

Periconceptual folate intake influences DNA methylation at birth based on dietary source in an analysis of pediatric acute lymphoblastic leukemia cases and controls

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ABSTRACT

Background: Periconceptual folate intake is associated with the establishment of DNA methylation in offspring; however, variations in this relation by food sources compared with folic acid supplements are not described. Also, maternal folate intake is associated with decreased risk of pediatric acute lymphoblastic leukemia (ALL), but the mechanism is not known.

Objectives: We evaluated the relation between periconceptual folate intake by source and DNA methylation at birth in a cohort of pediatric ALL cases and controls in an epigenome-wide association study.

Methods: Genome-wide DNA methylation status obtained from archived neonatal blood spots from pediatric ALL cases ($n = 189$) and controls ($n = 205$) in the California Childhood Leukemia Study (CCLS) from 1995–2008 was compared with periconceptual folate from total, food, and supplemental sources using multivariable linear regression. Further stratification was performed by income, education, ethnicity, and total folate intake. We evaluated variable DNA methylation response to periconceptual folate by ALL case status through an interaction term.

Results: Two significant differentially methylated probes (DMPs) were associated with food and supplemental periconceptual folate intake in all subjects ($n = 394$). The top differentially methylated region at the promoter region of *DUSP22* (dual specificity phosphatase 22) demonstrated DNA hypermethylation in ALL cases but not in controls in response to total and food folate intake. We further identified 8 interaction term DMPs with variable DNA methylation response to folate intake by ALL case status. Further stratification of the cohort by education and ethnicity revealed a substantially higher number of DMPs associated with supplemental folic acid intake in Hispanic subjects with lower income and educational level.

Conclusions: We identified modest associations between periconceptual folate intake and DNA methylation differing by source, including variation by ALL case status. Hispanic subjects of lower income and education appear uniquely responsive to periconceptual folate supplementation. *Am J Clin Nutr* 2022;116:1553–1564.

Keywords: DNA methylation, folate, acute lymphoblastic leukemia, periconceptual nutrition, epigenetics, pediatric oncology

Introduction

The etiology of pediatric acute lymphoblastic leukemia (ALL) is likely multifactorial (1) with a prenatal origin (2), identifying the significance of the intrauterine period in future leukemia risk. This includes an association between maternal diet during pregnancy and development of childhood ALL. Consumption of vegetables, fruits, proteins (3), and legumes (4) during pregnancy is associated with a reduced risk of ALL in offspring after accounting for socioeconomic status. To explain these findings, focus has been placed on micronutrients involved in

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Supplemental Tables 1–15 and Supplemental Figures 1–9 are available from the “Supplementary data” link in the online posting of the article and from the same link in the online table of contents at <https://academic.oup.com/ajcn/>.

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Abbreviations used: ALL, acute lymphoblastic leukemia; CCLS, California Childhood Leukemia Study; *CERK*, ceramide kinase; DFE, dietary folate equivalent; DMP, differentially methylated probe; DMR, differentially methylated region; *DUSP22*, dual specificity phosphatase 22; EWAS, epigenome-wide association study; FDR, false discovery rate; GenR, Generation R Study; mBFFQ, modified Block food-frequency questionnaire; MoBa, Norwegian Mother, Father, and Child Cohort Study; PC, principal component; ReFACTor, Reference-Free Adjustment for Cell Type Composition.

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one-carbon metabolic processes, including folate (vitamin B-9), cobalamin (vitamin B-12), vitamin B-6, riboflavin (vitamin B-2) and methionine (5), which regulate processes including nucleotide synthesis and de novo DNA methylation (6).

Maternal diets high in folate decrease the risk of pediatric ALL (7, 8). Combined case-control data from 12 studies in the Childhood Leukemia International Consortium, including 6963 pediatric ALL subjects, demonstrated a reduction in ALL risk with periconceptual folate supplementation (9), a finding since confirmed independently (10). Neonatal serum folate concentrations are not associated with the development of ALL (11), indicating that exposure in the periconceptual and early gestational period has the strongest impact on leukemia risk. Folate source may additionally play an important role in regulating ALL risk. Natural folate exists in a wide array of plant and animal sources, whereas folate-fortified foods and dietary supplements occur as synthetic folic acid. While total maternal folate intake appears to reduce ALL risk across all populations, children of Hispanic background (5) and mothers of low educational levels (9) demonstrate particular benefit from higher folate intake, including folic acid supplementation.

DNA methylation patterns are largely established during early embryogenesis under genetic, stochastic, and environmental influences, including maternal folate consumption (12–14). This suggests that DNA methylation may mediate the association of maternal dietary folate and pediatric ALL (15). While aberrant DNA methylation typifies pediatric ALL at diagnosis (16), its role as an early or predisposing contributor to leukemia development is unknown. We hypothesized that periconceptual maternal folate intake influences pediatric ALL risk by modifying DNA methylation, and that this effect varies by food versus supplemental sources. We assessed periconceptual folate intake through a retrospective maternal dietary survey collected by the California Childhood Leukemia Study (CCLS) in association with DNA methylation at birth in pediatric ALL cases, prior to diagnosis, and matched healthy controls through an epigenome-wide association study (EWAS).

Methods

Study population

The CCLS is a population-based, case-control study that enrolled subjects with newly diagnosed pediatric (0–14 y) leukemia at California hospitals from 1995 to 2008 (17). Controls were randomly selected from birth certificates from the California Department of Public Health Office of Vital Records at a 1:1 or 2:1 ratio matched by birth date (i.e., matched to date of diagnosis for cases), sex, maternal race, and Hispanic ethnicity. A subset of pediatric ALL cases (B-cell, T-cell, or unknown lineage) and matched controls were assigned for whole-genome DNA methylation analysis using the Illumina Infinium Methylation EPIC BeadChip platform (Illumina) (14, 18). Participant dried blood spots (DBSs) obtained from peripheral blood heel-stick samples at birth were obtained from archived samples maintained by the California Department of Public Health. DNA was isolated from DBS samples, as described elsewhere (14), prior to being sent for methylation analysis. Written informed consent was obtained from mothers of participants, with assent from subjects aged 7 y or older. The institutional review boards of participating

institutions and the California Committee for the Protection of Human Subjects reviewed and approved the study protocol.

Periconceptual folate estimation

Retrospective maternal dietary history spanning the year prior to pregnancy was obtained through a modified Block food-frequency questionnaire (mBFFQ) administered at diagnosis for cases or at the time of enrollment for controls (19). Specifications of the mBFFQ are reviewed elsewhere (4, 5). The mBFFQ surveyed frequency of intake of common foods and supplements, including 7 Hispanic-specific foods for Spanish-speaking patients. Folate intake was quantified as dietary folate equivalents (DFEs) and accounted for folic acid fortification in grain products in 1998. DFE measurements were categorized as total folate (from all sources), food folate (including natural and fortified food sources), and supplemental folic acid. Supplemental DFEs were based on exact labeled content of folic acid in multivitamin products and dietary supplements assessed on the mBFFQ. A total of 411 subjects were evaluated using the mBFFQ, including 198 ALL cases and 213 controls. One subject with incomplete folate intake estimation data was omitted.

