

Correspondence of DNA Methylation Between Blood and Brain Tissue and Its Application to Schizophrenia Research

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Given the difficulty of procuring human brain tissue, a key question in molecular psychiatry concerns the extent to which epigenetic signatures measured in more accessible tissues such as blood can serve as a surrogate marker for the brain. Here, we aimed (1) to investigate the blood-brain correspondence of DNA methylation using a within-subject design and (2) to identify changes in DNA methylation of brain-related biological pathways in schizophrenia.

We obtained paired blood and temporal lobe biopsy samples simultaneously from 12 epilepsy patients during neurosurgical treatment. Using the Infinium 450K methylation array we calculated similarity of blood and brain DNA methylation for each individual separately. We applied our findings by performing gene set enrichment analyses (GSEA) of peripheral blood DNA methylation data (Infinium 27K) of 111 schizophrenia patients and 122 healthy controls and included only Cytosine-phosphate-Guanine (CpG) sites that were significantly correlated across tissues.

Only 7.9% of CpG sites showed a statistically significant, large correlation between blood and brain tissue, a proportion that although small was significantly greater than predicted by chance. GSEA analysis of schizophrenia data revealed altered methylation profiles in pathways related to precursor metabolites and signaling peptides.

Our findings indicate that most DNA methylation markers in peripheral blood do not reliably predict brain DNA methylation status. However, a subset of peripheral data may proxy methylation status of brain tissue. Restricting the analysis to these markers can identify meaningful epigenetic differences in schizophrenia and potentially other brain disorders.

Key words: DNA methylation/cross-tissue/blood/brain/correlation/schizophrenia

Introduction

Despite convincing evidence for strong heritability for psychiatric disorders,¹ recently discovered genetic susceptibility loci explain only a small amount of the total variance.^{1–3} It has therefore been suggested that epigenetic processes might modulate gene expression.⁴

DNA methylation, one of the key epigenetic processes, involves the addition of a methyl group to the cytosine of a Cytosine-phosphate-Guanine (CpG) dinucleotide and can result in transcriptional silencing.⁵ DNA methylation has been suggested as the underlying mechanism of crucial developmental processes such as tissue and cellular differentiation. DNA methylation itself is thought to be affected by a wide range of environmental factors including nutritional supplements, chemicals, and parenting behavior.^{6–9}

Recently, groundbreaking studies have shown an association between parenting behavior (eg, licking and grooming in rodents) and DNA methylation alterations in genes, related to hypothalamic-pituitary-adrenal axis activity, underlining the importance of epigenetic mechanisms in (ab)normal development.^{9–11} Specifically, this discovery spurred the interest of clinician-scientists to focus on differences in DNA methylation related to severe psychiatric disorders such as schizophrenia, eg, in candidate genes^{12–14} and using methylome-wide approaches.^{15,16} In all of these studies methylation levels were measured in

easily accessible peripheral blood samples. For example, studying 27000 markers in peripheral blood of 22 pairs of monozygotic twins discordant for major psychosis, Dempster et al¹⁵ reported altered pathways related to nervous systems development and neurotransmitter receptor signaling. Using a much larger sample of over 700 schizophrenia patients and controls, Aberg et al¹⁶ used methyl-CpG binding domain sequencing methods and identified differentially methylated markers linked to hypoxia and infections.

Very few researchers have had the opportunity to investigate DNA methylation in postmortem brain samples of schizophrenia patients. Focusing on candidate genes such as RELN^{17,18} or MB-COMT¹⁹ or applying epigenome-wide approaches,²⁰ these studies showed marked methylation differences between patients and controls.

Studies using blood samples are more feasible but limited because they only allow for indirect conclusions about the associated biological processes in living brain tissue, where epigenetic changes might be of greater relevance with respect to psychiatric disorders.⁴ Hence, there is a need for studies investigating, how and to what degree methylation patterns obtained from easily accessible blood samples relate to those in living brain tissue.

Several studies analyzed the correlation of DNA methylation patterns across different tissue types—including blood and (postmortem) brain tissue.^{21–23} Using whole-blood and postmortem brain tissue methylation data sets and a between-subject analysis approach, Horvath et al²¹ found correlations of around $r = 0.9$ across the 2 tissues types, while Davies et al²³ reported a slightly lower correspondence of mean blood and brain methylation levels using a very similar study design.

