementary 224 Figure S2 and Figure S3 provide information on the measurement classification of the EDCs and glucocorticosteroids by cohort, respectively. 226

The effective sample sizes before and after balancing weights estimation are presented in Supplementary Tables Table S9, Table S10, Table S11, while basic summary statistics of the estimated balancing weights are presented in Supplementary Tables Table S12, Table S13, Table S14. As expected, the median value of the weights for each exposure was close to 1.00.

Figure 1 presents the forest plot for the MCs of the non-persistent EDCs on HRT-SE. For most EDCs, a cohort-specific decrease in the levels of the exposures from the 90th to the 10th percentiles was associated with a positive MC, indicating an increase in the values of HRT-SE and thus lower attention. Most of the cis included the null effect, though. Significant effects were observed for the paraben MEPA (MC: 0.042) and 95% CI: (0.013, 0.071)), and the phthalate metabolites oxo-MiNP (MC: 0.023 and 95% CI: (0.003, 0.044)), oh-MiNP (MC: 0.039 and 95% CI: (0.001, 0.076)), and MEHP (MC: 0.036 and 95% CI: (0.008, 0.063)). The organophosphate pesticide (OP pesticide) DETP was negatively associated with HRT-SE (MC: -0.026 and 95% CI: (-0.054, 0.001)). 241

Figure 2 presents the forest plot for the MCs of the non-persistent EDCs on total cortisone, cortisol, and corticosterone production. For most EDCs, a cohort-specific decrease in the levels of the exposures from the 90th to the 10th percentiles was associated with a positive MC, indicating an increase in the total production of these metabolites. Exceptions were BUPA, which was associated with negative MCs for all three outcomes, and MiBP, which was associated with a negative MC for total cortisone production only. The majority of the effects for the phenols and phthalate metabolites included the null. The phenol BPA showed the largest MCs across all three outcomes (cortisone production, MC: 0.263 and 95% CI: (0.131, 0.394); cortisol production, MC: 0.274 and 95% CI: (0.107, 0.441); corticosterone production, MC: 0.285 and 95% CI: (0.106, 0.464).

Figure 3 presents the forest plot for the MCs of the glucocorticosteroids on HRT-SE.
All MCs included the null, with no clear indication of directionality of the effect.

2.1 Effect modification by sex

Basic summary statistics of the estimated balancing weights for effect modification are presented in Supplementary Tables Table S15, Table S16, Table S17. As expected, the median value of the weights for each exposure was close to 1.00.

Table 4 presents the results of the difference between estimates of the MCs for females 259 and males, for the EDCs on the glucocorticosteroids and HRT-SE. For HRT-SE, signif-260 icant differences were present for the phenol OXBE (MC: 0.032 and 95% CI: (0.004, (0.061)) and the phthalate metabolites MEP (MC: -0.053 and 95% CI: (-0.138, 0.033)) 262 and MbZP (MC: -0.066 and 95% CI: (-0.126, -0.007)). For the glucocorticosteroids, significant differences were present across all three classes of EDCs and for all outcomes. The largest differences were attributable to the OP pesticides DMTP (cortisol production, MC: -0.21 and 95% CI: (-0.326, -0.094)) and DETP (corticosterone production, 266 (MC: -0.16 and 95% CI: (-0.332, 0.011)); cortisone production, (MC: -0.097 and 95% CI: 267 (-0.269, 0.076))). The forest plots of the individual MCs are presented in Supplementary 268 Figures Figure S4 and Figure S5. 269

Table 5 presents the results of the difference between estimates of the MCs for females and males, for the glucocorticosteroids on HRT-SE. Significant differences were present for cortisone production (MC: 0.14 and 95% CI: (0.019, 0.261)) and corticosterone production (MC: 0.126 and 95% CI: (0.009, 0.243)). Furthermore, for all exposures, the MCs had opposite sign (positive for males and negative for females). The forest plot of the individual MCs is presented in Figure S6.

3 Discussion

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The impact of exposure to EDCs on human health has attracted considerable research interest. While research in this area has mainly investigated the effects of prenatal exposure on child neurodevelopment (2), little is still known about childhood exposure. In this study, consisting of 1,297 children from 6 European birth cohorts, we observed that short-term childhood exposure to non-persistent EDCs had negative effects on HRT-SE and total production of cortisol, cortisone, and corticosterone, although the majority of the cis included the null effect. Increased production of these glucocorticosteroids did not seem to affect HRT-SE. Some of these effects differed for females and males, including significant differences for the effects of increased production of cortisone and corticosterone on HRT-SE. Specifically, an increased production of these glucocorticosteroids was associated with lower values of HRT-SE for females, and higher values for males. Taken together, these results suggest that these non-persistent EDCs might be responsible for perturbations of the HPA axis' homeostasis, and that higher

levels of these glucocorticosteroids might interfere with different functions of attention in a sex-specific manner.

We are not aware of prior studies specifically investigating the effects of exposure to EDCs in relation to HRT-SE. The literature on EDCs and neurodevelopment in children has mostly focused on OP pesticides (3,4,6,8), phthalate metabolites (5,9,10,17), and BPA (7,13,14), in relation to Attention-Deficit / Hyperactivity Disorder (ADHD) (3,7,8,13), and intelligence scales (4–6,9,10,17). Few studies have looked into different classes of EDCs (15 in relation with the Conners Attention Deficit Scale and the Behavior Assessment System for Children,16 in relation with ADHD symptoms). Overall, and consistent with our results, these studies seem to provide further evidence of the adverse effects of several EDCs on neurodevelopment in children. While not all these studies have investigated effect modification by sex, it seems that these adverse effects are stronger in males. A major limitation of these studies is the reliance on spot urine samples, that might not be representative of long-term exposures.

Our results are consistent with prior epidemiological research that associated exposure to certain EDCs with higher levels of cortisol (18–20). There are some differences, though. First, these studies only focus on phthalates, either as individual metabolites or as mixture. Second, exposure assessment in (19) and (18) was performed during gestation or the first 15 months of life, respectively. Finally, the glucocorticosteroids were measured in cord blood (19) and hair (20). Contrary to these studies, we did find effect modification by sex. We are not aware of other epidemiological studies investigating phthalates metabolites, phenols, and OP pesticides, in relation to urinary glucocorticosteroids in childhood. Nonetheless, previous toxicological studies provide evidence for the inhibition by phthalates of human 11β -hydroxysteroid dehydrogenase 2 (11β -HSD2) activity, responsible for the conversion of active cortisol into inactive cortisone (46,47). There is also in silico evidence suggesting that BPA, a phenol, and Triazophos (TAP), a organophosphorus insecticide, can bind to the human glucocorticoid receptor (48,49).

We are also not aware of prior epidemiological studies specifically investigating the effects of elevated levels of glucocorticosteroids in relation to HRT-SE, although there is evidence that under- or over-production of glucocorticosteroids interfere with the normal development of the brain (21). While we did find sex-specific evidence of an effect, their clinical relevance is questionable.

Our findings should be interpreted in light of the following limitations and strengths. Limitations include the cross-sectional design of the present study. Importantly, the non-persistent EDCs were measured in a pool of night and morning urine samples before the clinical visit, to represent exposure over the previous day, whereas the glucocorticosteroids were measured in the night urine sample. Although we included a wide range of confounders there is the possibility, as with other observational studies, of residual confounding, which might lead to a bias away from the null. Some of the confounders indicated in the adjustment sets had to be removed due to large fractions of missing values. There is further the possibility of misspecification of the outcome model, although we included a spline of the exposure to relax some of the linearity assumptions. The use of more data-adaptive learners was excluded due to the relatively

small sample size. We finally acknowledge the possibility that some of chemicals might not act independently (mixture effect). Further research is thus warranted.

Strengths of the present study include the use of pooled urine samples for chemical assessment, since it is known that these specific EDCs have very short half-lives (50,51). We decided to model both the *treatment* mechanisms, for the estimation of balancing weights, and the outcomes, with traditional covariates adjustment, to try to obtain doubly robust effect estimates. Finally, we decided not to interpret our results by focusing on the estimated coefficients of the regression models, but by making use of the g-computation procedure and estimate MCs.

In conclusion, in a study of 1,297 children from 6 European birth cohorts, we observed that (i) exposure to non-persistent EDCs in childhood might have short-term effects on HRT-SE in childhood, (ii) exposure to non-persistent EDCs in childhood might disrupt the HPA axis in childhood, and (iii) disruption of the HPA axis in childhood might have short-term, sex-specific effects on HRT-SE. Future studies should investigate how glucocorticosteroids might mediate the adverse effects of exposure to EDCs on childhood neurodevelopment in larger populations.

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4 Tables for descriptive data

$_{402}$ 4.1 Study populations

Table 1: Participant characteristics (HELIX subcohort; 2013-2016).

Characteristic	$\mathbf{N}=1,297^{a}$	
Age (years)	8.1 (6.5, 8.9)	
Child breastfeeding	1,093.0 (84.7%)	
Unknown	6	
Child ethnicity		
Caucasian	1,157.0 (90.0%)	
Pakistani	80.0 (6.2%)	
Asian	$21.0\ (1.6\%)$	
Other	$19.0\ (1.5\%)$	
African	7.0~(0.5%)	
Native American	2.0~(0.2%)	
White non European	0.0~(0.0%)	
Unknown	11	
Child neuropsychological diagnosis	$95.0\ (7.3\%)$	
Cohort	` ,	
MOBA	272.0 (21.0%)	
INMA	$221.0\ (17.0\%)$	
BIB	$204.0\ (15.7\%)$	
KANC	$203.0\ (15.7\%)$	
RHEA	$199.0\ (15.3\%)$	
EDEN	$198.0\ (15.3\%)$	
Creatinine night sample (g/l)	$1.7\ (0.9,\ 3.0)$	
Unknown	321	
Date of test (season)		
Spring	$358.0\ (27.7\%)$	
Winter	$339.0\ (26.2\%)$	
Autumn	300.0 (23.2%)	
Summer	297.0 (23.0%)	
Unknown	$\stackrel{\cdot}{3}$	
Family affluence scale		
6	410.0 (31.7%)	
5	325.0 (25.1%)	
7	248.0 (19.2%)	
4	174.0 (13.4%)	
3	92.0 (7.1%)	
2	28.0 (2.2%)	
1	12.0 (0.9%)	
0	6.0~(0.5%)	