DNA methylation analysis

Extracted DNA samples were modified by sodium bisulfite for conversion of unmethylated cytosines to uracil using the EZ DNA Methylation Kit (Zymo Research) for use in genome-wide methylation assessment. Samples were subsequently sent for methylation assessment using the Illumina Infinium Methylation EPIC BeadChip platform (Illumina) (14, 18). Raw IDAT (intensity data file) files were imported into R (Version 4.0.0, The R Foundation) for data preprocessing and normalization using the *openSesame* pipeline from the *SeSAMe* package (20) in *minfi* (21), with the distribution of signal background calibrated by type I probe out-of-band signal. Probes with a detection *P*-value threshold > 0.05 were masked from further analysis. *NOOB* background subtraction was performed, followed by removal of residual background. Nonlinear scaling was used to correct for dye balance. Probes and subjects with >5% missing values were removed. Probes previously identified as cross-hybridizing or overlapping genetic variants were additionally omitted (22). A total of 16 subjects were removed due to excessive missingness. Missing values were imputed using the *impute.knn* function in the R package *impute*. Chromosome X and Y probes were included in analysis. A total of 697,560 probes passed quality-control measures for inclusion in the study.

Statistical modeling

B-Values ranging from 0 (unmethylated) to 1 (fully methylated) were logit-transformed to M-values to normalize probe distribution for statistical modeling. Multivariable linear regression was conducted independently for the 3 folate variables (total, food, and supplemental). Supplemental DFEs were treated categorically (0, 194, 360, and 540 DFEs), whereas the remainder were treated as continuous variables. The model controlled for array batch effect (plate), ALL case status, sex, the top 10 principal components (PCs) for nucleated cell proportions and

top 10 PCs for genetic ancestry. Reference-Free Adjustment for Cell Type Composition (ReFACTor) was used to estimate nucleated cell proportions (23), whereas genetic ancestry was estimated using the EPISTRUCTURE (24) approach in GLINT (25). No significant variation in nucleated cell proportions (B cell, CD4 and CD8 T cell, granulocytes, monocytes, NK cells, and nucleated RBCs) was identified between ALL cases and controls using results of a separate reference-based deconvolution method (26–28). Differentially methylated probes (DMPs) were defined by false discovery rate (FDR) <0.05 based on the Benjamini and Hochberg method to correct for multiple comparisons. Differentially methylated regions (DMRs) were identified through *Comb-p* (29) using a seed *P* value < 0.05, maximum probe distance of 1000 base pairs, a minimum of 2 probes per region, and a significance threshold of Šidák-corrected *P* value < 0.05. All probes were annotated using the Bioconductor package *IlluminaHumanMethylationEPICanno.ilm10b4.hg19* (30).

Subgroup analysis

Given prior evidence of variation in the association between folate consumption and ALL risk by ethnicity and socioeconomic factors (5, 9, 31), we conducted a subgroup analysis stratified by Hispanic compared with non-Hispanic White ethnicity, annual household income, the highest level of household education, and overall folate consumption. Income stratifications were defined as low (<\$75,000) compared with high (≥\$75,000) annual income. Household education stratifications were defined as lower educational level (high school or less) compared with higher educational level (some college or more). Median total folate intake for all participants was used to define low (<530.6 total DFEs) compared with high (≥530.6 total DFEs) overall folate consumption.

Interaction term analysis

To identify DNA methylation sites with variable response to periconceptual folate intake by ALL case status, an interaction term (ALL case status multiplied by folate DFEs) was incorporated in the linear regression model as the main covariate of interest while controlling sex, batch effect (plate), ALL case status, folate DFEs by source, the top 10 EPISTRUCTURE PCs, and top 10 ReFACTor PCs. After evaluating B-value distributions of ALL cases and controls, extreme outliers were adjusted through winsorization. Specifically, for cg08267698, cg00277198, cg04656615, and cg19839822, the 2 most extreme outliers among ALL cases were adjusted to the remaining most extreme value; for cg14946192 and cg11943916, the most extreme outlier was adjusted; and for cg14541523, the 3 most extreme outliers were adjusted. Interaction term CpGs with FDR <0.05 were subsequently assessed separately in ALL-case-stratified populations using winsorized data to confirm an opposing direction of effect in cases compared with controls.

Validation testing

To validate findings and test consistency with prior reports of maternal folate and DNA methylation at birth, results from the probe-specific EWAS were compared with folate-responsive

CpGs previously published (13). The prior study evaluated 2 separate mother–offspring linked cohorts, the Norwegian Mother, Father, and Child Cohort Study (MoBa) and the Generation R Study (GenR), as well as a meta-analysis of the 2 cohorts revealing a total of 443 folate-responsive CpGs. A total of 359 CpGs overlapped with sites investigated in the current study. Spearman correlation coefficients were calculated between EWAS coefficients for total folate intake from this study and coefficients from the previously published meta-analysis, as well as the MoBa and GenR cohorts independently.

Data availability

The data underlying this article are available in the article and within **Supplemental Tables 1–15**. Results of the EWAS analysis presented in this study are provided as a downloadable file for all subjects, Hispanic subjects only, and non-Hispanic White subjects (32). This study used biospecimens from the California Biobank Program, which prohibits uploading of genomic data (including genome-wide DNA methylation) and/or sharing of individual-level data obtained from these biospecimens under the statutory scheme of the California Health and Safety Code sections 124980(j), 124991(b) and (h), and 103850(a) and (d).

Results

Cohort description and folate distribution

A total of 394 subjects were evaluated, including 189 ALL cases and 205 controls (**Supplemental Figure 1**). Cases and controls did not differ by sex, birth weight, race, Hispanic ethnicity, income, or highest household educational level (**Table 1**). Age at diagnosis ranged from 0.2 to 15.0 y for ALL cases (median: 4.2; IQR: 3.9), whereas age at enrollment for controls ranged from 0.3 to 14.7 y (median: 4.9; IQR: 5.3; *P* = 0.071). Median total folate intake was 530.6 DFEs. Median dietary intake was 419.0 DFEs from all food sources. For supplemental folic acid, 280 subjects reported no intake, 27 reported 194 DFEs, 14 reported 360 DFEs, and 73 reported 540 DFEs (**Table 1**, **Supplemental Figure 2A**). In this CCLS subset, cases and controls did not differ in folate intake for any source (**Table 1**, **Supplemental Figure 2B**). Of the 394 subjects included in the study, 201 (51.0%) had total DFEs equal to or greater than 520, the Estimated Average Requirement during pregnancy in the United States. Of the 189 cases, 99 (52.4%) had total DFEs equal to or greater than 520. Of the 205 controls, 102 (49.8%) had total DFEs equal to or greater than 520.

Subjects were further stratified by self-reported Hispanic ethnicity, annual income, household education, and total folate intake (**Supplemental Figure 2C–F**). Hispanic subjects reported higher folate intake from food sources, whereas non-Hispanic White subjects reported higher supplemental folic acid intake (**Supplemental Figure 2C**). Subjects with low annual income reported lower total folate intake compared with those with high income due to reduced supplemental folic acid intake, despite reporting higher intake from food sources (**Supplemental Figure 2D**), a trend similarly reflected in subjects with low household education (**Supplemental Figure 2E**).

