# ORIGINAL ARTICLE

# Transcriptional Signatures of Sleep Duration Discordance in Monozygotic Twins

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**Introduction:** Habitual short sleep duration is associated with adverse metabolic, cardiovascular, and inflammatory effects. Co-twin study methodologies account for familial (eg, genetics and shared environmental) confounding, allowing assessment of subtle environmental effects, such as the effect of habitual short sleep duration on gene expression. Therefore, we investigated gene expression in monozygotic twins discordant for actigraphically phenotyped habitual sleep duration. **Methods:** Eleven healthy monozygotic twin pairs (82% female; mean age 42.7 years; *SD* = 18.1), selected based on subjective sleep duration discordance, were objectively phenotyped for habitual sleep duration with 2 weeks of wrist actigraphy. Peripheral blood leukocyte (PBL) RNA from fasting blood samples was obtained on the final day of actigraphic measurement and hybridized to Illumina humanHT-12 microarrays. Differential gene expression was determined between paired samples and mapped to functional categories using Gene Ontology. Finally, a more comprehensive gene set enrichment analysis was performed based on the entire PBL transcriptome.

**Results:** The mean 24-hour sleep duration of the total sample was 439.2 minutes (*SD* = 46.8 minutes; range 325.4–521.6 minutes). Mean within-pair sleep duration difference per 24 hours was 64.4 minutes (*SD* = 21.2; range 45.9–114.6 minutes). The twin cohort displayed distinctive pathway enrichment based on sleep duration differences. Habitual short sleep was associated with up-regulation of genes involved in transcription, ribosome, translation, and oxidative phosphorylation. Unexpectedly, genes down-regulated in short sleep twins were highly enriched in immuno-inflammatory pathways such as interleukin signaling and leukocyte activation, as well as developmental programs, coagulation cascade, and cell adhesion.

**Conclusions:** Objectively assessed habitual sleep duration in monozygotic twin pairs appears to be associated with distinct patterns of differential gene expression and pathway enrichment. By accounting for familial confounding and measuring real life sleep duration, our study shows the transcriptomic effects of habitual short sleep on dysregulated immune response and provides a potential link between sleep deprivation and adverse metabolic, cardiovascular, and inflammatory outcomes.

Keywords: Sleep duration, Twins, Monozygotic, Gene expression, Leukocyte.

#### Statement of Significance

Habitual short sleep is common and associated with numerous untoward health outcomes including cognitive, metabolic, cardiovascular, and immunological impairment. We compared gene expression profiles of peripheral blood leukocytes between sleep duration discordant monozygotic twins to identify differentially activated transcriptional programs in these circulating immune cells and gain potential mechanistic insights linking habitual short sleep with poor outcomes. By measuring sleep duration in the natural environment we provided ecologically valid results allowing insights into the impact of "real world" chronic sleep curtailment on human health.

#### INTRODUCTION

Individual sleep need is both a heritable quantitative trait and a behaviorally influenced phenotype. Sleep duration heritability is substantial, estimated to be somewhere between 31% and up to 55% in classical monozygotic (MZ) twin versus dizygotic (DZ) twin studies.<sup>1-5</sup> More recently on the timeline of human evolution societal sleep duration has abruptly eroded, with about one-third of the working population sleeping  $\leq 6$ hours per night and sleep length dropping an estimated 1.5-2 hours per night over the past century.<sup>6-8</sup> Assuming that genetic factors determining sleep need have remained static over this same time period, environmental factors are exerting increasing influence on individual sleep duration. Modern society, with its control of light, omnipresent technology, and countless competing interests for time, along with the zeitgeist de-emphasizing sleep's importance, has resulted in the widespread deprioritization of sleep.<sup>9</sup> This growing disconnect between sleep need and sleep actualization has substantial adverse consequences

for cognitive functioning and metabolic, cardiovascular, immunological, and psychological health.<sup>10–17</sup>