Unknown	2
Fast food/take away (times/week)	$0.1\ (0.1,\ 0.5)$
Unknown	7
Fasting time (hours)	3.3(2.8, 4.0)
Financial situation	, , ,
Doing alright	414.0 (32.1%)
Living comfortably	412.0 (31.9%)
Getting by	331.0 (25.6%)
Finding it quite difficult	86.0 (6.7%)
Finding it very difficult	40.0 (3.1%)
Does not wish to answer	8.0 (0.6%)
Unknown	6
Fish and seafood (times/week)	$2.0\ (1.1,\ 3.5)$
Unknown	5
Fruits (times/week)	9.0 (5.9, 18.0)
Unknown	7
Head circumference (cm)	51.8 (50.6, 52.9)
Unknown	3
Height (m)	1.3 (1.2, 1.4)
Marital status	$1.9\ (1.2,\ 1.4)$
Living with the father	1,212.0 (94.5%)
	,
Living alone	39.0 (3.0%)
Other situation	31.0 (2.4%)
Unknown	15
Mood before assessment	1 222 0 (05 107)
Usual	1,232.0 (95.1%)
Not usual	64.0 (4.9%)
Unknown	1
Organic food (times/week)	$0.5 \ (0.0, \ 3.0)$
Unknown	7
Pregnancy maternal active smoking	190.0 (15.1%)
Unknown	40
Pregnancy maternal passive smoking	514.0 (40.3%)
Unknown	21
Rest before assessment	
Yes	1,209.0 (93.3%)
Not as well as usual	87.0 (6.7%)
Unknown	1
Sex	
Male	710.0 (54.7%)
Female	587.0 (45.3%)
Tobacco consumption	
Non-smoker and has never smoked	$681.0 \ (52.6\%)$
Daily smoker	$200.0 \ (15.5\%)$
Non-smoker but previously smoked daily	$186.0 \ (14.4\%)$

Non-smoker but previously smoked although not daily	$163.0\ (12.6\%)$
Smoker but not daily	$64.0 \ (4.9\%)$
Unknown	3
Vegetables (times/week)	6.5 (4.0, 10.0)
Unknown	6
Weight (kg)	$26.9\ (22.9,\ 32.6)$
hs_creatinine_cg	1.0 (0.8, 1.2)
hs_hitrtse	$299.6\ (231.3,\ 368.2)$
Unknown	18

 $^{^{}a}$ n (%); Median (IQR)

4.2 Endocrine disruptors

Table 2: Participants endocrine disruptors concentrations expressed in $\mu {\rm grams/L}$ (HELIX subcohort; 2013-2016).

Characteristic	$ m N=1,\!297^{\it a}$	
OP pesticide metabolites		
DEP	1.8 (0.4, 4.6); 2.0 (0.2)	
DETP	$0.1\ (0.1,\ 1.7);\ 21.0\ (1.6)$	
DMP	0.4 (0.3, 4.6); 6.0 (0.5)	
DMTP	2.8 (1.2, 6.3); 1.0 (0.1)	
Phenols		
BPA	3.8 (2.3, 7.0); 12.0 (0.9)	
BUPA	$0.1\ (0.0,\ 0.1);\ 5.0\ (0.4)$	
ETPA	0.7 (0.4, 1.2); 3.0 (0.2)	
MEPA	6.3 (3.1, 24.1); 2.0 (0.2)	
OXBE	$2.0 \ (0.8, 6.6); \ 0.0 \ (0.0)$	
PRPA	0.2 (0.0, 1.6); 17.0 (1.3)	
TRCS	0.6 (0.3, 1.5); 0.0 (0.0)	
Phthalate metab	olites	
MBzP	4.8 (2.7, 8.7); 1.0 (0.1)	
MECPP	32.8 (19.9, 57.6); 1.0 (0.1)	
MEHHP	$19.3\ (11.4,\ 33.1);\ 3.0\ (0.2)$	
MEHP	2.8 (1.6, 5.1); 41.0 (3.2)	
MEOHP	12.2 (7.1, 20.4); 1.0 (0.1)	
MEP	32.5 (15.0, 79.2); 0.0 (0.0)	
MiBP	$40.2\ (24.5,\ 71.1);\ 0.0\ (0.0)$	
MnBP	$22.7\ (14.5,\ 38.8);\ 0.0\ (0.0)$	
oh-MiNP	5.0 (3.1, 9.3); 0.0 (0.0)	

^aMedian (IQR); N missing (% missing)

4.3 Glucocorticosteroids

Table 3: Participants derived glucocorticosteroids concentrations expressed in ng/ml (HELIX subcohort; 2013-2016).

Characteristic	$ m N=1,\!004^{\it a}$	$\mathbf{N}=976^{a,b}$
cortisol production	4,607.9 (2,860.5, 6,787.6); 18.0 (1.8)	4,559.5 (2,834.5, 6,731.7); 17.0 (1.7)
cortisone production	4,608.1 (2,920.8, 6,843.9); 19.0 (1.9)	4,580.7 (2,899.3, 6,800.5); 18.0 (1.8)
corticosterone production	257.8 (157.9, 410.5); 3.0 (0.3)	256.7 (157.5, 409.7); 3.0 (0.3)

 $[^]a$ Median (IQR); N missing (% missing)

5 Tables for other analyses

5.1 Marginal hypotheses for effect modification

Table 4: Pairwise differences between sex-specific marginal contrasts for the effect of a decrease from the 90th to the 10th percentile of EDCs on HRT-SE, expressed in ms, and the glucocorticosteroids, expressed in ng/ml (HELIX subcohort; 2013-2016).

	$\mathrm{HRT} ext{-}\mathrm{SE}^a$	corticosterone production a	cortisol production a	cortisone producti
OP pesticid	le metabolites			
DEP	0.019 (-0.022, 0.061)	-0.082 (-0.276, 0.113)	-0.139 (-0.374, 0.096)	-0.104 (-0.312, 0.1
DETP	0.025 (-0.054, 0.104)	-0.16 (-0.332, 0.011)	-0.071 (-0.264, 0.123)	-0.097 (-0.269, 0.0
DMP	-0.034 (-0.093, 0.025)	$0.007 \ (-0.217, \ 0.231)$	-0.031 (-0.119, 0.057)	-0.069 (-0.207, 0.0
DMTP	0.005 (-0.095, 0.106)	-0.014 (-0.165, 0.137)	-0.21 (-0.326, -0.094)	-0.166 (-0.353, 0.0
Phenols				
BPA	0.032 (-0.026, 0.09)	-0.153 (-0.291, -0.015)	-0.125 (-0.269, 0.018)	-0.085 (-0.216, 0.0
BUPA	-0.022 (-0.067, 0.024)	-0.117 (-0.247, 0.012)	-0.129 (-0.209, -0.048)	-0.013 (-0.112, 0.0
ETPA	0.012 (-0.021, 0.045)	-0.254 (-0.416, -0.092)	-0.184 (-0.39, 0.022)	-0.219 (-0.472, 0.0
MEPA	-0.001 (-0.061, 0.058)	-0.129 (-0.271, 0.013)	-0.127 (-0.258, 0.004)	-0.144 (-0.257, -0.
OXBE	0.032 (0.004, 0.061)	-0.213 (-0.486, 0.059)	-0.077 (-0.306, 0.153)	-0.064 (-0.274, 0.1
PRPA	0.015 (-0.045, 0.074)	-0.12 (-0.262, 0.022)	-0.043 (-0.238, 0.151)	-0.102 (-0.223, 0.0
TRCS	-0.017 (-0.076, 0.042)	-0.142 (-0.251, -0.034)	-0.13 (-0.248, -0.012)	-0.152 (-0.207, -0.0

 $^{^{}b}$ Measurements available for the HELIX subcohort.

Phthalate metabolites

MBzP	-0.066 (-0.126, -0.007)	-0.026 (-0.098, 0.047)	-0.018 (-0.143, 0.108)	-0.079 (-0.174, 0.0
MECPP	0.008 (-0.076, 0.092)	-0.014 (-0.165, 0.136)	-0.043 (-0.084, -0.002)	0.017 (-0.055, 0.0
MEHHP	0.028 (-0.075, 0.131)	-0.052 (-0.264, 0.161)	-0.091 (-0.208, 0.026)	-0.006 (-0.087, 0.0
MEHP	0.017 (-0.082, 0.115)	-0.165 (-0.259, -0.071)	-0.221 (-0.289, -0.153)	-0.177 (-0.298, -0.0
MEOHP	0.02 (-0.068, 0.107)	-0.061 (-0.232, 0.111)	-0.075 (-0.157, 0.006)	0.009 (-0.063, 0.0
MEP	-0.053 (-0.138, 0.033)	-0.05 (-0.408, 0.308)	-0.083 (-0.384, 0.218)	-0.119 (-0.338, 0.
MiBP	-0.02 (-0.138, 0.098)	0.037 (-0.175, 0.249)	-0.041 (-0.267, 0.184)	-0.021 (-0.162, 0.1
MnBP	-0.035 (-0.11, 0.041)	$0.029 \ (-0.186, \ 0.243)$	0.063 (-0.134, 0.26)	0.017 (-0.076, 0.1
oh-MiNP	0.046 (-0.009, 0.102)	-0.127 (-0.335, 0.08)	-0.181 (-0.33, -0.033)	-0.164 (-0.304, -0.0
oxo-MiNP	-0.026 (-0.059, 0.008)	-0.12 (-0.315, 0.076)	-0.146 (-0.303, 0.011)	-0.127 (-0.238, -0.0

^aEstimate and 95% CI.

Table 5: Pairwise differences between sex-specific marginal contrasts for the effect of a decrease from the 90th to the 10th percentile of the glucocorticosteroids on HRT-SE expressed in ms (HELIX subcohort; 2013-2016).

	$\mathrm{HRT} ext{-}\mathrm{SE}^a$
Glucocorticosteroids	
corticosterone production cortisol production cortisone production	0.126 (0.009, 0.243) 0.097 (-0.045, 0.238) 0.14 (0.019, 0.261)

 $[^]a\mathrm{Estimate}$ and 95% CI.

- $_{\scriptscriptstyle 412}$ 6 Figures for main results
- 413 6.1 Marginal contrasts

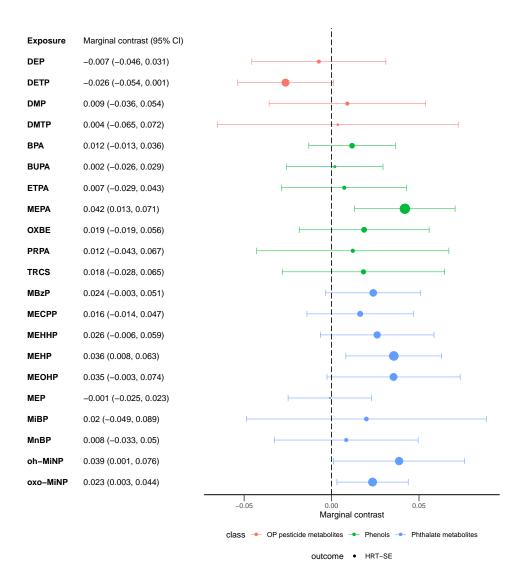


Figure 1: Marginal contrasts for the effect of a decrease from the 90th to the 10th percentile of the EDCs on HRT-SE expressed in ms (HELIX subcohort; 2013-2016). Circles indicate effect estimates. Solid lines indicate the 95% CI.

