

RESEARCH PAPER

## DNA methylation profiling reveals differences in the 3 human monocyte subsets and identifies uremia to induce DNA methylation changes during differentiation

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### ABSTRACT

Human monocytes are a heterogeneous cell population consisting of 3 subsets: classical CD14<sup>++</sup>CD16<sup>-</sup>, intermediate CD14<sup>++</sup>CD16<sup>+</sup> and nonclassical CD14<sup>+</sup>CD16<sup>++</sup> monocytes. *Via* poorly characterized mechanisms, intermediate monocyte counts rise in chronic inflammatory diseases, among which chronic kidney disease is of particular epidemiologic importance. DNA methylation is a central epigenetic feature that controls hematopoiesis. By applying next-generation Methyl-Sequencing we now tested how far the 3 monocyte subsets differ in their DNA methylome and whether uremia induces DNA methylation changes in differentiating monocytes. We found that each monocyte subset displays a unique phenotype with regards to DNA methylation. Genes with differentially methylated promoter regions in intermediate monocytes were linked to distinct immunological processes, which is in line with results from recent gene expression analyses. *In vitro*, uremia induced dysregulation of DNA methylation in differentiating monocytes, which affected several transcription regulators important for monocyte differentiation (e.g., *FLT3*, *HDAC1*, *MNT*) and led to enhanced generation of intermediate monocytes. As potential mediator, the uremic toxin and methylation inhibitor S-adenosylhomocysteine induced shifts in monocyte subsets *in vitro*, and associated with monocyte subset counts *in vivo*. Our data support the concept of monocyte trichotomy and the distinct role of intermediate monocytes in human immunity. The shift in monocyte subsets that occurs in chronic kidney disease, a proinflammatory condition of substantial epidemiological impact, may be induced by accumulation of uremic toxins that mediate epigenetic dysregulation.

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### Introduction

The circulating pool of human monocytes is composed of 3 subsets that are specialized to fulfill distinct tasks in the immune system. Based on the classification of the International Consensus Statement on Monocyte Nomenclature, these subsets are defined as classical CD14<sup>++</sup>CD16<sup>-</sup> monocytes, intermediate CD14<sup>++</sup>CD16<sup>+</sup> monocytes, and nonclassical CD14<sup>+</sup>CD16<sup>++</sup> monocytes.<sup>1</sup>

Following this official nomenclature, several studies characterized monocyte subsets in genome-wide gene expression approaches.<sup>2–5</sup> Although these studies did not analyze the mechanisms of transcriptional regulation, they broadened our understanding of monocyte heterogeneity and specifically acknowledged the importance of intermediate monocytes. So far, intermediate monocytes were either neglected, or they were merely considered as a transient cell population in the differentiation process from classical into nonclassical monocytes with no notable immunological functions. In contrast, these recent gene expression analyses, and other functional studies, identified intermediate monocytes as distinct mediators of proinflammatory responses.<sup>6</sup>

This is in line with clinical studies on monocyte heterogeneity. Counts of intermediate monocytes are increased in several proinflammatory conditions, among which chronic kidney disease (CKD) is of particular epidemiological importance, as it affects one tenth of the global adult population.<sup>7</sup> Declining renal function is associated with a shift in monocyte subsets, and CKD patients with highest cell counts of intermediate monocytes have worst cardiovascular outcome.<sup>8–11</sup> However, the underlying mechanism for the shift of monocyte subsets in CKD and other proinflammatory diseases remains enigmatic.

Pioneering animal studies found the one carbon (C1) metabolism to be directly linked to monocyte heterogeneity and characterized the C1 metabolite homocysteine as a central mediator causing shifts in monocyte subsets toward intermediate monocytes.<sup>12,13</sup> Importantly, the C1 metabolism is closely connected to epigenetic gene regulation, particularly to DNA methylation; the C1 metabolite S-adenosylmethionine (SAM) is the universal methyl group donor, whereas its derivate S-adenosylhomocysteine (SAH) is a strong inhibitor of cellular methyltransferases.

Despite the evidence for a direct link between the C1 metabolism and monocyte heterogeneity and the central role of DNA methylation in the differentiation of haematopoietic stem cells to monocytes,<sup>14</sup> no data on the impact of DNA methylation on the regulation of monocyte heterogeneity have been provided so far. This impact might be of particular interest in CKD patients, who have tremendously increased plasma levels of homocysteine, SAM and SAH.

By applying the next-generation sequencing Methyl-Sequencing (Methyl-Seq) method, we now characterized genome-wide DNA methylation in the 3 monocyte subsets and analyzed the impact of uremia on DNA methylation in differentiating monocytes.

## Results

### Generation of Methyl-Seq libraries for the 3 monocyte subsets

To analyze whether the 3 monocyte subsets differ in their genome-wide DNA methylation profiles, we isolated classical, intermediate, and nonclassical monocytes from 7 healthy volunteers (Fig. S1) and generated 3 independent Methyl-Seq libraries. After removal of duplicates, low-quality reads, and reads that could not be mapped to the genome, the total number of reads was 70,168,933, comprising 28,259,303 from classical, 22,871,218 from intermediate, and 19,038,412 from nonclassical monocytes. In total, Methyl-Seq analysis allowed us to analyze 746,801 genomic loci. Of these 746,801 loci, 79,988 are located in upstream regions of genes (47,971 in CpG islands), on which our following analyses are focused given that those regions are primarily involved in the regulation of gene expression. The distribution of mapping regions is given in Figure 1A.

### Differentially methylated loci in intermediate monocytes

First, we aimed to characterize differentially methylated genomic loci in intermediate monocytes given the recent acknowledgment of these cells as a distinct cell population with particular proinflammatory potential.<sup>1-6,15</sup> When comparing genome-wide DNA methylation between intermediate monocytes and the 2 other monocyte subsets, we found 35,871 differentially methylated loci between intermediate and classical monocytes and 37,297 differentially methylated loci between intermediate and nonclassical monocytes ( $\text{Prob} \geq 0.8$ ; Fig. 1B). When focusing on CpG islands in gene upstream regions, we found 5,102 differentially methylated loci between intermediate and classical and 5,646 differentially methylated loci between intermediate and nonclassical monocytes. Interestingly, of those differentially methylated loci, a high amount of loci were hypomethylated in intermediate monocytes as compared to classical monocytes (4161 hypomethylated vs. 941 hypermethylated loci) and to nonclassical monocytes (3198 hypomethylated vs. 2448 hypermethylated loci; Fig. 1B).

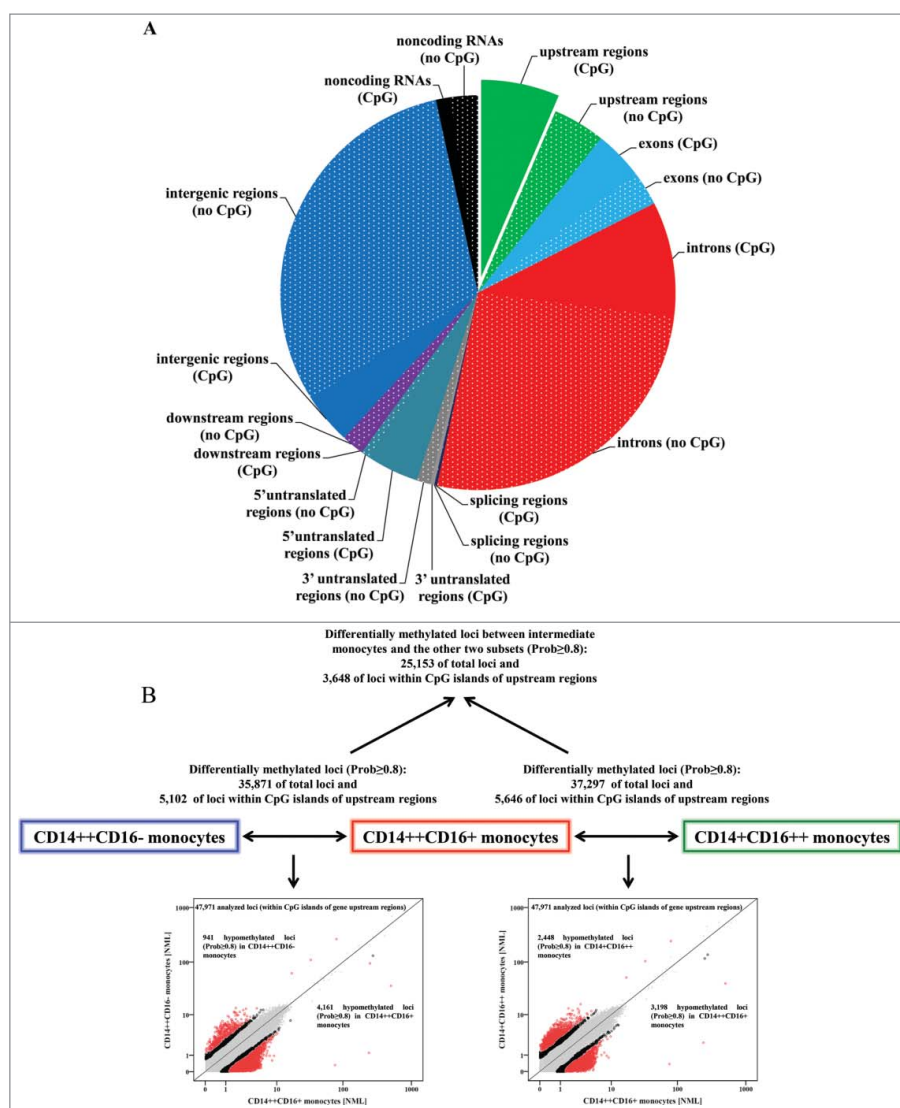
The distinct nature of intermediate monocytes is underscored by the observation that a substantial number of loci differed both between intermediate and classical monocytes, as well as between intermediate and nonclassical monocytes