Much research has been devoted to epidemiology concerning the relationship between habitual short sleep duration and human health<sup>18-20</sup> and to identifying genetic determinants of sleep duration and circadian functioning in humans and model organisms.<sup>21-23</sup> Although numerous experimental studies have explored the effect of extreme, controlled sleep deprivation paradigms on mammalian physiology,<sup>24-27</sup> ecologically valid research exploring the effect of habitual short sleep in situ has been lacking due to methodological challenges. Since individualized sleep need is variable and substantially genetically determined, finding appropriate controls is problematic given that any sleep duration may maintain physiological homeostasis for one individual but not another. Cross-over study designs attempt to address this issue, but questions regarding ecological validity remain as these studies control sleep duration rather than investigate sleep in situ.<sup>28-31</sup> Without a biomarker or endophenotype

to match subjects for sleep need, delineation of specific pathways that translate observed short sleep into disturbed physiology is difficult. The end result is scarce research exploring "real world" physiological impacts of short sleep where compensatory mechanisms may alter the sleep/physiological homeostasis relationship in unpredictable ways.

Co-twin studies, by focusing on intra-pair differences, provide a highly sensitive approach for evaluating associations of subtle laboratory or clinical findings with a specific condition. Because of the extremely tight matching between MZ twins for many potential confounders including genetic drivers of sleep need, co-twin studies of MZ siblings provide the best matched controls, thereby solving the conundrum of appropriate controls for ecologically valid sleep duration research. This method also involves fewer assumptions, requires a smaller sample size and is less susceptible to ascertainment biases than non-twin research methods.

In this study, we hypothesized that an unbiased assessment of the transcriptional landscape of peripheral blood leukocytes among MZ twins with discordant habitual sleep duration would provide novel insights into the molecular perturbations elicited by lifestyle-driven habitual sleep curtailment.

#### **METHODS**

#### Subjects

This study was performed at the Washington State Twin Registry, a community-based sample of twins constructed using data from the Washington State Department of Licensing. As of April 2016, the Registry consisted of over 8965 pairs. Zygosity is determined using previously validated self-report methods that are correct at least 95% of the time.<sup>32,33</sup> For the 11 enrolled pairs in this study, MZ zygosity was confirmed by assessing twin concordance for 15 short tandem DNA repeats with the PowerPlex 16 HS System (Promega Corporation, Madison, WI).<sup>34</sup>

Every twin enrolled in the Registry completes a recruitment survey, which has included a sleep duration question since 2009. In 2006 and 2008, a health survey was mailed to more than 4000 enrolled twins that included the same sleep duration question. Sleep duration was ascertained from the question, "On average, how long do you sleep per night?" reported in hours and minutes. Out of 1284 MZ pairs, 610 were discordant by at least 60 minutes in habitual sleep duration. Because there is no standard definition of habitual sleep duration discordance for MZ twins, we adopted a 60-minute difference as the principal screening and inclusion criteria. These twin pairs were mailed an invitation letter explaining the study with a number for them to call for further screening for study eligibility. Interested twin pairs were then screened and deemed ineligible if they had a history of: diabetes, depression or depressive symptoms (PHQ-2 score > 2),<sup>35</sup> bipolar disorder, schizophrenia, restless legs syndrome, narcolepsy, obstructive sleep apnea, insomnia, circadian rhythm sleep disorder, shift work, cigarette smoking, recreational drug use or alcohol use. Because sleep duration from the recruitment and health surveys were completed in the past, current sleep duration was screened with the same question as before, as well at the sleep timing questionnaire.<sup>36</sup> Only twin pairs with at least 60 minutes of sleep duration discordance on either of these measures were deemed study eligible. A total of 116 twin pairs were screened for study enrollment, 70 were study eligible, 52 were enrolled, and the 11 most

discordant pairs underwent gene expression analysis. All female twins had negative pregnancy tests and all twins were negative for drugs of abuse by serum drug testing.

