Placental Malaria Induces a Unique Methylation Profile Associated with Fetal Growth Restriction

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Abstract

Background: Fetal growth restriction (FGR) is associated with perinatal death and adverse birth

outcomes, as well as long-term complications, including increased childhood morbidity, abnormal

neurodevelopment, and cardio-metabolic diseases in adulthood. Placental epigenetic reprogramming

associated with FGR may mediate these long-term outcomes. Placental malaria (PM), characterized by

sequestration of *Plasmodium falciparum*-infected erythrocytes in placental intervillous space, is the

leading global cause of FGR, but its impact on placental epigenetics is unknown. We hypothesized that

placental methylomic profiling would reveal common and distinct mechanistic pathways of non-malarial

and PM-associated FGR.

Results: We analyzed placentas from a US cohort with no malaria exposure (n = 12) and a cohort from

eastern Uganda, a region with a high prevalence of malaria (n = 12). From each site, 8 cases of FGR

(defined as birth weight <10%ile for gestational age by Intergrowth-21 standard curves) and 4 healthy

controls with normal weight were analyzed. PM was diagnosed by placental histopathology. We

compared the methylation levels of over 850K CpGs of the placentas using Infinium MethylationEPIC v1

microarray. Non-malarial FGR was associated with 65 differentially methylated CpGs (DMCs), whereas

PM-FGR was associated with 133 DMCs, compared to their corresponding controls without FGR. One

DMC (cg16389901, located in the promoter region of *BMP4*) was commonly hypomethylated in both

groups. We identified 522 DMCs between non-malarial FGR vs. PM-FGR placentas, which was

independent of differing geographic location or cellular composition.

Conclusion: Placentas with PM-associated FGR have distinct methylation profiles as compared to

placentas with non-malarial FGR, suggesting novel epigenetic reprogramming in response to malaria.

Larger cohort studies are needed to determine the distinct long-term health outcomes in PM-associated

FGR pregnancies.

Background

Malaria in pregnancy leads to adverse birth outcomes including fetal growth restriction (FGR), low birth weight, preterm birth, and fetal loss. In 2022, 12.7 million pregnant individuals in sub-Saharan Africa were exposed to malaria, potentially resulting in an estimated 914,000 babies being born with low birth weight in the absence of pregnancy-specific chemoprevention Placental malaria (PM), characterized by the sequestration of *Plasmodium falciparum*-infected red blood cells (RBCs) in the placental intervillous spaces, has been independently associated with small for gestational age deliveries and poor neurodevelopmental outcomes (1–4). PM is the leading global cause of FGR. Two mechanisms have been proposed: 1) congestion and inflammation, secondary to the sequestration of infected RBCs in the intervillous spaces during pregnancy, disrupt trophoblast invasion and angiogenesis, decreasing umbilical artery flow (5–7); and 2) vascular dysfunction and chronic inflammation contribute to impaired nutrient exchange at the fetal-maternal interface and imbalances in growth factors (8).

Fetal growth is evaluated by in utero ultrasonographic measurements of fetal biometric measurements (9). FGR is defined as an estimated fetal weight or abdominal circumference less than the 10th percentile for gestational age (10). FGR has important influences on human health. Early onset FGR (<32 weeks gestation) and severe FGR (<3rd percentile) are associated with up to 1.5-fold increased risk of stillbirth and a 2 to 5-fold risk of perinatal death (11). Long-term complications of FGR include increased childhood morbidity and cardiovascular, metabolic, and neuropsychiatric diseases in adulthood (2,4,12–24). In areas with no malaria risk, the etiologies of FGR include maternal comorbidities such as hypertension, autoimmune disease, renal insufficiency as well as placental dysfunction, genetic abnormalities, and environmental exposures (10).

