www.nature.com/leu

ORIGINAL ARTICLE The mutational oncoprint of recurrent cytogenetic abnormalities in adult patients with *de novo* acute myeloid leukemia

A-K Eisfeld^{1,9}, K Mrózek^{1,9}, J Kohlschmidt^{1,2}, D Nicolet^{1,2}, S Orwick³, CJ Walker¹, KW Kroll³, JS Blachly³, AJ Carroll⁴, JE Kolitz⁵, BL Powell⁶, ES Wang⁷, RM Stone⁸, A de la Chapelle¹, JC Byrd^{3,10} and CD Bloomfield^{1,10}

Recurrent chromosomal abnormalities and gene mutations detected at the time of diagnosis of acute myeloid leukemia (AML) are associated with particular disease features, treatment response and survival of AML patients, and are used to denote specific disease entities in the World Health Organization classification of myeloid neoplasms and acute leukemia. However, large studies that integrate cytogenetic and comprehensive mutational information are scarce. We created a comprehensive oncoprint of mutations associated with recurrent cytogenetic findings by combining the information on mutational patterns of 80 cancer- and leukemia-associated genes with cytogenetic findings in 1603 adult patients with *de novo* AML. We show unique differences in the mutational profiles among major cytogenetic subsets, identify novel associations between recurrent cytogenetic abnormalities and both specific gene mutations and gene functional groups, and reveal differences in cytogenetic and mutational features between patients younger than 60 years and those aged 60 years or older. The identified associations between cytogenetic and molecular genetic data may help guide mutation testing in AML, and result in more focused application of targeted therapy in patients with *de novo* AML.

Leukemia (2017) 31, 2211-2218; doi:10.1038/leu.2017.86

INTRODUCTION

Acute myeloid leukemia (AML) is classified based on the morphology of the leukemic blasts and associated dysplasia, surface and intracellular protein expression, and specific chromosomal abnormalities.¹ In addition, gene mutations contribute to disease features, treatment response and survival, and promising examples show that some of those mutations might be used as therapeutic targets.^{1–4} The recent sequencing efforts of The Cancer Genome Atlas (TCGA)² and other studies³⁻⁵ have begun to uncover the mutational landscape of AML. It is widely acknowledged that some gene mutations are strongly enriched in certain cytogenetic subsets of AML,⁶ such as, NPM1 and biallelic CEBPA mutations in cytogenetically normal AML (CN-AML),^{2,6,7} TP53 mutations in complex karyotype AML (CK-AML)^{8,9} and KIT mutations in core-binding factor AML (CBF-AML).6.10,11 These gene mutations in some cases contribute to disease features, treatment response and overall survival.^{6,9,11,12} Furthermore, certain gene mutations may be used as therapeutic targets in cytogenetic subgroups, as demonstrated by the integration of tyrosine kinase inhibitors into clinical trials in patients with CBF-AML with *KIT* mutations.¹ Despite these promising examples, there is a paucity of sufficiently large studies that correlate cytogenetics with extensive mutational information in AML patients.^{1–3,6}

To depict the wealth of genomic information in a graphical way, the concept of an oncoprint has recently been developed.^{13,14} The oncoprint is a concise and compact graphical summary of genomic alterations (that is, gene mutations and cytogenetic abnormalities) in multiple genes across a set of tumor samples.¹⁴ Consequently, we created an oncoprint of 80 mutations associated with recurrent cytogenetic findings in one of the largest cohorts of 1603 adult patients with *de novo* AML other than acute promyelocytic leukemia.

MATERIALS AND METHODS

Patients, treatment and cytogenetic studies

Pretreatment bone marrow (BM) or peripheral blood (PB) samples containing $\geq 20\%$ leukemic blasts were obtained from 1603 adult patients diagnosed with *de novo* AML, 1080 of whom were aged < 60 years and 523 were aged 60 years or older. All patients were enrolled onto Cancer and Leukemia Group B (CALGB) companion protocols CALGB 8461 (cytogenetic studies), CALGB 9665 (leukemia tissue bank) and CALGB 20202 (molecular studies), and were similarly treated on CALGB/Alliance for Clinical Trials in Oncology (Alliance) trials.^{15–25} Patients with acute

⁹These authors contributed equally to this work.

¹⁰These senior authors contributed equally to this work.

Received 2 November 2016; revised 17 January 2017; accepted 16 February 2017; accepted article preview online 21 March 2017; advance online publication, 18 April 2017

¹The Ohio State University Comprehensive Cancer Center, Columbus, OH, USA; ²Alliance Statistics and Data Center, Mayo Clinic, Rochester, MN, USA; ³Division of Hematology, Department of Internal Medicine, The Ohio State University, Comprehensive Cancer Center, Columbus, OH, USA; ⁴Department of Genetics, University of Alabama at Birmingham, Birmingham, AL, USA; ⁵Monter Cancer Center, Hofstra North Shore-Long Island Jewish School of Medicine, Lake Success, NY, USA; ⁶Comprehensive Cancer Center of Wake Forest University, Winston-Salem, NC, USA; ⁷Department of Medicine, Roswell Park Cancer Institute, Buffalo, NY, USA and ⁸Department of Medical Oncology, Dana-Farber/Partners CancerCare, Boston, MA, USA. Correspondence: Dr A-K Eisfeld, The Ohio State University Comprehensive Cancer Center, 460 West 12th Avenue, Room 850, Columbus, OH 43210-1228, USA or Dr K Mrózek, The Ohio State University Comprehensive Cancer Center, C933 James Cancer Hospital, 460 West 10th Avenue, Columbus, OH 43210-1228, USA. E-mail: ann-kathrin.eisfeld@osumc.edu or krzysztof.mrozek@osumc.edu or clara.bloomfield@osumc.edu

2212

promyelocytic leukemia, AML evolving from an antecedent hematologic malignancy or treatment-related AML were not included in the study. Cytogenetic analyses of pretreatment BM and/or PB samples were performed by institutional laboratories approved by the CALGB/Alliance using unstimulated short-term (24- to 48-h) cultures. Twenty or more BM metaphase cells were analyzed in each patient designated as having a normal karyotype. Cytogenetic results were confirmed by central karyotype review.²⁶ All patients provided written informed consent, and study protocols were in accordance with the Declaration of Helsinki and approved by the Institutional Review Boards at each participating center.