(25,153 of total loci, and 3,648 loci in CpG islands of gene upstream regions, of which the 50 with strongest differences in DNA methylation are given in Table 1). Characterizing these 50 genes by using the Human Gene Database (GeneCards®) (<http://www.genecards.org/>) we could categorize these genes to distinct cellular processes such as cell differentiation and cell cycle progression (e.g., *NOTCH2NL*, *MXD4*, *RFWD2*), regulation of gene expression (e.g., *ZNF787*, *ELOF1*, *SETX*), intracellular transport processes (e.g., *CSNK1G2*, *FYCO1*, *GCC1*), lipid metabolism and oxidation (e.g., *GPX4*, *TMEM97*, *ACOT7*), as well as immune system processes, such as T cell activation, inflammation, and adhesion and migration (e.g., *FYN*, *CXCL12*, *STK10*).

We next performed pathway analysis with genes showing differential methylated upstream regions in intermediate monocytes as compared to both classical and nonclassical monocytes, in order to characterize differentially regulated pathways in intermediate monocytes (Fig. S2). Using the string database (<http://string-db.org/>)<sup>16</sup> we identified differentially regulated biological processes in intermediate monocytes, most of which were associated with cell differentiation and cellular biosynthesis processes (e.g., *JUNB*, *TGFB1*, *ERF*), regulation of gene expression (e.g., *KLF13*, *EGR3*, *POU3F2*), and immune system processes (e.g., *FASN*, *ELMO2*, *ITGA2*). Genes located at central positions within this pathway analysis are linked to NF- $\kappa$ B signaling (e.g., *RELA*, *NFKB1*, *NFKB2*) and other transcription factor dependent processes that regulate gene expression within immune system processes (e.g., *STAT1*, *CEBPB*, *FOS*). These results were confirmed by an enrichment analysis performed with the WEBGESTALT platform (<http://bioinfo.vanderbilt.edu/webgestalt/>), which linked genes with differentially methylated promoter regions in intermediate monocytes to distinct processes that include immune system processes, cell differentiation and cell cycle control, TNF receptor signaling, as well as lipid and lipoprotein metabolism. Genes enriched in these pathways were subsequently used as input to the GENEMANIA database (<http://www.genemania.org/>) in order to construct networks of interactions (Fig. S3).

Interestingly, 214 loci in CpG islands of gene upstream regions that were differentially methylated in intermediate monocytes could be linked to regions coding for microRNAs (Table S1 for the 50 most differentially methylated loci). Pathway analysis (<http://mirsystem.cgm.ntu.edu.tw/>)<sup>17</sup> of these miRNAs confirmed an enrichment of pathways for transcriptional regulation and for pathways associated with regulation of immune system processes, comprising toll-like receptor cascades, cytokine signaling, and angiotensin receptor Tie2 mediated signaling (e.g., miR-126, miR-148a, miR-210).

Finally, we analyzed whether these differentially methylated loci are associated with differential expression of the corresponding genes. Among 97 genes that were recently identified to be specifically expressed in intermediate monocytes,<sup>5</sup> those 61 genes defined by a 26-hit tag (perfect match in annotation) were now analyzed with regard to DNA methylation. We identified 55 loci (10 in CpG islands of gene upstream regions) linked to these genes that showed lower DNA methylation in intermediate monocytes as compared to both classical and nonclassical monocytes ( $\text{Prob} \geq 0.8$ ; Table S2).



**Figure 1.** Methyl-Seq analysis of isolated monocyte subsets. (A) Distribution of mapping regions of Methyl-Seq analysis. Plain sections show analyzed regions in CpG islands, patterned sections show analyzed regions that are not located in CpG islands. CpG islands within gene upstream regions are highlighted, as analyses are focused on these regions throughout the manuscript. (B) Schematic representation of differences in DNA methylation between the 3 monocyte subsets. The total number of differentially methylated loci (Prob $\geq$ 0.8) is given for total loci and for loci within CpG islands of gene upstream regions. The scatter plots illustrate differences in DNA methylation between intermediate and the 2 other monocyte subsets. Presented are loci within CpG islands of gene upstream regions; loci with differential methylation are given as circles (Prob $\geq$ 0.9 in red, Prob between 0.8 and 0.9 in black) and all other loci are given as gray dots.

### Differentiation of monocyte subsets under uremic conditions

We next addressed the question of whether the shift of monocyte subsets from classical toward intermediate and nonclassical monocytes that is observed in several proinflammatory diseases may be mediated *via* DNA methylation. We focused this analysis on patients with chronic kidney disease (CKD) because of its high prevalence<sup>7</sup> and its robust association with pronounced shifts in monocyte subset distribution.<sup>8,9</sup>

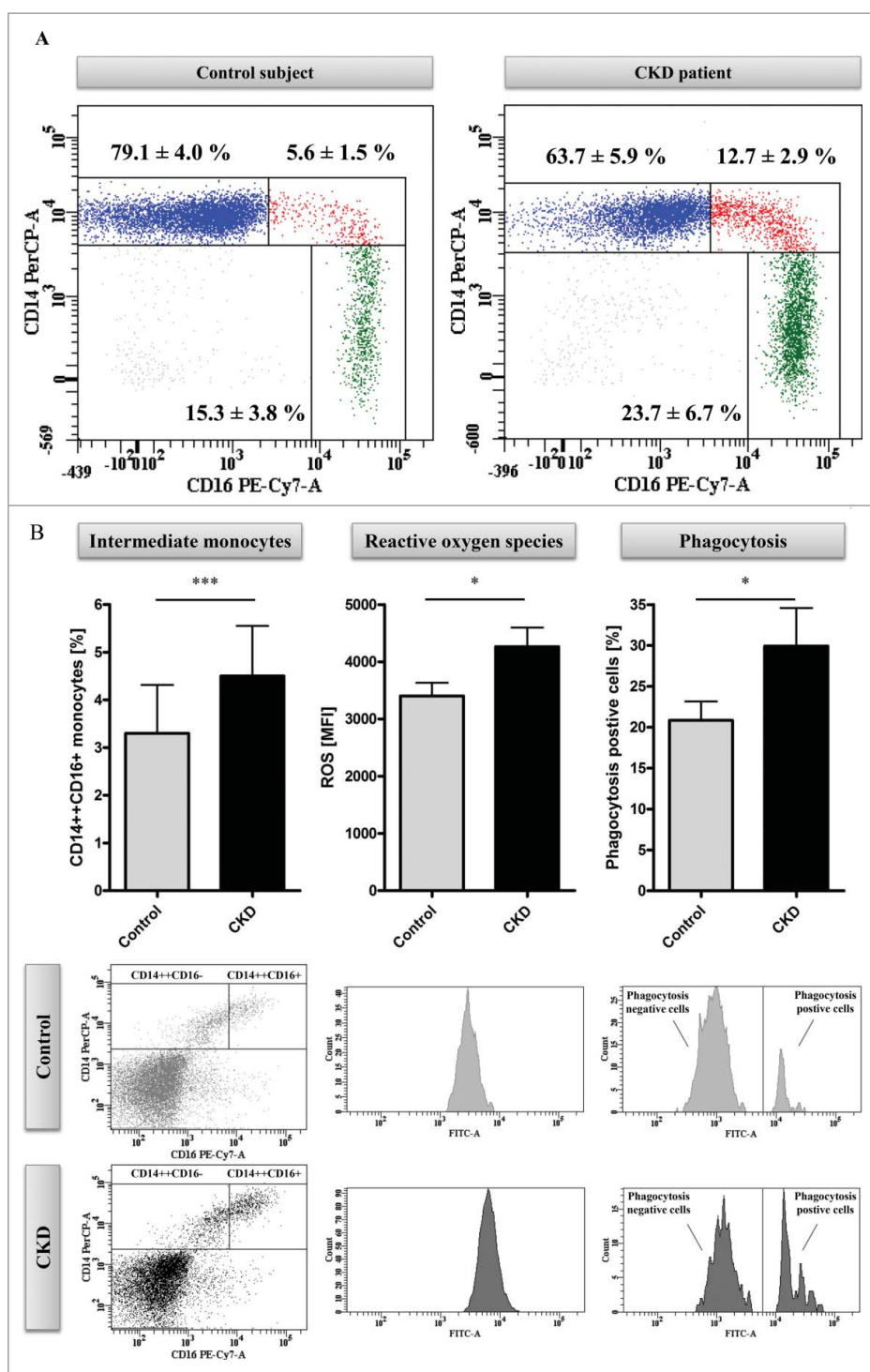
Therefore, we recruited patients with advanced CKD who were treated with standard hemodialysis treatment as well as age and gender matched controls. As expected, patients had higher counts of intermediate ( $P<0.05$ ) and nonclassical ( $P<0.01$ ) monocytes compared to control subjects (Fig. 2A for a representative example).