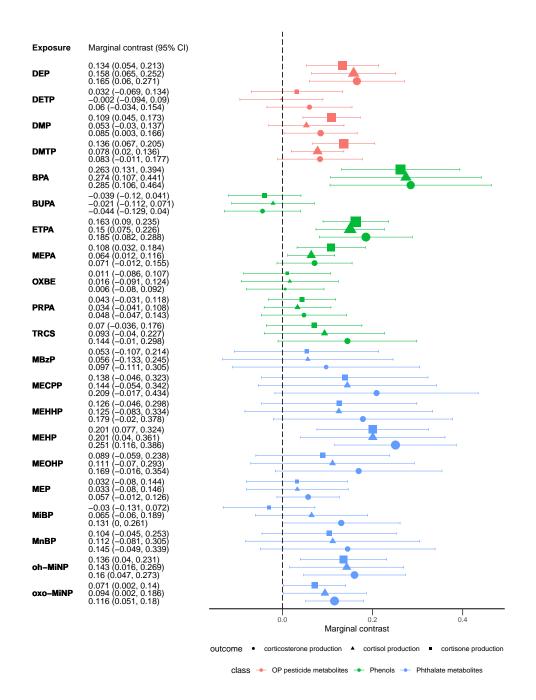


Figure 2: Marginal contrasts for the effect of a decrease from the 90th to the 10th percentile of the EDCs on the glucocorticosteroids expressed in ng/ml (HELIX subcohort; 2013-2016). Circles, triangles, and squares indicate effect estimates. Solid lines indicate the 95% CI.

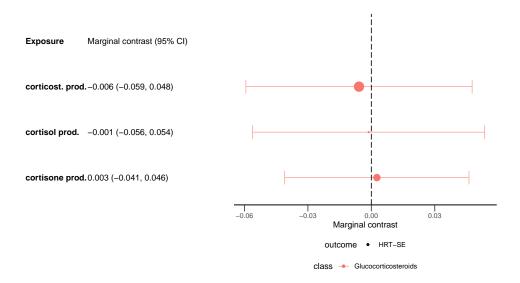


Figure 3: Marginal contrasts for the effect of a decrease from the 90th to the 10th percentile of the glucocorticosteroids on HRT-SE expressed in ms (HELIX subcohort; 2013-2016). Circles indicate effect estimates. Solid lines indicate the 95% CI. Abbreviations: cortisone production (cortisone prod.); cortisol production (cortisol prod.); corticost. prod. (corticosterone production).

⁴ 7 Supplementary information

7.1 Directed Acyclic Graphs

```
dag {
417 age_child
418 biomarker
419 breastfeeding
420 bw
421 characteristics_child
422 chemical [exposure]
423 child_diet
424 child_smoking
425 cohort
426 creatinine
427 envFactors_visit
428 ethnicity_child
429 ethnicity_mother
430 familySEP
431 gestational_age
432 maternalAlcohol_preg
433 maternalDiet_preg
434 maternalSEP_preg
435 maternalSmoking_preg
436 neuropsychologicalDiagnosis_child
437 outcome [outcome]
438 paternalSEP_preg
439 season_visit
440 sex_child
   time_lastMeal
   type_sample
443 age_child -> biomarker
444 age_child -> characteristics_child
   age_child -> creatinine
   age_child -> outcome
   age_child -> type_sample
   biomarker -> outcome
   breastfeeding -> neuropsychologicalDiagnosis_child
_{450} breastfeeding -> outcome
bw -> characteristics_child
bw -> neuropsychologicalDiagnosis_child
453 characteristics_child -> biomarker
454 characteristics child -> chemical
455 characteristics_child -> creatinine
456 characteristics_child -> outcome
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```
chemical -> biomarker
   chemical -> outcome
459 child_diet -> biomarker
460 child_diet -> characteristics_child
461 child_diet -> chemical
   child_diet -> outcome
   child_smoking -> biomarker
   child_smoking -> characteristics_child
   child_smoking -> creatinine
466 child_smoking -> outcome
467 cohort -> biomarker
468 cohort -> bw
469 cohort -> characteristics_child
470 cohort -> chemical
471 cohort -> child_diet
472 cohort -> creatinine
473 cohort -> outcome
474 creatinine -> biomarker
475 creatinine -> chemical
476 creatinine -> outcome
477 envFactors_visit -> outcome
   ethnicity_child -> biomarker
   ethnicity_child -> bw
   ethnicity_child -> characteristics_child
   ethnicity_child -> chemical
   ethnicity_child -> child_diet
483 ethnicity_child -> child_smoking
484 ethnicity_child -> creatinine
ethnicity_child -> neuropsychologicalDiagnosis_child
486 ethnicity_child -> outcome
487 ethnicity_mother -> biomarker
488 ethnicity_mother -> breastfeeding
489 ethnicity_mother -> bw
490 ethnicity_mother -> characteristics_child
491 ethnicity_mother -> child_diet
  ethnicity_mother -> familySEP
   ethnicity_mother -> maternalAlcohol_preg
   ethnicity_mother -> maternalDiet_preg
   ethnicity_mother -> maternalSEP_preg
   ethnicity_mother -> maternalSmoking_preg
   ethnicity_mother -> neuropsychologicalDiagnosis_child
498 ethnicity_mother -> outcome
499 familySEP -> biomarker
500 familySEP -> characteristics_child
_{501} familySEP -> chemical
```

```
502 familySEP -> child_diet
503 familySEP -> child_smoking
504 familySEP -> creatinine
505 familySEP -> outcome
506 gestational_age -> bw
   gestational_age -> characteristics_child
   gestational_age -> neuropsychologicalDiagnosis_child
   maternalAlcohol_preg -> bw
   maternalAlcohol_preg -> characteristics_child
511 maternalAlcohol_preg -> neuropsychologicalDiagnosis_child
_{512} maternalAlcohol_preg -> outcome
513 maternalDiet_preg -> characteristics_child
514 maternalDiet_preg -> neuropsychologicalDiagnosis_child
515 maternalDiet_preg -> outcome
_{516} maternalSEP_preg -> breastfeeding
517 maternalSEP_preg -> bw
518 maternalSEP_preg -> characteristics_child
519 maternalSEP_preg -> familySEP
520 maternalSEP_preg -> maternalAlcohol_preg
   maternalSEP_preg -> maternalDiet_preg
521
   maternalSEP_preg -> maternalSmoking_preg
522
   maternalSEP_preg -> neuropsychologicalDiagnosis_child
   maternalSEP_preg -> outcome
   maternalSmoking_preg -> bw
526 maternalSmoking_preg -> characteristics_child
527 maternalSmoking_preg -> neuropsychologicalDiagnosis_child
528 maternalSmoking_preg -> outcome
529 neuropsychologicalDiagnosis child -> outcome
_{530} paternalSEP_preg -> breastfeeding
   paternalSEP_preg -> bw
   paternalSEP_preg -> characteristics_child
533 paternalSEP_preg -> familySEP
paternalSEP_preg -> maternalAlcohol_preg
paternalSEP_preg -> maternalDiet_preg
536 paternalSEP_preg -> maternalSmoking_preg
paternalSEP_preg -> neuropsychologicalDiagnosis_child
   paternalSEP_preg -> outcome
   season_visit -> biomarker
   season_visit -> chemical
541 sex_child -> biomarker
542 sex_child -> characteristics_child
sex_child -> chemical
544 sex_child -> child_diet
sex_child -> child_smoking
sex_child -> creatinine
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sex_child -> neuropsychologicalDiagnosis_child
_{548} sex_child -> outcome
sex_child -> type_sample
550 time_lastMeal -> biomarker
551 time_lastMeal -> chemical
552 type_sample -> chemical
   type_sample -> creatinine
554
555 dag {
556 age_child
557 biomarker [outcome]
558 breastfeeding
559 bw
560 characteristics_child
561 chemical [exposure]
562 child_diet
563 child_smoking
564 cohort
565 creatinine
566 envFactors_visit
567 ethnicity_child
568 ethnicity_mother
569 familySEP
570 gestational_age
571 maternalAlcohol_preg
572 maternalDiet_preg
573 maternalSEP_preg
574 maternalSmoking_preg
575 neuropsychologicalDiagnosis_child
   outcome
577 paternalSEP_preg
578 season_visit
579 sex_child
580 time_lastMeal
581 type_sample
582 age_child -> biomarker
583 age_child -> characteristics_child
584 age_child -> creatinine
sss age_child -> outcome
586 age_child -> type_sample
587 biomarker -> outcome
588 breastfeeding -> neuropsychologicalDiagnosis_child
589 breastfeeding -> outcome
590 bw -> characteristics_child
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591 bw -> neuropsychologicalDiagnosis_child
  characteristics_child -> biomarker
593 characteristics_child -> chemical
   characteristics_child -> creatinine
   characteristics_child -> outcome
   chemical -> biomarker
   chemical -> outcome
   child_diet -> biomarker
   child_diet -> characteristics_child
600 child_diet -> chemical
601 child_diet -> outcome
602 child_smoking -> biomarker
603 child_smoking -> characteristics_child
   child_smoking -> creatinine
   child_smoking -> outcome
606 cohort -> biomarker
607 cohort -> bw
608 cohort -> characteristics_child
609 cohort -> chemical
610 cohort -> child_diet
611 cohort -> creatinine
612 cohort -> outcome
   creatinine -> biomarker
614 creatinine -> chemical
615 creatinine -> outcome
envFactors_visit -> outcome
ethnicity_child -> biomarker
618 ethnicity child -> bw
619 ethnicity_child -> characteristics_child
620 ethnicity_child -> chemical
621 ethnicity_child -> child_diet
ethnicity_child -> child_smoking
623 ethnicity_child -> creatinine
ethnicity_child -> neuropsychologicalDiagnosis_child
ethnicity_child -> outcome
626 ethnicity_mother -> biomarker
   ethnicity_mother -> breastfeeding
   ethnicity_mother -> bw
   ethnicity_mother -> characteristics_child
   ethnicity_mother -> child_diet
   ethnicity_mother -> familySEP
   ethnicity_mother -> maternalAlcohol_preg
  ethnicity_mother -> maternalDiet_preg
634 ethnicity_mother -> maternalSEP_preg
635 ethnicity_mother -> maternalSmoking_preg
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ethnicity_mother -> neuropsychologicalDiagnosis_child
637 ethnicity_mother -> outcome
638 familySEP -> biomarker
639 familySEP -> characteristics_child
640 familySEP -> chemical
641 familySEP -> child_diet
   familySEP -> child_smoking
   familySEP -> creatinine
644 familySEP -> outcome
645 gestational_age -> bw
   gestational_age -> characteristics_child
647 gestational_age -> neuropsychologicalDiagnosis_child
648 maternalAlcohol_preg -> bw
649 maternalAlcohol_preg -> characteristics_child
maternalAlcohol_preg -> neuropsychologicalDiagnosis_child
651 maternalAlcohol_preg -> outcome
652 maternalDiet_preg -> characteristics_child
maternalDiet_preg -> neuropsychologicalDiagnosis_child
654 maternalDiet_preg -> outcome
   maternalSEP_preg -> breastfeeding
   maternalSEP_preg -> bw
   maternalSEP_preg -> characteristics_child
   maternalSEP_preg -> familySEP
   maternalSEP_preg -> maternalAlcohol_preg
   maternalSEP_preg -> maternalDiet_preg
   maternalSEP_preg -> maternalSmoking_preg
662 maternalSEP_preg -> neuropsychologicalDiagnosis_child
663 maternalSEP_preg -> outcome
664 maternalSmoking_preg -> bw
665 maternalSmoking_preg -> characteristics_child
maternalSmoking_preg -> neuropsychologicalDiagnosis_child
667 maternalSmoking_preg -> outcome
neuropsychologicalDiagnosis_child -> outcome
669 paternalSEP_preg -> breastfeeding
670 paternalSEP_preg -> bw
paternalSEP_preg -> characteristics_child
   paternalSEP_preg -> familySEP
   paternalSEP_preg -> maternalAlcohol_preg
   paternalSEP_preg -> maternalDiet_preg
   paternalSEP_preg -> maternalSmoking_preg
   paternalSEP_preg -> neuropsychologicalDiagnosis_child
or paternalSEP_preg -> outcome
678 season_visit -> biomarker
679 season_visit -> chemical
680 sex_child -> biomarker
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681 sex_child -> characteristics_child
682 sex_child -> chemical
683 sex_child -> child_diet
sex_child -> child_smoking
sex_child -> creatinine
686 sex_child -> neuropsychologicalDiagnosis_child
   sex_child -> outcome
   sex_child -> type_sample
   time_lastMeal -> biomarker
690 time_lastMeal -> chemical
691 type_sample -> chemical
   type_sample -> creatinine
693 }
694 dag {
695 age_child
696 biomarker [exposure]
697 breastfeeding
698 bw
699 characteristics_child
700 chemical
701 child_diet
702 child_smoking
703 cohort
704 creatinine
705 envFactors_visit
706 ethnicity_child
707 ethnicity_mother
708 familySEP
709 gestational_age
710 maternalAlcohol_preg
711 maternalDiet_preg
712 maternalSEP_preg
713 maternalSmoking_preg
714 neuropsychologicalDiagnosis_child
715 outcome [outcome]
716 paternalSEP_preg
717 season_visit
718 sex_child
719 time_lastMeal
720 type_sample
721 age_child -> biomarker
722 age_child -> characteristics_child
723 age_child -> creatinine
724 age_child -> outcome
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725 age_child -> type_sample
726 biomarker -> outcome
preastfeeding -> neuropsychologicalDiagnosis_child
728 breastfeeding -> outcome
729 bw -> characteristics child
730 bw -> neuropsychologicalDiagnosis_child
   characteristics_child -> biomarker
   characteristics_child -> chemical
   characteristics_child -> creatinine
734 characteristics_child -> outcome
735 chemical -> biomarker
736 chemical -> outcome
737 child_diet -> biomarker
738 child_diet -> characteristics_child
739 child_diet -> chemical
740 child diet -> outcome
r41 child_smoking -> biomarker
742 child_smoking -> characteristics_child
743 child_smoking -> creatinine
744 child_smoking -> outcome
745 cohort -> biomarker
746 cohort -> bw
   cohort -> characteristics_child
_{748} cohort -> chemical
749 cohort -> child_diet
750 cohort -> creatinine
751 cohort -> outcome
752 creatinine -> biomarker
753 creatinine -> chemical
754 creatinine -> outcome
755 envFactors_visit -> outcome
756 ethnicity_child -> biomarker
757 ethnicity_child -> bw
758 ethnicity_child -> characteristics_child
759 ethnicity_child -> chemical
760 ethnicity_child -> child_diet
   ethnicity_child -> child_smoking
   ethnicity_child -> creatinine
   ethnicity_child -> neuropsychologicalDiagnosis_child
   ethnicity_child -> outcome
   ethnicity_mother -> biomarker
766 ethnicity_mother -> breastfeeding
767 ethnicity_mother -> bw
768 ethnicity_mother -> characteristics_child
769 ethnicity_mother -> child_diet
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ethnicity_mother -> familySEP
   ethnicity_mother -> maternalAlcohol_preg
772 ethnicity_mother -> maternalDiet_preg
  ethnicity_mother -> maternalSEP_preg
   ethnicity_mother -> maternalSmoking_preg
   ethnicity_mother -> neuropsychologicalDiagnosis_child
   ethnicity_mother -> outcome
   familySEP -> biomarker
778 familySEP -> characteristics_child
779 familySEP -> chemical
780 familySEP -> child_diet
781 familySEP -> child_smoking
782 familySEP -> creatinine
783 familySEP -> outcome
   gestational_age -> bw
   gestational_age -> characteristics_child
786 gestational_age -> neuropsychologicalDiagnosis_child
787 maternalAlcohol_preg -> bw
788 maternalAlcohol_preg -> characteristics_child
   maternalAlcohol_preg -> neuropsychologicalDiagnosis_child
   maternalAlcohol_preg -> outcome
   maternalDiet_preg -> characteristics_child
   maternalDiet_preg -> neuropsychologicalDiagnosis_child
   maternalDiet_preg -> outcome
   maternalSEP_preg -> breastfeeding
  maternalSEP_preg -> bw
796 maternalSEP_preg -> characteristics_child
797 maternalSEP_preg -> familySEP
798 maternalSEP_preg -> maternalAlcohol_preg
799 maternalSEP_preg -> maternalDiet_preg
800 maternalSEP_preg -> maternalSmoking_preg
maternalSEP_preg -> neuropsychologicalDiagnosis_child
802 maternalSEP_preg -> outcome
803 maternalSmoking_preg -> bw
804 maternalSmoking_preg -> characteristics_child
  maternalSmoking_preg -> neuropsychologicalDiagnosis_child
   maternalSmoking_preg -> outcome
   neuropsychologicalDiagnosis_child -> outcome
   paternalSEP_preg -> breastfeeding
   paternalSEP_preg -> bw
   paternalSEP_preg -> characteristics_child
   paternalSEP_preg -> familySEP
   paternalSEP_preg -> maternalAlcohol_preg
   paternalSEP_preg -> maternalDiet_preg
   paternalSEP_preg -> maternalSmoking_preg
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paternalSEP_preg -> neuropsychologicalDiagnosis_child
   paternalSEP_preg -> outcome
   season_visit -> biomarker
   season_visit -> chemical
   sex_child -> biomarker
819
   sex_child -> characteristics_child
   sex_child -> chemical
   sex_child -> child_diet
822
   sex_child -> child_smoking
823
   sex_child -> creatinine
   sex_child -> neuropsychologicalDiagnosis_child
   sex_child -> outcome
   sex_child -> type_sample
   time_lastMeal -> biomarker
   time_lastMeal -> chemical
   type_sample -> chemical
   type_sample -> creatinine
```