Molecular analyses

Mononuclear cells were enriched through Ficoll-Hypaque gradient centrifugation and cryopreserved until use. Genomic DNA was extracted using the DNeasy Blood and Tissue Kit (QIAGEN, Hilden, Germany). The mutational status of 79 protein coding genes was determined centrally at The Ohio State University by targeted amplicon sequencing using the MiSeq platform (Illumina, San Diego, CA, USA). In brief, DNA library preparations were performed according to the manufacturer's directions. Samples were pooled and run on the MiSeg machine using the Illumina MiSeq Reagent Kit v3. Sequenced reads were aligned to the hg19 genome build using the Illumina Isis Banded Smith-Waterman aligner. Single nucleotide variant and indel calling were performed using, respectively, MuTect and VarScan.^{27,28} All called variants underwent visual inspection of the aligned reads using the Integrative Genomics Viewer (Broad Institute, Cambridge, MA, USA).²⁹ Variant filtering was done using the MuCor algorithm.³⁰ The variant allele fraction (VAF) cut-off was set to 0.10 for inclusion into the analyses. To distinguish between driver and passenger mutations, the analysis was repeated with a VAF cut-off of 0.30 (Supplementary Figure S1). Variants (missense, nonsense or frameshift) were considered to be mutations if they were not reported in the 1000 Genome database, dbSNP137 or dbSNP142. In the instances when < 15reads were present, the gene mutation status was determined not to be evaluable. Testing for the presence or absence of FLT3 internal tandem duplication (FLT3-ITD) was performed using the Pindel algorithm on the targeted sequencing data. In addition to the 79 gene sequencing panel, testing for CEBPA mutations was performed with Sanger sequencing methods as previously described,⁷ thus resulting in a total of 80 genes whose mutational status was assessed in our study. In accordance with the revision of the World Health Organization (WHO) classification of myeloid neoplasms and acute leukemia,³¹ only patients with biallelic CEBPA mutations were considered as CEBPA mutated. Gene mutations were assigned to nine previously described² functional groups: (1) chromatin remodeling (ASXL1, BCOR, BCORL1, EZH2 and SMARCA2); (2) cohesin complex (RAD21, SMC1A, SMC3 and STAG2); (3) kinases {AXL, FLT3 [both FLT3-ITD and tyrosine kinase domain mutations (FLT3-TKD)], KIT and TYK2}; (4) methylation-related (DNMT3A, IDH1, IDH2, and TET2); (5) NPM1 (NPM1); (6) RAS pathway (CBL, KRAS, NRAS and PTPN11); (7) spliceosome (SF3B1, SRSF2, U2AF1 and ZRSR2); (8) transcription factors (CEBPA, ETV6, IKZF1, GATA2, NOTCH1 and RUNX1); and (9) tumor suppressors (PHF6, TP53 and WT1).

Statistical analyses

Baseline clinical characteristics among patients belonging to five major cytogenetic groups (please see below) were compared using Fisher's exact test for categorical variables and the Wilcoxon rank sum test for continuous variables (Supplementary Table S1). Fisher's exact test was used for comparisons of frequencies of specific mutations (Supplementary Table S2) and frequencies of gene mutations assigned to the functional groups (Table 1) among the five major cytogenetic groups. Fisher's exact test was also used for comparisons of frequencies of gene mutations assigned to the functional groups between all younger and older AML patients (Table 2), and between the younger and older AML patients classified into five major cytogenetic groups (Supplementary Tables S3-S8). We adjusted P-values to control for per family error rate and a P-value of \leq 0.05 was considered as statistically significant. With power of 80% we can detect up to a 10% difference in gene mutations assigned to a functional group between groups. The dataset was locked on 21 January, 2016. Data collection and statistical analyses were performed by the Alliance Statistics and Data Center.

RESULTS AND DISCUSSION

Cytogenetically, the AML patients were classified into 34 specific karyotype subgroups^{32,33} (listed in individual lines in Figure 1), which were then assigned to one of five major cytogenetic groups: (1) CN-AML, indicated by green color in Figures 1-4 and Supplementary Figure S1; (2) CK-AML, indicated by red (defined by the presence of \ge 3 chromosome aberrations that did not include balanced (reciprocal) translocations or inversions,^{34,35} and subdivided into 'typical' complex karyotype, that is, containing abnormalities resulting in loss of chromosome material from 5g, 7g and/or 17p, and 'atypical' complex karyotype that does not contain the aforementioned abnormalities³⁵); (3) CBF-AML, indicated by grav [that is, patients with t(8:21)(g22:g22) or inv (16)(p13.1q22)/t(16;16)(p13.1;q22)]; (4) AML with balanced translocations or inversions other than those associated with CBF-AML (irrespective of karyotype complexity), indicated by yellow; and (5) AML with unbalanced chromosomal abnormalities detected in non-complex karyotypes, indicated by blue color (that is, trisomies, monosomies and deletions). Using a targeted nextgeneration sequencing panel supplemented by Sanger sequencing, we analyzed the mutational status of 80 cancer- and leukemia-associated genes. The mutated genes were assigned to the nine aforementioned functional groups, which were defined based on the genes' biologic functions.² This comprehensive framework enabled us to characterize the mutational features of most recurrent cytogenetic abnormalities seen in AML patients (Figures 1 and 2; Table 1; Supplementary Table S2).