PM and FGR independently impact infant growth and neurodevelopment (25–29). These long-term health impacts may be mediated through epigenetic modifications, including DNA methylation, histone marks, and expression of non-coding RNAs (30–32). For example, placental epigenetic modifications proximal to genes such as IGF2, AHRR, HSD11B2, WNT2, and FOLS1 were found to be associated with FGR (33,34). In contrast, epigenetic studies of human responses to malaria have been largely focused on immune markers of disease susceptibility (35,36). Altered DNA methylation has been demonstrated in monocytes after malaria infection, resulting in age-dependent changes in innate immune

and inflammatory responses (37,38). To our knowledge, no studies have examined the epigenetic

interactions among FGR and PM-inflicted pregnancies, although existing evidence suggests the potential

for shared and divergent mechanisms contributing to altered fetal programming. In this study, we

compared methylation profiles in placentas of non-malarial and PM-associated pregnancies, with or

without FGR.

Methods

Study design and subjects

Placental samples were collected from two independent patient cohorts. Cohort 1 (no malaria) was

comprised of 12 placental samples prospectively collected at the University of California, San Francisco,

United States (US) from 2018 to 2022 (IRB #10-00505, #20-32077 and #21-33986). Cohort 2 (malaria

endemic) was comprised of 12 placental samples prospectively collected from 2021-2022 in Busia,

Uganda, as part of a randomized controlled trial of intermittent preventative treatment for malaria in

pregnancy (NCT04336189, IRB#19-29105).

Case definitions: All patients were primigravidas and had no evidence of fetal genetic or structural

anomalies. FGR cases were identified by estimated fetal weight < 10th percentile for gestational age on

all prenatal ultrasounds throughout pregnancy (up to 4 were performed) and birth weight <10th percentile

for gestational age by Intergrowth-21 birth weight standards (39). PM-FGR cases were complicated by

both FGR and placental malaria (PM) diagnosed by placental histopathology according to Rogerson

criteria (40). The presence of *Plasmodium* parasites indicated active PM, whereas malaria pigment

(hemozoin) accumulation in the placental tissue was classified as chronic PM (41). Control cases from

each cohort were from healthy pregnancies with no pregnancy complications and no evidence of malaria

in pregnancy at any time during the study (for Cohort 2). Samples were divided into four groups: 1) FGR

(no malarial FGR, n=8), 2) C^{FGR} (healthy controls from the US, n=4), 3) PM-FGR (placental malaria

associated FGR, n=8), and 4) C^{PM-FGR} (healthy controls from Uganda, n=4; **Figure 1A**). Detailed case

information is provided in **Supplemental Table 1.**

Specimen collection

Placental biopsies were collected from the maternal side of the placenta within 1 hour of delivery.

Biopsies no larger than 5 x 10 x 10mm were washed with ice-cold PBS three times and placed in

RNAlater™ (Qiagen, Germantown, MD). After a minimum incubation of 24 hours in RNAlater at 4°C,

biopsies were frozen and stored at -80°C. The same protocol was followed at both sites.

DNA extraction

DNA was extracted from placental biopsies using a DNeasy Blood & Tissue Kit (Qiagen, Germantown,

MD) according to the manufacturer's standard protocol. Samples were treated with RNase for 2 minutes.

Infinite M NanoQuant (Tecan, Morrisville, NC) was used to estimate the purity and concentration of

extracted DNA. The A260/A280 ratio for all samples was between 1.75-1.93.

Infinium MethylationEPIC v1 Assay

We profiled global methylation of DNA aliquots of placental samples. In brief, bisulfate conversion of 1μg

DNA/sample was performed using and the EZ DNA Methylation-Lightning Kit (Zymo Research, Irvine,

CA). Bisulfite converted DNA was amplified, fragmented, precipitated, resuspended, and hybridized to

Infinium Methylation EPIC v1.0 (Illumina, San Diego, CA) arrays following the manufacturer's protocol.

Arrays were washed to remove any unspecific binding, extended and stained primers and imaged using

iScan (Illumina, San Diego, CA) platform.