#### Actigraphy

All twins were monitored concurrently for 14 days with the Actiwatch-2 actigraph worn on the non-dominant wrist starting at 5:00 pm of the first day of the research protocol (Philips Respironics, Andover, MA). The actigraph provides continuous motion data using an accelerometer to monitor the speed and degree of arm movements thus providing an indirect measure of daily sleep/wake patterns based on the assumption that movement subsides with sleep. To facilitate actigraph record scoring each twin filled out a sleep diary concurrently for the entire 14-day period. Actigraphy differentiates sleep from wake with good agreement to polysomnography.37-39 Actigram analysis was performed using Respironics Actiware 5 software (Philips, Respironics, Andover, MA) and previously described protocols.40 Briefly, rest intervals were set manually based on the sleep diary data provided the diary correlated within 15 minutes of expected activity level changes for bedtimes, wake times, and naptimes. If this was not the case then watch detected light levels, or, if needed, twin specified event marks, were used to determine rest intervals. The sleep period was automatically scored within the rest interval by a software-based automatic sleep scoring algorithm based on pre-set amplitude and frequency criteria for detected movements ascertained in 30-second epochs.<sup>39</sup> Total sleep time was calculated by adding nighttime sleep plus daytime naps for the full recording period of 14 days. Total adjusted recording time was the total recording time minus the excluded interval time. Twenty-four hour sleep time was standardized by dividing the total sleep time by the total recording time and multiplying by 24 (for hours in the day) and then 60 (for minutes per hour). Epoch length was 30 seconds. The PI randomly audited 1 out of every 10 actigraph records for adherence to protocols and accuracy.

#### **Blood Sample Acquisition and RNA Purification**

On the morning of day 15 of the research protocol (directly following completion of the 14-day actigraphy assessment) all twins provided a fasting blood sample drawn directly into two PAXgene<sup>TM</sup> vacutainers (Qiagen N.V., Franklin Lakes, NJ). The RNA was separated and purified as previously described.<sup>41</sup> Residual genomic DNA was removed with RNeasy MinElute cleanup kits (Qiagen N.V., Franklin Lakes, NJ) according to the manufacturer's instructions. Total RNA integrity was checked using an Agilent 2100 Bioanalyzer (Agilent Technologies, Inc., Santa Clara, CA) and quantified using a Trinean DropSense96 spectrophotometer (Caliper Life Sciences, Hopkinton, MA).

#### **Microarray Experiments**

High quality RNA samples were converted to cDNA and biotin-labeled for microarray analysis using Ambion's Illumina TotalPrep RNA Amplification kit (Life Technologies, Grand Island, NY). Labeled cRNAs were hybridized on HumanHT-12 v4 Expression BeadChips (Illumina, Inc., San Diego, CA) and image processed using an Illumina iScan system. Microarray data were assessed for quality, followed by quantile normalization using the Bioconductor package lumi.<sup>42</sup> The dataset was initially filtered by flagging probes that fell below a low-signal

threshold, which was defined by the 75th percentile of the negative control probe signals within each array. The full dataset was subsequently processed using a variance filter (ie, "shorth" function in the Bioconductor package genefilter). Approximately 10 000 transcripts passed the above filtering steps and underwent further analysis. Detailed microarray experiment description and data, meeting Minimum Information About a Microarray Experiment (MIAME) criteria, are available at Gene Expression Omnibus (GSE80612).

## **Data Analysis**

We analyzed the microarray dataset using two strategies. Initially, we identified differentially expressed genes between twin-paired samples (long sleep duration vs. short sleep duration) using the Bioconductor package limma.<sup>43</sup> False discovery rate (FDR) correction for multiple testing was applied and a combined criteria of an FDR < 0.01 and  $|\log_2|$  [expression ratio] $| \ge 0.322 (\pm 1.25$ -fold) was used to define statistically significant differential expression between the long versus short sleep duration groups.<sup>44</sup> Functional enrichment analysis of the differentially expressed genes was performed with the webbased program (*bioinfo.vanderbilt.edu/webgestalt*) using Gene Ontology (GO) annotations.<sup>45</sup> After correction for multiple testing, processes with adjusted enrichment *p* values < 0.05 were deemed significant.