We detected a total of 4390 gene mutations in our patient cohort, with a median of three mutations (range, 0–9 mutations) detected per patient. Among all 1603 patients, the most frequently affected functional groups were the methylation-related group, with 45% of patients harboring mutations in at least one methylation-related gene, kinases (36% of patients) and *NPM1* (31% of patients), and the least frequently affected were the cohesin complex (12%) and tumor suppressors (14%) (Table 1).

We also investigated the chronology of mutations during clonal evolution stratified by functional groups: based on mutation VAFs we analyzed whether they were the first, second, third, fourth, fifth or later mutational event within a given patient sample. Our results indicate that mutations in tumor suppressor genes, the cohesin complex or the spliceosome (if present) are most commonly the first mutational events (in 47%, 43% and 41% of mutated patients, respectively), whereas kinase mutations and mutations in RAS genes were only rarely the mutations with the highest VAF in a patient sample (21% and 22%, respectively), indicating that they might arise later during clonal evolution (Supplementary Figure S2).

The mutational oncoprint revealed key differences in gene mutation frequencies among the five major cytogenetic groups (Figures 1 and 2; Table 1). Among the most striking was the high incidence of mutations in methylation-related genes in patients with CN-AML, CK-AML or unbalanced abnormalities (cytogenetic subgroups #1, #2-3 and #19-34, respectively), in whom methylation-related genes constituted a functional group that was either the most or second most often affected by mutations. In contrast, these mutations were almost absent in CBF-AML patients (cytogenetic subgroups #4-5) or rather rare in patients harboring non-CBF-AML-related balanced translocations or inversions (cytogenetic subgroups #6-18). Furthermore, mutations in spliceosome genes were frequent in patients with unbalanced abnormalities (cytogenetic subgroups #19-34), especially those with sole trisomy of chromosomes 4, 8, 11, 13 or 21 (cytogenetic subgroups #19-23).

CN-AML patients had a broad mutational spectrum, involving all functional groups (green color; subgroup #1, Figures 1 and 2; Table 1). Mutations in methylation-related genes (61% of patients),

	. ,			· ·			
Functional group ^a	<i>All</i> n = 1603	<i>CN-AML</i> n = 716	Complex karyotype n = 137	<i>CBF-AML</i> n = 177	Balanced rearrangements n = 224	Unbalanced abnormalities n = 349	P ^b
Chromatin remodeling, n (%) Mutated Wild-type	265 (17) 1338 (83)	105 (15) 611 (85)	17 (12) 120 (88)	16 (9) 161 (91)	42 (19) 182 (81)	85 (24) 264 (76)	< 0.001
<i>Cohesin complex,</i> n (%) Mutated Wild-type	191 (12) 1412 (88)	110 (15) 606 (85)	9 (7) 128 (93)	10 (6) 167 (94)	21 (9) 203 (91)	41 (12) 308 (88)	< 0.001
<i>Kinases,</i> n <i>(%)</i> Mutated Wild-type	533 (36) 968 (64)	318 (46) 369 (54)	19 (15) 106 (85)	56 (32) 118 (68)	45 (22) 156 (78)	95 (30) 219 (70)	< 0.001
<i>Methylation-related,</i> n (%) Mutated Wild-type	714 (45) 889 (55)	438 (61) 278 (39)	43 (31) 94 (69)	4 (2) 173 (98)	41 (18) 183 (82)	188 (54) 161 (46)	< 0.001
NPM1, n (%) Mutated Wild-type	492 (31) 1086 (69)	407 (57) 305 (43)	6 (5) 123 (95)	0 (0) 177 (100)	11 (5) 207 (95)	68 (20) 274 (80)	< 0.001
RAS pathway, n (%) Mutated Wild-type	389 (24) 1214 (76)	174 (24) 542 (76)	19 (14) 118 (86)	51 (29) 126 (71)	65 (29) 159 (71)	80 (23) 269 (77)	0.008
<i>Spliceosome,</i> n (%) Mutated Wild-type	321 (20) 1271 (80)	136 (19) 578 (81)	21 (16) 113 (84)	11 (6) 165 (94)	41 (18) 182 (82)	112 (32) 233 (68)	< 0.001
<i>Transcription factors,</i> n (%) Mutated Wild-type	301 (21) 1122 (79)	131 (21) 502 (79)	22 (18) 101 (82)	8 (5) 169 (95)	39 (21) 143 (79)	101 (33) 207 (67)	< 0.001
<i>Tumor suppressors,</i> n (%) Mutated Wild-type	223 (14) 1380 (86)	84 (12) 632 (88)	63 (46) 74 (54)	12 (7) 165 (93)	26 (12) 198 (88)	38 (11) 311 (89)	< 0.001

Table 1. Frequencies of gene mutations assigned to the nine functional groups detected in patients with *de novo* acute myeloid leukemia, listed for the total patient cohort and separately for the five major cytogenetic groups

Abbreviations: CBF-AML, core-binding factor AML; CN-AML, cytogenetically normal acute myeloid leukemia; *n*, number. ^aChromatin remodeling is mutated if *ASXL1*, *BCOR*, *BCORL1*, *EZH2* or *SMARCA2* is mutated. Cohesin complex is mutated if *RAD21*, *SMC1A*, *SMC3* or *STAG2* is mutated. Kinases is mutated if *AXL*, *FLT3*-ITD, *FLT3*-TKD, *KIT* or *TYK2* is mutated. Methylation-related is mutated if *DNMT3A*, *IDH1*, *IDH2*, or *TET2* is mutated. *NPM1* is mutated. *RAS* pathway is mutated if *CBL*, *KRAS*, *NRAS* or *PTPN11* is mutated. Spliceosome is mutated if *SF3B1*, *SRSF2*, *U2AF1* or *ZRSP2* is mutated. Transcription factors is mutated if *CEBPA*, *ETV6*, *IKZF1*, *GATA2*, *NOTCH1* or *RUNX1* is mutated. Tumor suppressors is mutated if *PHF6*, *TP53* or *WT1* is mutated. ^b*P*-values are from Fisher's exact test and compare the five major cytogenetic groups.