TABLE 1 Subject characteristics¹

	All subjects (<i>n</i> = 394)	Cases (<i>n</i> = 189)	Controls (<i>n</i> = 205)	<i>P</i>
Female sex, <i>n</i> (%)	174 (44.2%)	86 (45.5%)	88 (43.1%)	0.61 ²
Median (IQR) gestational age, wk (IQR)	40 (2)	40 (3)	40 (1)	0.04 ³
Mean (SD) birth weight, g	3411.1 (563.2)	3361.7 (549.7)	3456.6 (572.9)	0.09 ⁴
Race, <i>n</i> (%)				0.41 ⁵
White/Caucasian	216 (54.8%)	96 (50.8%)	120 (58.5%)	
Black/African American	9 (2.3%)	4 (2.1%)	5 (2.4%)	
Native American	6 (1.5%)	4 (2.1%)	2 (1.0%)	
Asian or Pacific Islander	26 (6.6%)	11 (5.8%)	15 (7.3%)	
Mixed or others	135 (34.3%)	72 (38.1%)	63 (30.7%)	
Ethnicity, <i>n</i> (%)				0.96 ²
Hispanic	175 (44.4%)	83 (43.9%)	92 (44.9%)	
Non-Hispanic	219 (55.6%)	106 (56.1%)	113 (55.1%)	
Annual income, <i>n</i> (%)				0.44 ²
<\$15,000	46 (11.7%)	24 (12.7%)	22 (10.7%)	
\$15,000–29,999	68 (17.3%)	39 (20.6%)	29 (14.1%)	
\$30,000–44,999	45 (11.4%)	22 (11.6%)	25 (12.2%)	
\$45,000–59,999	54 (13.7%)	27 (14.3%)	27 (13.2%)	
\$60,000–74,999	42 (10.7%)	18 (9.5%)	23 (11.2%)	
≥\$75,000	137 (34.8%)	58 (30.7%)	79 (38.5%)	
Household education, <i>n</i> (%)				0.21 ²
None or elementary school	15 (3.8%)	9 (4.8%)	6 (2.9%)	
High school or similar	117 (29.7%)	57 (30.2%)	60 (29.3%)	
Some college or similar	120 (30.5%)	49 (25.9%)	71 (34.6%)	
Bachelor's degree or higher	142 (36.0%)	74 (39.2%)	68 (33.2%)	
Median (IQR) maternal folate DFEs				
Total	530.6 (532.1)	536.4 (533.9)	519.8 (516.9)	0.85 ³
Food	419.0 (308.3)	439.6 (316.1)	410.0 (299.8)	0.83 ³
Supplemental, <i>n</i> subjects per category				
0 DFEs	280	134	146	0.91 ²
194 DFEs	27	12	15	
360 DFEs	14	8	6	
540 DFEs	73	35	38	

¹Characteristics of the *n* = 394 subjects assessed in this study from the California Childhood Leukemia Study (CCLS) with genome-wide DNA-methylation data available are shown. Characteristics of the *n* = 189 pediatric acute lymphoblastic leukemia cases and *n* = 205 matched controls included in this group are presented separately. No notable differences between case and control subjects were identified by sex, birth weight, reported race and ethnicity, annual income, or highest level of household education. Maternal periconceptional folate intake was calculated as DFEs and assessed by total intake, intake from food sources, and intake from supplemental sources. Total and food DFEs were assessed on a continuous scale, whereas supplemental folic acid was assessed categorically. DFE, dietary folate equivalent.

²Chi-square test,

³Wilcoxon test,

⁴Welch's *t*-test,

⁵Fisher's exact test.

Probe-specific analysis by folate source

A total of 697,560 EPIC array CpG probes passed quality control measures for use in multivariable linear regression. Genomic inflation (λ) values by source were $\lambda = 1.08$ for total, 1.03 for food, and 0.96 for supplemental DFEs (Figure 1A). No significant DMPs were identified for total DFEs, 1 was identified for food DFEs, and 1 for supplemental DFEs (Supplemental Table 1, Figure 1B). Full EWAS results are available as a downloadable file (32). A DMP at *HENMT1* (HEN methyltransferase 1) (cg16977637) on chromosome 1 had a positive association (regression coefficient: 2.45×10^{-04} ; FDR = 0.030) with food DFEs, whereas an intergenic probe (cg17582160) was inversely associated with supplemental DFEs (coefficient: -0.724 ; FDR = 0.032). The top 10 probe-specific

results for each folate variable are shown in Supplemental Table 1. Gene set enrichment analysis for the top 1000 probes was unremarkable for all folate sources. Correlation between regression coefficients was evaluated to characterize consistency of effect between folate sources (Supplemental Figure 3). The strength of correlation was strongest between total folate and food DFEs (Spearman's $R = 0.75$, $P < 2.2 \times 10^{-16}$). Correlation remained significant, although weaker, between total and supplemental DFEs ($R = 0.16$, $P < 2.2 \times 10^{-16}$) and food and supplemental DFEs ($R = 0.05$, $P < 2.2 \times 10^{-16}$).

Regional analysis by folate source

DMRs were analyzed using *Comb-p* (29). A total of 32 DMRs were identified in association with total folate DFEs [18 (56.3%)