RNA extraction and qRT-PCR

RNA was extracted from placental biopsies using RNeasy Mini Kit (Qiagen, Germantown, MD) according

to the manufacturer's standard protocol. Infinite M NanoQuant (Tecan, Morrisville, NC) was used to

estimate the purity and concentration of extracted RNA. The A260/A280 ratio for all samples was

between 2.11-2.19. We converted 500 ng of purified RNA to cDNA using qScript cDNA synthesis kit

(Quantabio, Beverly, MA), and performed qRT-PCR using TaqMan primer for *BMP4* (Hs03676628_s1)

mixed with TaqMan Universal Master Mix II, no UNG (Life Technologies, Quant Studio 6). Reactions were

carried out for 40 cycles. At least 3 technical replicates were analyzed for all comparisons. The

expression level of *BMP4* was calculated via the $\Delta\Delta$CT method. We normalized expression using the

mean CT of the housekeeping gene, GAPDH (Hs02786624_g1).

<u>Bioinformatic analysis</u>

The raw data obtained from the iScan platform was cleaned and preprocessed for data analysis using R

(version 4.2.1) and minfi package (version 1.44.0). The quality of the samples was assessed by

computing detection p-values for all probes. Low-quality probes that failed at a detection p-value of 0.05

in at least 10% of the samples, probes located on the sex chromosome (X and Y), probes with SNPs at

the CpG site, and cross-reactive probes were filtered out prior to quantile normalization and differential

methylation analysis. No samples were excluded based on high p-value probes. The total number of

probes before filtering was 865,859, whereas total number of probes after filtering was 786,227.

Differential methylation analysis was performed by first computing M values, i.e., the log ratios of

methylated vs. unmethylated signal intensities for each probe and limma (version 3.54.2) implemented in

the R-package minfi package. Secondly, β-values were calculated, representing the total % methylation

level of each CpG site. We performed 4 pairwise comparisons: 1) FGR vs. C^{FGR}; 2) PM-FGR vs. C^{PM-FGR};

3) C^{FGR} vs. C^{PM-FGR}; 4) FGR vs. PM-FGR. In comparisons among groups, differentially methylated CpGs

(DMC) were identified based on an unadjusted *p*-value < 0.0001 and an absolute average difference in

methylation ($|\Delta\beta|$) $> 10\%$ (test group vs. control group). Genes proximal to DMCs, were identified using

the University of California, Santa Cruz Genome Browser[42]. Functional gene ontology (GO) enrichment

analysis of genes associated with DMCs was conducted using the Database for Annotation, Visualization

and Integrated Discovery (DAVID)[43]. For qRT-PCR, we conducted Mann-Whitney test between

pairwise comparisons to determine significant differences in expression (p<0.05). Cellular deconvolution

analysis was conducted using *planet* (v1.12) package on R [44]. Figures were generated using R Studio

(v2023.03.0+386), GraphPad Prism (v10.2.3) and BioRender.

Results

<u>Characteristics of study participants</u>

To search for associations between FGR types and methylation patterns in samples from the US and

Uganda we selected a total of 24 placentas divided into four groups: C^{FGR} (n=4), C^{PM-FGR} (n=4). FGR

(n=8), and PM-FGR (n=8). The median and interquartile ranges for gestational age, birth weight and

Intergrowth-21 birth weight percentiles and the percentage of female infants were provided in **Table 1**.

Table 1. Study group characteristics.				
Characteristics	**FGR (n=8)**	**C^{FGR} (n=4)**	**PM-FGR (n=8)**	**C^{PM-FGR} (n=4)**
Gestational age	37.5 (36.7-38.2)	39.2 (39.1-39.5)	39.8 (39.1-41.2)	39.2 (38.3-40.1)
Birth weight (gr)	2193 (2004-2355)	3565 (3048-3768)	2600 (2510-2843)	2915 (2885-3470)
Intergrowth-21 birth weight percentile	2.9 (1.1-5.5)	80.1 (30.1-87.7)	3.9 (3.2-5.7)	29.4 (21.8-76.1)
Infant sex (female)	62.5%	25%	50%	75%

The median and interquartile ranges were provided for gestational age, birth weight and
Intergrowth-21 birth weight percentiles. Percentage of female infants were provided for infant sex.