Despite these very valuable results, limitations of these studies include the study design and the fact that brain tissue was obtained postmortem. First, there is evidence that pre-, peri-, and postmortem factors such as pH, postmortem interval, and preservation methods might have profound effects on DNA methylation (for a review see Pidsley et al²⁴), which can bias study results based on postmortem tissue. Second, comparing methylation levels across tissues, which were obtained from different individuals and/or using mean methylation values averaged across subjects ignores inter-individual variability. It is well possible that—although group-average methylation values show a high level of correlation between blood and brain tissue (BBT)—the correlation within a given subject is weak (see also SM-figure 1). If our goal is to study inter-individual differences in DNA-methylation related to brain-based disorders such as schizophrenia using blood samples as a proxy—data on similarity of DNA-methylation between BBT based on between-subject designs can be misleading (see also SM-figure 2). To date, there are only 2 published reports applying a within-subject design (ie, analyzing paired data from the same subjects) to study blood-brain tissue correlations in DNA

methylation in humans. The first study²⁵ focused on a single gene (prodynorphine) while the second one²³ included only 2 participants.

The current study had 2 major aims. First, we wanted to explore how DNA methylation signatures in whole blood relate to those in brain tissue of the same individual. Our approach represents the first study to (1) use living brain tissue obtained during neurosurgery, (2) apply a within-subject design in such an analysis and (3) use a large set of methylation markers, including over 450000 CpG sites. The second aim was to utilize the results from the first part of our study to explore brain-relevant DNA methylation differences in schizophrenia using epigenome-wide data obtained in blood samples and gene set enrichment analysis (GSEA). Compared with an epigenome-wide association approach (which tests each individual marker independently), GSEA has the added advantage that results are more reproducible allowing to detect affected pathways even when changes in individual genes are moderate or raw data are noisy.²⁶

Method

Aim 1

Blood-Brain Tissue (BBT) Sample. Human neocortical tissue samples and blood probes were obtained during neurosurgical treatment of 12 patients with pharmacoresistant temporal lobe epilepsy (mean age = 40.92±15.38 years; 4 female; SM-table 1). We only included patients with cortical dysplasia, which is associated with less severe histopathological changes of the brain tissue. In contrast, the more common Ammon's horn sclerosis (hippocampal sclerosis) includes segmental loss of pyramidal neurons, granule cell dispersion, and reactive gliosis.²⁷ Sections from the temporal lobe were snap-frozen immediately, dissected using a cryomicrotome, histopathologically classified by a trained neuropathologist and stored at -80°C. Blood probes were obtained at the same time and stored together with the brain samples.

Participants were excluded, if they had neurological conditions other than temporal lobe epilepsy, a family history of epilepsy, current substance abuse or dependence, a severe endocrine disorder or an abnormal body mass (<18 or >30), a severe metabolic disorder or incomplete medical records. The institutional review board approved the study and all participants provided written informed consent.

BBT DNA methylation quality control and preprocessing. Genome-wide DNA methylation of DNA from whole BBT samples was assessed with the Illumina Human Methylation 450 Bead Chip (Illumina Inc, CA, US). No background correction or normalization was performed at this stage. Quality control and further analysis was

performed in the statistical programming environment R (version 2.15.2) using various Bioconductor packages (v.2.18.0) including lumi (2.10.0), methylumi (2.4.0), and watermelon (0.99.14).²⁸

Prior to the calculation of the methylation status of each individual probe several preprocessing and quality control steps were performed (see SM 1.2). Subsequently, we performed a quantile color bias adjustment of the red and green fluorescence channel intensities. After this, intensities were normalized using the Danet function in watermelon. We then removed all single nucleotide polymorphism and other non-CpG-associated probes ($N = 3145$) and 29043 probes, which have been shown to be nonspecific on this chip.²⁹ Last, we removed all CpG sites on the X or Y chromosome ($N = 10291$), leaving a total of 440518 autosomal CpG sites, which were transformed into beta values for

subsequent analyses. For an overview of probe selection during preprocessing see also figure 1A. For additional details regarding data acquisition and preprocessing please see SM 1.2.