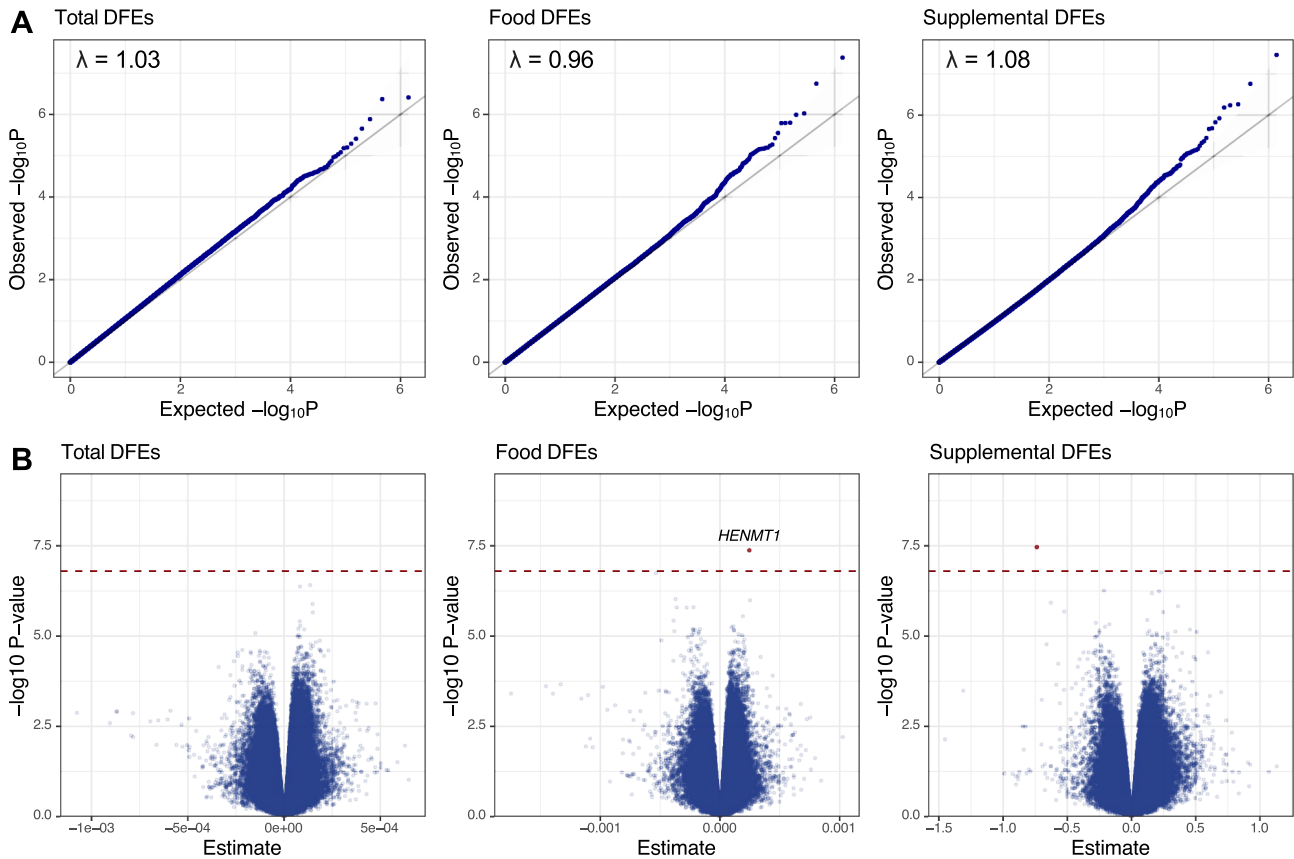


FIGURE 1 CpG-specific epigenome-wide association study results by maternal periconceptional folate source. A total 697,560 CpGs from the EPIC DNA-methylation array (Illumina) were included in multivariable linear regression analysis. (A) Quantile-quantile (QQ) plots demonstrating distribution of observed versus expected $-\log_{10}$ raw P values for total, food, and supplemental periconceptional DFEs. Lambda values (λ) on plots represent estimation of genomic inflation, which was minimal across the 3 folate sources. (B) Volcano plot demonstrating $-\log_{10}$ raw P value by regression coefficient. One significant DMP was identified in association with food folate and a second in association with supplemental folic acid intake. The hatched line represents $FDR < 0.05$. Significant DMPs are positioned above the hatched line and are bolded, with associated gene names presented on the plot; unnamed DMPs are intergenic. DFE, dietary folate equivalent; DMP, differentially methylated probe; FDR, false discovery rate.

predominantly hypermethylated and 14 (43.8%) hypomethylated in response to folate intake], 35 were associated with food DFEs [14 (40.0%) hypermethylated, 21 (60.0%) hypomethylated], and 48 were associated with supplemental DFEs [41 (85.4%) hypermethylated, 7 (14.6%) hypomethylated] (Figure 2, Table 2, Supplemental Tables 3 and 4). Regional gene set enrichment analysis was unremarkable. A region spanning 1137 bp on chromosome 6 within the promoter region of *DUSP22* (dual specificity phosphatase 22) was the top DMR for total and food DFEs, although it was not associated with supplemental DFEs (Figure 3). Regression coefficients for the 2 folate sources were negative for all 9 probes in the *DUSP22* region, indicating an inverse relation with DNA methylation (Supplemental Figure 4A). Probes in the region showed $P < 0.05$ only in ALL cases and not controls when analyzed independently (Supplemental Figure 4B).

Subgroup-stratified EWAS analysis

Regression analysis was repeated in subgroups stratified by Hispanic ethnicity, household education, annual income, and total folate intake (Supplemental Table 2 and Supplemental Tables 5–9; Supplemental Figure 2B–F). Two DMPs were

identified among Hispanic subjects ($n = 175$, n exposed to supplemental folic acid = 33), both associated with supplemental DFEs. One DMP was identified in association with supplemental folic acid intake in non-Hispanic White subjects ($n = 159$, n exposed = 59) (Supplemental Table 9). Subjects with low annual income ($n = 257$, n exposed to supplemental folic acid = 50) had 1 DMP for total, 2 for food, and 21 for supplemental DFEs, whereas high-income subjects ($n = 137$, n exposed = 64) had no significant DMPs for any folate category. Subjects with a lower educational level ($n = 132$, n exposed to supplemental folic acid = 15) had 241 significant DMPs for supplemental DFEs and no significant DMPs for total and food DFEs, whereas those with a higher education ($n = 262$, n exposed = 99) had 22 significant DMPs for food DFEs but none for total and supplemental DFEs. Subjects with low total folate intake ($n = 197$, n exposed to supplemental folic acid = 10) had 3 DMPs associated with supplemental DFEs and none for total and food DFEs, whereas high-total-folate subjects ($n = 197$, n exposed = 104) had no significant DMPs for any folate category.

To assess ethnicity-related differences within these subgroups, we next stratified Hispanic and non-Hispanic subjects by annual income, household education, and total folate intake separately