Next, we undertook a more unbiased and comprehensive approach by applying Gene Set Enrichment Analysis (GSEA)<sup>46</sup> to the entire filtered microarray dataset using 1315 curated pathways derived from multiple resources including Kyoto Encyclopedia of Genes and Genomes, Reactome, Pathway Interaction Database, and Biocarta. Random permutation analysis and an FDR < 0.05 was used to designate significant enrichment for gene sets. We performed "leading edge" analysis on the GSEA results to identify the subset of genes that significantly contributed to pathway enrichment.<sup>47</sup> We then used hierarchical clustering based on gene set membership profile of leading edge genes to group overlapping pathways and identify larger, functionally coherent biologic modules.<sup>48,49</sup>

# RESULTS

## **Subject Characteristics and Demographics**

The twins were predominantly Caucasian, female, and educated. The mean age was 42.7 years (SD = 18.1), and the mean sleep duration for the twins as a whole was 439.2 minutes (SD = 46.8). The mean within-pair sleep duration difference was 64.4 minutes (SD = 21.2). Table 1 provides further demographic details.

# Discordant Sleep Duration is Associated With Differential Activation of Transcriptional Programs in PBLs

Using strict statistical criteria, we identified 575 differentially expressed transcripts in PBLs of discordant twins, of which 369 were up-regulated and 206 were down-regulated in short sleep subjects relative to their long sleep twin pairs (Figure 1A, full list available as Supplementary Table S1). The relative changes in expression were modest, with most genes being altered by less than 2-fold (Supplementary Table S1). The differentially

expressed genes were enriched in distinct GO annotations, with transcripts up-regulated in short sleep mapping to ribosomal, transcription, and translational processes whereas downregulated genes in short sleep were overrepresented across functionally diverse categories including immunity, wound healing, cell adhesion, chemotaxis, chemokine binding, and leukocyte activation (Figure 1B).

Although GO analysis of differentially expressed genes provides an overview of enriched functional categories, it does not fully exploit the genome-wide transcriptional information available, nor does it provide pathway-specific details. Therefore, we complemented our approach by performing GSEA, a more comprehensive analysis that is based on the expression pattern distribution of the entire microarray dataset. To maximize biologic relevance, we focused on ~1300 gene sets derived from curated canonical pathways. We identified 20 gene sets whose gene members were up-regulated and 124 gene sets whose members were down-regulated in subjects with short sleep duration relative to their long sleep duration twin pairs (full list available as Supplementary Table S2). We integrated these results by clustering enriched pathways together based on mutual membership of their leading edge genes. As depicted in Figure 2, this analysis defined multiple larger, "biological modules" comprised of functionally coherent processes. Enriched gene sets whose members were up-regulated in short sleep included those involved in transcription, translation, and oxidative phosphorylation. In contrast, modules with down-regulated genes in short sleep encompassed a wider functional repertoire dominated by immuno-inflammatory pathways but also included growth factor signaling, developmental programs, integrin and adhesion processes, and complement/coagulation cascade. The immunity-associated gene sets down-regulated in PBLs of short sleep duration twins included several cytokine and interleukin signaling pathways (eg, IL-2, IL-4, IL-6, and IL-8), interferon signaling, phagocytosis, granulocyte macrophage colony stimulating

Table 1—Subject Characteristics.	
Twin pairs (N = 11, 22 total twins)	N (%)
MZ male-male	2 (18%)
MZ female–female	9 (82%)
Demographic characteristics	N (%)
Caucasian	20 (91%)
High school graduate	3 (14%)
Associates degree/some college	4 (32%)
≥ College degree	15 (68%)
Study variables	Mean, SD, Range
Age (years)	42.7, SD = 18.1, 20.2–70.9
Sleep duration (min)	439.2, SD = 46.8, 325.4–521.6
Body mass index (kg/m <sup>2</sup> )	24.5, SD = 4.9, 18–37
Within pair sleep duration difference (min)	64.4, SD = 21.2, 45.9–114.6

MZ = monozygotic; SD = standard deviation.