NPM1 (57%), and kinases (46%) dominated the mutation pattern, which is consistent with recent findings of Metzeler *et al.*⁴

In concordance with previous reports,^{8,9} TP53 mutations were the most common ones in patients with CK-AML (red color; subgroups #2 and 3), being found in 38% of the patients (Figures 1 and 2; Supplementary Table S2). The second most common mutation, TET2, was detected only half as often (17%). We found differences in the mutation patterns associated with typical vs atypical complex karyotypes (subgroup #2 vs #3; Figures 1 and 2). The TP53 mutations were present in 52% of patients with typical CK-AML compared with only 5% of patients with atypical CK-AML (P < 0.001). Conversely, patients with atypical complex karyotype harbored more often mutations in another tumor suppressor gene, PHF6 (15% vs 2%, P=0.03). Furthermore, patients with atypical CK-AML had a broader spectrum of recurrent mutations, with nine mutations, namely FLT3-TKD and mutations in the DNMT3A, IDH2, NPM1, NRAS, PHF6, RUNX1, TET2 and ZRSR2 genes, occurring in $\ge 10\%$ of patients as compared with mutations in only three genes, DNMT3A, TP53 and TET2, detected in ≥ 10% of patients with typical CK-AML (Figures 1 and 2), suggesting the existence of important biological differences between typical and atypical CK-AML.

Patients with CBF-AML (gray color; subgroups #4 and #5) had very few detectable mutations in addition to their respective disease-defining RUNX1-RUNX1T1 or CBFB-MYH11 gene fusions, with a median of one mutation (range, 0–5) vs two (range, 0–7) or three mutations (range, 0-9) detected in AML patients belonging the remaining major cytogenetic groups (P < 0.001; to Supplementary Table S2). Specifically, CBF-AML was characterized by a complete absence of NPM1 and biallelic CEBPA mutations (Supplementary Table S2), and a paucity of mutations in methylation-related genes, which were found in only 2% of CBF-AML patients compared with 51% of the remaining AML cohort (P < 0.001, Table 1). As previously reported,^{10,11,36} the most frequently mutated genes in patients with CBF-AML were NRAS (found in 23% of CBF-AML patients) and KIT (20%). Mutations in CCND2, detected in 12% of t(8;21) patients, have just recently been discovered as a novel mutational feature of AML with t(8;21).^{37,38} We also noted an enrichment of mutations in cohesin complex genes in patients with t(8;21), 15% of whom carried these mutations, as opposed to patients with inv(16), none of whom did. This is in line with the report from Duployez *et al.*,³⁶ who detected cohesin complex mutations in 18% of their t(8;21) patients and in none of those with inv(16). They also reported an enrichment of

2214

Table 2. Frequencies of gene mutations assigned to the functionalgroups detected in patients with *de novo* acute myeloid leukemiaaged < 60 years and patients \geq 60 years of age

Functional group ^a	Patients aged < 60 years n = 1080	Patients aged ≥60 years n=523	P ^b
<i>Chromatin remodeling,</i> n (%) Mutated Wild-type	147 (14) 933 (86)	118 (23) 405 (77)	< 0.001
<i>Cohesin complex,</i> n (%) Mutated Wild-type	126 (12) 954 (88)	65 (12) 458 (88)	0.68
<i>Kinases,</i> n <i>(%)</i> Mutated Wild-type	392 (39) 623 (61)	141 (29) 345 (71)	< 0.001
<i>Methylation-related,</i> n (%) Mutated Wild-type	394 (36) 686 (64)	320 (61) 203 (39)	< 0.001
<i>NPM1,</i> n <i>(%)</i> Mutated Wild-type	337 (32) 726 (68)	155 (30) 360 (70)	0.52
<i>RAS pathway,</i> n <i>(%)</i> Mutated Wild-type	285 (26) 795 (74)	104 (20) 419 (80)	0.004
<i>Spliceosome,</i> n <i>(%)</i> Mutated Wild-type	130 (12) 944 (88)	191 (37) 327 (63)	< 0.001
<i>Transcription factors,</i> n (%) Mutated Wild-type	171 (18) 797 (82)	130 (29) 325 (71)	< 0.001
Tumor suppressors, n (%) Mutated Wild-type	143 (13) 937 (87)	80 (15) 443 (85)	0.28
Total number of mutations Median Range	2 0–9	3 0-8	< 0.001