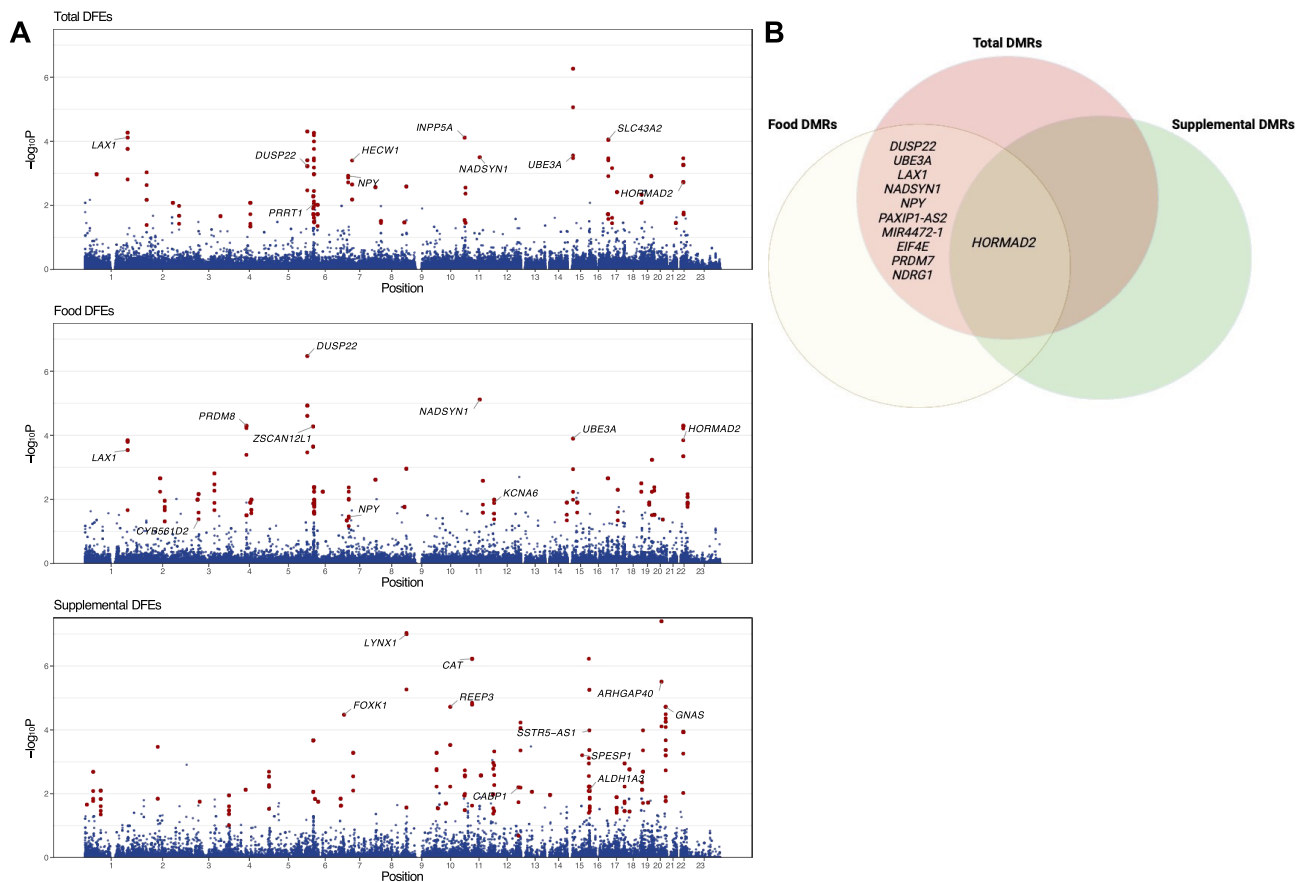


FIGURE 2 Differentially methylated regions by folate source. DMRs by folate source were identified based on spatial correlation of P values using *Comb-p* Šidák P values, which are corrected for multiple comparisons across regions according to the *Comb-p* algorithm. A Šidák P -value threshold <0.05 was used to define significance. (A) Manhattan plots shown demonstrate $-\log_{10}$ region P values from *Comb-p* analysis by chromosomal position. Probes within DMRs are bolded, with labels for the top 10 DMRs by P value. A total of 32 DMRs were identified in association with total folate intake, 35 associated with food folate intake, and 48 with supplemental folic acid. (B) Venn diagrams of probes overlapping between folate sources demonstrate a single DMR (at *HORMAD2*, *HORMA* domain containing 2) common to all sources, along with 10 additional DMRs overlapping between total and food sources. No additional DMRs overlapped between total and supplemental sources or food and supplemental sources. Panel B was created with BioRender.com. DFE, dietary folate equivalent; DMR, differentially methylated region.

for analysis. Hispanic subjects with low household education ($n = 102$, n exposed to supplemental folic acid = 12), low annual income ($n = 150$, n exposed = 21), and low total folate intake ($n = 83$, n exposed = 2) demonstrated 215, 90, and 387 DMPs associated with supplemental DFEs, respectively (Figure 4, Supplemental Figure 5A–C). Hispanic subjects with low household education additionally had 1 DMP associated with total DFEs and 2 associated with food DFEs. In Hispanic subjects with high household education ($n = 73$) and high total folate intake ($n = 92$) there were no significant DMPs for any folate category, whereas those with high income levels ($n = 25$) could not be assessed independently due to the small sample size. The sample size for non-Hispanic White subjects with a low educational level ($n = 23$) precluded regression analysis. Non-Hispanic White subjects with low income ($n = 77$, n exposed to supplemental folic acid = 23) had 1 significant DMP associated with supplemental DFEs (Supplemental Figure 6A–C). Non-Hispanic White subjects with lower total folate intake ($n = 84$) had 2 significant DMPs for food DFEs and 14 DMPs for supplemental DFEs (n exposed = 5).

Non-Hispanic White subjects with high household education ($n = 136$) had 1 DMP associated with food DFEs, whereas those with high income ($n = 82$) and high total folate intake ($n = 75$) had no significant findings. Subgroup-specific DMRs are provided in Supplemental Table 3 and Supplemental Tables 10–14.

Comparison to prior maternal folate-responsive DNA methylation sites

To evaluate consistency with prior studies, we compared the coefficient direction of effect for 359 CpG sites that overlapped with 443 folate-responsive sites (13) identified in 2 European cohorts: MoBa and GenR (Supplemental Table 15). Total folate intake coefficients were associated with published meta-analysis results from the 2 cohorts (Spearman's $R = 0.15$, $P = 0.003$; Supplemental Figure 7A–C). Independently, our results showed a stronger correlation with the GenR cohort ($R = 0.25$, $P = 1.10 \times 10^{-06}$) than the MoBA cohort ($R = 0.065$, $P = 0.220$).

TABLE 2 Top differentially methylated regions by folate source¹

Folate source and chromosome	Position (Hg 19)		Width, bp	No. of probes	Gene association	Šidák <i>P</i>	DNA methylation response to folate
	Start	End					
Total							
6	291687	292823	1137	9	<i>DUSP22</i>	8.18×10^{-13}	Negative
10	134331790	134332442	653	6	<i>INPP5A</i>	9.76×10^{-10}	Positive
15	25684578	25684849	272	5	<i>UBE3A</i>	4.00×10^{-9}	Positive
1	203734167	203734559	393	7	<i>LAXI</i>	3.49×10^{-6}	Negative
17	1508261	1508723	463	8	<i>SLC43A2</i>	4.52×10^{-6}	Positive
6	32120773	32121368	596	20	<i>PRRT1</i>	9.85×10^{-6}	Negative
22	30476089	30476525	437	11	<i>HORMAD2</i>	6.18×10^{-5}	Negative
11	71210210	71210295	86	2	<i>NADSYN1</i>	9.61×10^{-5}	Positive
7	43288635	43288940	306	5	<i>HECW1</i>	1.34×10^{-4}	Positive
7	24323559	24323939	381	8	<i>NPY</i>	2.28×10^{-4}	Positive
Food							
6	291687	292823	1137	9	<i>DUSP22</i>	1.25×10^{-16}	Negative
7	24323559	24323939	381	8	<i>NPY</i>	1.30×10^{-11}	Positive
4	81118343	81119473	1131	10	<i>PRDM8</i>	6.96×10^{-10}	Positive
12	4918075	4919230	1156	10	<i>KCNA6</i>	4.68×10^{-7}	Positive
11	71210210	71210295	86	2	<i>NADSYN1</i>	1.08×10^{-6}	Negative
22	30476089	30476525	437	11	<i>HORMAD2</i>	3.97×10^{-6}	Negative
6	28058724	28059208	485	9	<i>ZSCAN12P1</i>	4.53×10^{-6}	Negative
1	203734167	203734559	393	7	<i>LAXI</i>	1.68×10^{-5}	Negative
15	25684578	25684849	272	5	<i>UBE3A</i>	1.72×10^{-5}	Positive
3	50388823	50388924	102	5	<i>CYB56ID2</i>	6.14×10^{-5}	Positive
Supplemental							
15	69222592	69223018	427	6	<i>SPESP1</i>	3.05×10^{-14}	Positive
8	143859669	143860090	422	9	<i>LYNX1</i>	1.06×10^{-10}	Positive
20	37230326	37230741	416	6	<i>ARHGAP40</i>	1.64×10^{-9}	Positive
11	34460107	34460789	683	12	<i>CAT</i>	1.14×10^{-8}	Positive
7	4762236	4762371	136	2	<i>FOXK1</i>	3.20×10^{-7}	Negative
16	1121693	1122047	355	5	<i>SSTR3-AS1</i>	5.77×10^{-7}	Positive
10	65733092	65733575	484	5	<i>REEP3</i>	1.92×10^{-6}	Positive
15	101389272	101390023	752	5	<i>ALDH1A3</i>	2.66×10^{-6}	Positive
20	57427412	57427977	566	18	<i>GNAS</i>	3.30×10^{-6}	Positive
12	121087689	121088408	720	3	<i>CABP1</i>	6.57×10^{-6}	Positive