**Figure 1**—Functional analysis of differentially expressed genes between sleep discordant monozygotic (MZ) twins. (A) Heatmap of 575 differentially expressed genes displaying pair-wise differences between short and long sleep MZ twin pairs after hierarchical clustering. There were 369 up-regulated genes (magenta) and 206 down-regulated genes (cyan) in short versus long sleep (complete list is available in Supplementary Table S1). Despite clear segregation between differentially up and down-regulated genes, note significant heterogeneity in expression differences among the 11 twin pairs. (B) Functional analysis of differentially expressed genes based on Gene Ontology (GO) annotations showed that distinctly different processes were enriched among up-regulated (magenta) and down-regulated (cyan) genes in short sleep. These significant functional categories have been depicted based on the relational structure of GO database.

factor signaling, and pro-inflammatory messengers such as the Jak-Stat system.

Collectively, GSEA and GO enrichment analysis of altered gene expression profiles in discordant sleep revealed, unexpectedly, a generalized suppression of immune and inflammatory pathways in subjects with short sleep relative to their long sleep twins.

# Acute Versus Chronic Reduction in Sleep Duration May Lead to Different Patterns of Activation in Immune and Inflammatory Pathways

We compared our findings to other published reports on genome-wide transcriptional consequences of sleep curtailment. An elegantly designed study by Aho et al.<sup>50</sup> assessed the effects of forced short-term partial sleep restriction (five nights) on peripheral blood mononuclear cell (PBMC) gene expression of nine healthy volunteers. In contrast to our results, they found that short-term sleep deprivation up-regulated many immunerelated GO processes, including interleukin production, leukocyte activation, immune response and B cell activation. To further explore this apparent discrepancy, we downloaded and processed their study's raw microarray data (Affymetrix U133 Plus 2.0) from ArrayExpress repository (E-MEXP-3936). We normalized the entire dataset that also included control subjects (n = 4) and a recovery time point using Robust Multiarray Average algorithm, but focused further analysis to PBMC expression differences between baseline versus sleep restriction

of the nine subjects. We observed that, similar to our experiments, alterations in gene expression were modest following reduced sleep duration. To compare the entire available transcriptional profiles between the two studies, we applied the same GSEA procedure to the Aho microarray data using ~1300 curated pathways. We used a more permissive FDR < 0.15because very few gene sets were enriched at an FDR cutoff < 0.05. Our independent analysis confirmed their report that partial sleep restriction is associated with up-regulation of pathways mapping to immune-related processes such as interleukin activity (IL-6 and IL-3), interferon signaling, Toll pathways, B cell receptor signaling, and the inflammasome cascade (complete list available as Supplementary Table S3). However, we observed that the three pathways significantly down-regulated in forced sleep restriction were also associated with immunity, that is, natural killer cell mediated cytotoxicity, graft versus host disease, and antigen processing and presentation. Interestingly, we also found that natural killer cell signaling pathways were suppressed in our short sleep duration twins (Figure 2).

