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Epigenome-wide association study links site-specific DNA methylation changes with cow's milk allergy

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Summary

We demonstrate that DNA methylation alterations at multiple genes, including those in the TH₁-TH₂ pathways and some novel genes, are associated with cow's milk allergy (CMA), which shed new light on the epigenetic underpinnings of CMA.

Keywords

DNA methylation; cow's milk allergy; epigenome-wide association

To the editor

IgE-mediated cow's milk allergy (CMA), which affects 2-3% of young children, is among the most common types of food allergy (FA). The molecular mechanisms underlying the development, persistence, and resolution of CMA remain largely unknown. Several recent studies have suggested that epigenetic alterations are involved in allergy development.^{1, 2} DNA methylation (DNAm), a type of epigenetic mechanism, regulates gene expression. Alterations in DNAm play a key role in T-cell differentiation and in maintaining TH₁/TH₂ balance,^{1, 2} and thus may offer a potential mechanistic explanation for the natural history of CMA. However, to date, research on the epigenetics of FA,³ or CMA in particular,⁴ has been very limited. Most of the available studies are based on small sample sizes (<60 children), and were not replicated in an independent sample.

We performed the first epigenome-wide association study (EWAS) of CMA in U.S. children using a two-stage approach. In the discovery stage, we measured DNAm at 485,512 genomic loci in whole blood samples from 106 Caucasian children with CMA (cases) and 76 non-allergic and non-atopic Caucasians (controls) using the Illumina HumanMethylation450 arrays. All of the cases and controls were enrolled by the Chicago Food Allergy Study using identical protocols. We then sought to validate the top significant DNAm loci in two independent replication samples including: 1) childhood whole blood samples of 25 Caucasian children (5 CMA cases and 20 controls) from the same Chicago Food Allergy

Study (Chicago replication sample), and 2) cord blood samples from 140 African-American children (8 cases and 132 controls) from the Boston Birth Cohort (Boston replication sample) (see Methods in the online Repository). Population characteristics of the discovery and replication samples are presented in Tables E1 and E2, respectively.

CMA cases were defined if the children met the following criteria: 1) a convincing history of symptoms indicative of an allergic reaction within 2 hours of ingestion of cow's milk; and 2) clear evidence of sensitization defined as having a specific IgE (sIgE) ≥ 0.35 kU/L to cow's milk and/or a positive skin prick test to cow's milk with mean wheal diameter ≥ 3 mm greater than the saline control. After quality control steps (see Methods in the online Repository), 435,642 CpG sites were available for subsequent data analyses. We fit a linear regression model for ComBat-transformed M value at each CpG site as a function of CMA status, adjusting for potential confounders (see Methods in the online Repository). Bonferroni correction was applied to account for multiple testing ($p < 1.15E-07$).

In the discovery stage, we identified 575 significant autosomal differentially methylated positions (DMPs) (469 located within 385 genes and 106 intergenic): 568 hypomethylated and 7 hypermethylated in CMA cases compared to controls ($p < 1.15E-07$, Fig 1). The majority of these 575 DMPs showed a small DNAm change between cases and controls, and only five DMPs had an absolute mean DNAm difference $\geq 5\%$ (Fig 1 & Table 1). On the X-chromosome, DMP cg16737869 met our p-value significance threshold, but with a modest DNAm change between cases and controls (2%).

In parallel with individual DMP analyses, we performed a genome-wide screen to identify differentially methylated regions (DMRs) using a “bump hunting” approach. A marginally significant DMR in the 3' untranslated region of the *Enah/Vasp-like (EVL)* gene was identified, which was hypomethylated in CMA cases compared to controls (family-wise error rate=0.085, Fig E1a). This DMR included five highly correlated DMPs ($r > 0.8$, Fig E1b) that were all significantly associated with CMA at $p < 1.15E-07$, two of which having a DNAm difference $> 5\%$ between cases and controls.

We then performed KEGG pathway enrichment analysis using WebGestalt on the 386 annotated genes that contained at least one significant DMP associated with CMA. Three enriched pathways were identified, including “Butirosin and neomycin biosynthesis”, “Starch & sucrose metabolism” and “Fructose and mannose metabolism”, all of which shared three genes (*hexokinase 1-3*) that are critical to glucose metabolism (Table E3). This result supports our previous findings on the significant associations between gestational diabetes and increased risk of food sensitization.⁵

Replications

Among the 576 DMPs associated with CMA, 10 loci meeting the following criteria were selected for replication: 1) significant DMPs with an absolute DNAm difference $> 5\%$ ($n=5$); and/or 2) significant DMPs that annotated to genes relevant to the TH₁-TH₂ pathway ($n=5$) (Table 1). In the Chicago replication sample, 7 DMPs were validated for their associations with CMA at a false discovery rate (FDR) < 0.05 (Table 1). In the Boston replication sample, only DMP cg08404225 in the *IL5RA* gene was significantly hypomethylated in CMA cases

relative to the normal controls after FDR correction (FDR=0.01). The associations between the 8 validated DMPs and CMA in the replication samples were in the same directions as were identified in the discovery sample (Table 1, Fig E2).