¹The top 10 DMRs by folate source identified based on spatial correlation of *P* values using *Comb-p*. Šidák *P* values are corrected for multiple comparisons across regions according to the *Comb-p* algorithm. The top region associated with total and food folate intake located on chromosome 22 and associated with the promoter region of *DUSP22*. A total of 32 DMRs were identified in association with total, 35 associated with food, and 48 with supplemental folic acid intake. *ALDH1A3*, aldehyde dehydrogenase 1 family member A3; *ARHGAP40*, Rho GTPase activating protein 40; *CABP1*, calcium binding protein 1; *CAT*, catalase; *CYB56ID2*, cytochrome b561 family member D2; DMR, differentially methylated region; *FOXK1*, forkhead box K1; *GNAS*, GNAS complex locus; Hg19, human genome reference assembly (GRCh37); *HECW1*, HECT, C2 and WW domain containing E3 ubiquitin protein ligase 1; *HORMAD2*, HORMA domain containing 2; *INPP5A*, inositol polyphosphate-5-phosphatase A; *KCNA6*, potassium voltage-gated channel subfamily A member 6; *LAXI*, lymphocyte transmembrane adaptor 1; *LYNX1*, Ly6/neurotoxin 1; *NADSYN1*, NAD synthetase 1; *NPY*, neuropeptide Y; *PRDM8*, PR/SET domain 8; *PRRT1*, proline rich transmembrane protein 1; *REEP3*, receptor accessory protein 3; *SLC43A2*, solute carrier family 43 member 2; *SPESP1*, sperm equatorial segment protein 1; *SSTR3-AS1*, *SSTR3* antisense RNA 1; *UBE3A*, ubiquitin protein ligase E3A; *ZSCAN12P1*, zinc finger and SCAN domain containing 12 pseudogene 1.

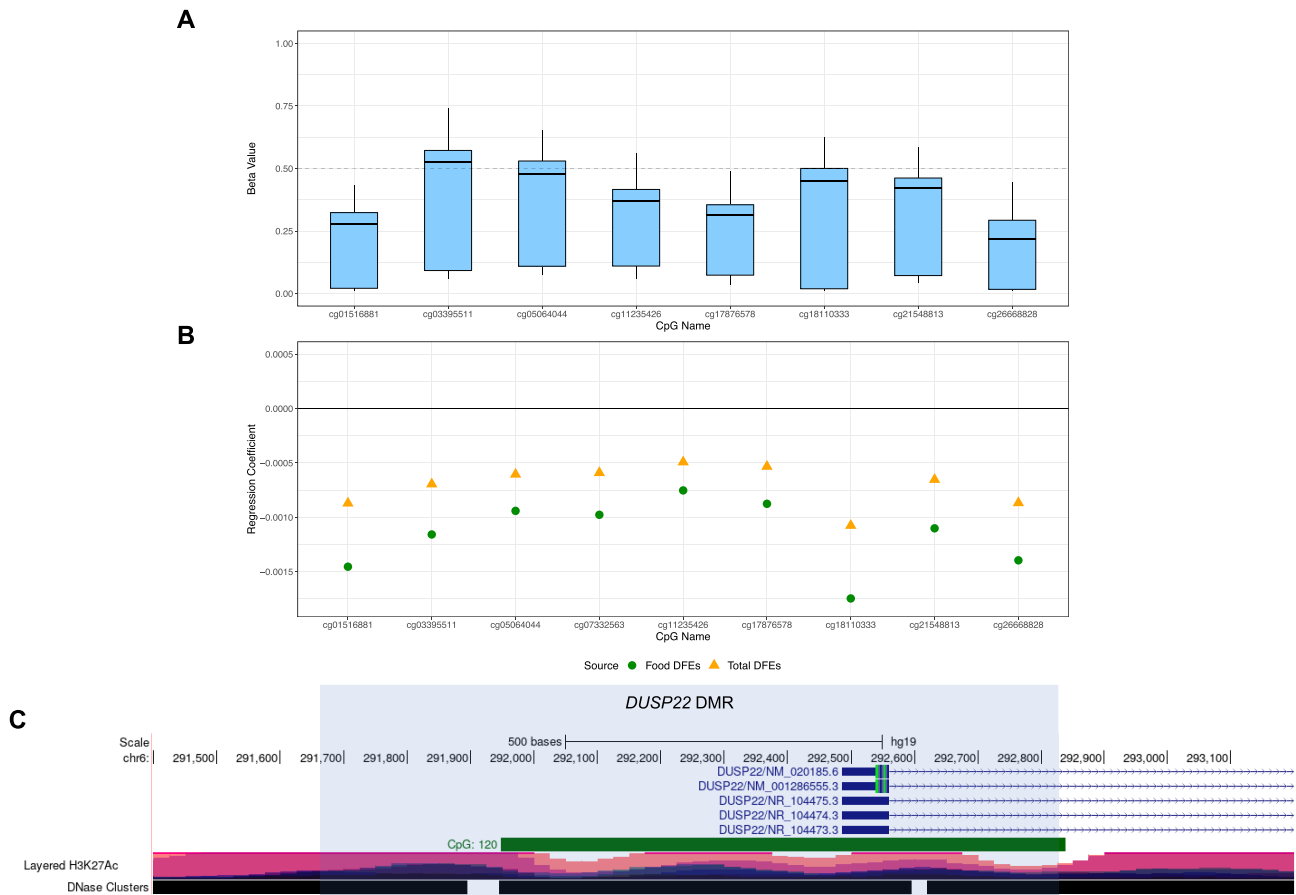


FIGURE 3 Regional description of the top DMR at *DUSP22* (dual specificity phosphatase 22). (A) Box plot diagram of DNA methylation B-values for all subjects ($n = 394$) for the 9 CpG probes located within the 1137-bp region on chromosome 6 associated with the promoter region of *DUSP22* identified in *Comb-p* in association with maternal total and food folate intake. (B) Regression coefficients for the same 9 CpG probes within the region for maternal total and food folate intake. (C) Diagram of local region surrounding the *DUSP22* DMR (shaded region) on chromosome 6 with annotations from the UCSC Genome Browser including CpG island regions and H3K27 acetylation sites. DMR, differentially methylated region; *DUSP22*, dual specificity phosphatase 22.

Leukemia-specific associations

A total of 8 CpGs were found to have an interaction between ALL case status and food folate intake (FDR = 0.003–0.026; **Table 3**). No significant interactions were identified for total or supplemental DFEs. Significant probes were subsequently analyzed in subgroups stratified by ALL case status (**Supplemental Figure 8**) following winsorization of extreme outliers (**Supplemental Figure 9**). Coefficients for all 8 CpGs were opposed in direction of effect between ALL cases and controls. P values ranged from 3.03×10^{-05} to 0.014 in cases, whereas just 1 CpG (cg24425686, associated with *CERK*, ceramide kinase; $P = 0.037$) had $P < 0.05$ in controls (remaining control P values ranged from 0.162 to 0.844).