We first tested whether uremia *per se* induces enhanced generation of intermediate monocytes. Therefore, we collected serum samples from patients and controls and differentiated intermediate monocytes from haematopoietic stem cells isolated from healthy donors.<sup>18</sup> Upon stimulation with uremic serum, more intermediate monocytes were generated as compared to control conditions ( $P<0.001$ ; Fig. 2B). Moreover, intermediate monocytes that were generated under uremic conditions were characterized by a higher ROS production and higher phagocytosis capacity compared to monocytes generated under control conditions ( $P<0.05$ ; Fig. 2B). Similarly, classical monocytes generated under uremic conditions produced higher ROS levels ( $P<0.05$ ) and had higher phagocytosis capacity than classical monocytes generated under control conditions, although the latter finding did not reach statistical significance (Fig. S4).

**Table 1.** Top differentially methylated loci (in CpG islands of gene upstream regions) in CD14<sup>++</sup>CD16<sup>+</sup> monocytes as compared to CD14<sup>++</sup>CD16<sup>-</sup> and CD14<sup>+</sup>CD16<sup>++</sup> monocytes.

Position	Gene	Description	CD14 <sup>++</sup> CD16 <sup>-</sup> vs. CD14 <sup>++</sup> CD16 <sup>+</sup>			CD14 <sup>+</sup> CD16 <sup>++</sup> vs. CD14 <sup>++</sup> CD16 <sup>+</sup>	
			NML	NML	NML	Prob CD14 <sup>++</sup> CD16 <sup>-</sup> / CD14 <sup>++</sup> CD16 <sup>+</sup>	log <sub>2</sub> FC CD14 <sup>+</sup> CD16 <sup>++</sup> / CD14 <sup>++</sup> CD16 <sup>+</sup>
chr1:25757294-25757299	TMEM57	transmembrane protein 57	0.1	5.1	0.1	0.999 / 0.999	5.2 / 5.6
chr1:145208992-145208997	NOTCH2NL	notch 2 N-terminal like	0.2	5.2	0.4	0.999 / 0.998	4.9 / 3.8
chr2:43823285-43823290	THADA	thyroid adenoma associated	0.2	5.0	0.1	0.999 / 0.999	4.3 / 6.6
chr19:1267318-1267323	CIRBP	cold inducible RNA binding protein	0.4	5.5	0.5	0.999 / 0.998	4.0 / 3.5
chr17:43324893-43324898	MAP3K14-AS1	MAP3K14 antisense RNA 1	0.3	5.0	0.3	0.999 / 0.998	4.2 / 4.3
chr1:148556381-148556386	NBPF15	neuroblastoma breakpoint family, member 15	1.0	9.1	0.8	0.998 / 0.999	3.2 / 3.5
chr10:46993229-46993234	GPRIN2	G protein regulated inducer of neurite outgrowth 2	0.6	8.4	0.9	1.000 / 0.997	3.8 / 3.2
chr7:143534549-143534554	LOC154761	family with sequence similarity 115, member C pseudogene	0.2	5.5	0.5	0.999 / 0.997	4.9 / 3.4
chr17:7819587-7819592	LOC284023	NA	0.4	5.3	0.4	0.999 / 0.998	3.6 / 3.7
chr2:128785597-128785602	SAP130	Sin3A-associated protein, 130kDa	0.4	5.0	0.3	0.998 / 0.998	3.7 / 4.2
chr19:56632656-56632661	ZNF787	zinc finger protein 787	0.4	5.0	0.3	0.998 / 0.998	3.6 / 4.3
chr1:36916162-36916167	OSCP1	organic solute carrier partner 1	0.2	5.4	0.5	0.999 / 0.997	4.4 / 3.4
chr11:76092381-76092386	PRKRIR	protein-kinase, interferon-inducible double stranded RNA dependent inhibitor, repressor of (P58 repressor)	0.2	4.7	0.2	0.999 / 0.998	4.5 / 4.5
chr17:74070713-74070718	GALR2	galanin receptor 2	0.2	4.7	0.2	0.999 / 0.998	4.7 / 4.5
chr19:11670214-11670219	ELOF1	elongation factor 1 homolog (S. cerevisiae)	0.4	4.9	0.3	0.998 / 0.998	3.6 / 4.2
chr19:1940458-1940463	CSNK1G2	casein kinase 1, gamma 2	0.4	4.8	0.3	0.998 / 0.998	3.8 / 4.2
chr7:102213259-102213264	POLR2J3	polymerase (RNA) II (DNA directed) polypeptide J3	7.5	0.8	7.6	0.998 / 0.998	-3.2 / -3.3
chr17:8534325-8534330	MYH10	myosin, heavy chain 10, non-muscle	0.2	4.6	0.3	0.998 / 0.997	4.7 / 3.9
chr6:112194667-112194672	FYN	FYN proto-oncogene, Src family tyrosine kinase	0.5	5.1	0.4	0.997 / 0.998	3.4 / 3.8
chr12:49246065-49246070	DDX23	DEAD (Asp-Glu-Ala-Asp) box polypeptide 23	0.1	4.5	0.3	0.998 / 0.997	5.4 / 4.1
chr16:686860-686865	C16orf13	chromosome 16 open reading frame 13	0.5	5.2	0.5	0.998 / 0.997	3.5 / 3.4
chr4:2264327-2264332	MXD4	MAX dimerization protein 4	0.3	4.7	0.4	0.998 / 0.997	4.1 / 3.7
chr1:120838772-120838777	FAM72B	family with sequence similarity 72, member B	0.2	4.8	0.4	0.999 / 0.996	4.5 / 3.5
chr17:34957991-34957996	MRM1	mitochondrial rRNA methyltransferase 1 homolog (S. cerevisiae)	0.1	4.4	0.1	0.998 / 0.997	4.9 / 5.4
chr4:13486515-13486520	RAB28	RAB28, member RAS oncogene family	0.3	4.5	0.2	0.998 / 0.997	4.0 / 4.8
chr11:75236631-75236636	GDPD5	glycerophosphodiester phosphodiesterase domain containing 5	0.2	4.4	0.1	0.998 / 0.997	4.4 / 5.4
chr10:44880740-44880745	CXCL12	chemokine (C-X-C motif) ligand 12	0.4	4.7	0.4	0.998 / 0.997	3.7 / 3.7
chr3:46037337-46037342	FYCO1	FYVE and coiled-coil domain containing 1	0.3	4.5	0.3	0.998 / 0.997	3.8 / 4.1
chr19:1103841-1103846	GPX4	glutathione peroxidase 4	0.2	4.4	0.2	0.998 / 0.997	4.1 / 4.8
chr4:2264184-2264189	MXD4	MAX dimerization protein 4	0.2	4.9	0.5	0.999 / 0.995	4.3 / 3.2
chr5:171615865-171615870	STK10	serine/threonine kinase 10	0.2	4.3	0.2	0.998 / 0.996	4.6 / 4.4
chr16:770721-770726	FAM173A	family with sequence similarity 173, member A	0.1	4.2	0.2	0.998 / 0.996	5.9 / 4.7
chr2:87303947-87303952	LOC285074	anaphase promoting complex subunit 1 pseudogene	6.1	0.7	6.5	0.996 / 0.997	-3.1 / -3.2
chr10:44882133-44882138	CXCL12	chemokine (C-X-C motif) ligand	0.4	4.4	0.2	0.997 / 0.997	3.6 / 4.4
chr2:73340397-73340402	RAB11FIP5	RAB11 family interacting protein 5 (class I)	0.4	4.5	0.4	0.997 / 0.996	3.7 / 3.6
chr6:34217221-34217226	C6orf1	chromosome 6 open reading frame 1	0.1	4.3	0.3	0.998 / 0.995	4.9 / 3.8
chr7:127225841-127225846	GCC1	GRIP and coiled-coil domain containing 1	0.2	5.5	0.7	0.999 / 0.994	4.5 / 3.0
chr5:612156-612161	CEP72	centrosomal protein 72kDa	0.3	4.4	0.3	0.997 / 0.996	3.8 / 4.1
chr17:26645494-26645499	TMEM97	transmembrane protein 97	0.4	4.4	0.2	0.997 / 0.997	3.6 / 4.4
chr4:152330105-152330110	FAM160A1	family with sequence similarity 160, member A1	0.5	4.9	0.4	0.996 / 0.997	3.2 / 3.6
chr16:67678949-67678954	RLTPR	RGD motif, leucine rich repeats, tropomodulin domain and proline-rich containing	0.2	4.3	0.3	0.997 / 0.996	4.3 / 4.0
chr5:137090687-137090692	HNRNPA0	heterogeneous nuclear ribonucleoprotein A0	0.2	4.9	0.6	0.999 / 0.994	4.5 / 3.1
chr4:1858552-1858557	LETM1	leucine zipper-EF-hand containing transmembrane protein 1	0.2	4.5	0.4	0.998 / 0.995	4.4 / 3.4
chr4:53525726-53525731	USP46	ubiquitin specific peptidase 46	0.3	4.2	0.1	0.996 / 0.996	3.7 / 6.3
chr16:686756-686761	C16orf13	chromosome 16 open reading frame 13	5.5	0.7	6.4	0.995 / 0.998	-3.1 / -3.3
chr1:176176803-176176808	RFWD2	ring finger and WD repeat domain 2, E3 ubiquitin protein ligase	0.3	4.8	0.5	0.998 / 0.994	3.9 / 3.2
chr16:3550165-3550170	CLUAP1	clusterin associated protein 1	0.3	4.2	0.2	0.997 / 0.996	4.1 / 4.7
chr1:6453838-6453843	ACOT7	acyl-CoA thioesterase 7	0.2	4.3	0.4	0.998 / 0.995	4.4 / 3.6
chr9:135230442-135230447	SETX	Senataxin	0.1	4.2	0.3	0.997 / 0.995	5.3 / 4.0
chr19:11592808-11592813	ELAVL3	ELAV like neuron-specific RNA binding protein 3	0.3	4.2	0.3	0.997 / 0.995	4.1 / 3.8