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- 9.1.3 Description of glucocorticosteroids
- 9.2 Figures for other results
- 9.2.1 Marginal contrasts for effect modification

Compound	Symbol	Variable name	PubChem CID	Parental compoun
OP pesticide metabolites				
diethyl dithiophosphate	DEDTP	dedtp	9274	
diethyl phosphate	DEP	dep	654	
diethyl thiophosphate	DETP	$\det p$	3683036	
dimethyl dithiophosphate	DMDTP	dmdtp		
dimethyl phosphate	DMP	dmp	13134	
dimethyl thiophosphate	DMTP	dmtp	168140	
Phenols				
bisphenol A	BPA	bpa	6623	
n-butyl-paraben	BUPA	bupa	7184	
ethyl-paraben	ETPA	etpa	8434	
methyl-paraben	MEPA	mepa	7456	
oxybenzone	OXBE	oxbe	4632	
propyl-paraben	PRPA	prpa	7175	
triclosan	TRCS	trcs	5564	
Phthalate metabolites				
mono benzyl phthalate	MBzP	mbzp	31736	BBzP
mono-2-ethyl 5-carboxypentyl phthalate	MECPP	mecpp	148386	DEHP
mono-2-ethyl-5-hydroxyhexyl phthalate	MEHHP	mehhp	170295	DEHP
mono-2-ethylhexyl phthalate	MEHP	mehp	21924291	DEHP
mono-2-ethyl-5-oxohexyl phthalate	MEOHP	meohp	119096	DEHP
monoethyl phthalate	MEP	mep	75318	DEP
mono-iso-butyl phthalate	MiBP	mibp	92272	DiBP
mono-n-butyl phthalate	MnBP	mnbp	8575	DnBP
mono-4-methyl-7-hydroxyoctyl phthalate	oh-MiNP	ohminp	102401880	MiNP
mono-4-methyl-7-oxooctyl phthalate	oxo-MiNP	oxominp	102401881	MiNP

Table S1: Information about non-persistent EDCs, including the full compound name, the standard symbol, the used variable name, the identifier from PubChem, and the parental compound.

Metabolite	Symbol	HMDB ID	CAS number
Androgen			
Androsternedione	AED	HMDB0000053	63-05-8
Testosterone	T	${\rm HMDB0000234}$	58-22-0
Androgen metabolite			
Androsterone	Andros	HMDB0000031	53-41-8
Etiocholanolone	Etio	${\rm HMDB0000490}$	53-42-9
Glucocorticosteroid			
11-dehydrocorticosterone	A	HMDB0004029	72-23-1
Corticosterone	В	HMDB0001547	50-22-6
Cortisol	F	HMDB0000063	50-23-7
Cortisone	E	HMDB0002802	53-06-5
Glucocorticosteroid metabol	ite		
11 -hydroxyandrosterone	110HAndros	HMDB0002984	57-61-4
17-deoxycortolone	17-DO-cortolone	NA	NA
20 -dihydrocortisol	20aDHF	NA	NA
20 -dihydrocortisone	20aDHE	NA	NA
20 -dihydrocortisol	20bDHF	NA	NA
20 -dihydrocortisone	20bDHE	NA	NA
5 ,20 -cortol	5a20acortol	HMDB0003180	516-38-1
5 ,20 -cortol	5a20bcortol	HMDB0005821	667-65-2
5 -tetrahydrocorticosterone	5aTHB	HMDB0000449	600-63-5
5 -tetrahydrocortisol	5aTHF	HMDB0000526	302-91-0
5 -tetrahydrocortisone	5aTHE	NA	NA
5 ,20 -cortol	5b20acortol	HMDB0003180	516-38-1
5,20 -cortolone	5b20acortolone	HMDB0003128	516-42-7
5 ,20 -cortol	5b20bcortol	HMDB0005821	667-65-2
5,20 -cortolone	5b20bcortolone	NA	NA
5 -dihydrocortisol	5bDHF	HMDB0003259	1482-50-4
5 -tetrahydrocorticosterone	5bTHB	HMDB0000268	68-42-8
5 -tetrahydrocortisol	5bTHF	HMDB0000949	1953-02-01
5 -tetrahydrocortisone	5bTHE	NA	NA
6 -hydroxycortisol	6OHF	HMDB0247074	1111
6 -hydroxycortisone	6OHE	NA	NA
Glucocorticosteroid precurso			
17-hydroxyprogesterone	17OHP	HMDB0000374	68-96-2
Cortexolone	S	HMDB0000015	152-58-9
Deoxycorticosterone	DOC	HMDB0000016	64-85-7
Glucocorticosteroid precurso	or metabolite		
17-hydroxypregnanolone	17HP	HMDB0000363	387-79-1
5 -dihydrocortexolone	5bDHS	NA	NA
5 -tetrahydrocortexolone	5bTHS	NA NA	NA NA
	PT 38	NA NA	NA 1098-45-9
Pregnantriol Tetrahydragartavalana	r ı		
Tetrahydrocortexolone	THS	HMDB0005972	68-60-0

Abbreviations: Human Metabolome Database (HMDB); Chemical Abstracts Service (CAS).