Statistical Analyses: BBT. To assess associations between BBT in a within-subject design, we calculated Spearman correlation coefficients and P values for each CpG by correlating paired (ie, same subject) blood and brain data points (see SM-Figure 1, approach B). Correlations were derived using the pspearman package in R, which computes Spearman's rank tests with a pre-computed exact null distribution for $N \leq 22$. Furthermore, we created subsets containing only variable CpG sites (defined as those with a SD greater than the maximum of the SD density curve) or CpG sites for which there is evidence that the associated genes are expressed in the

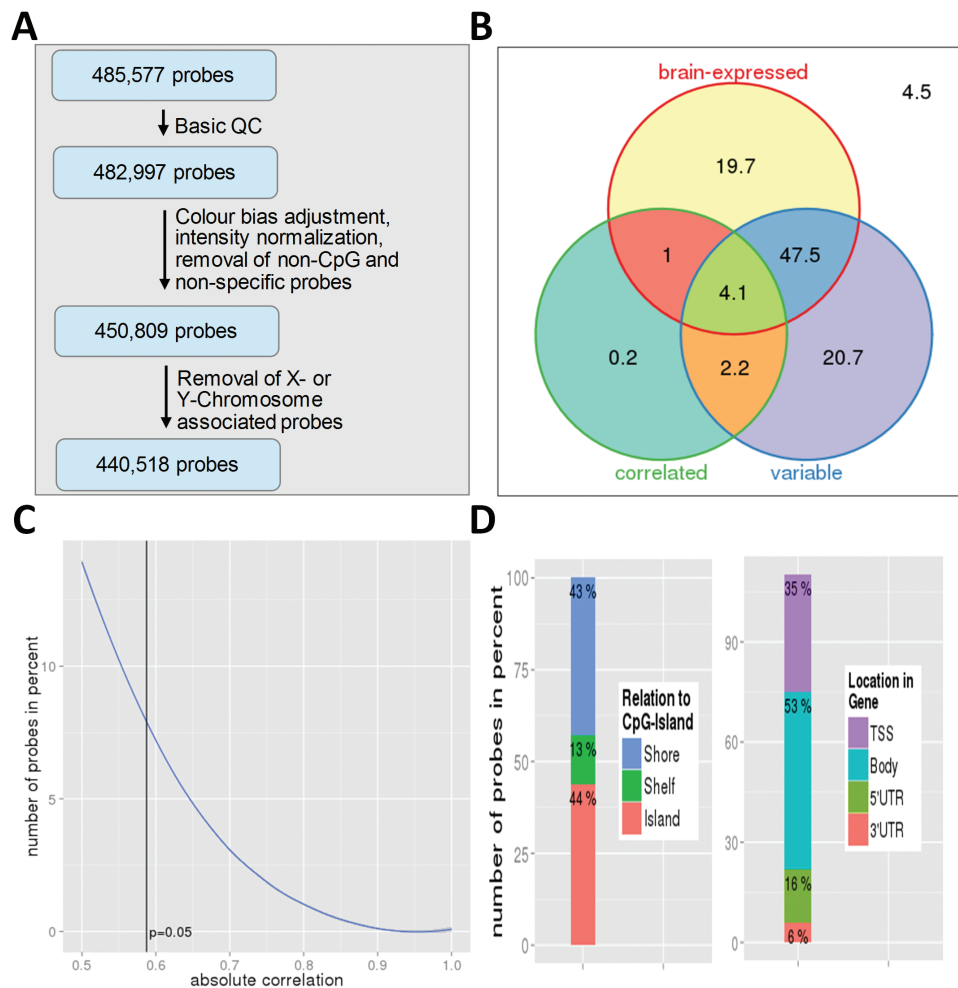


Fig. 1. (A) Probe selection during preprocessing. (B) Percentage of all CpG sites passing quality control being variable (bottom right), correlated between blood and brain tissue (bottom left), or brain-associated (top). 4.5% of all CpG sites were neither variable nor correlated nor brain-associated. (C) Percentage of variable, brain-associated CpG sites, which pass a given Spearman correlation threshold. The vertical line marks the cut-off for significant correlations at $P < .05$. (D) Characteristics of variable, brain-associated CpG sites (in percent). Due to multiple gene location entries for some CpG sites in the Illumina annotation file, total percentage exceeds 100%.

human brain (based on results from the Allen Human Brain Atlas, <http://www.brain-map.org/>). For detailed information see [SM 1.3](#) and [SM 1.4](#).