NML: normalized tag count (tags per million); Prob: probability; FC: fold change; NA: not available



**Figure 2.** Methyl-Seq analysis of uremic monocytes. (A) Representative dot plots of monocyte subsets of a hemodialysis patient (right panel) and an age and gender matched control subject (left panel). Given are mean percentages ( $\pm$ SD) for monocyte subsets of 5 patients and controls, respectively. (B) Analysis of *in vitro* differentiated intermediate monocytes. Percentages of intermediate monocytes (left panel) as well as the capacity of intermediate monocytes to produce reactive oxygen species (middle panel) and to phagocyte (right panel) were determined with flow-cytometry. Data are presented as mean $\pm$ SEM and compared by Student t test. Representative dot plots and histograms are shown. \*  $P < 0.05$ , \*\*\* $P < 0.001$ . ROS indicates reactive oxygen species. (C) Distribution of mapping regions of Methyl-Seq analysis. Plain sections show analyzed regions in CpG islands, patterned sections show analyzed regions that are not located in CpG islands. CpG islands within gene upstream regions are highlighted, as analyses are focused on these regions throughout the manuscript. (D) Schematic representation of differences in DNA methylation between monocytes that were differentiated under control or under uremic conditions. Presented are total loci (left panel) as well as loci within CpG islands of gene upstream regions (right panel). Loci with differential methylation are given as circles (Prob $\geq$ 0.9 in red, Prob between 0.8 and 0.9 in black) and all other loci are given as gray dots. To allow better illustration, axes are cut at NML counts of 100, as no differences in DNA methylation were observed in loci with higher NML count. Complete scatter plots are given in Figure S5.

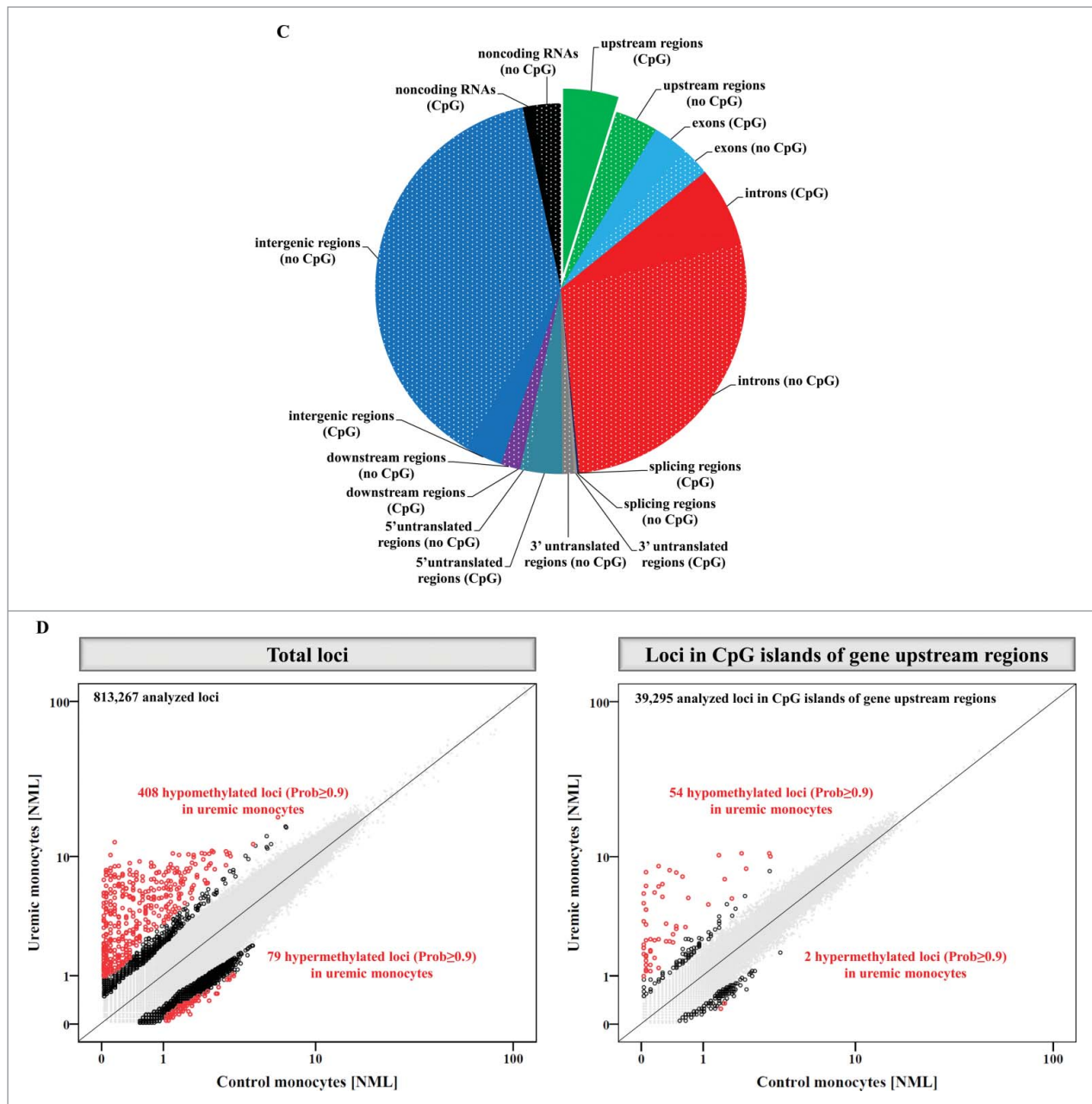


Figure 2. (Continued)

### Generation of Methyl-Seq libraries of differentiated monocytes

In order to analyze whether uremia affects DNA methylation in differentiating monocytes, we performed Methyl-Seq analysis of monocytes that were differentiated under control and under uremic conditions. Thus, we generated 2 independent libraries (“control monocytes” and “uremic monocytes”), which consisted of 38,707,311 reads in total, comprising 18,611,539 reads from control monocytes and 20,095,772 reads from uremic monocytes. Methyl-Seq analysis allowed us to analyze 813,267 genomic loci. Of these 813,267 loci, 69,615 are located in upstream regions of genes (39,295 in CpG islands), on which we focused our next analyses. The distribution of mapping regions is given in Fig. 2C.