Discussion

These results identify site-specific and regional associations between periconceptional folate intake and DNA methylation in offspring varying by dietary source. We identified DMPs for food and supplemental sources, but none when assessing these sources as combined total folate intake. Although 11 DMRs overlapped between total and food folate sources, just 1 supplemental DMR

overlapped with the other folate sources. This divergence in results between total, food, and supplemental sources implies a distinct relation for each folate source in contributing to the early establishment of DNA methylation.

We additionally show that the relation between maternal dietary folate intake and DNA methylation at birth varies by Hispanic ethnicity, household education, annual income, and the overall amount of folate consumed. For individuals with lower educational and income levels, the strongest relation with DNA methylation variation resulted from supplemental folic acid intake. This finding was likely driven by Hispanic subjects, who showed substantially greater association with supplemental folic acid intake compared with non-Hispanic White subjects in the low-education and low-income subgroups. This finding agrees with prior studies that identified ALL risk reduction in Hispanic patients with the highest concentrations of maternal supplemental folic acid (5) and those with mothers of low education (9), indicating a potential additional benefit to targeted folate supplementation in these groups. All subjects in the low-overall-folate subgroup failed to meet US national guidelines for folate intake during pregnancy (>600 DFEs). Although the identified association with supplemental folic acid

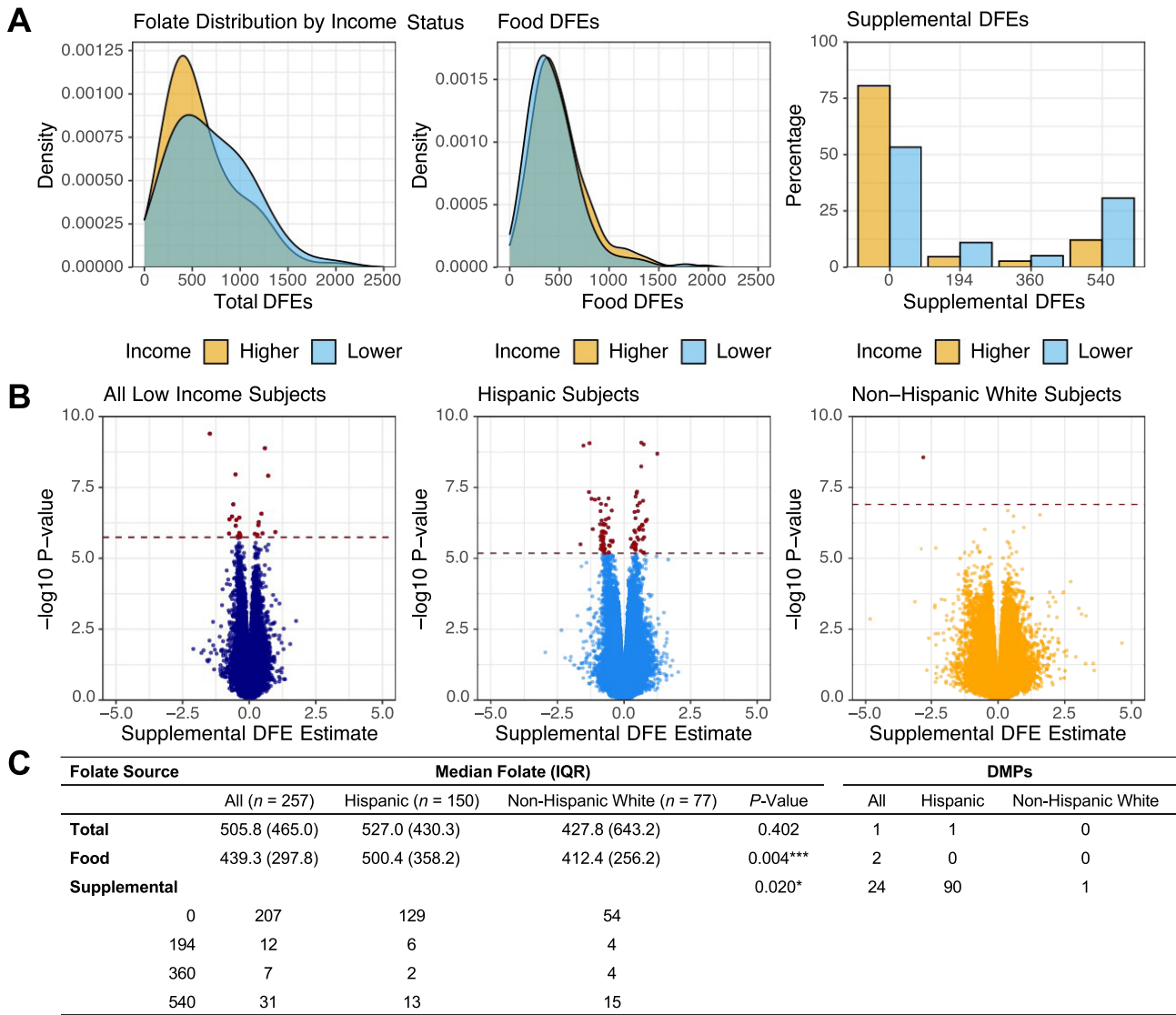


FIGURE 4 Hispanic subjects within the low-income stratification show a stronger association with supplemental folic acid intake compared with non-Hispanic White subjects. (A) Folate distribution by source within lower-income subjects (annual income <\$75,000/y) stratified by Hispanic ($n = 150$) and non-Hispanic White ($n = 77$) subjects. Hispanic subjects were found to take in higher concentrations of folate from food sources, whereas non-Hispanic White subjects take in higher concentrations of folate from supplemental sources. (B) Regression results were associated with supplemental folic acid intake in all lower-income subjects ($n = 257$; left panel) compared with regression results further stratified by Hispanic subjects only (middle panel) and non-Hispanic White subjects (right panel). The hatched line represents $FDR < 0.05$. Bolded points positioned above the hatched line represent significant DMPs. (C) Table demonstrating median folate values in lower-income subjects further stratified by Hispanic ethnicity. DFE, dietary folate equivalent; DMP, differentially methylated probe; FDR, false discovery rate.

intake remained consistent across Hispanic compared with non-Hispanic White subgroups, the low number of subjects exposed to supplemental folic acid within these stratifications may have contributed to the large number of significant findings.

We identified a DMR linked to total and food periconceptual folate intake at the promoter region of *DUSP22*, a protein phosphatase and known tumor suppressor involved in mitogen-activated protein kinase (MAPK) and signal transducer and activator of transcription 3 (STAT3) regulation (33). *DUSP22* rearrangements constitute 30% of ALK (anaplastic lymphoma kinase)-negative anaplastic large-cell lymphoma (34) and are found dysregulated in chronic lymphocytic leukemia (35). The

gene body region of *DUSP22* has additionally been identified in multiple studies to be differentially methylated in pediatric ALL at diagnosis (16, 36), and has been shown to be hypermethylated in response to maternal folate depletion in mouse models (15). This study is the first to confirm a similar direction of effect in response to maternal folate in humans. Although the direction of effect was the same between ALL cases and controls in this study, the strength of association was greater in ALL cases.