Abbreviation: *n*, number. ^aChromatin remodeling is mutated if *ASXL1*, *BCOR*, *BCORL1*, *EZH2* or *SMARCA2* is mutated. Cohesin complex is mutated if *RAD21*, *SMC1A*, *SMC3* or *STAG2* is mutated. Kinases is mutated if *AXL*, *FLT3*-ITD, *FLT3*-TKD, *KIT* or *TYK2* is mutated. Methylation-related is mutated if *DMMT3A*, *IDH1*, *IDH2*, or *TET2* is mutated. *NPM1* is mutated if *NPM1* is mutated. Spliceosome is mutated if *SF3B1*, *SRSF2*, *U2AF1* or *ZRSR2* is mutated. Transcription factors is mutated if *CEBPA*, *ETV6*, *IKZF1*, *GATA2*, *NOTCH1* or *RUNX1* is mutated. Tumor suppressors is mutated if *PHF6*, *TP53* or *WT1* is mutated. Only genes whose mutation frequencies in all patients were $\geq 2\%$ were included in the aforementioned functional groups. A given functional group was considered to be involved if at least one of the genes assigned to this functional group was found mutated. ^b*P*-values for discrete variables are from Fisher's exact test and for continuous variables are from the Wilcoxon rank sum test and compare patients aged < 60 years.

mutations in chromatin remodeling genes in t(8;21) AML. Although those mutations were also more frequent in our t(8;21) cohort (13 vs 6% in patients with inv(16)), the difference did not reach statistical significance (P = 0.18). We suspect that the difference between our results and those of Duployez *et al.*³⁶ may be related in part to the fact that we did not test for *ASXL2* mutations in our study.

Patients with other, non-CBF-AML-associated balanced rearrangements (yellow color; subgroups #6-18; Figures 1 and 2; Table 1) shared some mutational features with CBF-AML.^{6,36} Specifically, there was a paucity of biallelic CEBPA mutations (1%) and NPM1 mutations (5%), whereas mutations in the RAS pathway (29%) and kinases (22%) functional groups were relatively frequent. As previously described,^{39,40} AML patients with 11q23/MLL-rearrangements often had mutations in RAS pathway genes, whereas they rarely harbored mutations in other functional groups compared with patients with non-MLL-rearranged balanced rearrangements. For example, only 9% of MLL-rearranged patients (subgroups #6–12) harbored mutations in chromatin remodeling genes vs 26% of patients with non-MLL-rearranged balanced rearrangements (subgroups #13-18), and similar differences were observed for tumor suppressor (3% vs 18%), methylation-related (12% vs 23%) and spliceosome (12% vs 24%) functional groups.

Some of the recurrent cytogenetic subgroups presented with particular molecular features. For example, 47% of patients with t(6;11)(g27;g23) (subgroup #7) harbored KRAS mutations, as compared with only 3% of all AML patients without t(6;11), and 6% of patients with balanced translocations other than t(6:11) (Figures 1 and 2). We detected FLT3-ITD in 5 of 7 (71%) patients with sole t(6;9)(p23;q34) (subgroup #15), which is consistent with the literature.⁴¹ However, remarkably, only three other single gene mutations were found in this patient cohort (NRAS mutation in a patient without FLT3-ITD, and TET2 and ZRSR2 accompanying FLT3-ITD in one patient each). Of the AML patients with the t(9;22) (q34;q11.2)/BCR-ABL1⁴² (subgroup #16), 47% had mutations in RUNX1, and 27% harbored mutations in ZRSR2. This observation is of special interest, because AML with t(9;22) has been added as a new entity to the 2016 revision of the WHO classification of myeloid neoplasms and acute leukemia,³¹ and specific molecular features of this rare subset are largely unknown.⁴² In agreement with a previous report,⁴³ patients with inv(3)(q21q26)/t(3;3)(q21; q26) (subgroup #13) had frequent mutations in *SF3B1* and *BCOR* (both found in 38% of patients). Notably, patients with rare recurrent balanced rearrangements (subgroup #17) and patients with unique balanced rearrangements (subgroup #18) had TP53 mutations detectable in 20% and 15% of the patients, respectively. This is in sharp contrast to patients with all other, more frequent recurrent balanced rearrangements, who totally lack TP53 mutations. However, on closer inspection, the karyotypes of 75% of TP53 mutation-positive patients in both subgroup #17 and subgroup #18 were complex as opposed to, respectively, only 22 and 38% of TP53 mutation-negative patients in these subgroups having a complex karyotype. This suggests that, in contrast to well-established balanced rearrangements, the presence of a unique or even a rare recurrent balanced rearrangement within a complex karyotype should not be the reason for excluding such patients from the CK-AML category. Furthermore, 18% of patients with unique balanced translocations (subgroup #18) harbored mutations in NPM1, which are only rarely seen in patients with other balanced rearrangements (subgroups #13-17).

The last major cytogenetic group, comprised of patients with gains or losses of chromosome material in non-complex karyotypes (blue color; subgroups #19–34; Figures 1 and 2; Table 1), was characterized by high frequencies of mutations in methylation-related genes, found in 54% of patients, transcription factor genes (33%) and spliceosome genes (32%). Interestingly, spliceosome mutations were predominantly enriched in patients with gains of chromosomal material, with almost half of these patients harboring one or more such mutations. With the exception of patients with sole trisomy 11 (subgroup #21), who most frequently harbored *U2AF1* mutations (43%),⁴⁴ *SRSF2* was the most often mutated spliceosome gene in patients with unbalanced chromosomal abnormalities. It was mutated in 17% of patients with sole gain of specific chromosomes, being especially



Figure 1. Oncoprint of mutations found in patients with *de novo* acute myeloid leukemia who had specific cytogenetic findings. The color coding of rows indicate the assignment of recurrent cytogenetic abnormalities to five major cytogenetic groups. Each individual line corresponds to one of 34 specific cytogenetic subgroups. Columns represent single gene mutations that are clustered into the previously described functional groups.² The frequency of each mutation detected within a given cytogenetic subset is indicated by a black-to-white color gradient, with black indicating a mutation frequency \ge 50%, and white indicating a mutation frequency < 1% of patients. In addition, the specific frequencies (in percent) are indicated in each cell.