### Differentially methylated loci in uremic monocytes

Genome-wide DNA methylation analysis revealed 6,618 differentially methylated loci between monocytes that were differentiated under control or uremic conditions, respectively (Prob $\geq$ 0.8). When focusing on CpG islands in gene upstream regions, we found 283 differentially methylated loci, of which 136 were hypomethylated and 147 hypermethylated in uremic monocytes (Fig. 2D, Fig. S5). Interestingly, when focusing on those loci with highest differences in DNA methylation (Prob $\geq$ 0.9; indicated in red in Fig. 2D), we found a strong enrichment of hypomethylated loci in uremic monocytes (total loci: 408 hypomethylated vs. 79 hypermethylated; loci in CpG islands of upstream regions: 54 hypomethylated vs. 2 hypermethylated). Those 50 loci with strongest differences in DNA

**Table 2.** Top differentially methylated loci (in CpG islands of gene upstream regions) in uremic monocytes as compared to control monocytes.

Position	Gene	Description	Control monocytes NML	Uremic monocytes NML	Prob	log2FC
chr17:42298408-42298413	UBTF	upstream binding transcription factor, RNA polymerase I	0.2	8.6	1.000	5.3
chr11:43702119-43702124	HSD17B12	hydroxysteroid (17- $\beta$ ) dehydrogenase 12	0.1	7.8	1.000	7.2
chr4:166128588-166128593	KLHL2	kelch-like family member 2	0.4	8.1	1.000	4.4
chr2:86116229-86116234	ST3GAL5	ST3 $\beta$ -galactoside $\alpha$ -2,3-sialyltransferase 5	0.5	7.8	1.000	4.0
chr9:140118246-140118251	C9orf169	chromosome 9 open reading frame 169	0.1	6.2	1.000	6.9
chr2:45878887-45878892	PRKCE	protein kinase C, epsilon	0.3	6.4	1.000	4.6
chr16:51185257-51185262	SALL1	spalt-like transcription factor 1	0.2	6.2	1.000	4.9
chr12:7053171-7053176	C12orf57	chromosome 12 open reading frame 57	0.0	5.5	1.000	7.7
chr9:127703512-127703517	GOLGA1	golgin A1	0.2	5.6	1.000	5.1
chr10:94449085-94449090	HHEX	hematopoietically expressed homeobox	0.6	7.3	0.999	3.6
chr15:101835544-101835549	SNRPA1	small nuclear ribonucleoprotein polypeptide A'	0.3	5.2	0.999	4.3
chr22:50683474-50683479	TUBGCP6	tubulin, gamma complex associated protein 6	0.1	4.2	0.998	6.3
chr1:861097-861102	SAMD11	sterile $\alpha$ motif domain containing 11	0.1	4.2	0.998	6.3
chr9:90112524-90112529	DAPK1	death-associated protein kinase 1	0.0	3.4	0.994	7.0
chr21:37692207-37692212	MORC3	MORC family CW-type zinc finger 3	1.4	10.2	0.994	2.9
chr14:103524263-103524268	CDC42BPB	CDC42 binding protein kinase $\beta$ (DMPK-like)	0.1	3.2	0.993	5.9
chr5:10761675-10761680	DAP	death-associated protein	0.7	5.1	0.992	2.9
chr17:1533226-1533231	SLC43A2	solute carrier family 43 (amino acid system L transporter), member 2	0.1	2.3	0.980	5.4
chr3:48723486-48723491	NCKIPSD	NCK interacting protein with SH3 domain	0.1	2.4	0.980	4.5
chr1:91183789-91183794	BARHL2	BarH-like homeobox 2	2.1	10.5	0.978	2.3
chr1:33430402-33430407	RNF19B	ring finger protein 19B	0.2	2.3	0.978	3.9
chr12:65153256-65153261	GNS	glucosamine (N-acetyl)-6-sulfatase	0.2	2.4	0.977	3.5
chr17:1613840-1613845	TLCD2	TLC domain containing 2	0.0	2.1	0.976	6.3
chr1:2458037-2458042	PANK4	pantothenate kinase 4	1.5	7.0	0.973	2.2
chr9:140116222-140116227	RNF208	ring finger protein 208	0.5	2.9	0.972	2.6
chr3:56591104-56591109	CCDC66	coiled-coil domain containing 66	0.0	2.0	0.972	6.2
chr4:1872228-1872233	WHSC1	Wolf-Hirschhorn syndrome candidate 1	0.0	2.0	0.972	6.2
chr1:20512525-20512530	UBXN10	UBX domain protein 10	0.4	2.6	0.966	2.6
chr22:39916141-39916146	ATF4	activating transcription factor 4	0.3	2.3	0.965	2.8
chr1:2344070-2344075	PEX10	peroxisomal biogenesis factor 10	0.1	1.9	0.965	4.1
chr22:39916233-39916238	ATF4	activating transcription factor 4	0.1	1.8	0.963	4.1
chr1:14026636-14026641	PRDM2	PR domain containing 2, with ZNF domain	0.0	1.7	0.962	6.0
chr3:48723384-48723389	NCKIPSD	NCK interacting protein with SH3 domain	0.6	3.0	0.960	2.2
chr19:58897792-58897797	RPS5	ribosomal protein S5	0.1	1.7	0.958	5.0
chr6:36355988-36355993	ETV7	ets variant 7	0.4	2.3	0.958	2.6
chr17:1613937-1613942	TLCD2	TLC domain containing 2	0.1	1.6	0.956	4.9
chr17:74379544-74379549	SPHK1	sphingosine kinase 1	0.1	1.5	0.947	4.8
chr17:2305318-2305323	MNT	MAX network transcriptional repressor	0.2	1.6	0.945	3.3
chr7:45961262-45961267	IGFBP3	insulin-like growth factor binding protein 3	2.2	8.3	0.932	1.9
chr19:531530-531535	CDC34	cell division cycle 34	0.1	1.3	0.932	3.6
chr8:42010204-42010209	AP3M2	adaptor-related protein complex 3, mu 2 subunit	0.1	1.2	0.922	4.5
chr2:133174115-133174120	GPR39	G protein-coupled receptor 39	3.2	10.5	0.920	1.7
chr7:112430503-112430508	TMEM168	transmembrane protein 168	1.4	0.2	0.918	-2.5
chr12:56652328-56652333	ANKRD52	ankyrin repeat domain 52	0.1	1.1	0.916	4.4
chr20:19997703-19997708	NAA20	N( $\alpha$ )-acetyltransferase 20, NatB catalytic subunit	3.2	10.0	0.915	1.6
chr19:47551909-47551914	TMEM160	transmembrane protein 160	0.1	1.1	0.911	3.4
chr1:32757466-32757471	HDAC1	histone deacetylase 1	1.5	0.3	0.907	-2.2
chr21:35747557-35747562	SMIM11	small integral membrane protein 11	0.0	1.0	0.903	5.2
chr8:17780349-17780354	PCM1	pericentriolar material 1	1.8	5.0	0.903	1.5
chr21:28339999-28340004	ADAMT5	ADAM metalloproteinase with thrombospondin type 1 motif, 5	0.2	1.2	0.900	2.5

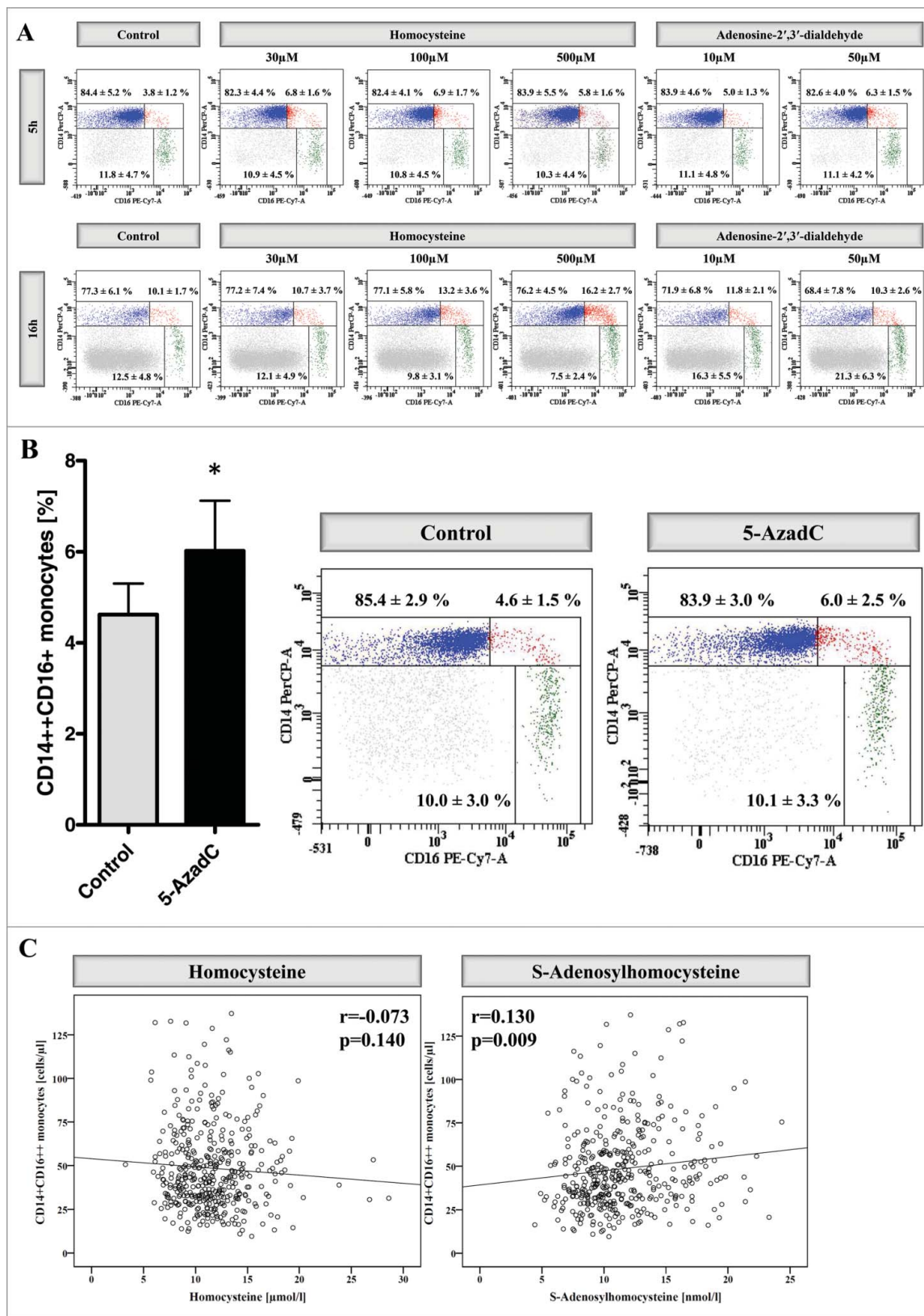
NML: normalized tag count (tags per million); Prob: probability; FC: fold change.