We identified unique relations between periconceptual folate and DNA methylation by ALL case status, including DMPs associated with *CERK* (ceramide kinase), *CUTA* (cutA divalent cation tolerance homolog), *WDFY4* (WDFY family

TABLE 3 Differences in DNA methylation responsiveness to maternal periconceptional food folate by pediatric leukemia case status¹

CpG	Chr	Position (Hg19)	Gene	Interaction Term			Cases (n = 189)		Controls (n = 205)	
				Coef.	SE	FDR	Coef.	P	Coef.	P
cg24425686	22	47100062	<i>CERK</i>	-5.44×10^{-04}	9.13×10^{-05}	0.003	-1.65×10^{-04}	0.002	9.97×10^{-05}	0.037
cg08267698	6	33386073	<i>CUTA</i>	4.66×10^{-04}	7.99×10^{-05}	0.003	2.02×10^{-04}	1.19×10^{-04}	-5.23×10^{-05}	0.162
cg00277198	10	49973686	<i>WDFY4</i>	-5.04×10^{-04}	8.70×10^{-05}	0.003	-1.66×10^{-04}	2.61×10^{-04}	6.04×10^{-05}	0.112
cg14946192	11	65729164	<i>SART1</i>	3.00×10^{-04}	5.27×10^{-05}	0.005	7.82×10^{-05}	0.002	-6.07×10^{-06}	0.844
cg04656615	20	43711547	—	-4.77×10^{-04}	8.47×10^{-05}	0.005	-1.36×10^{-04}	0.003	3.51×10^{-05}	0.354
cg19839822	22	42579537	<i>TCF20</i>	-6.26×10^{-04}	1.12×10^{-04}	0.005	-1.48×10^{-04}	3.92×10^{-04}	2.37×10^{-05}	0.523
cg11943916	5	172282611	<i>ERGIC1</i>	-5.19×10^{-04}	9.81×10^{-05}	0.021	-1.37×10^{-04}	0.014	3.65×10^{-05}	0.442
cg14541523	12	132089933	—	-6.29×10^{-04}	1.21×10^{-04}	0.026	-3.12×10^{-04}	3.03×10^{-05}	2.40×10^{-05}	0.767

¹To identify CpG sites with variation in effect by leukemia case status, an interaction term incorporating source-specific folate DFEs and leukemia case status was analyzed in the linear regression model. Interaction term CpGs with FDR <0.05 were then assessed using multivariable linear regression in leukemia case- and control-stratified subgroups to assess variation in the effect of maternal periconceptional folate on DNA methylation. A total of 8 interaction CpGs with FDR <0.05 were identified in association with maternal food folate intake. Following winsorization of extreme outliers, case-stratified regression analysis at these 8 probes demonstrated opposing direction of effect in ALL cases and controls. All probes were significant ($P < 0.05$) in ALL cases, whereas just one (cg24425686) was significant in controls. ALL, acute lymphoblastic leukemia; *CERK*, ceramide kinase; Chr, chromosome; Coef., coefficient; *CUTA*, cutA divalent cation tolerance homolog; *ERGIC1*, endoplasmic reticulum-golgi intermediate compartment 1; DFE, dietary folate equivalent; FDR, false discovery rate; Hg19, human genome build version 19; *SART1*, spliceosome associated factor 1; *TCF20*, transcription factor 20; *WDFY4*, WDFY family member 4.

member 4), *SART1* (spliceosome associated factor 1), *TCF20* (transcription factor 20), and *ERGIC1* (endoplasmic reticulum-golgi intermediate compartment 1). Each of these genes are previously identified as differentially methylated at diagnosis in B-cell precursor ALL (36). All sites demonstrated an opposing direction of effect in ALL cases and controls. We did not directly test for an underlying mechanism to explain variation in folate responsiveness at these sites, including mediation by genetic variation. However, evidence of a variable response in ALL cases lends support for folate to act as a driver of early changes in DNA methylation, which impact future pediatric ALL development.

The strength of this study is the large sampling of subjects with both perinatal DNA methylation data, prior to onset of pediatric ALL, and detailed periconceptional dietary folate calculations for mothers. We also show that our results are correlated with a prior study investigating maternal folate-responsive DNA methylation sites in offspring (13). This correlation was stronger for the GenR cohort than the MoBa cohort when assessed independently. We did not identify a clear explanation for this difference, as both cohorts are based on European populations (Norway and the Netherlands) and did not differ obviously in subject characteristics (13). In part, this difference may be attributable to variation in the timing and method of folate measurement, as the GenR cohort evaluated maternal blood folate concentrations at 12 wk of gestational age and the MoBa cohort measured this concentration at 16 wk. This study, in contrast, evaluated DFEs calculated through retrospectively obtained maternal dietary history, creating a potential for inaccuracies in data acquisition and recall bias, in particular given that no formal assessment of the reliability of the mBFFQ exists (31). However, although knowledge of a general benefit for folate intake in pregnancy is prevalent, its specific association with ALL risk is less widely known, which may serve to limit variation in recall between ALL cases and controls included in this study (37). Dietary folate calculations may also fail to account for variation in folate bioavailability resulting from potential differences in dietary absorption, drug interactions, and variants in genes involved in folate metabolism, which also are associated with risk of pediatric ALL (38–40). However, direct measurement of serum folate may vary temporally by recency of food intake and thus may not be fully reflective of maternal folate stores (41) available to the developing fetus. Finally, as ALL-defining chromosomal translocations have been identified at birth, we cannot fully rule out the influence of a subpopulation of pre-leukemic cells on the reported results of this study.

In summary, we identified a source-specific relation between dietary periconceptional folate and DNA methylation at birth. We additionally identified a particular impact for supplemental folic acid in Hispanic subjects, specifically those with lower educational and lower income levels. Further investigations into the relation of maternal folate on DNA methylation at birth should account for these varying folate sources. We also identified DNA methylation variation by ALL case status, including a notable region of interest at *DUSP22*. Further investigation into a potential functional role for this early molecular alteration in ALL predisposition in children is warranted.

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The authors' responsibilities were as follows—EMN, JLW, CM, and AJs: designed the study; AYK, LM, CM, EMN, and SL: collected data and prepared data for analysis; EMN: analyzed the data and statistical approach and prepared the manuscript; AYK, LM, and CM: organized the provision of study samples; and all authors: read and approved the final manuscript. The authors report no conflicts of interest.

Data Availability

Data described in the manuscript, code book, and analytic code will be made available upon reasonable request pending approval from authors. The data underlying this article are available in the article and in its online supplementary material. This study used biospecimens from the California Biobank Program, which prohibits uploading of genomic data (including genome-wide DNA-methylation) and/or sharing of individual level data obtained from these biospecimens under the statutory scheme of the California Health and Safety Code Sections 124980(j), 124991(b), (h), and 103850(a) and (d). Results of the EWAS analysis presented in this study are provided as a downloadable file for all subjects, Hispanic subjects only, and non-Hispanic white subjects (32).

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