The differences observed between our study and those of Aho could be due to several factors. For example, different microarray platforms were used for gene expression profiling (Illumina vs. Affymetrix). Furthermore, Aho's study investigated PBMCs (ie, lymphocytes and monocytes), whereas we studied all circulating leukocyte populations (ie, lymphocytes, monocytes, neutrophils, and other granulocytes). Previous studies have demonstrated distinct transcriptional signatures



**Figure 2**—Pathway analysis of Peripheral blood leukocyte (PBL) transcriptome in monozygotic (MZ) twin pairs with discordant sleep duration. A graphical summary of significantly enriched gene sets is shown based on gene set enrichment analysis (GSEA) of 1315 curated pathways. Gene sets were deemed enriched if significant subsets of their members ("leading edge") were either up or down-regulated in short sleep relative to long sleep twins (FDR < 0.05). Hierarchical clustering of enriched gene sets based on their membership profile revealed larger groupings of functionally similar pathways with shared genes known as "modules." Note that several of the down-regulated modules in short sleep map to immune and inflammatory processes. Complete list is available in Supplementary Table S2.

between circulating leukocyte sub-populations in humans,<sup>51</sup> and it is possible that sleep restriction elicits cell-type specific responses across leukocyte subsets. Nevertheless, a key difference between our study designs, namely the duration and experimental setting of sleep curtailment, was likely a critical contributor to the profound differences observed in pathway enrichment.

Taken together, the weight of available published data indicate that experimentally-induced "acute" sleep restriction is associated with activation of immune and pro-inflammatory processes, although some immune-related pathways may also be suppressed. In contrast, our study finds that "chronically" shortened sleep duration under natural conditions is associated with down-regulation of several of the same immune-mediated processes.

# DISCUSSION

Despite the significant role that genes are believed to play in determining an individual's sleep duration, progress to identify associated genes in healthy unrelated adults has been challenging. One possible explanation for the lack of replicated genetic findings in sleep duration is the small effect size of individual genes. The fact that genome-wide association studies in the scale of thousands of subjects identified very few genetic variants associated with sleep duration implies that very large sample sizes are necessary to detect individual loci.<sup>52</sup> Genomewide transcription profiling may serve as a useful surrogate for identifying endophenotypes of sleep duration, especially when applied to the unique genetic characteristics of MZ twins. In this study, we found distinct expression patterns in the circulating leukocytes of healthy MZ twin pairs with discordant habitual sleep duration.

We interrogated immune cells because the immune system is likely involved in producing the untoward systemic effects of short sleep. Short-term, laboratory-based sleep deprivation is associated with increased leukocyte activation with concomitant changes in pro-inflammatory cytokines such as C-reactive protein, IL-6, and tumor necrosis factor (TNF).<sup>13,53–55</sup> Sleep loss increases transcription of IL-6 and TNF messenger RNA through activation of nuclear factor NF- $\kappa$ B, a transcription factor that serves a critical role in the inflammatory signaling cascade that controls cellular expression of pro-inflammatory genes.<sup>13,56,57</sup>

In contrast, we found that PBLs of twin pairs with shorter sleep duration were characterized by down-regulation of immuno-inflammatory genes and pathways. Suppression of immune responses due to sleep deprivation has been previously reported. For example, acute curtailment of sleep can influence antibody titers following vaccination,58,59 and adults with poorer response to vaccines experience higher rates of clinical illness<sup>60</sup> supporting the concept that sleep duration influences immune response to antigenic challenge. The immunologic consequences of habitual short sleep in the natural environment have been less studied. Cohen and colleagues reported that chronic reduction in sleep duration, as assessed by self-report<sup>61</sup> or actigraphy,<sup>62</sup> was associated with increased susceptibility to the common cold and blunted antibody response to hepatitis B vaccination.63 A similar association between shorter sleep duration and increased incidence of common illnesses in adolescents was reported by Orzech et al.64