methylation are presented in Table 2. Importantly, within these 50 loci that differed most pronouncedly in DNA methylation, we identified several loci linked to transcription factors (e.g., *ATF4*, *SALL1*, *MNT*).

String and gene ontology analysis of genes with differentially methylated upstream regions in uremic monocytes (Fig. S6) confirmed an enrichment of GO terms connected to transcriptional regulation [e.g., “negative regulation of gene expression” (*SAP130*, *LIMS1*, *UBTF*, in biological process), “sequence-specific DNA binding transcription factor activity” (e.g., *HDAC1*, *ZNF224*, *BTAFL1*, in molecular function)]. Of particular interest, the upstream region of *FLT3*, which plays an important role in

the differentiation of haematopoietic stem cells, was found to be differentially methylated in uremic monocytes. Genes with differentially methylated upstream regions in uremic monocytes could additionally be linked to GO terms associated with atherogenesis and cholesterol metabolism such as “regulation of macrophage derived foam cell differentiation,” “regulation of cholesterol storage,” and “regulation of lipid metabolic process” (e.g., *NR1H2*, *MAPK9*, *PRKCE*).

To further analyze the impact of uremia on the induction of proatherogenic pathways in differentiating monocytes, we analyzed whether those genes with differentially methylated upstream regions can be associated with cardiovascular disease



**Figure 3.** Impact of C1 metabolites on monocyte subsets. (A) Distribution of monocyte subsets after stimulation of whole blood for 5 h (upper panel) and 16 h (lower panel) with increasing concentrations of homocysteine (30  $\mu\text{M}$ , 100  $\mu\text{M}$ , and 500  $\mu\text{M}$ ) or Adenosine-2',3'-dialdehyde (10  $\mu\text{M}$  and 50  $\mu\text{M}$ ). Data are presented as mean  $\pm$  SD of 6 (for 5 h) and 7 (16 h) independent experiments, and one representative example is illustrated. (B) Distribution of monocyte subsets after stimulation of whole blood for 5 h with 5-aza-2'-deoxycytidine (0.5  $\mu\text{M}$ ). Data are presented as mean  $\pm$  SEM of 5 independent experiments (left panel). One representative example is illustrated and the mean percentages ( $\pm$ SD) of the 3 monocyte subsets from 5 independent experiments are presented (right panel). (C) Correlation between nonclassical monocytes and homocysteine (left panel) as well as between nonclassical monocytes and S-adenosylhomocysteine (right panel) within the I Like HOME study. To allow better visualization, data from 2 participants (participant 1: plasma homocysteine 46.7 mmol/l; participant 2: plasma SAH 43.0 nmol/l) are not depicted in the figure, but included in all calculations. Correlation coefficients were calculated by Pearson test.



(CVD) and with underlying pathological pathways of atherosclerosis, namely infections and immune disease. By using the Genetic Association Database (accessible from the National Institutes of Health; <http://geneticassociationdb.nih.gov/>) we found that numerous genes with differentially methylated upstream regions (64 out of 283) are associated with CVD, infections and/or immune diseases (Table S3).

Finally, we aimed to analyze whether monocytes generated under uremic conditions are closer related to circulating intermediate monocytes than monocytes generated under control conditions. Therefore, we performed a hierarchical cluster analysis with those 10,000 loci that have the highest tag count in the combined analysis comprising monocyte subsets and *in vitro* generated monocytes. Indeed, we confirmed that monocytes generated under uremic conditions are closer related to circulating intermediate monocytes than monocytes generated under control conditions (Fig. S7). In line, most of those loci that were identified to be hypomethylated in uremic monocytes as compared to control monocytes were also hypomethylated in circulating intermediate as compared to circulating classical and to circulating nonclassical monocytes (88% of those loci presented in Table 2).

### Impact of C1 metabolites on monocyte subsets

Finally, we aimed to analyze whether central uremic toxins that are linked to epigenetic dysregulation—homocysteine and S-adenosylhomocysteine (SAH)—may account for shifts in monocyte subsets. Stimulation of monocytes with increasing concentrations (30  $\mu$ M, 100  $\mu$ M, and 500  $\mu$ M) of homocysteine for 5 h induced a significant rise in intermediate monocytes (Fig. 3A, Fig. S8). As the incubation with homocysteine also increases the intracellular concentrations of SAH, we next stimulated monocytes with different concentrations (10  $\mu$ M and 50  $\mu$ M) of Adenosine-2',3'-dialdehyde (Adox), which is an inhibitor of the SAH hydrolase and thus selectively increases intracellular SAH concentrations without increasing homocysteine levels.<sup>19</sup> We found that Adox also induced a significant increase of intermediate monocytes after 5 h stimulation (Fig. 3A, Fig. S8). Interestingly, stimulation of monocytes with the DNA hypomethylating drug 5-aza-2'-deoxycytidine induced a similar shift in monocyte subsets as homocysteine and Adox stimulation (Fig. 3B).

We subsequently aimed to verify whether the increase of intermediate monocyte percentages after homocysteine and Adox stimulation represents a true conversion of classical monocytes into intermediate monocytes or a mere upregulation of CD16 on classical monocytes, so that our gating strategies would identify *bona fide* classical monocytes as intermediate monocytes. We therefore analyzed the expression of distinct surface markers on total monocytes, without further gating for monocyte subsets. Compared to unstimulated cells, homocysteine and Adox stimulation induced an upregulation of CD16 and CD86 (Fig. S9) as well as CCR5 and CX3CR1 (Figure S10) on total monocytes, even though the expression within each predefined monocyte subset remained stable. As all 4 antigens are less strongly expressed on classical monocytes than on other monocyte subsets, their upregulation points toward true monocyte subset conversion in the context of homocysteine and Adox stimulation. The stable expression of CCR5 expression

on those intermediate monocytes in closest vicinity to classical monocytes after their stimulation with homocysteine and Adox further points against a shift of *bona fide* classical monocytes into the intermediate monocyte gate (Figure S11).

Upon more prolonged incubation of 16 h, the increase in intermediate monocytes after homocysteine stimulation persists, whereas stimulation with Adox drives an increase in nonclassical monocytes (Fig. 3A).

We finally reanalyzed data from the I Like HOME study, in which cell counts of monocyte subsets and plasma levels of C1 metabolites were analyzed in 420 subjects from the general population. In line with the *in vitro* data, we found a significant association between nonclassical monocytes and SAH levels (Fig. 3C, Figure S12). No association was found between nonclassical monocytes and homocysteine as well as between intermediate monocytes and the 2 C1 metabolites (Fig. 3C, Figure S12, Figure S13).