Dimensional Reduction Analysis

We profiled the methylome of our selected placentas using Illumina Infinium MethylationEPIC Arrays v1.

After applying quality control measures, we compared methylation patterns of 786,227 CpG sites among

FGR, PM-FGR, and respective controls, C^{FGR} and C^{PM-FGR}, from the two unique geographic locations.

Unsupervised principal component analysis using M-values of all CpG sites suggested no overall distinct

separation among the four groups, suggesting general similarities in global methylation profiles

independent of FGR or PM-FGR status or collection site (**Figure 1B-E**). In pairwise comparisons

between groups, separation was most prominent between FGR and PM-FGR groups (**Figure 1F**).

Identification of Differentially Methylated CpGs

To better characterize differences in methylation levels with non-malarial FGR and PM-associated FGR

we investigated the differentially methylated CpGs using an unadjusted p value cutoff of p<0.0001 and a

secondary cutoff of at least 10% absolute difference in mean methylation ($|\Delta\beta| > 0.10$). To confirm the

power of the significance cutoff in terms of differentiating the groups, unsupervised hierarchical clustering

was performed using β-values of the respective DMCs. As expected, our samples clustered based on

study group (**Supplemental Figure 1, Supplemental Data 1**).

<u>Differentially Methylated CpGs with FGR</u>

We first investigated the influence of non-malarial FGR on placental methylation profiles in comparison

with their respective geographic controls. We identified 65 DMCs, that were distributed across all

autosomal chromosomes except for chromosomes 19 and 21 (**Figure 2A**). Of the 65 DMCs, 48 were

hypomethylated and 17 were hypermethylated with non-malarial FGR vs. C^{FGR} (**Figure 2B**). While most of

the DMCs were located at the body and intergenic regions, 14 hypomethylated CpGs and 6

hypermethylated CpGs were located in the promoter or 1st exon region (**Figure 2C**). Functional

enrichment analysis through DAVID revealed that the genes associated with the 14 hypomethylated

CpGs located in the promoter or 1st exon region were involved in transport, cellular response to stress,

nephron development and localization within membrane; in contrast, the 6 hypermethylated CpGs were

associated with genes involved in angiogenesis.

<u>Differentially Methylated CpGs with PM-FGR</u>

Next, we investigated the DMCs between PM-FGR vs. C^{PM-FGR}, we identified 133 CpGs that were

distributed across all autosomal chromosomes with the exception of chromosome 9 (**Figure 2D**). Of the

133 DMCs, 82 were hypomethylated and 51 were hypermethylated with non-malarial FGR vs. C^{FGR}

(**Figure 2E**). While most of the DMCs were located at the body and intergenic regions, 12

hypomethylated CpGs and 10 hypermethylated CpGs were located in the promoter or 1st exon region

(**Figure 2F**). Genes associated with the 12 hypomethylated CpGs located in the promoter or 1st exon

region were involved in signaling; the 6 hypermethylated CpGs were associated with genes involved in

cell differentiation, tissue development and transport across the membrane.

<u>Common changes observed with non-malarial FGR and PM-FGR</u>

To identify the epigenetic modulations observed with both non-malarial and PM-FGR, we investigated the

overlapping DMCs between FGR vs. C^{FGR} and PM-FGR vs. C^{PM-FGR} comparisons. We identified only a

single CpG, cg16389901, that was commonly hypomethylated with both FGR and PM-FGR when

compared to their respective controls (**Figure 3A**). In comparing trends in methylation patterns among

DMCs identified in either disease group, we observed distinct patterns between non-malarial FGR and

PM-FGR (**Figure 3B-3C**). The commonly hypomethylated CpG site cg16389901 is in the promoter region

of two splice variants of *BMP4*, a cell growth-related gene known to participate in trophoblast

differentiation within the placenta (45) (**Figure 3D**). Interestingly, DNA methylation levels of other CpGs

associated with *BMP4* did not show a difference between FGR vs. C^{FGR} or PM-FGR vs. C^{PM-FGR}

comparisons, suggesting a specific association with FGR. To understand the impact of differential DNA

methylation on the mRNA level we conducted qRT-PCR targeting *BMP4*. The mRNA expression levels of

BMP4 did not show any significant difference between the four study groups (**Figure 3E**).