Table S2: Information about the glucocorticosteroids, including the full metabolite name, the standard symbol, the identifier from the HMDB, and the CAS number.

creatinine hs_creatinine_cg numerical Creatinine pooled sample envFactors_visit hs_mood categorical kest before assessment 1,2 hs_rest_nth categorical categorical categorical line line		type	description	coding
breastfeeding bs_bf	age_child			
hs_bf	hs_age_years	numerical	Age	
characteristics_child hs_c_height hs_c_weight hs_c_weight hs_head_circ mumerical hs_head_circ hild_diet hs_fastfood hs_ford_food mumerical hs_total_finits hs_total_finits hs_total_finits hs_total_weg hild_smoking hs_total_weg child_smoking hs_total_weg hs_total_weg hs_total_weg hild_smoking hs_total_weg	breastfeeding			
Beautiful	hs_bf	categorical	Child breastfeeding	0,1
hs_c_weight hs_head_circ numerical head circumference child_diet hs_fastfood numerical hs_total_fish numerical hs_total_fish numerical hs_total_fish numerical hs_total_fish numerical hs_total_fish numerical hs_total_veg numerical chs_total_veg numerical object to the fish and seafood Fruits bs_tob categorical Tobacco consumption 1,2,3,4,5 cohort cohort character Cohort SAB,EDEN,BIB,RHE. creatinine hs_creatinine_cg numerical environments of the fish and seafood fruits hs_mood hs_reatinine_cg numerical environments of the fish and the fish in the	characteristics_child			
hs head circ numerical Head circumference child_diet	hs_c_height	numerical	Height	
child_diet hs_fastfood numerical hs_total_fish numerical hs_total_fish numerical hs_total_fruits numerical hs_total_fruits numerical hs_total_fruits numerical hs_total_veg numerical cohort character Cohort SAB_EDEN_BIB_RHE_creatinine hs_creatinine cg numerical hs_rest_uhh categorical categorical Creatinine pooled sample numerical hs_rest_uhh categorical categorical categorical Mood before assessment 1,2 1,			~	
hs_fastfood hs_org_food numerical hs_total_fish numerical hs_total_fish numerical bs_total_fish numerical hs_total_fish numerical bs_total_fish numerical bs_total_fruits numerical hs_total_veg numerical bs_total_veg numerical bs_total_veg numerical bs_total_veg numerical bs_total_veg numerical bs_total_veg numerical child_smoking hs_tob		numerical	Head circumference	
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h_legume_preg numerical Legume consumption during pregnancy numerical numerical Meat consumption during pregnancy numerical Vegetables consumption during pregnancy 0,1,2 e3_edum categorical Maternal education 0,1,2 e3_marital categorical Socioeconomic status of the parents 1,2,3 numerical vegetables consumption during pregnancy 0,1,2 e3_edum 0,1,2 e3_edum vegetables consumption during pregnancy 0,1,2 e3_edum 0,1,2 e3_edum vegetables consumption during pregnancy 0,1,2 e3_edum vegetables vegeta				
h_meat_preg numerical Meat consumption during pregnancy Vegetables consumption during pregnancy maternalSEP_preg e3_edum categorical Maternal education 0,1,2 e3_marital categorical Marital status 0,1,2 e3_ses categorical Socioeconomic status of the parents 1,2,3 maternalSmoking_preg e3_asmokyn_p categorical Pregnancy maternal active smoking 0,1				
h_veg_preg numerical Vegetables consumption during pregnancy maternalSEP_preg e3_edum categorical Maternal education 0,1,2 e3_marital categorical Marital status 0,1,2 e3_ses categorical Socioeconomic status of the parents 1,2,3 maternalSmoking_preg e3_asmokyn_p categorical Pregnancy maternal active smoking 0,1				
e3_edum categorical Maternal education 0,1,2 e3_marital categorical Marital status 0,1,2 e3_ses categorical Socioeconomic status of the parents 1,2,3 maternalSmoking_preg categorical Pregnancy maternal active smoking 0,1		numerical		
e3_marital categorical Marital status 0,1,2 e3_ses categorical Socioeconomic status of the parents 1,2,3 maternalSmoking_preg e3_asmokyn_p categorical Pregnancy maternal active smoking 0,1	maternalSEP_preg			
e3_marital categorical Marital status 0,1,2 e3_ses categorical Socioeconomic status of the parents 1,2,3 maternalSmoking_preg e3_asmokyn_p categorical Pregnancy maternal active smoking 0,1	e3_edum	categorical	Maternal education	0,1,2
maternalSmoking_preg e3_asmokyn_p categorical Pregnancy maternal active smoking 0,1	e3_marital	categorical		0,1,2
e3_asmokyn_p categorical Pregnancy maternal active smoking 0,1	·——	categorical	Socioeconomic status of the parents	1,2,3
	e3_asmokyn_p	categorical	Pregnancy maternal passive smoking	0,1

	type	description	coding
age_child			-
hs_age_years	numerical	Age	
characteristics_child	•		
hs_c_height hs_c_weight hs_head_circ	numerical numerical numerical	Height Weight Head circumference	
child_diet			
hs_fastfood hs_org_food hs_total_fish hs_total_fruits hs_total_veg	numerical numerical numerical numerical numerical	Fast food/take away Organic food Fish and seafood Fruits Vegetables	
child_smoking			
hs_tob	categorical	Tobacco consumption	1,2,3,4,5
cohort			
cohort	character	Cohort	$SAB,\!EDEN,\!BIB,\!RHEA,\!KANC,\!MOBA$
creatinine			
creatinine_to_helix hs_creatinine_cg	numerical numerical	Creatinine night sample Creatinine pooled sample	
ethnicity_child			
h_ethnicity_c	character	Child ethnicity	1,2,3,4,5,6,7
ethnicity_mother			
h_ethnicity_m	integer	Mother ethnicity	1,2,3,4,5,6,7
familySEP			
FAS_score hs_finance	numerical categorical	Family Affluence Scale Financial situation	1,2,3,4,5,6
season_visit			
hs_date_neu	date	Date of test	
sex_child			
e3_sex	categorical	Sex	0,1
time_lastMeal			
hs_dift_mealblood_imp	numerical	Fasting time	
^a Percentage of confounders	included in the	he models: 95%.	

 $[\]label{thm:prop:section} \begin{tabular}{ll} Table S4: Codebook for the covariates used in the estimation of the marginal comparisons of EDCs on the glucoconticosteroids. \end{tabular}$

	type	description	coding
age_child			
hs_age_years	numerical	Age	
breastfeeding	ı <u> </u>		
hs_bf	categorical	Child breastfeeding	0,1
	categoricai	Clind breastreeding	0,1
characteristics_child			
hs_c_height	numerical	Height	
hs_c_weight hs head circ	numerical numerical	Weight Head circumference	
chemical	numencar	nead circumerence	
	. 1	D: 1 1 A /DDA)	
hs_bpa_c hs_bupa_c	numerical numerical	Bisphenol A (BPA) N-Butyl paraben (BUPA)	
hs_dedtp_cadj	numerical	Diethyl dithiophosphate (DEDTP) adjusted for creatinine	
hs_dep_c	numerical	Diethyl phosphate (DEP)	
hs_detp_c	numerical	Diethyl thiophosphate (DETP)	
hs_dmdtp_craw	numerical	Dimethyl dithiophosphate (DMDTP)	
hs_dmp_c	numerical	Dimethyl phosphate (DMP)	
hs_dmtp_c	numerical	Dimethyl thiophosphate (DMTP)	
hs_etpa_c	numerical	Ethyl paraben (ETPA)	
hs_mbzp_c	numerical	Mono benzyl phthalate (MbzP) Mono-2-ethyl 5-carboxypentyl phthalate (MECPP)	
hs_mecpp_c hs_mehhp_c	numerical numerical	Mono-2-ethyl-5-hydroxyhexyl phthalate (MEHHP)	
hs_mehp_c	numerical	Mono-2-ethylhexyl phthalate (MEHP)	
hs_meohp_c	numerical	Mono-2-ethyl-5-oxohexyl phthalate (MEOHP)	
hs_mep_c	numerical	Monoethyl phthalate (MEP)	
hs_mepa_c	numerical	Methyl paraben (MEPA)	
hs_mibp_c	numerical	Mono-iso-butyl phthalate (MiBP)	
hs_mnbp_c	numerical	Mono-n-butyl phthalate (MnBP)	
hs_ohminp_c	numerical	Mono-4-methyl-7-hydroxyoctyl phthalate (OHMiNP)	
hs_oxbe_c	numerical	Oxybenzone (OXBE)	
hs_oxominp_c hs_prpa_c	numerical numerical	Mono-4-methyl-7-oxooctyl phthalate (OXOMiNP)	
hs_trcs_c	numerical	Propyl paraben (PRPA) Triclosan (TRCS)	
child diet	Trainer roar	THOUSENI (TIVES)	
hs fastfood	numerical	Fast food/take away	
hs_org_food	numerical	Organic food	
hs_org_lood hs total fish	numerical	Fish and seafood	
hs total fruits	numerical	Fruits	
hs_total_veg	numerical	Vegetables	
child_smoking			
hs_tob	categorical	Tobacco consumption	1,2,3,4,5
cohort		41	
cohort	character	Cohort	SAB,EDEN
creatinine			
creatinine_to_helix	numerical	Creatinine night sample	
envFactors_visit			
hs mood	categorical	Mood before assessment	1,2
hs rest nth	categorical	Rest before assessment	1,2 $1,2$
ethnicity_child	703-2002		,
h ethnicity c	character	Child ethnicity	1,2,3,4,5,6,7
ethnicity_mother			, , , -, -, -, -, -, -, -, -, -, -, -, -
h ethnicity m	integer	Mother ethnicity	1.2.3.4.5.6.7

Metabolite	LLOQ
5aTHF	5.00
5bTHE	5.00
5b20acortolone	5.00
5b20bcortolone	5.00
5a20acortol	2.50
5a20bcortol	2.50
5b20acortol	2.50
5b20bcortol	2.50
11OHAndros	2.00
17HP	2.00
PT	2.00
$20 \mathrm{bDHF}$	0.50
5bTHF	0.50
6OHF	0.50
E	0.50
20aDHE	0.50
20bDHE	0.50
$5 \mathrm{aTHE}$	0.50
6OHE	0.50
$5 \mathrm{aTHB}$	0.50
5bTHB	0.50
17DOcortolone	0.50
5bTHS	0.50
Andros	0.50
Etio	0.50
F	0.25
20aDHF	0.25
5bDHF	0.10
A	0.10
S	0.10
5bDHS	0.10
${ m T}$	0.10
AED	0.10

Abbreviations: lower limit of quantification (LLOQ).