To our knowledge, genome-wide transcriptional consequences of chronic short versus long sleep in subjects under natural conditions have not been previously published. However, other investigators have reported on the effects of laboratory-based short-term sleep curtailment in altering gene expression. We compared our results with those of a well-designed study based on acute sleep restriction<sup>50</sup> and found significant differences in the patterns of gene expression and pathway enrichment. Specifically, immune and inflammatory programs were generally activated in circulating leukocytes when sleep restriction is imposed for a limited duration, whereas, in our home environment-based study, chronic short sleep duration was associated with down-regulation of similar pathways. Interestingly, this comparison also revealed several overlapping themes such as suppression of processes involved in natural killer cell signaling (Supplementary Tables S2 and S3). A plausible explanation for these discordant findings is that the host response to short-term sleep restriction is quite different from its adaptive response to chronic reduction of sleep duration. While the mechanisms underlying distinct transcriptional profiles between chronic and acute sleep reduction remain to be identified, epigenetic regulation may play a potentially important role-as was recently

reported in experimental sleep deprivation in humans,<sup>65</sup> and sleep fragmentation in mice.<sup>66</sup> Furthermore, reduced immune gene expression responses in chronic versus acute stimuli have been previously reported in several human disorders including hepatitis B infection<sup>67</sup> and autoimmune thrombocytopenia.<sup>68</sup> Our group recently reported that among patients with chronic obstructive pulmonary disease (COPD), those with more severe disease demonstrated a diminished cytokine response to pathogen-associated molecular patterns, possibly reflecting an adaptive host response to the increased load of bacterial colonization reported in patients with more severe COPD.<sup>69</sup>

In addition to down-regulation of immune and inflammation-related processes, we found suppression of several other biological programs in twins with shorter sleep including those mapping to development, adhesion, leukocyte migration, and hemostasis. The role of these pathways in altering leukocyte function in subjects with chronically reduced sleep duration warrants further investigation because of their association with cardiovascular and metabolic disorders. Furthermore, several epidemiologic studies have linked short sleep duration with increased risk<sup>70</sup> and worse outcomes in certain cancers,<sup>71</sup> and our finding that habitual curtailment of sleep is associated with dysregulated immuno-inflammatory, developmental, migration, and adhesion responses hints at possible mechanisms promoted by chronically short sleep duration.

Our study has a number of limitations. The sample size is small (N = 22), although it is comparable to previous reports describing the effects of sleep deprivation on gene expression. Furthermore, our study's strategy of comparing MZ twin pairs provides a unique approach to reduce inter-individual variability and therefore reduce sample size requirements. Another shortcoming is our reliance on actigraphy to estimate sleep duration. However, electroencephalograph (EEG) measurements are not feasible for chronic evaluation of sleep in the natural environmental setting and previous studies have demonstrated tight correlation between actigraphic and EEG-based assessment of sleep duration.<sup>37,38</sup> We measured PBL gene expression at a single time point and therefore did not capture temporal dynamics of transcription. We attempted to partially mitigate this limitation by ensuring blood draws of twin pairs were completed at the same time under identical conditions. Future studies exploring the temporal patterns of gene expression associated with chronic short sleep are important extensions of our project. We assessed gene transcription in a heterogeneous leukocyte cell population which may have hidden subtle cell specific differences in gene expression. Finally, our report is descriptive and does not identify a mechanism whereby the transcriptional responses of PBLs to acute versus chronic reduction in sleep duration appear to be distinctly different. Additional mechanistic studies will be required to decipher the molecular underpinnings of this finding.

In conclusion, by exploiting the unique genetic structure of MZ twins, we report on the first unbiased assessment of transcriptional signatures associated with discordant habitual sleep duration. In contrast to previous studies linking acutely imposed sleep restriction with increased inflammatory responses, we found that shorter sleep duration in the natural setting was associated with down-regulation of specific immune and inflammatory programs in circulating leukocytes. Future studies are needed to clarify the mechanisms underlying differential host response during habitual versus forced reduction in sleep duration and delineate the long-term health consequences of this phenomenon.

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## SUPPLEMENTARY MATERIAL

Supplementary Tables S1-S3 are available at SLEEP online.

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## DISCLOSURE STATEMENT

None declared.