## Discussion

As a central epigenetic feature, DNA methylation controls differentiation of haematopoietic stem cells toward specialized lineage-committed cell types. Distinct cell populations differ in their DNA methylation profiles, which allow these cells to adhere to their specific gene expression programs.<sup>14</sup>

Although monocytes have been acknowledged as a heterogeneous cell population with subset-specific gene expression profiles<sup>1-6,15</sup>, data on transcriptional regulation of the 3 monocyte subsets have been lacking so far. Gene expression is centrally regulated by epigenetic mechanisms, which can broadly be subdivided into the 3 categories: DNA methylation, histone modifications, and microRNAs (miRNAs). Within the FANTOM5 (Functional Annotation of Mammalian Genome 5) project, which aims to characterize transcriptional regulation within the majority of human cells, significant differences in histone modifications were found between classical and nonclassical monocytes, which correlated with their gene expression profiles.<sup>20</sup>

Using the Methyl-Seq next-generation sequencing method, we now performed for the first time a genome-wide DNA methylation analysis of the 3 human monocyte subsets. By sequencing 70,168,933 reads and analyzing 746,801 loci, we generated high-resolution DNA methylation profiles of the 3 monocyte subsets. Demonstrating that intermediate monocytes show a distinct phenotype with regard to DNA methylation, our data further supports the trichotomy of monocytes.<sup>2-5</sup> Particularly, we found a higher number of hypomethylated than hypermethylated loci when comparing intermediate monocytes to classical and nonclassical monocytes.

Intermediate monocytes are centrally involved in distinct immune system processes, such as antigen processing and presentation.<sup>4,5,20-22</sup> Additionally, they were characterized as a proinflammatory monocyte subset, as they produce high levels of reactive oxygen species<sup>5</sup> and of proinflammatory cytokines such as TNF $\alpha$  and IL1 $\beta$  after LPS stimulation.<sup>2</sup> The present DNA methylation analysis extends these previous findings and shows that the 3 monocyte subsets differ in their DNA methylation profiles. Next, pathway analyses support the concept that intermediate monocytes may have a distinct role in immunity

with regards to T cell activation, inflammation as well as adhesion and migration. Moreover, these analyses linked differentially methylated genes to further cellular processes such as gene regulation, cell differentiation, and cellular biosynthesis, in line with the idea that intermediate monocytes are cells in transition, originating from classical monocytes and differentiating to nonclassical monocytes.

In clinical studies, counts of intermediate monocytes were found to be elevated in many pathological conditions,<sup>6</sup> particularly in chronic kidney disease (CKD), which affects one tenth of the human population.<sup>7</sup> In line with their proinflammatory potential, intermediate monocyte counts predict future cardiovascular events both in patients with<sup>8–11</sup> and without<sup>23</sup> overt CKD. Thus, monocyte subsets have been proposed as future targets in cardiovascular and nephrological medicine.<sup>24</sup> However, the development of pharmaceuticals that will affect monocyte subset biology requires a more detailed understanding of the mechanisms that underlie the shift of monocyte subsets in human disease.

The plasticity of epigenetics is an important tool for immune cells to react upon changes in the environment. Failure in epigenetic regulation may therefore induce immune cell dysfunction and thus lead to changes in the immune cell composition, as seen in CKD patients.<sup>25</sup> Importantly, the non-physiologic uremic milieu may directly induce epigenetic dysregulation in circulating immune cells and may thus contribute to immune dysfunction in CKD.<sup>26–29</sup>

By applying Methyl-Seq next-generation sequencing analysis we now show for the first time that uremia *per se* induces differential DNA methylation in differentiating monocytes. By sequencing 38,707,311 reads, we analyzed DNA methylation of 813,267 genomic loci. Among 6,618 loci (283 in CpG upstream regions) that were found to be differentially methylated between control and uremic monocytes, we identified several loci linked to transcriptional regulators and to monocyte differentiation. Moreover, several differentially methylated loci were connected to proatherogenic pathways, which is of particular interest in CKD, as many patients have premature cardiovascular disease caused by accelerated atherosclerosis, to which monocytes centrally contribute.<sup>30</sup>

In line with previous reports,<sup>27,31</sup> we found that uremic monocytes displayed a high number of strongly hypomethylated loci. Importantly, declining renal function is associated with a strong increase in S-adenosylhomocysteine (SAH),<sup>32,33</sup> the derivative of the universal methyl group donor S-Adenosylmethionine (SAM). SAH itself is a strong inhibitor of cellular methyltransferases and is thus directly linked to epigenetic regulation.<sup>26</sup>

As SAH is rapidly converted into homocysteine, homocysteine and SAH levels are closely correlated. Notably, SAH is currently discussed as the real culprit for the high cardiovascular disease risk in patients with hyperhomocysteinemia.<sup>33–36</sup> In these patients, lowering of homocysteine with B vitamins did not affect cardiovascular outcome, which questions a pathophysiological role of homocysteine in cardiovascular disease. Instead, B vitamin supplementation does not lower SAH levels at all,<sup>37,38</sup> which leaves SAH as the potential culprit in hyperhomocysteinemia.

Experimental studies that analyzed the pathophysiological effects of SAH found that the increase of SAH—either by a

specific diet or by supplementation of the SAH hydrolase inhibitor adenosine-2,3-dialdehyde (Adox)—accelerated the development of atherosclerosis, which was associated with DNA methylation, without a contribution of homocysteine.<sup>39,40</sup> However, data on the implications of C1 metabolites on monocyte biology focused on homocysteine rather than on SAH so far. First, animal studies with cystathionine  $\beta$ -synthase deficient mice have shown that hyperhomocysteinemia promotes the generation of intermediate (and classical) monocytes.<sup>12,13</sup> Moreover, these studies demonstrated that the addition of homocysteine to *in vitro* cultures of mouse primary splenocytes induced the intermediate monocyte subset. However, as the supplementation of homocysteine also increases the intracellular SAH levels,<sup>19</sup> the exact mediator for the enhanced generation of intermediate monocytes cannot fully be identified from these studies. Notably, in the same animal model, intermediate monocytes negatively correlated with the SAM/SAH ratio, which is an indicator for DNA methylation capacity.<sup>41</sup> Moreover, a recent clinical study demonstrated that DNA hypomethylating drugs induce the generation of intermediate and nonclassical monocytes in patients with chronic myelomonocytic leukemia.<sup>42</sup> In line, *in vitro* stimulation with the DNA hypomethylating drug 5-aza-2'-deoxycytidine induced a shift of monocyte subsets toward intermediate monocytes in the present study. Further studies are needed in order to analyze whether the induction of DNA hypermethylation in monocyte subsets, e.g., by supplementation of S-Adenosylmethionine, may be an option to reduce intermediate monocyte cell counts in patients.

Our data support the notion that SAH rather than homocysteine itself may mediate the enhanced generation of intermediate monocytes *via* epigenetic mechanisms. Of note, beyond C1 metabolites, also other uremic toxins may trigger epigenetic dysregulation in circulating immune cells and may thus contribute to immune dysfunction in CKD. Particularly, chronic inflammation—which is a common feature in CKD<sup>43</sup>—has been associated with changes in DNA methylation. First, proinflammatory cytokines were shown to regulate a DNA methyltransferase gene.<sup>44</sup> Second, an association between the inflammation status and global DNA methylation was shown in CKD patients.<sup>28</sup> Finally, we previously demonstrated that the p66Shc (SHC1) gene, which plays a central role in the stress response and reactive oxygen species metabolism, is hypomethylated in dialysis patients.<sup>45</sup>

In summary, we demonstrated for the first time that the 3 human monocyte subsets differ in their DNA methylation profiles, which may account for their different immunological functions. Next, we suggest that the accumulation of epigenetically active uremic toxins in patients with CKD may induce a reprogramming of differentiating monocytes, an enhanced generation of intermediate monocytes and an activation of their proinflammatory signaling cascades.

## Materials and methods

### Isolation of monocyte subsets

The three monocyte subsets were isolated from 7 healthy volunteers according to our established method.<sup>5</sup> In brief,

peripheral blood mononuclear cells (PBMCs) were isolated from EDTA-anticoagulated blood by density gradient centrifugation (Ficoll-Paque PLUS, GE Healthcare [17-1440-03]). Subsequently, CD16 expressing non-monocytes, i.e., NK cells and neutrophils, were depleted by using a cocktail of CD15 and CD56 MicroBeads (Non-monocyte Depletion Cocktail, CD16+ Monocyte Isolation Kit, Miltenyi Biotec [130-091-765]). Next, cells were incubated with anti-CD14 FITC antibody (clone TÜK4 Miltenyi Biotec [130-080-701]) and anti-FITC MultiSort MicroBeads (Anti-FITC MultiSort Kit; Miltenyi Biotec [130-058-701]), in order to separate classical and intermediate from nonclassical and non-monocytes. Finally, both cell fractions (classical/intermediate monocytes and nonclassical/non-monocytes) were incubated with CD16 MicroBeads to separate classical from intermediate monocytes and to separate nonclassical from non-monocytes. A representative example of isolated monocyte subsets is depicted in Figure S1. All steps were performed at 4°C and purity was analyzed flow-cytometrically after staining cells with anti-CD86 PE (clone HA5.2B7, Beckman-Coulter [IM2729U]), anti-CD14 PerCP (clone MΦP9, BD Biosciences [345786]) and anti-CD16 PE-Cy7 (clone 3G8, BD Biosciences [557744]) antibodies. For all flow-cytometry experiments, we applied our validated CD86-based gating strategy.<sup>5,11</sup>

All participants recruited for this study gave informed consent. The study protocol was approved by the local Ethics Committee.