<u>Differentially methylated CpGs between FGR vs. PM-FGR</u>

We next compared the methylation profiles between FGR and PM-FGR. To account for baseline

epigenetic differences based on the distinct geographical locations of the two cohorts, we compared the

DMCs between the two control groups (C^{FGR} vs. C^{PM-FGR}), showing 183 CpGs that were differentially

methylated between the two study sites. Of these 183 DMCs, 7 CpG sites were also identified when

comparing FGR vs. PM-FGR. The exclusion of these 7 CpGs as potentially affected by population-based

differences resulted in 522 CpGs that were associated with PM status (**Figure 4A**). The number of DMCs

identified between FGR vs. PM-FGR was more than 8-fold than identified between FGR vs. C^{FGR} and 3-

fold between PM-FGR vs. C^{PM-FGR} comparisons, highlighting the distinct changes observed with PM. The

522 DMCs were distributed across all autosomal chromosomes (**Figure 4B**). Of the 522 DMCs, 143 were

hypermethylated in non-malarial FGR placentas and 379 were hypermethylated in PM-FGR placentas

(**Figure 4C**). While most of the DMCs were located at the body and intergenic regions, 30

hypermethylated CpGs with FGR and 106 CpGs hypermethylated with PM-FGR were located in the

promoter or 1st exon region (**Figure 4D)**. Genes associated with the 30 hypermethylated CpGs with FGR

located in the promoter or 1st exon region were involved in actin cytoskeleton organization, whereas the

106 hypermethylated CpGs with PM-FGR were associated with genes involved in multicellular organism

development, regulation of metabolic processes, nervous system process, cell differentiation and

response to growth factor. Particularly, 3 CpG sites in the promoter region of *ARPC1B* and 4 CpG sites in

the promoter region of *ZSCAN23* were hypermethylated with FGR. On the other hand, 7 CpG sites in the

promoter region of *FAM124B* and 4 CpG sites in the promoter region of *SPG7* were hypermethylated with

PM-FGR.

<u>Identifying the cellular composition of all placental samples</u>

Our study used DNA extracted from homogenized placental tissue. To understand the cellular

composition of each sample, we performed cellular deconvolution analysis based on reference

methylation data of term placental cells generated by Yuan et al. (44) (**Figure 5A**). The robust partial

correlations (RPC) method was used to identify the percentages of syncytiotrophoblasts, trophoblasts,

endothelial cells, stromal cells, Hofbauer cells and nucleated red blood cells (nRBC) based on β-values of

the most distinguishing CpG sites among these cell types. As expected, our placental samples were

predicted based to be enriched for syncytiotrophoblasts, constituting an average of 69.5% of all cells. The

next most prevalent cell types were stromal cells (13.9%), endothelial cells (12.1%), and trophoblasts

(3.8%). The average abundance of Hofbauer cells and nRBC in total was less than 0.6%. We performed

unsupervised hierarchical clustering to investigate whether the cellular composition of samples differed

between the four study groups (**Figure 5B**). Overall, the cellular composition of samples did not show any

clear separation between groups (**Figure 5B, Supplemental Figure 2**). However, hierarchical clustering

of only FGR and PM-FGR samples demonstrated a more prominent clustering between the two groups

(**Figure 5C**). This separation was primarily associated with a significant increase in the percentage of

syncytiotrophoblasts in PM-FGR compared to FGR samples (74.4% vs. 65.5%, respectively; p<0.002).