Because our BBT sample size was moderate making it susceptible to outliers, we used multi-dimensional scaling analysis in R to assess whether the DNA methylation patterns in our BBT dataset were comparable with a much larger dataset of whole blood and brain samples from the superior temporal gyrus. To confirm that the percentage of correlated probes was well above what would have been expected by chance, we carried out a permutation analysis by estimating the proportion distribution of significantly correlated CpG sites under the null hypothesis. For more information see below, [SM 2.1](#) and [SM 2.2](#).

Aim 2

MCIC Study of Schizophrenia. Cryo-conserved blood samples from participants of the Mind Clinical Imaging Consortium (MCIC) study of schizophrenia from 4 participating sites were used to determine DNA methylation. Patients had a Diagnostic and Statistical Manual of Mental Disorders (*DSM-IV*) diagnosis of schizophrenia ($N = 103$), schizophreniform disorder ($N = 4$) or schizoaffective disorder ($N = 3$), established using a Structured Clinical Interview for DSM disorders³⁰ and a review of case files by trained clinicians. Severity of positive and negative symptoms was rated using the Scales for Assessment of Positive/Negative Symptoms.^{31,32} Depression symptoms were assessed using the Calgary Depression Scale.³³ Healthy controls were excluded if they had a history of a medical or Axis I psychiatric diagnosis. Patients were excluded if they met criteria for current (within the past month) substance abuse or dependence. All subjects gave written informed consent prior to study enrolment. The human subjects research committees at each of the 4 sites approved the study protocol. For additional details about the participants and clinical measures, see references.³⁴

MCIC DNA Methylation Quality Control and Preprocessing. Blood samples were obtained from 234 participants and sent to the Harvard Partners Center for Genetics and Genomics for DNA extraction. All DNA extraction, bisulphite modification, and hybridization steps were done blinded to group assignment, the latter 2 were performed at the Mind Research Network Neurogenetics Core Lab on an Infinium HumanMethylation27 BeadChip using Illumina Infinium Methylation Assay. For more information on MCIC DNA methylation preprocessing, see [SM 1.5](#). The final methylation data set comprised 228 subjects (110 schizophrenia patients and 118 healthy controls) and 27480 CpG sites.

Statistical Analyses: MCIC. In order to perform GSEA with the goal to identify brain-related biological

pathways with altered methylation profiles associated with schizophrenia, we pruned the MCIC dataset for variable, brain-associated and highly correlated CpG sites only (see above and results section). After this step 1218 CpG sites remained in the analysis. Based on the 1454 gene ontology (GO) targets gene sets downloaded from the Molecular Signatures Database (<http://www.broadinstitute.org/gsea/msigdb/>) containing genes based on the controlled vocabulary of the GO project,³⁵ we performed GSEA using 457 gene sets left in the analysis after filtering for gene set size (min = 5, max = 500) using GSEA software.²⁶ GSEA holds the advantage that pathways can be reliably detected even when effect sizes of individual CpG sites are small or signal-to-noise ratio is low, which is of importance especially for polygenic disorders such as schizophrenia. For further details about GSEA methods, please see [SM 2.6](#) and Subramanian et al.²⁶

Results

Aim 1

BBT Probe Characteristics. As illustrated in [figure 1B](#), 74.5% of all CpG sites passing quality control were variable. For 72.3% of CpG sites, there was evidence that the associated gene is expressed in the human brain. To ensure biological relevance, the following analyses were restricted to variable CpG sites associated with genes, for which there is evidence of brain-expression (227428, ie, 51.6% of all CpG sites, which passed quality control, [figure 1B](#)).