The biological significance of the 8 validated DMPs was explored with a web tool, EpiExplorer. As shown in Table E4, DMP cg11770323 overlapped with the DNaseI hypersensitive site; DMP cg18550847 was within a CpG island; and DMPs cg13316148, cg08404225 and cg26787239 overlapped with the enhancers and with lamina-associated domains (LAD). We also found that DMPs cg16386158, cg13316148, cg26787239 and cg11770323 co-localized with the CTCF-binding sites (Table E4). Overall, these data indicate that DNAm alteration of these loci may be biologically relevant, but further validation is needed.

This study not only confirmed that DNAm alterations in TH₁-TH₂ balance (i.e., those annotated to *IL1RL1*, *IL5RA*, *IL4*, *CCL18* and *STAT4* genes) are associated with CMA, it also revealed some novel candidates for CMA. Among the 8 validated DMPs, three DMPs, all with absolute mean DNAm >5% between cases and controls, were annotated to *NDFIP2* (cg11770323), *EVL* (cg18550847) and *TRAPPC9* (cg09377531), respectively. These three genes have not previously been implicated in allergy, but their role may be biologically plausible. *NDFIP2*, one of the *IL-4* regulated genes, can promote interferon gamma production via polarized human TH₁ lymphocytes.⁶ *NDFIP2* can also activate E3 ubiquitin ligases, which may play an important role in preventing allergic diseases. *EVL* is one of the IL-13-regulated genes.⁷ The analyses from GIANT⁸ showed that the *EVL* and *IL4* genes are highly co-expressed in basophils. *TRAPPC9* encodes a protein that likely plays a role in NF-kappa-B signaling, a pathway that is relevant to the immune system. Further studies are needed to explore the role of these annotated genes in CMA.

The two replication analyses in this study, although with limited sample sizes, have provided additional information. Replication in the Chicago sample, where the cases were all allergic to both peanut and cow's milk and the non-CMA controls were all allergic to peanut only, suggested that the replicated DNAm associations may be specific to CMA; while replication in the Boston sample, where DNAm was measured in cord blood from African-American samples, indicate that the replicated DNAm alterations between cases and controls may occur in-utero and may be common across race groups.

Several limitations are noted. First, we used whole blood DNA to obtain DNAm profiling. Second, questions remain regarding how to interpret small DNAm differences between CMA and controls, mostly <5%. One possibility is that such small changes in whole blood may be reflective of larger changes in a specific cell type, as demonstrated in a previous study⁹. Third, DNAm levels of the identified DMPs were not validated using other techniques such as pyrosequencing, and no functional assays were conducted in this study. However, previous studies have demonstrated that the 450K array correlates well with direct pyrosequencing.¹⁰

In conclusion, this was the first EWAS of CMA in U.S. children and it clearly demonstrated that methylation alterations in specific gene loci are associated with CMA. Findings from