Only a single CpG site overlapped with the 522 identified CpGs used for cellular deconvolution analysis,

indicating that DMCs identified between FGR vs. PM-FGR were unlikely to be driven by differences in

cellular composition (**Figure 5D**).

Discussion

To our knowledge, this is the first study to investigate methylation profiles in PM. We found that

placentas from non-malarial FGR and placental malaria-associated FGR cases exhibited highly divergent

methylation profiles. Interestingly, there was only a single CpG site, associated with the promoter region

of *BMP4,* that was commonly hypomethylated in placentas associated with both non-malarial FGR and

PM-FGR. In PM-FGR, hypermethylated CpGs were associated with genes encoding proteins involved in

developmental processes, whereas hypermethylated CpGs in FGR were associated with genes encoding

proteins involved in metabolic processes. Cellular deconvolution demonstrated differences in the relative

abundances of placental cell types between placentas associated with non-malarial and PM-FGR;

however, these differences did not explain the distinct methylation profiles of these groups. Overall, our

results suggest novel epigenetic modifications in response to PM-associated FGR compared to those

seen with non-malarial FGR.

Previous studies investigating placental epigenetic changes related to FGR in populations without

risk of malaria identified various differentially methylated CpG sites in genes encoding proteins involved

with fatty acid oxidation, transcriptional regulation, immune responses, cell adhesion, metabolism, and

cell growth (33,46–49). Similar to our study, one study from Korea investigating the methylation levels of

placenta and cord blood samples with FGR described changes in methylation profiles of genes encoding

proteins involved with metabolism and developmental pathways (48). While various studies investigated

methylation profiles of placenta, maternal blood or cord blood samples from pregnancies complicated with

fetal growth restriction, there was a lack of overlap of differentially methylated CpG sites as well as genes

related to those DMCs across these studies (33,34,46,47,49–52). Our results revealed unique

differentially methylated CpG sites and related genes compared to the previous FGR related studies.

Differences in results between studies may have been due to diverse mechanisms of epigenetic

modulation other than DNA methylation, such as histone modifications or non-coding RNA, as well as

differences in study populations.

In analyses of placentas, both non-malarial FGR and PM-FGR were associated with moderate

numbers of differentially methylated CpGs compared to their corresponding controls. Interestingly, a

single CpG site was commonly hypomethylated with both non-malarial FGR and PM-FGR—cg16389901.

This site is located 200-1500 bases upstream of the transcription start site of the *BMP4* gene. *BMP4* is a

well-studied growth-associated protein that also plays an important role in trophoblast differentiation

(45,53). The Korean study also described hypermethylation of genes encoding proteins involved in the

negative regulation of the BMP signaling pathway, which aligns with our results (48). Hypomethylation of

BMP4, resulting in increased expression, may be a common compensatory mechanism in the placenta to

counteract other functional changes that lead to inhibited fetal growth. In our placental samples, mRNA

levels of *BMP4* did not show any significant difference between our study groups. This could suggest that

the hypomethylation of *BMP4* with both non-malarial FGR and PM-FGR is a compensatory response to

normalize the mRNA levels in the setting of other mechanisms that may result in reduced expression of

this protein (e.g. histone modifications, posttranslational modifications)

Hypermethylated CpG sites in placentas from non-malarial FGR compared to PM-associated

FGR included CpGs located at the promoter regions of *ARPC1B* and *ZSCAN23*. Homozygous mutations

in the *ARPC1B* gene have been associated with disruptions in the immune system (54). Promoter region

hypermethylation of *ZSCAN23* has been associated with the acceleration of pancreatic cancer growth

(55). Conversely, hypermethylated CpG sites in placentas from PM-associated compared to non-malarial

FGR included CpGs located at the promoter regions of *FAM124B* and *SPG7*. *FAM124B* has been

proposed as an important protein involved in neurodevelopmental disorders, while SpG7 mutations have

been linked to spastic paraplegia and cerebellar ataxia (56,57). Further follow-up studies on offspring are

needed to investigate long-term outcomes associated with non-malarial FGR vs. PM-associated FGR and

to understand whether these outcomes are mediated by epigenetic mechanisms.