DNA methylation signatures of BBT in our study were similar to those of whole blood and superior temporal gyrus brain tissue (obtained in 2 different samples) of a much larger publicly available dataset of healthy controls (GSE43414; [SM-figure 5](#)), suggesting that our results can be generalized (ie, they were not influenced by sample specifics of this study).

Correlation of DNA methylation between BBT. [Figure 1C](#) shows the percentage of CpG sites passing a given correlation threshold. Only 7.9% of a total of 227428 variable, brain-associated CpG sites showed a significant correlation ($P < .05$, corresponding to $\rho \geq 0.59$) between BBT. In other words, 4.1% of all CpG sites were variable, brain-associated and significantly correlated ([figure 1B](#)). In terms of effects size, 39.2% and 14.0% of all variable, brain-associated CpG sites showed moderate ($\rho \geq 0.3$) or large ($\rho \geq 0.5$) correlations, respectively. Permutation analyses (estimating the proportion distribution of significantly correlated CpG sites under the null hypothesis, $N = 10000$ under rearrangements of subject labels on the observed data points; [SM-figure 6](#)) confirmed that the percentage of significantly correlated probes was well above what would have been expected by chance.

Descriptive analyses of these variable, brain-associated, and correlated CpG sites revealed that eighty-seven

percent were located either in CpG islands or in CpG shores (defined as within 2kb from CpG islands). Only 13% were associated with CpG shelf areas (between 2–4kb from CpG islands) (figure 1D). With respect to gene location, the majority of correlated CpG sites were located in gene bodies (53%) and in transcription start sites (35%). Comparing CpG sites with highest and lowest correlation values (each $N = 100$), we found that neither cluster displayed a clear pattern of hypo- or hypermethylation in blood or brain tissue. That is, when looking at the blood-minus-brain nonparametric rank differences in DNA methylation for each of the 200 CpG sites in each of the 12 subjects, we found both CpG sites, with higher and sites, with lower absolute DNA methylation in brain tissue compared with blood, irrespective of correlation strength. However, the variability of rank differences within and across subjects was larger in the low correlation cluster (SM-figure 7A). Compared with correlation results using a within-subject design, averaging probe methylation across subjects (ie, adopting a between-subject design as in previous studies) produced high mean correlation coefficients between BBT for both correlation clusters (SM-figure 7B and 7C). This illustrates that studies using blood as a proxy to study inter-individual differences in brain DNA methylation should be rather based on within-subjects design data. For an illustration of this point, see also SM-figure 1. For a list of the 100 CpG sites with highest within-subject correlation, see SM-table 2.

Aim 2

Application to Schizophrenia (MCIC Sample). We proceeded to use all variable, brain-expressed and significantly correlated CpG sites, which were also present on the Illumina 27K array (1218 CpG sites, mapping to 1154 genes) in a GSEA of a schizophrenia case-control sample. Patients and controls did not differ in demographic variables such as gender, age or parental socio-economic status but patients had a significantly lower verbal IQ. Clinical variables, eg, mean length of illness was 11.73(\pm 10.26) years, were typical for schizophrenia patients in an in- and outpatient treatment setting (for details see table 1).

GSEA revealed one GO gene set, related to the generation of precursor metabolites and energy, displaying differential methylation between schizophrenia patients and controls after permutation and false discovery rate (FDR) correction (normalized enrichment score = 2.05, FDR = 0.02; figure 2, SM table 3). Among the genes significantly contributing to the enrichment score, were arginine vasopressin and its receptor (*AVPR1A*) and arginine vasopressin (*AVP*). The associated CpG sites were located in the promoter regions close to the transcription start sites of these 2 genes (35bp upstream and 326bp downstream, respectively; see SM-figure 8). The *AVP*-associated site was also within 100bp of several transcription factor binding sites, such as *TGIF*, *GFII*, and *MYC*. Other enriched