Table S6: Lower limits of quantification expressed in ng/ml for the glucocorticosteroids (HELIX subcohort; 2013-2016).

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Characteristic		Overall, $N = 1,297^a$	$BIB, N = 204^a$
Age (years)		8.1 (6.5, 8.9)	6.6 (6.5, 6.8)
Child breastfeeding		1,093.0 (84.7%)	147.0 (72.4%)
Unknown		6	ì
Child ethnicity			
Caucasian		1,157.0 (90.0%)	87.0 (42.6%)
Pakistani		80.0 (6.2%)	80.0 (39.2%)
Asian		$21.0 \ (1.6\%)$	13.0 (6.4%)
Other		19.0 (1.5%)	17.0 (8.3%)
African		7.0 (0.5%)	7.0 (3.4%)
Native American		2.0 (0.2%)	0.0 (0.0%)
White non European		0.0 (0.0%)	0.0 (0.0%)
Unknown		11	0.0 (0.070)
Child neuropsychological diagnosis		95.0 (7.3%)	3.0 (1.5%)
Creatinine night sample (g/l)		1.7 (0.9, 3.0)	0.8 (0.6, 1.1)
Unknown		321	72
Date of test (season)		521	12
Spring		358.0 (27.7%)	48.0 (23.5%)
Winter		339.0 (26.2%)	40.0 (23.5%)
Winter Autumn		300.0 (23.2%)	49.0 (24.0%)
Summer		297.0 (23.0%)	49.0 (24.0%) 67.0 (32.8%)
Summer Unknown		297.0 (23.0%) 3	07.0 (32.8%)
Family affluence scale		Э	U
*		410.0 (21.707)	240 (16 707)
6		410.0 (31.7%)	34.0 (16.7%)
5		325.0 (25.1%)	48.0 (23.5%)
7		248.0 (19.2%)	26.0 (12.7%)
4		174.0 (13.4%)	40.0 (19.6%)
3		92.0 (7.1%)	34.0 (16.7%)
2		28.0 (2.2%)	16.0 (7.8%)
1		12.0 (0.9%)	4.0 (2.0%)
0		6.0 (0.5%)	2.0 (1.0%)
Unknown		2	0
Fast food/take away (times/week)		$0.1 \ (0.1, \ 0.5)$	0.5 (0.1, 1.0)
Unknown		7	0
Fasting time (hours)		$3.3\ (2.8,\ 4.0)$	$3.3\ (2.8,\ 4.1)$
Financial situation		11.1.0 (00.104)	- 0.0 (0 - 004)
Doing alright		414.0 (32.1%)	73.0 (35.8%)
Living comfortably		412.0 (31.9%)	59.0 (28.9%)
Getting by		331.0 (25.6%)	59.0 (28.9%)
Finding it quite difficult		86.0 (6.7%)	8.0 (3.9%)
Finding it very difficult		40.0 (3.1%)	5.0~(2.5%)
Does not wish to answer		8.0 (0.6%)	0.0~(0.0%)
Unknown		6	0
Fish and seafood (times/week)		$2.0 \ (1.1, \ 3.5)$	$2.0\ (1.0,\ 3.1)$
Unknown		5	1
Fruits (times/week)	4.6	$9.0 \ (5.9, 18.0)$	15.5 (10.0, 21.0)
Unknown	43	7	2
Head circumference (cm)		$51.8 \ (50.6, \ 52.9)$	51.4 (50.3, 52.3)
Unknown		3	0
Height (m)		1.3 (1.2, 1.4)	$1.2\ (1.2,\ 1.2)$
Marital status			
Living with the father		$1,212.0 \ (94.5\%)$	178.0~(87.3%)
Living alone		39.0 (3.0%)	0.0~(0.0%)
Other situation		$31.0\ (2.4\%)$	$26.0\ (12.7\%)$
Unknown		15	0
Mood before assessment			
Usual		1,232.0 (95.1%)	198.0 (97.1%)
Not usual		64.0 (4.9%)	6.0 (2.9%)
Unknown		1	0
Organic food (times/week)		0.5 (0.0, 3.0)	$0.0 \ (0.0, \ 0.5)$

Characteristic	Overall, $N = 1,004^a$	$BIB, N = 154^a$	$EDEN, N = 137^a$	INI
Glucocorticosteroio	d			
A Unknown	4.3 (2.4, 8.2) 1	4.8 (2.8, 9.0)	$5.1\ (2.6,\ 9.1)$	3
E F	22.9 (13.1, 38.5) 5.5 (3.2, 9.5)	25.7 (14.5, 41.4) 6.3 (4.2, 10.4)	28.6 (14.1, 42.0) 7.8 (4.2, 11.4)	17. 4
Unknown	2	0	0	
Glucocorticosteroio	d metabolite			
11OHAndros Unknown	234.2 (130.3, 390.5) 3	259.7 (151.9, 375.0) 0	413.0 (221.7, 617.0) 0	256.
17-DO-cortolone Unknown	57.5 (29.1, 101.7)	56.1 (32.8, 100.6) 0	76.5 (46.0, 137.6) 0	61.3
20aDHE Unknown	16.6 (9.7, 27.5) 11	$14.2\ (7.0,\ 25.8)$	$25.8 (15.1, 37.8) \\ 0$	15.
20aDHF Unknown	6.6 (3.3, 13.3)	7.2 (3.8, 14.0)	$10.0\ (5.7,\ 19.5)\\0$	5
20bDHE Unknown	9.5 (6.2, 14.3) 17	8.7 (4.8, 14.8) 14	$13.2 (9.7, 17.3) \\ 0$	9.
20bDHF	15.2 (9.1, 24.8)	16.5 (10.8, 26.5)	19.9 (12.0, 32.0)	13
5a20acortol Unknown	88.9 (52.1, 141.6)	109.8 (61.7, 177.3) 9	$103.0 \ (58.0, \ 153.8) \\ 0$	83.0
5a20bcortol Unknown	122.4 (70.4, 185.0) 5	131.0 (66.3, 182.3) 5	$148.8 \ (108.8, \ 226.1) \\ 0$	124.
5aTHB	$133.1\ (76.1,\ 222.4)$	$159.8 \ (101.7, \ 241.3)$	$144.2 \ (87.9,\ 255.3)$	115.
5aTHE Unknown	73.9 (39.7, 124.0) 1	$82.0 \ (52.1, 145.7)$	83.9 (41.5, 132.7) 0	62.
5aTHF 5b20acortol	2,870.0 (1,663.7, 4,389.0) 147.7 (83.5, 225.8)	3,394.6 (2,288.1, 5,308.1) 177.4 (98.9, 302.3)	3,474.2 (1,856.1, 5,253.4) 169.7 (91.1, 252.9)	2,756.9 $141.$
Unknown	11	11	0	
5b 20 acortolone	$641.9 \ (366.0, 983.1)$	$638.3 \ (385.0, 1,028.2)$	903.7 (574.5, 1,296.1)	654.
5b20bcortol Unknown	$195.7\ (120.1,\ 302.4)$	$242.7 \ (152.0,\ 356.8)$	$225.2\ (142.1,\ 371.5)$	199.9
5b20bcortolone 5bDHF	546.9 (336.3, 837.1) 1.4 (0.9, 2.0)	561.3 (331.3, 889.9) 1.4 (0.9, 2.2)	682.3 (452.0, 1,031.1) 1.8 (1.3, 2.6)	534. 1
Unknown	$\frac{1.4 (0.9, 2.0)}{2}$	0	0	1
5bTHB	49.3 (28.0, 82.7)	53.3 (27.5, 98.3)	60.9 (34.9, 94.5)	50.
Unknown	1	0	0	
5bTHE	3,138.3 (1,889.5, 4,694.0)	$3,552.8 \ (2,335.3,\ 4,797.4)$	$3,649.6 \ (2,293.5,\ 5,317.1)$	2,911.6
5bTHF	906.5 (548.0, 1,416.1)	1,116.2 (660.8, 1,644.8)	$1,238.6 \ (743.1,\ 1,578.3)$	882.9
Unknown	2	2	0	
6OHE 6OHF	11.9 (6.5, 18.4) 42.8 (22.5, 76.7)	13.2 (7.6, 20.6) 51.9 (29.8, 93.9)	12.2 (6.1, 17.4) 55.8 (29.8, 82.3)	$\frac{9}{32}$
Glucocorticosteroio	d precursor	,	, ,	
S	0.4 (0.3, 0.8)	0.5 (0.3, 0.9)	0.4 (0.3, 0.7)	0
Unknown	94 44	6	5	
Glucocorticosteroio	d precursor metabolite			
17HP	22.3 (15.1, 33.5)	17.0 (11.1, 27.6)	33.2 (23.5, 44.0)	20.
Unknown 5bDHS	0.3 (0.2, 0.4)	$0 \\ 0.3 (0.2, 0.4)$	$0 \\ 0.3 \ (0.2, \ 0.5)$	0
Unknown	132	5	20	
5bTHS Unknown	$30.7 \ (18.5, 50.5)$	35.7 (20.7, 59.2) 0	34.5 (19.8, 52.1) 0	27.
PT	200.6 (112.8, 342.0)	149.1 (87.6, 246.3)	378.8 (230.8, 542.8)	253.
Androgen				
AED	$0.2 \ (0.2, \ 0.3)$	$0.2\ (0.2,\ 0.3)$	$0.3 \ (0.2, \ 0.5)$	0
Unknown	407	0 7 (0.5. 1.0)	34	

Exposure	Unadjusted	$Adjusted^a$
Phenols		
PRPA	1,297	1,297
ETPA	1,297	1,289
OXBE	1,297	1,277
BUPA	1,297	1,276
MEPA	1,297	1,266
TRCS	1,297	1,255
BPA	1,297	1,137
OP pesticid	e metabolites	
DETP	1,297	1,222
DEP	1,297	1,222
DMTP	1,297	1,219
DMP	1,297	1,172
Phthalate n	netabolites	
oxo-MiNP	1,297	1,199
oh-MiNP	1,297	1,171
MBzP	1,297	1,114
MEHP	1,297	1,090
MEP	1,297	1,054
MnBP	1,297	1,035
MEHHP	1,297	1,010
MEOHP	1,297	1,000
MECPP	1,297	980.4
MiBP	1,297	927.3

 $[^]a$ Truncated weights.