Figure 2. Circle plot illustrating proportions of patients belonging to the five major cytogenetic groups, indicated by the identical color code as in Figure 1, and bar graphs indicating frequencies of mutations belonging to specific functional groups detected in cytogenetic subsets analyzed.

© 2017 Macmillan Publishers Limited, part of Springer Nature.



Figure 3. Oncoprint of mutations found in patients < 60 years of age, with respect to their cytogenetic findings.



Figure 4. Oncoprint of mutations found in patients ≥ 60 years of age with respect to their cytogenetic findings.

frequent in patients with sole trisomy 13 (50%; Figures 1 and 2). Collectively, this suggests that splicing defects and acquisition of trisomies may cooperate during leukemogenesis. As with CBF-AML and *KIT* mutations, this provides a rationale for the potential use of therapies that include agents pharmacologically targeting the splicing machinery in AML patients with sole trisomies and mutated spliceosome genes.⁴⁵

In addition to 34 cytogenetic groups, we also analyzed the mutational spectrum of patients with monosomal karyotype. The

monosomal karyotype is defined as the presence of two or more autosomal monosomies or one autosomal monosomy and at least one structural aberration (other than those denoting CBF-AML),⁴⁶ and has been associated with an extremely poor prognosis in AML.^{46,47} The most frequent mutation in patients with monosomal karyotype was that of *TP53*, which was detected in 39% of the patients (Supplementary Figure 3). Only two other mutations were detected in at least 10% of patients, namely *NRAS* (10%) and *TET2* (10%), which resembles the findings in patients with typical complex karyotype.

2216

Lastly, we prepared mutational oncoprints separately for patients younger than 60 years and those aged 60 years or older (Figures 3 and 4). This revealed important differences in both their cytogenetic and mutational backgrounds. Whereas the proportions of CN-AML patients in both age groups were virtually identical (44.9% among younger vs 44.7% among older patients, P = 0.96), as previously reported^{48,49} CBF-AML was more than five times more frequent in younger than older patients (15.1% vs 2.7%, P < 0.001), and balanced rearrangements other than those associated with CBF-AML were also more frequent in younger patients (15.7% vs 10.3%, P=0.003). In contrast, older patients harbored more frequently CK-AML (17.2% vs 7%, P = 0.003) and unbalanced rearrangements present in a non-complex karyotype (30.6% vs 11.7%, P < 0.001) than younger patients under 60 years of age (Supplementary Table S3). Our data support previous reports showing age-related differences in the distribution of recurring cytogenetic abnormalities.^{48–50} The enrichment of CK-AML and unbalanced rearrangements in patients aged \geq 60 years is also consistent with a higher incidence of AML with myelodysplasia-related changes in older patients.³¹

With respect to their mutational features, in general, younger AML patients harbored fewer mutations than older patients (median, 2 vs 3 mutations; P < 0.001; Table 2). Mutations in kinase genes (39% of younger vs 29% of older patients, P < 0.001) and RAS pathway mutations (26% vs 20%, P=0.004) were more frequent in younger AML patients, whereas mutations involving methylation-related genes (61% of older vs 36% of younger patients, P < 0.001), spliceosome (37% vs 12%, P < 0.001), transcription factor (29% vs 18%, P < 0.001), and chromatin remodeling genes (23% vs 14%, P < 0.001) were more often found in older patients. Examination of age-related mutation distributions within five major cytogenetic groups has shown that the aforementioned overall differences in the mutational features were largely driven by patients with CN-AML (Supplementary Table S4) and patients with unbalanced rearrangements (Supplementary Table S8). Among patients with CK-AML only mutations in genes encoding kinases were more frequent in younger patients (22% vs 7%, P = 0.02) and spliceosome mutations in older patients (25% vs 8%, P=0.008; Supplementary Table S5). In patients with balanced rearrangements other than those associated with CBF-AML, only mutations in the RAS pathway genes were more common in younger patients (33% vs 17%, P = 0.02), whereas mutations in the NPM1 gene (13% vs 2%, P = 0.005) and genes belonging to the methylation-related functional group (30% vs 15%, P = 0.02) were more frequent in patients aged 60 years or older (Supplementary Table S7). Taken together, the above findings are consistent with differences in the biology of AML between the younger and older patients.

In summary, our mutational oncoprint data represent a comprehensive depiction of single gene mutations and functional groups in recurrent cytogenetic subsets to date. The presence and absence of particular gene mutations in specific cytogenetic subgroups contribute to better understanding of both the pathogenesis of AML and differences in outcomes of patients belonging to the same specific cytogenetic subgroup who differ with regard to the presence or absence of specific mutations. Furthermore, if these data are confirmed, the mutational oncoprint may be used as a guide for mutation testing in personalized characterization of the leukemia in individual AML patients (for example, spliceosome mutations in patients with sole trisomies, *PHF6* mutations in atypical CK), and may ultimately lead to a more focused application of targeted therapy in AML.

CONFLICT OF INTEREST

The authors declare no conflict of interest.

ACKNOWLEDGEMENTS

We are grateful to the patients who consented to participate in these clinical trials and the families who supported them; to Donna Bucci and the CALGB/Alliance Leukemia Tissue Bank at The Ohio State University Comprehensive Cancer Center, Columbus, OH, USA for sample processing and storage services and Lisa J. Sterling and Christine Finks for data management. Research reported in this publication was supported by the National Cancer Institute of the National Institutes of Health under Award Numbers U10CA031946, U10CA033601, U10CA180821 and U10CA180882 (to the Alliance for Clinical Trials in Oncology), U10CA101140, U10CA180850, U10CA180866, U10CA180866, U10CA032291, U10CA035279, U10CA047545, U10CA059518, CA077658, CA016058, CA140158, CA180821, CA180882, CA196171, R35 CA197734 and SP30 CA016058; the Coleman Leukemia Research Foundation; The D Warren Brown Foundation, the Pelotonia Fellowship Program (A-KE); and by an allocation of computing resources from The Ohio Supercomputer Center.