Table 1. Demographics

Sample	Gender (Female)		Age		WRAT3-RT		Parental SES		Age of Onset		Length of Illness		Negative Symptoms		Positive Symptoms		Calgary Depression Score		Current Antipsychotic Drug Dose		Cumulative Antipsychotic Drug Dose		
	N	N	Mean (SD)	Mean (SD)	Mean (SD)	Mean (SD)	Mean (SD)	Mean (SD)	Mean (SD)	Mean (SD)	Mean (SD)	Mean (SD)	Mean (SD)	Mean (SD)	Mean (SD)	Mean (SD)	Mean (SD)	Mean (SD)	Mean (SD)	Mean (SD)	Mean (SD)	Mean (SD)	
SZ	110	28	34.7 (10.59)	46.17 ^a (6.91)	2.9 (1.02)	22.95 (6.30)	11.73 (10.26)	8.14 (3.96)	4.88 (2.86)	3.42 (4.38)	131.46 (355.84)	57.36 (121.87)											
HC	118	43	32.53 (11.11)	51.09 ^a (3.93)	2.68 (0.75)	—	—	—	—	—	—	—	—	—	—	—	—	—	—	—	—	—	

Note: Means and standard deviations (SD) are given. SZ, patient with schizophrenia; HC, healthy control, WRAT3-RT, Wide Range Achievement Test 3-Reading Test. Parental SES (socioeconomic status) was classified according to Hollingshead. Severity of positive and negative symptoms was rated using the Scales for Assessment of Positive/Negative Symptoms (SANS),³¹ and the Scale for Assessment of Positive Symptoms (SAPS).³² Depression symptoms were assessed using the Calgary Depression Scale.³³ Cumulative and current antipsychotic exposure was calculated using the chlorpromazine (CPZ) conversion factors Andreasen et al.⁵⁴ ^asignificantly different between SZ and HC on basis of Students *t* test ($P < .05$).

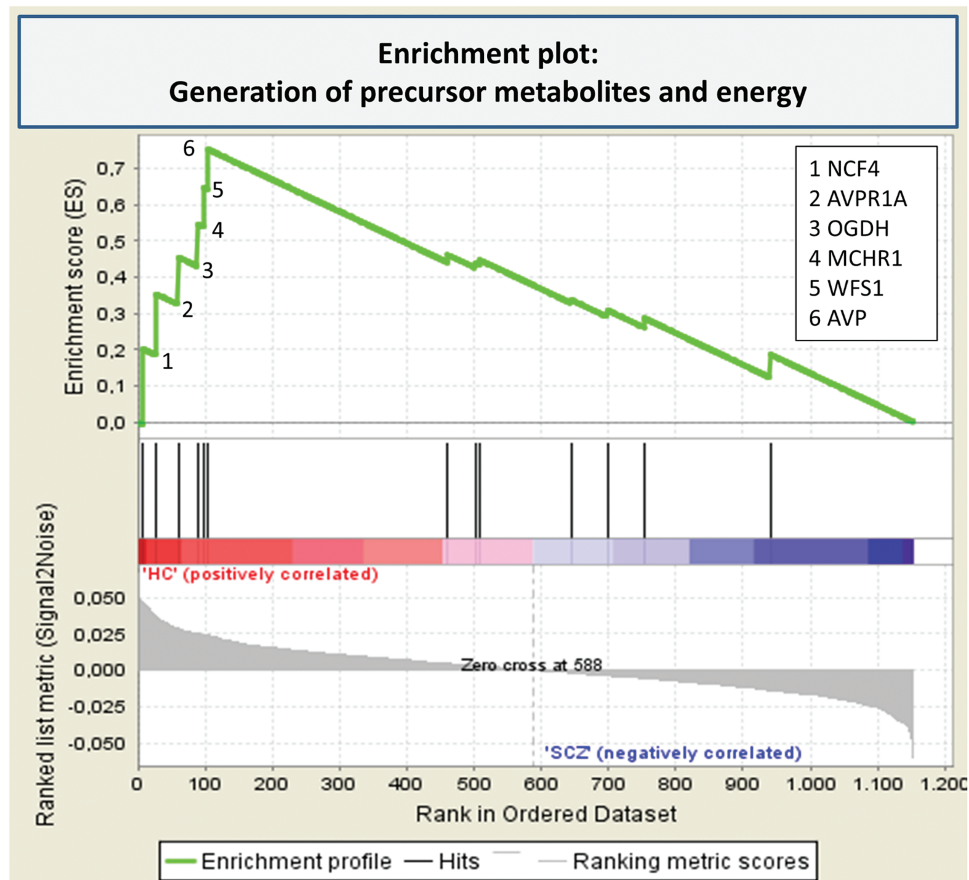


Fig. 2. Enrichment plot: Generation of precursor metabolites and energy.