### Generation of monocytes from haematopoietic stem cells

Monocytes were generated from haematopoietic stem cells as described previously.<sup>18</sup> In brief, haematopoietic stem cells were first isolated from PBMCs of healthy subjects using the CD34 MicroBead Kit (Miltenyi Biotec [130-046-702]). Purity of isolated haematopoietic stem cells was analyzed flow-cytometrically after staining cells with anti-CD34 APC (clone 581; BD Biosciences [555824]) and anti-CD45 PE (clone HI30; BD Biosciences [555483]).

Differentiation of monocytes from haematopoietic stem cells was performed in a 2-step culture. First, haematopoietic stem cells were expanded in the Haematopoietic Progenitor Cell Expansion Medium DXF (PromoCell [C-28021]). For this purpose, isolated cells were cultured in 6-well plates in the presence of the recombinant human growth factors TPO, SCF, flt3-ligand and IL-3 (Cytokine Mix E, PromoCell [C-39890]) for 13 d. Second, after initial expansion, cells were transferred into the Haematopoietic Progenitor Medium (PromoCell [C-28020]) and cultured for further 7 d. Success of differentiation was flow-cytometrically analyzed at day 7 of differentiation after anti-CD86, anti-CD14 and anti-CD16 staining. For Methyl-Seq analysis, classical and intermediate monocytes were isolated with CD14 MicroBeads (Miltenyi Biotec [130-050-201]) according to manufacturer's instructions.

In order to analyze the impact of uremia on monocyte differentiation, Haematopoietic Progenitor Cell Expansion Medium DXF and the Haematopoietic Progenitor Medium were supplemented with 10% serum of hemodialysis patients or of age and gender matched controls. Clinically stable patients (n = 5), undergoing standard hemodialysis therapy

3 times a week, were recruited from the Department of Internal Medicine IV of the Saarland University Medical Center. Blood was drawn before a dialysis session after the long interdialytic interval. To circumvent age- and sex-specific impact on our epigenetic analyses, recruitment was confined to male subjects aged between 60 and 70 y. Mean age of dialysis patients was  $64.2 \pm 2.8$  y. Control subjects (n = 5) were recruited from the outpatient department of the Department of Internal Medicine IV. Control subjects had normal kidney function (eGFR =  $77.1 \pm 10.3$  ml/min/1.73m<sup>2</sup>), no albuminuria, and a mean age of  $66.6 \pm 4.3$  y.

### Methyl-Seq analysis

Isolated monocyte subsets and *in vitro* differentiated monocytes were frozen in liquid nitrogen and stored at  $-80^{\circ}\text{C}$  until DNA isolation. DNA was isolated by using the DNeasy Blood & Tissue Kit (Qiagen [69504]). Genome-wide analysis of CpG DNA methylation was performed by a modified Methyl-Seq method<sup>46</sup> at GenXPro GmbH. In brief, *HpaII* was used as the methylation-sensitive enzyme, recognizing non-CpG-methylated CCGG sites. After digestion with *HpaII*, "TrueQuant" Y-adapters (GenXPro) suitable for direct Illumina Sequencing were ligated to the fraction of molecules between 100 and 500 bps, which was prior separated from larger DNA fragments using AMPureBeads (Beckman-Coulter [A63882]). Subsequently, the larger DNA was randomly sheared using a bioruptor (Diagenode) to a size of 300–500 bps and adapters containing Illumina P7 priming sites were ligated. The products were PCR amplified using P5 and P7 primers (Illumina) with 10 cycles and sequenced on an Illumina HiSeq2000 machine with 50 cycles.

### Bioinformatics

After removal of PCR-duplicates identified by TrueQuant technology, reads starting with the *HpaII*-specific recognition sequence (CCGG) were quality-trimmed and mapped to the human genome (hg19) using novoalign (<http://www.novocraft.com/products/novoalign/>). For each genomic *HpaII* site, reads starting at this position were quantified in each library. The RefSeq track as well as the CpG island track from the UCSC table browser (<https://genome.ucsc.edu/cgi-bin/hgTables>) were used to annotate genomic restriction sites. Regions up to 2 kb upstream of the transcription start site (TSS) of genes contained in the RefSeq track were defined as promoter regions. Accordingly, downstream regions were defined as genomic regions up to 2 kb downstream of the 3'UTR. In order to annotate miRNA promoter regions, miRNA TSS information was retrieved from the miRStart web service (<http://mirstart.mbc.nctu.edu.tw/>).

To test for differential methylation, quantification results for all restriction sites were normalized to tags per million (NML) and a statistical test was carried out using NOISeq.<sup>47</sup> Significant differential methylation was indicated by a q-value of 0.8 indicating odds of 4:1 that the region is truly differentially methylated ( $\text{Prob} \geq 0.8$ ).<sup>47,48</sup>

All Methyl-Seq data are available in the Gene Express Omnibus (GEO) under accession number GSE73788.

### Characterization of *in vitro* generated monocytes

Phagocytosis capacity was measured by using the Fluoresbrite yellow green carboxylate microspheres (0.75  $\mu\text{m}$ ; Polysciences [07766-10]), which were first opsonized for 30 min at 37°C with serum from healthy subjects (diluted to 50% with Krebs Ringers PBS) and adjusted to 10<sup>8</sup> particles/ml. For the phagocytosis assay, 10  $\mu\text{l}$  of opsonized microspheres were mixed with 1  $\times$  10<sup>4</sup> cells (day 7 of differentiation) in 100  $\mu\text{l}$  culture medium and incubated for 30 min at 37°C with gentle shaking. Finally, samples were stained with anti-CD86, anti-CD14, and anti-CD16, and counts of FITC positive cells were determined flow-cytometrically.

Reactive oxygen species (ROS) were measured flow-cytometrically in monocyte subsets with the cell permanent 5-(and-6)-carboxy-2',7'-difluorodihydrofluorescein diacetate (H<sub>2</sub>DFFDA, Life Technologies [C-13293]). Therefore, 1  $\times$  10<sup>4</sup> cells (day 7 of differentiation) were incubated with H<sub>2</sub>DFFDA in a concentration of 10  $\mu\text{M}$  for 15 min at 37°C and 5% CO<sub>2</sub>. Finally, cells were stained with anti-CD86, anti-CD14, and anti-CD16, and ROS levels were determined as MFI in monocyte subsets. Background fluorescence, which was measured in negative controls, was subtracted.

### Stimulation of monocytes

In a whole-blood assay, monocytes were stimulated with different concentrations of homocysteine, Adenosine-2',3'-dialdehyde and 5-aza-2'-deoxycytidine (Sigma Aldrich [H4628, A9384 and A3656]) for 5 or 16 h at 37°C and 5% CO<sub>2</sub>. Afterwards, cells were washed, stained and analyzed by flow-cytometry according our validated protocol.<sup>5,11</sup>

### Association of monocyte heterogeneity and C1 metabolites in the I Like HOME study

To prove the epidemiological relevance of our *in vitro* findings, we analyzed C1 metabolites and monocyte subsets among 420 healthy individuals, who were recruited into our I Like HOME study (Inflammation, Lipoprotein Metabolism and Kidney Damage in early atherogenesis—The Homburg Evaluation). Study details were published before.<sup>33</sup> Briefly, the I Like HOME study recruited health-care workers to analyze the association of inflammatory and metabolic risk factors with subclinical atherosclerosis. In all participants, monocyte subsets were analyzed and C1 metabolites were measured as described before.<sup>33</sup> For technical reasons, data on monocyte subsets, homocysteine, and SAH are missing in 2, 5, and 12 individuals, respectively.

All study participants provided written consent. The study protocol was approved by the local Ethics Committee.

### Statistics

Clinical and flow-cytometry data are presented as mean  $\pm$  SEM, or as numbers (percentages), unless stated differently, and compared with the Student's *t*-test or one-way analysis of variance (ANOVA), followed by Dunnett's multiple comparison test as *post hoc* test, as appropriate. Associations between continuous variables were analyzed using Pearson correlation

testing. Detailed information on statistical analyses of DNA methylation data are provided above.

Two-sided *P*-values < 0.05 were considered significant. Data were analyzed with IBM SPSS Statistics 23 (SPSS, Inc.) and GraphPad Prism4 (GraphPad).

### Disclosure of potential conflicts of interest

No potential conflicts of interest were disclosed.

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