Cellular deconvolution analysis revealed dominance of syncytiotrophoblasts, which were present

in significantly higher proportions in PM-associated FGR samples. Differences in the proportion of

syncytiotrophoblasts may be associated with a classic pathological finding of syncytial knot formation

commonly observed with PM, which is thought to be a response to inflammatory damage associated with

infected RBCs in the intervillous spaces (58). Despite the differences in cellular composition, the

differentially methylated CpGs were distinct from those associated with specific cell types. In contrast, a

study that conducted the same deconvolution analysis on placentas from monochorionic twins with

selective FGR found decreased proportions of stromal cells in the twin with FGR compared to the

normally grown twin (46). This suggests that placental cellular composition may change in different

etiologies of FGR and warrants further study.

Our study has some limitations. First, we had a small sample size, and larger studies are needed

to confirm our findings. Second, due to the homogenization of placental tissue, we were unable to

distinguish between the origins of different cell types, particularly maternal and fetal immune cells. Third,

due to the high prevalence of malaria in pregnancy at our study site in Uganda, we did not identify any

FGR cases from Uganda without evidence of malaria infection during pregnancy; these cases would

provide a more direct comparison between non-malarial and PM-associated FGR in an African

population. Finally, we focused on methylation profiles detected by a targeted methylation array, rather

than whole genome bisulfide sequencing, which may identify additional differentially methylated CpGs.

Further studies investigating other types of epigenetic mechanisms such as histone modifications or

assessment of open chromatin regions would provide deeper insight into epigenetic changes occurring

with non-malarial and PM-associated FGR. Additional transcriptomic and proteomic analysis of similar

cohorts would also reveal insight into downstream effects of epigenetic modifications.

This is the first study, to our knowledge, comparing the methylation profiles of malarial and non-

malarial FGR in the placenta. Other strengths of our study include detailed characterizations of the

pregnancies, allowing for the selection of appropriate controls for each population. We only included

primigravid patients to avoid confounding from gravidity-induced differences in methylation profiles.

Finally, placental biopsies from both sites were collected and processed with the same protocol, allowing

for comparison between the different patient populations.

The significant differences that we found in DMCs in non-malarial and PM-associated FGR, even

after controlling for geographic location, suggest distinct pathways of epigenetic reprogramming in the

setting of FGR with or without PM. The independent and combined impact of placental malaria and

placental epigenetics may have potential implications for long-term health in the offspring.

Declarations

Ethics approval and consent to participate

This study was approved by the University of California, San Francisco and Makerere University. Written

informed consent was obtained from all participants.

Availability of data and materials

The dataset generated during the study will be available in the GEO repository (waiting for accession

number).

Competing interests

The authors declare that they have no competing interests.

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Authors' contributions

Conceptualization: NO and SLG

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Project administration: AK, JK

Supervision: AK, SLG

Writing – original draft: NO and SLG

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Figure Legends

Figure 1. Principal Component Analysis. A. Schematic demonstration of study groups and collection

sites. **B.** Principal component analysis including all samples. **C.** Principal component analysis of FGR and

C^{FGR} samples. **D.** Principal component analysis of PM-FGR and C^{PM-FGR} samples **E.** Principal component

analysis of C^{FGR} and C^{PM-FGR} samples **F**. Principal component analysis of FGR and PM-FGR samples.

Figure 2. Differentially methylated CpGs (DMCs) observed with non-malarial FGR and placental

malaria-associated FGR and their respective controls. **A.** Manhattan plot of 65 DMCs ($p<0.0001$ and

$|\Delta\beta| > 0.1$) between FGR vs. C^{FGR} demonstrated by pink circles. **B.** Volcano plot displaying 48

hypomethylated and 17 were hypermethylated CpGs with FGR vs. C^{FGR} indicated by pink circles. **C.** Bar

graph demonstrating the distribution of hypermethylated (dark pink) and hypomethylated (light pink)

DMCs with FGR vs. C^{FGR} among CpG positions. **D.** Manhattan plot of 133 DMCs (p<0.0001 and |Δβ| >

0.1) between PM-FGR vs. C^{PM-FGR} demonstrated by teal circles. **E.** Volcano plot displaying 82

hypomethylated and 51 were hypermethylated CpGs with PM- FGR vs. C^{PM-FGR} indicated by teal circles.