Profile of the running enrichment score and positions of gene set members on the rank ordered list (according to association with a diagnosis of schizophrenia). The leading edge subset is the set of genes that appear in the ranked list prior to the peak. For more information, see [SM 2.6](#).

genes in this pathway included *MCHR1*, *WFS1*, *NCF4*, and *OGDH*. Cumulative antipsychotic drug dose did not correlate with DNA methylation of any of the genes significantly contributing to the enrichment score.

As a negative control, we then ran a separate GSEA using all variable, brain-expressed CpG sites with low cross-tissue within-subject correlation (defined as ($P > .95$, corresponding to $\rho \leq 0.21$); 923 CpG sites, mapping to 900 genes). No gene set achieved significance after FDR correction ($P < .05$, see also [SM 2.7](#)).

Discussion

Given the difficulty of procuring human brain tissue vs the relative ease of measuring biological markers in blood, it is crucial to understand whether blood samples can be used to ask questions about the epigenetic signatures in the brain. Therefore, we used epigenome-wide markers collected invasively from both blood and living brain tissue of the same subjects at the same time to explore blood-brain tissue correlations of DNA methylation data. Using a within-subject design, we found that only a small proportion of markers (ie, 7.9%) showed a significant, large correlation between

both tissue types, ie, most CpG sites are uncorrelated and researchers interested in the epigenetics of brain-related disorders should be careful when interpreting methylome-wide data assessed in peripheral tissues such as blood. The majority of the correlated CpG sites were found in or close to CpG islands and in gene bodies.

The second part of our study shows how knowledge about the within-subject cross-tissue correspondence of DNA methylation markers can be used to identify brain-related epigenetic risk mechanisms of schizophrenia via easily accessible CpG markers assessed in blood cells. By restricting our analysis to probes with a significant correlation with brain DNA methylation markers and using GSEA, we found that alterations in blood DNA methylation in schizophrenia, which correspond to brain tissue DNA methylation, are found in a gene set associated with the generation of precursor metabolites and energy, including peptides such as arginine vasopressin.

Results from previous studies analyzing blood-brain tissue correspondence of methylation profiles were mixed. A few studies reported moderate to high mean correlations across tissue types in humans applying a between-subject design (see also introduction). For example, Fan

and Zhang³⁶ analyzed 16 000 methylation markers from different human non-CNS tissues types. Averaging each CpG site across all samples, they found high average correlation coefficients ranging between 0.7–0.85. Divergent results can be attributed to the statistical approach selected by the researchers (as demonstrated in [SM-Figure 1, 2, and 7](#)) and to the (more common) fact that the different tissue types were obtained from different individuals. There is ample evidence that developmental processes such as cell differentiation are associated with unique methylation profiles for each cell lineage or tissue type, even across species. For example, Hon et al³⁷ reported that methylomes from 17 different mouse tissues clustered according to germ layer. Another recent study described a notable interspecies correspondence of tissue-specific methylation.³⁸ That is, cluster analysis of 3 tissue types in mice and humans perfectly discriminated among tissue types, regardless of the species of origin.³⁷ Similarly, 2 recent studies comparing inter-tissue and inter-subject methylation variability reported greater correspondence of methylation patterns within a tissue across subjects than within a subject across tissues.^{39,40}

Results from our study are in line with these findings and underline the tissue-specificity of methylation profiles. Conflicting results with respect to previous human methylation studies are mainly due to study design. Whereas studies examining mean methylation values—averaged across samples or participants (between-subject design)—claim high tissue correspondence, studies employing cluster analyses or within-subject designs report lower correlations.