 $\label{thm:prop:size} \begin{tabular}{ll} Table S9: Effective sample size before and after balancing weights estimation (exposures: EDCs; outcome: HRT-SE) (HELIX subcohort; 2013-2016). \end{tabular}$

Exposure	Unadjusted	$Adjusted^a$
Phenols		
OXBE	976.0	960.1
PRPA	976.0	956.0
MEPA	976.0	953.7
BUPA	976.0	952.3
ETPA	976.0	951.7
TRCS	976.0	942.4
BPA	976.0	856.4
OP pesticio	le metabolites	
DEP	976.0	922.1
DETP	976.0	922.1
DMTP	976.0	907.3
DMP	976.0	893.3
Phthalate n	netabolites	
oh-MiNP	976.0	877.9
oxo-MiNP	976.0	873.6
MBzP	976.0	828.8
MEHP	976.0	827.3
MEP	976.0	796.3
MEHHP	976.0	784.8
MECPP	976.0	768.1
MEOHP	976.0	761.5
MnBP	976.0	745.7
MiBP	976.0	690.9

 $[^]a\mathrm{Truncated}$ weights.

Table S10: Effective sample size before and after balancing weights estimation (exposures: EDCs; outcomes: glucocorticosteroids) (HELIX subcohort; 2013-2016).

Exposure	Unadjusted	${\rm Adjusted}^a$
cortisone production	976.0	777.2
corticosterone production	976.0	757.5
cortisol production	976.0	751.5

^aTruncated weights.

Table S11: Effective sample size before and after balancing weights estimation (exposures: glucocorticosteroids; outcome: HRT-SE) (HELIX subcohort; 2013-2016).

	Median (IQR)	Range
${\bf Characteristic}^a$	$oxed{N=1,297^a}$	$\overline{{f N}=1,\!297^a}$
OP pesticide meta	bolites	
DMP	0.99(0.73, 1.25)	0.49, 1.50
DMTP	1.00 (0.81, 1.20)	0.59, 1.39
DEP	1.01 (0.81, 1.19)	0.59, 1.39
DETP	$0.99 \ (0.81, \ 1.18)$	0.61, 1.41
Phenols		
MEPA	1.01 (0.90, 1.13)	0.74, 1.25
ETPA	1.01 (0.96, 1.07)	0.88, 1.14
PRPA		
2143289344	$1,297 \ (100\%)$	$1,297 \ (100\%)$
BPA	0.99 (0.70, 1.27)	0.39, 1.57
BUPA	$1.01 \ (0.91, \ 1.11)$	0.81, 1.22
OXBE	$1.01\ (0.92,\ 1.09)$	0.79, 1.21
TRCS	$1.01\ (0.87,\ 1.13)$	0.68, 1.28
Phthalate metabol	ites	
MEP	0.93 (0.61, 1.27)	0.27, 1.77
MiBP	$0.91\ (0.46,\ 1.38)$	0.05, 1.92
MnBP	$0.98 \ (0.59, 1.33)$	0.20, 1.74
MBzP	$0.98 \ (0.66, 1.27)$	0.35, 1.62
MEHP	$0.98 \ (0.64, 1.28)$	0.31, 1.68
MEHHP	$0.96 \ (0.54, \ 1.35)$	0.16, 1.76
MEOHP	$0.96 \ (0.52, \ 1.35)$	0.15, 1.78
MECPP	$0.95 \ (0.50, \ 1.34)$	0.14, 1.84
oh-MiNP	$1.00 \ (0.74, \ 1.24)$	0.47, 1.51
oxo-MiNP	1.01 (0.78, 1.20)	0.52, 1.43

^aTruncated weights.

Table S12: Summary statistics of the estimated balancing weights (exposures: EDCs; outcome: HRT-SE) (HELIX subcohort; 2013-2016).

	Median (IQR)	Range		
${\bf Characteristic}^a$	$\overline{ m N=976}^a$	$\overline{{ m N}=976^a}$		
OP pesticide metabolites				
DMP	0.99 (0.75, 1.23)	0.51, 1.46		
DMTP	1.00 (0.78, 1.23)	0.56, 1.41		
DEP	0.99 (0.81, 1.20)	0.64, 1.41		
DETP	0.99 (0.82, 1.18)	0.62, 1.41		
Phenols				
MEPA	1.00 (0.90, 1.13)	0.75, 1.26		
ETPA	1.02 (0.90, 1.14)	0.72, 1.24		
PRPA	1.00 (0.92, 1.12)	0.76, 1.26		
BPA	1.00 (0.70, 1.26)	0.40, 1.58		
BUPA	1.01 (0.90, 1.13)	0.75, 1.27		
OXBE	$1.01\ (0.92,\ 1.10)$	0.78, 1.21		
TRCS	$1.01 \ (0.86, \ 1.14)$	0.68, 1.29		
Phthalate metabol	ites			
MEP	0.92 (0.60, 1.27)	0.28, 1.74		
MiBP	0.88 (0.44, 1.38)	0.09, 1.98		
MnBP	$0.97 \ (0.52, 1.35)$	0.14, 1.84		
MBzP	$0.94 \ (0.68, 1.29)$	0.35, 1.68		
MEHP	$0.98 \ (0.65, 1.29)$	0.33, 1.64		
MEHHP	$0.98 \ (0.56, 1.35)$	0.21, 1.69		
MEOHP	$0.98 \ (0.53, \ 1.35)$	0.18, 1.77		
MECPP	$0.96 \ (0.55, \ 1.36)$	0.19, 1.76		
oh-MiNP	$0.99 \ (0.73, \ 1.25)$	0.45, 1.49		
oxo-MiNP	1.01 (0.71, 1.25)	0.45, 1.52		

^aTruncated weights.

Table S13: Summary statistics of the estimated balancing weights (exposures: EDCs; outcomes: glucocorticosteroids) (HELIX subcohort; 2013-2016).

	Median (IQR)	Range
${\bf Characteristic}^a$	$\overline{ m N}=976^a$	$\overline{{ m N}=976^a}$
cortisol production cortisone production corticosterone production	1.00 (0.54, 1.39) 1.00 (0.59, 1.39) 0.98 (0.56, 1.39)	0.14, 1.80 0.19, 1.73 0.15, 1.78

 $[^]a$ Truncated weights.

 $\label{thm:prop:statistics} \begin{tabular}{ll} Table S14: {\bf Summary statistics of the estimated balancing weights (exposures: glucocorticosteroids; outcome: HRT-SE) (HELIX subcohort; 2013-2016). \end{tabular}$

	Median (IQR)		Range	
${\bf Characteristic}^a$	females, $N = 587^a$	$\mathbf{males}, \mathrm{N} = 710^{a}$	females, $N = 587^a$	$\mathbf{males}, \mathrm{N} = 710^a$
OP pesticide metabolites				
DMP	0.99 (0.74, 1.25)	1.00 (0.74, 1.25)	0.53, 1.46	0.53, 1.46
DMTP	1.00(0.79, 1.22)	1.01 (0.82, 1.20)	0.58, 1.38	0.58, 1.38
DEP	1.01 (0.82, 1.18)	1.02 (0.84, 1.17)	0.64, 1.36	0.64, 1.36
DETP	$1.00 \ (0.77, \ 1.22)$	$1.01 \ (0.82, \ 1.20)$	0.57, 1.39	0.57, 1.39
Phenols				
MEPA	1.02 (0.89, 1.15)	1.02 (0.94, 1.11)	0.76, 1.23	0.76, 1.23
ETPA	$1.02 \ (0.96, \ 1.08)$	$1.01\ (0.97,\ 1.06)$	0.91, 1.12	0.91, 1.12
PRPA	$1.02 \ (0.92, \ 1.13)$	$1.02 \ (0.95, \ 1.10)$	0.82, 1.21	0.82, 1.21
BPA	$1.02 \ (0.73, \ 1.28)$	1.02 (0.74, 1.25)	0.42, 1.50	0.42, 1.50
BUPA	1.02 (0.95, 1.10)	$1.01 \ (0.81, \ 1.20)$	0.67, 1.29	0.67, 1.29
OXBE	$1.03 \ (0.92, \ 1.12)$	1.02 (0.94, 1.09)	0.81, 1.19	0.81, 1.19
TRCS	$1.03 \ (0.92, \ 1.13)$	$1.01 \ (0.89, \ 1.12)$	0.73, 1.25	0.73, 1.25
Phthalate metabolites				
MEP	0.96 (0.67, 1.26)	0.93 (0.62, 1.30)	0.31, 1.68	0.31, 1.68
MiBP	$0.93 \ (0.51, \ 1.39)$	$0.96 \ (0.52, \ 1.40)$	0.16, 1.85	0.16, 1.85
MnBP	$1.00 \ (0.63, \ 1.33)$	$0.98 \ (0.59, \ 1.35)$	0.28, 1.68	0.28, 1.68
MBzP	$1.00 \ (0.71, \ 1.27)$	$0.99 \ (0.69, 1.27)$	0.40, 1.57	0.40, 1.57
MEHP	$1.02 \ (0.69, \ 1.27)$	$0.98 \ (0.62, \ 1.32)$	0.33, 1.62	0.33, 1.62
MEHHP	$1.01\ (0.60,\ 1.29)$	$0.95 \ (0.56, \ 1.36)$	0.26, 1.72	0.26, 1.72
MEOHP	$1.00 \ (0.63, \ 1.29)$	$0.95 \ (0.53, \ 1.40)$	0.23, 1.74	0.23, 1.74
MECPP	$1.00 \ (0.59, \ 1.33)$	$0.95 \ (0.50, \ 1.37)$	0.23, 1.76	0.23, 1.76
oh-MiNP	$1.02 \ (0.78, \ 1.22)$	$1.00 \ (0.76, \ 1.23)$	0.51, 1.46	0.51, 1.46
oxo-MiNP	$1.02 \ (0.84, \ 1.17)$	$1.01 \ (0.76, \ 1.21)$	0.58, 1.39	0.58, 1.39

 $[\]overline{^a}$ Truncated weights.

Table S15: Summary statistics of the estimated balancing weights for effect modification (exposures: EDCs; outcome: HRT-SE; modifier: sex) (HELIX subcohort; 2013-2016).