DISCLAIMER

The content is solely the responsibility of the authors and does not necessarily represent the official views of the National Institutes of Health.

AUTHOR CONTRIBUTIONS

A-KE, KM, JCB and CDB contributed to the study design; A-KE, KM, AdlC, JCB and CDB contributed to the data interpretation, A-KE, KM, JK, JCB and CDB wrote the manuscript; A-KE and SO performed laboratory-based research; JSB and KWK performed the data processing; JK and DN performed statistical analysis; RMS, AJC, KM, JEK, BLP, ESW and CDB were involved directly or indirectly in the care of patients and/or sample procurement. All authors read and agreed on the final version of the manuscript.

REFERENCES

- 1 Döhner H, Weisdorf DJ, Bloomfield CD. Acute myeloid leukemia. N Engl J Med 2015; 373: 1136–1152.
- 2 Cancer Genome Atlas Research Network. Genomic and epigenomic landscapes of adult de novo myeloid leukemia. N Engl J Med 2013; 368: 2059–2074.
- 3 Papaemmanuil E, Gerstung M, Bullinger L, Gaidzik VI, Paschka P, Roberts ND *et al.* Genomic classification and prognosis in acute myeloid leukemia. *N Engl J Med* 2016; **374**: 2209–2221.
- 4 Metzeler KH, Herold T, Rothenberg-Thurley M, Amler S, Sauerland MC, Görlich D et al. Spectrum and prognostic relevance of driver gene mutations in acute myeloid leukemia. *Blood* 2016; **128**: 686–698.
- 5 Stone R, Mandrekar S, Sanford BL, Geyer S, Bloomfield CD, Dohner K et al. The multi-kinase inhibitor midostaurin (M) prolongs survival compared with placebo (P) in combination with daunorubicin (D)/cytarabine (C) induction (ind), high-dose C consolidation (consol), and as maintenance (maint) therapy in newly diagnosed acute myeloid leukemia (AML) patients (pts) age 18-60 with FLT3 mutations (muts): an international prospective randomized (rand) p-controlled double-blind trial (CALGB 10603/RATIFY (Alliance)). Blood 2015; **126**: (abstract 6).
- 6 Grimwade D, Ivey A, Huntly BJP. Molecular landscape of acute myeloid leukemia in younger adults and its clinical significance. *Blood* 2016; **127**: 29–41.
- 7 Marcucci G, Maharry K, Radmacher MD, Mrózek K, Vukosavljevic T, Paschka P et al. Prognostic significance of, and gene and microRNA expression signatures associated with, CEBPA mutations in cytogenetically normal acute myeloid leukemia with high-risk molecular features: a Cancer and Leukemia Group B study. J Clin Oncol 2008; 26: 5078–5087.
- 8 Schoch C, Kern W, Kohlmann A, Hiddemann W, Schnittger S, Haferlach T. Acute myeloid leukemia with a complex aberrant karyotype is a distinct biological entity characterized by genomic imbalances and a specific gene expression profile. *Genes Chromosomes Cancer* 2005; 43: 227–238.
- 9 Rücker FG, Schlenk RF, Bullinger L, Kayser S, Teleanu V, Kett H *et al. TP53* alterations in acute myeloid leukemia with complex karyotype correlate with specific copy number alterations, monosomal karyotype and dismal outcome. *Blood* 2012; **119**: 2114–2121.
- 10 Beghini A, Peterlongo P, Ripamonti CB, Larizza L, Cairoli R, Morra E *et al.* C-kit mutations in core binding factor leukemias. *Blood* 2000; **95**: 726–727.
- 11 Paschka P, Marcucci G, Ruppert AS, Mrózek K, Chen H, Kittles RA *et al.* Adverse prognostic significance of *KIT* mutations in adult acute myeloid leukemia with inv (16) and t(8;21): a Cancer and Leukemia Group B study. *J Clin Oncol* 2006; 24: 3904–3911.
- 12 Mrózek K, Marcucci G, Paschka P, Whitman SP, Bloomfield CD. Clinical relevance of mutations and gene-expression changes in adult acute myeloid leukemia with

2218

normal cytogenetics: are we ready for a prognostically prioritized molecular classification? *Blood* 2007; **109**: 431–448.