Accordingly, the few existing candidate gene studies applying a within-subject design in rodents reported moderate across tissue correlations in 1 out of 4 CpGs in the *Bdnf* gene ($r = 0.53$) and between 2 (out of 7) different CpGs in *Fkbp5* (R^2 of 0.23–0.49).^{41,42} There has been only 1 other human methylome-wide study—apart from ours—that applied a within-subject design. Using postmortem brain tissue and blood obtained pre-mortem from the same 2 individuals, Davies et al²³ reported correlation values of 0.66–0.76 between BBT. The even lower correlations described in our study could be a result of a larger sample size ($N = 12$ vs $N = 2$), differences in brain tissue retrieval (neurosurgical biopsies vs postmortem tissue) and different methodology (DNA microarray vs methylated DNA immunoprecipitation sequencing).⁴³

Taken together, our results indicate that the common practice of studying DNA methylation in peripheral tissues to study disorders of the brain should be applied with great caution. Although tissue type is only 1 source of variation in DNA methylation data (and future studies should address the effects of age, gender, and cell type, see [SM-figure 3](#) regarding the latter point), we suggest a way forward which includes prioritizing CpG sites that are validated as proxies, ie, with a high correlation in DNA methylation across both tissue types, for future analyses.

Consequently, we excluded all uncorrelated CpG sites for a GSEA of the MCIC data (ie a large blood-based DNA methylation dataset of patients with schizophrenia and healthy controls). Crucial genes of the schizophrenia-linked precursor metabolites and energy pathway identified in GSEA included *AVP* and *AVPR1A*. Although we cannot draw conclusions about the functional relevance of DNA methylation changes in these genes and future studies are needed to replicate these patterns in postmortem brain samples as well as investigate the impact on gene expression, it is interesting to note that probes were found in close proximity to the transcription start sites, pointing towards a potential functional role. Furthermore, an association between *AVP* and schizophrenia has been reported in previous genetic⁴⁴ and endocrinological studies.⁴⁵ *AVP* has an important role in social memory and cognition^{46–48}—domains that are affected in schizophrenia.⁴⁹ In line with that, *AVP* serum concentrations are increased in schizophrenia patients and correlate with positive symptom severity and verbal learning deficits.⁴⁵ Administration of vasopressin or vasopressin analogues, has been shown to have beneficial effects on social memory^{47,50,51} and reexpression of *AVPR1A* in *AVPR1A* knock-out mice ameliorates social interaction deficits.⁴⁸

Other highly enriched genes included *MCHRI*, an important neuroendocrine modulator of appetite that has previously been shown to be associated with schizophrenia,⁵² as well as *WFS1*, associated with Wolfram syndrome, which affects central nervous system development.⁵³

Our results have to be seen in the light of the following additional limitations. First, our BBT sample was only of moderate size, although larger than previous studies. Second, brain tissue was obtained from the temporal lobe restricting inference regarding other brain areas. Third, brain tissue was obtained from epilepsy patients with cortical dysplasia, which could bias our results. However, cortical dysplasia in epilepsy is associated with less severe histopathological changes of the brain tissue than the more common Ammon's horn sclerosis,²⁷ and overall methylation patterns in our temporal lobe samples were highly similar to temporal lobe samples of healthy individuals ([SM 2.1](#)). Fourth, we were not able to differentiate between cytosine methylation and hydroxymethylation, which is a common limitation to standard bisulfite-based analysis techniques.

In sum, we explored blood-brain tissue correlations of DNA methylation data and characterized epigenetic risk mechanisms of schizophrenia. As a novel approach, we used living brain tissue, epigenome-wide data and, most importantly, applied a within-subject design. Our correlational findings indicate that only a small proportion of CpG sites show highly similar DNA methylation patterns in BBT within the same subject (as opposed to approaches using group averages). Studies using blood as a proxy to

study inter-individual differences in brain DNA methylation should therefore be based on within-subjects design data. Our results can guide future research in psychiatric epigenetics, ie, could help to predict which CpG sites can be studied indirectly by analyzing blood samples. Following this approach, ie, by using easily accessible CpG markers taken from blood samples, for which there is evidence for a high correlation with brain DNA methylation markers, we identified a brain-related biological pathway that is affected in schizophrenia and can be identified using peripheral tissue. The pathway, related to precursor metabolites and signaling peptides, may provide new potential targets for schizophrenia research and treatment.

Supplementary Material

Supplementary material is available at <http://schizophreniabulletin.oxfordjournals.org>.

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