	Median (IQR)		Range		
${\bf Characteristic}^a$	females, $N = 434^a$	$males, N = 542^a$	$\overline{\mathbf{females}, \mathbf{N} = 434^a}$	$males, N = 542^a$	
OP pesticide meta	OP pesticide metabolites				
DMP	0.98 (0.77, 1.23)	1.01 (0.76, 1.21)	0.57, 1.45	0.57, 1.45	
DMTP	1.03 (0.78, 1.22)	1.01 (0.79, 1.23)	0.56, 1.40	0.56, 1.40	
DEP	$1.01 \ (0.85, 1.16)$	1.00 (0.84, 1.18)	0.67, 1.36	0.67, 1.36	
DETP	$1.00 \ (0.77, \ 1.22)$	$1.01 \ (0.86, \ 1.17)$	0.57, 1.40	0.57, 1.40	
Phenols					
MEPA	1.01 (0.88, 1.16)	1.03 (0.94, 1.11)	0.73, 1.26	0.73, 1.26	
ETPA	1.04 (0.92, 1.12)	$1.02 \ (0.91, \ 1.12)$	0.78, 1.22	0.78, 1.22	
PRPA	$1.03 \ (0.87, \ 1.16)$	$1.02 \ (0.95, \ 1.10)$	0.74, 1.24	0.74, 1.24	
BPA	$1.00 \ (0.71, \ 1.28)$	$1.01\ (0.75,\ 1.24)$	0.44, 1.52	0.44, 1.52	
BUPA	1.02 (0.95, 1.11)	$1.01\ (0.80,\ 1.20)$	0.64, 1.30	0.64, 1.30	
OXBE	$1.03 \ (0.86, \ 1.16)$	1.02 (0.95, 1.09)	0.76, 1.22	0.76, 1.22	
TRCS	$1.03 \ (0.92, \ 1.13)$	$1.01 \ (0.88, \ 1.14)$	0.73, 1.25	0.73, 1.25	
Phthalate metabolites					
MEP	$0.99\ (0.70,\ 1.24)$	$0.95 \ (0.55, 1.30)$	0.31, 1.68	0.31, 1.68	
MiBP	0.92 (0.46, 1.40)	$0.92\ (0.54,\ 1.39)$	0.15, 1.84	0.15, 1.84	
MnBP	0.97 (0.51, 1.40)	$0.98 \ (0.57, \ 1.32)$	0.21, 1.78	0.21, 1.78	
MBzP	$0.99 \ (0.70, \ 1.26)$	$0.98 \ (0.66, 1.31)$	0.38, 1.58	0.38, 1.58	
MEHP	$1.01\ (0.72,\ 1.29)$	$0.98 \ (0.61, \ 1.34)$	0.36, 1.58	0.36, 1.58	
MEHHP	$1.02 \ (0.65, \ 1.31)$	$1.00 \ (0.59, \ 1.35)$	0.30, 1.63	0.30, 1.63	
MEOHP	$1.01\ (0.62,\ 1.32)$	$1.01 \ (0.51, \ 1.41)$	0.24, 1.68	0.24, 1.68	
MECPP	$0.98 \ (0.62, \ 1.32)$	$0.98 \ (0.54, \ 1.40)$	0.29, 1.67	0.29, 1.67	
oh-MiNP	$1.00 \ (0.73, \ 1.26)$	$1.00 \ (0.78, \ 1.24)$	0.49, 1.44	0.49, 1.44	
oxo-MiNP	$1.03 \ (0.74, \ 1.27)$	$1.02 \ (0.76, \ 1.24)$	0.47, 1.45	0.47, 1.45	

 $[\]overline{^a}$ Truncated weights.

Table S16: Summary statistics of the estimated balancing weights for effect modification (exposures: EDCs; outcomes: glucocorticosteroids; modifier: sex) (HELIX subcohort; 2013-2016).

	Median (IQR)		Ran	ıge
${\bf Characteristic}^a$	females, $N = 434^a$	males, $N = 542^a$	females, $N = 434^a$	males, $N = 542^{\circ}$
cortisol production cortisone production corticosterone production	0.97 (0.57, 1.41) 1.00 (0.61, 1.40) 1.00 (0.60, 1.39)	1.01 (0.59, 1.35) 1.00 (0.59, 1.38) 1.03 (0.56, 1.37)	0.24, 1.71 0.27, 1.69 0.23, 1.71	0.24, 1.71 0.27, 1.69 0.23, 1.71

^aTruncated weights.

Table S17: Summary statistics of the estimated balancing weights for effect modification (exposures: glucocorticosteroids; outcome: HRT-SE; modifier: sex) (HELIX subcohort; 2013-2016).

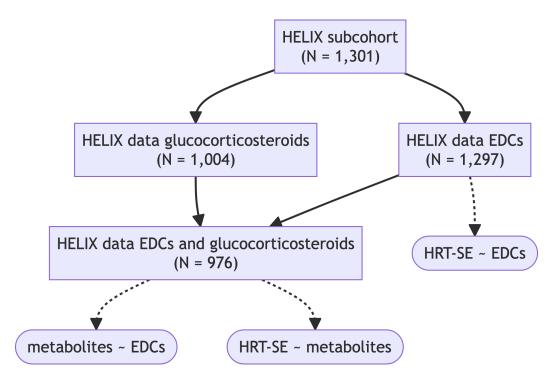


Figure S1: Flowchart describing the sample size for each research question.

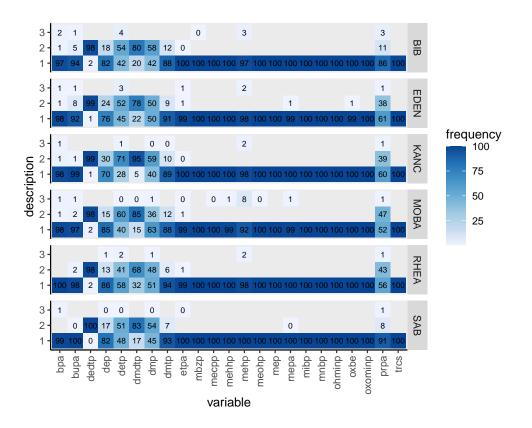


Figure S2: Measurement classification of EDCs, by cohort (HELIX subcohort; **2013-2016**). Coding: 1, quantifiable; 2, <LOD; 3, interference or out of range; 4. not analysed.

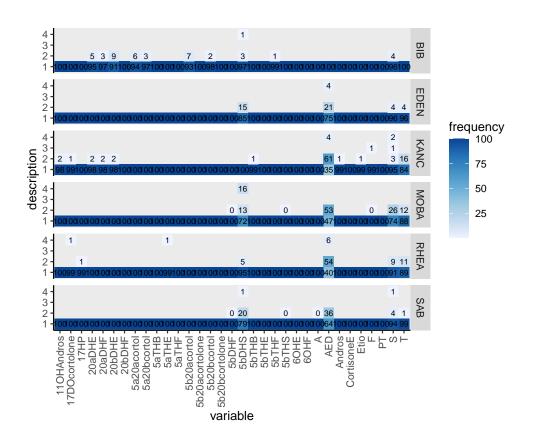


Figure S3: Measurement classification of the glucocorticosteroids, by cohort (HELIX subcohort; 2013-2016). Coding: 1, quantifiable; 2, <LOQ; 3, interference or out of range; 4, not detected.

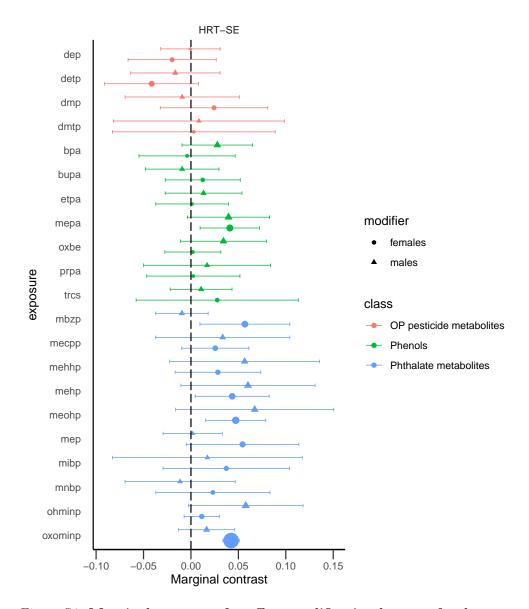


Figure S4: Marginal contrasts for effect modification by sex of a decrease from the 90th to the 10th percentile of the EDCs on HRT-SE expressed in ms (HELIX subcohort; 2013-2016). Circles and triangles indicate effect estimates. Solid lines indicate the 95% CI.

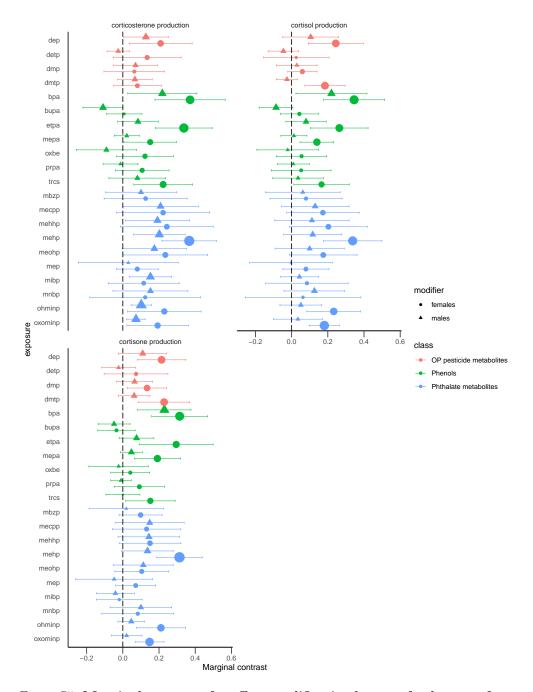


Figure S5: Marginal contrasts for effect modification by sex of a decrease from the 90th to the 10th percentile of the EDCs on the glucocorticosteroids expressed in ng/ml (HELIX subcohort; 2013-2016). Circles and triangles indicate effect estimates. Solid lines indicate the 95% CI.

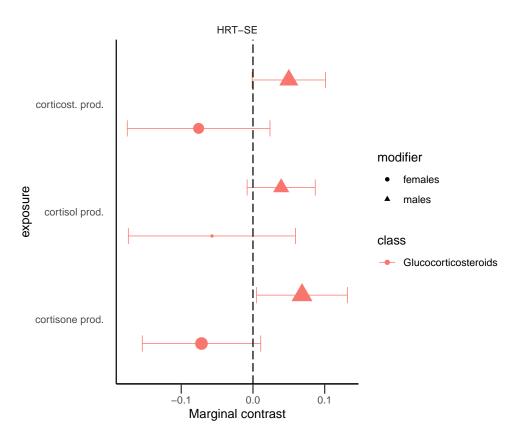


Figure S6: Marginal contrasts for effect modification by sex of a decrease from the 90th to the 10th percentile of the glucocorticosteroids on HRT-SE expressed in ms (HELIX subcohort; 2013-2016). Circles and triangles indicate effect estimates. Solid lines indicate the 95% CI. Abbreviations: cortisone production (cortisone prod.); cortisol production (cortisol prod.); corticost. prod. (corticosterone production).