F. Bar graph demonstrating the distribution of hypermethylated (dark teal) and hypomethylated (light teal)

DMCs with PM- FGR vs. C^{PM-FGR} among CpG positions.

Figure 3. Commonly differentially methylated CpG site with non-malarial FGR and placental

malaria-associated FGR. **A.** Venn diagram demonstrating the sole overlapping differentially methylated

CpG site, cg16389901, that was commonly hypomethylated with both non-malarial and placental malaria-

associated FGR when compared to their controls. **B.** Normalized methylation levels of all samples based

on their geographically matched control group average of 65 DMCs identified between FGR vs. C^{FGR} **C.**

Normalized methylation levels of all samples based on their geographically matched control group

average of 133 DMCs identified between PM-FGR vs. C^{PM-FGR} **D.** Average DNA methylation of CpG sites

associated with *BMP4*, including cg16389901 (marked in red), for all four groups. Red asterisk indicates

significance. **E.** Gene expression levels of *BMP4* measured by qRT-PCR.

Figure 4. Differentially methylated CpGs (DMCs) observed between non-malarial FGR vs. placental

malaria-associated FGR. A. Venn diagram demonstrating the 522 DMCs (p<0.0001 and |Δβ| > 0.1)

between FGR vs. PM-FGR after subtracting geographical location-driven baseline differences **B.**

Manhattan plot of 522 DMCs between FGR vs. PM-FGR demonstrated by purple circles. **C.** Volcano plot

displaying 143 hypermethylated CpGs in FGR and 379 CpGs hypermethylated in PM-FGR indicated by

purple circles. **D.** Bar graph demonstrating the distribution of hypermethylated CpGs with FGR (light

purple) and hypermethylated with PM-FGR (dark purple) among CpG positions.

Figure 5. Cellular deconvolution analysis based on overall methylation levels. A. Cell composition

of all samples estimated using robust partial correlations analysis through planet package in R. **B.**

Hierarchical clustering of all samples based on cellular deconvolution results. **C.** Hierarchical clustering of

FGR and PM-FGR samples based on cellular deconvolution analysis. **D.** Venn diagram demonstrating

the overlap between CpGs used for cellular deconvolution analysis and differentially methylated CpGs

between FGR vs. PM-FGR.

Supplementary Documents

Supplementary Table 1. Patient characteristics. cHTN; chronic hypertension, gHTN; gestational

hypertension, gDM; gestational DM, PreE; preeclampsia, SIPE; superimposed preeclampsia.

Supplementary Figure 1. Hierarchical clustering of samples based on methylation levels of

differentially methylated CpGs (DMCs). A. Methylation level of 65 DMCs between FGR vs. C^{FGR} **B.**

Methylation level of 133 DMCs between PM-FGR vs. C^{PM-FGR} **C.** Methylation level of 183 DMCs between

C^{FGR} vs. C^{PM-FGR} **D.** Methylation level of 522 DMCs between FGR vs. PM-FGR

Supplementary Figure 2. Hierarchical clustering of samples based on cellular composition. A.

Hierarchical clustering of FGR and C^{FGR} samples based on cellular composition**. B.** Hierarchical

clustering of PM-FGR and C^{PM-FGR} samples based on cellular composition.

Supplementary Data 1. List of differentially methylated CpG sites.

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Figure 1.

Figure 2.

Figure 3.

Figure 4.

A.

DMCs between
C^{FGR} vs. C^{PM-FGR}

DMCs between
FGR vs. PM-FGR

B.

C.

D.

A.

B.

C.

D.