this study warrant additional validation and functional studies, and, if confirmed, may help to improve our understanding of the epigenetic mechanisms underlying the development and resolution of CMA and offer novel targets for prediction, prevention and treatment of CMA.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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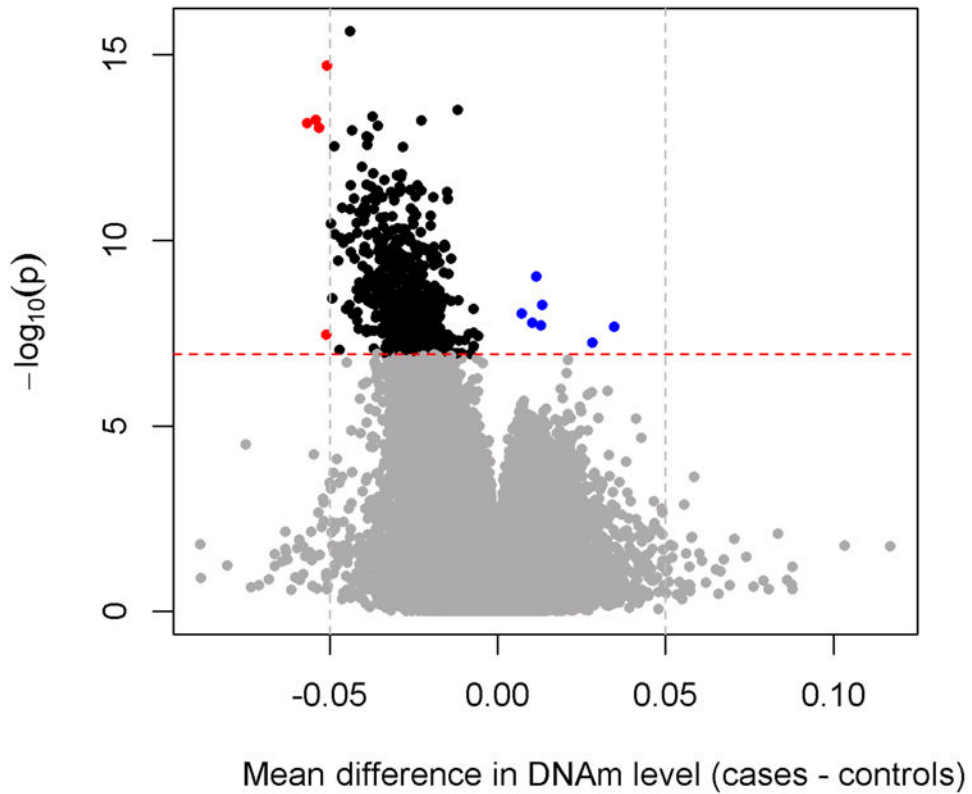


Fig. 1. Volcano plot showing the significance and magnitude of autosomal DNA methylation changes associated with cow's milk allergy (CMA)
Mean differences in DNA methylation (cases-controls) are plotted on the x-axis and corresponding $-\log_{10}(p)$ -value) are plotted on the y-axis. Each point represents a measured CpG site. Black and blue points represent CpG sites significantly hypomethylated and hypermethylated in CMA cases, respectively. Red points represent those significant CpG sites with DNA methylation difference $>5\%$ between cases and controls. The red dashed horizontal line represents the genome-wide significance threshold ($p=1.15E-07$).

The top significant differentially methylated positions and their associations with cow's milk allergy in the discovery and replication samples

Table 1

DMPs	CHR	Gene	Location	Chicago Discovery		Chicago Replication		Boston Replication	
				β_{diff}^a	p-value ^b	β_{diff}^a	p-value ^c	β_{diff}^a	p-value ^d
DMPs with absolute DNAm difference 5% in cases vs controls									
cg11770323	13	<i>NDFIP2</i>	Intron	-5.7	2.0E-15	-4.0	0.005*	-0.9	0.811
cg16409452	14	<i>EVL</i>	3'UTR	-5.4	5.6E-14	-7.3	0.042	-1.4	0.322
cg18550847	14	<i>EVL</i>	3'UTR	-5.3	9.6E-14	-7.4	0.034*	-1.9	0.187
cg09377531	8	<i>TRAPPC9</i>	Intron	-5.1	7.0E-14	-7.8	0.004*	-1.5	0.260
cg15090899	6	<i>RPS6KA2</i>	Exon	-5.1	3.6E-08	-7.1	0.384	-2.1	0.811
DMPs with annotated genes relevant to TH1-TH2 pathway									
cg16386158	2	<i>IL1RL1</i>	TSS1500	-3.8	1.7E-13	-8.8	0.007*	-2.4	0.041
cg08404225	3	<i>IL5RA</i>	5'UTR	-3.7	9.3E-10	-5.5	0.062	-2.2	0.001*
cg13316148	2	<i>STA74</i>	Intron	-3.2	6.3E-09	-5.2	0.013*	-0.4	0.301
cg26787239	5	<i>IL4</i>	TSS1500	-2.6	6.7E-09	-4.8	0.006*	-1.5	0.042
cg06040872	17	<i>CCL18</i>	Intron	-3.2	4.0E-09	-5.2	0.018*	-0.6	0.256

CHR: chromosome; DMP: differentially methylated position; UTR: untranslated region. TSS: translation starting site.

^aMean methylation difference between cases and controls.

^bp-value was calculated based on linear regression models with ComBat-transformed M value at each DMP as the outcome, adjusted for age, gender, breastfeeding, parental history of food allergy, estimated cell composition, and genetic ancestry.

^cp-value was calculated based on the linear regression model with ComBat-transformed M value at each DMP as the outcome, adjusted for cell composition and age. Further adjustment for gender and parental history of allergy did not significantly change the associations.

^dp-value was calculated based on the linear regression model with ComBat-transformed M-value at each DMP as the outcome, adjusted for cell composition, gender, parental history of food allergy, and gestational age group.

* FDR (false discovery rate) < 5%