- 13 Cerami E, Gao J, Dogrusoz U, Gross BE, Sumer SO, Aksoy BA et al. The cBio cancer genomics portal: an open platform for exploring multidimensional cancer genomics data. Cancer Discov 2012; 2: 401–404.
- 14 Gao J, Aksoy BA, Dogrusoz U, Dresdner G, Gross B, Sumer SO et al. Integrative analysis of complex cancer genomics and clinical profiles using the cBioPortal. Sci Signal 2013; 6: pl1.
- 15 Mayer RJ, Davis RB, Schiffer CA, Berg DT, Powell BL, Schulman P *et al.* Intensive postremission chemotherapy in adults with acute myeloid leukemia. *N Engl J Med* 1994; **331**: 896–903.
- 16 Kolitz JE, George SL, Marcucci G, Vij R, Powell BL, Allen SL *et al.* P-glycoprotein inhibition using valspodar (PSC-833) does not improve outcomes for patients younger than age 60 years with newly diagnosed acute myeloid leukemia: Cancer and Leukemia Group B study 19808. *Blood* 2010; **116**: 1413–1421.
- 17 Blum W, Sanford BL, Klisovic R, DeAngelo DJ, Uy G, Powell BL et al. Maintenance therapy with decitabine in younger adults with acute myeloid leukemia in first remission: a phase 2 Cancer and Leukemia Group B study (CALGB 10503). Leukemia 2017; 31: 34–39.
- 18 Kolitz JE, George SL, Dodge RK, Hurd DD, Powell BL, Allen SL *et al.* Dose escalation studies of cytarabine, daunorubicin, and etoposide with and without multidrug resistance modulation with PSC-833 in untreated adults with acute myeloid leukemia younger than 60 years: final induction results of Cancer and Leukemia Group B study 9621. *J Clin Oncol* 2004; **22**: 4290–4301.
- 19 Moore JO, Dodge RK, Amrein PC, Kolitz J, Lee EJ, Powell B *et al.* Granulocytecolony stimulating factor (filgrastim) accelerates granulocyte recovery after intensive postremission chemotherapy for acute myeloid leukemia with aziridinyl benzoquinone and mitoxantrone: Cancer and Leukemia Group B study 9022. *Blood* 1997; **89**: 780–788.
- 20 Moore JO, George SL, Dodge RK, Amrein PC, Powell BL, Kolitz JE *et al.* Sequential multiagent chemotherapy is not superior to high-dose cytarabine alone as postremission intensification therapy for acute myeloid leukemia in adults under 60 years of age: Cancer and Leukemia Group B study 9222. *Blood* 2005; **105**: 3420–3427.
- 21 Baer MR, George SL, Caligiuri MA, Sanford BL, Bothun SM, Mrózek K *et al.* Lowdose interleukin-2 immunotherapy does not improve outcome of patients age 60 years and older with acute myeloid leukemia in first complete remission: Cancer and Leukemia Group B study 9720. *J Clin Oncol* 2008; **26**: 4934–4939.
- 22 Marcucci G, Moser B, Blum W, Stock W, Wetzler M, Kolitz JE *et al.* A phase III randomized trial of intensive induction and consolidation chemotherapy ± oblimersen, a pro-apoptotic Bcl-2 antisense oligonucleotide in untreated acute myeloid leukemia patients >60 years old. *J Clin Oncol* 2007; **25**(suppl): 360s (abstract 7012).
- 23 Attar EC, Johnson JL, Amrein PC, Lozanski G, Wadleigh M, DeAngelo DJ *et al.* Bortezomib added to daunorubicin and cytarabine during induction therapy and to intermediate-dose cytarabine for consolidation in patients with previously untreated acute myeloid leukemia age 60 to 75 years: CALGB (Alliance) study 10502. *J Clin Oncol* 2013; **31**: 923–929.
- 24 Stone RM, Berg DT, George SL, Dodge RK, Paciucci PA, Schulman P et al. Granulocyte-macrophage colony-stimulating factor after initial chemotherapy for elderly patients with primary acute myelogenous leukemia. N Engl J Med 1995; 332: 1671–1677.
- 25 Lee EJ, George SL, Caligiuri M, Szatrowski TP, Powell BL, Lemke S et al. Parallel phase I studies of daunorubicin given with cytarabine and etoposide with or without the multidrug resistance modulator PSC-833 in previously untreated patients 60 years of age or older with acute myeloid leukemia: results of Cancer and Leukemia Group B study 9420. J Clin Oncol 1999; 17: 2831–2839.
- 26 Mrózek K, Carroll AJ, Maharry K, Rao KW, Patil SR, Pettenati MJ *et al*. Central review of cytogenetics is necessary for cooperative group correlative and clinical studies of adult acute leukemia: the Cancer and Leukemia Group B experience. *Int J Oncol* 2008; **33**: 239–244.
- 27 Cibulskis K, Lawrence MS, Carter SL, Sivachenko A, Jaffe D, Sougnez C *et al.* Sensitive detection of somatic point mutations in impure and heterogeneous cancer samples. *Nat Biotechnol* 2013; **31**: 213–219.
- 28 DePristo MA, Banks E, Poplin R, Garimella KV, Maguire JR, Hartl C et al. A framework for variation discovery and genotyping using next-generation DNA sequencing data. Nat Genet 2011; 43: 491–498.
- 29 Robinson JT, Thorvaldsdóttir H, Winckler W, Guttman M, Lander ES, Getz G et al. Integrative genomics viewer. Nat Biotechnol 2011; 29: 24–26.
- 30 Kroll KW, Eisfeld A-K, Lozanski G, Bloomfield CD, Byrd JC, Blachly JS. MuCor: mutation aggregation and correlation. *Bioinformatics* 2016; **32**: 1557–1558.

- 31 Arber DA, Orazi A, Hasserjian R, Thiele J, Borowitz MJ, Le Beau MM *et al.* The 2016 revision to the World Health Organization classification of myeloid neoplasms and acute leukemia. *Blood* 2016; **127**: 2391–2405.
- 32 Mrózek K, Heerema NA, Bloomfield CD. Cytogenetics in acute leukemia. Blood Rev 2004; 18: 115–136.
- 33 Grimwade D, Hills RK, Moorman AV, Walker H, Chatters S, Goldstone AH et al. Refinement of cytogenetic classification in acute myeloid leukemia: determination of prognostic significance of rare recurring chromosomal abnormalities among 5876 younger adult patients treated in the United Kingdom Medical Research Council trials. Blood 2010; **116**: 354–365.
- 34 Schoch C, Haferlach T, Bursch S, Gerstner D, Schnittger S, Dugas M *et al.* Loss of genetic material is more common than gain in acute myeloid leukemia with complex aberrant karyotype: a detailed analysis of 125 cases using conventional chromosome analysis and fluorescence in situ hybridization including 24-color FISH. *Genes Chromosomes Cancer* 2002; **35**: 20–29.
- 35 Mrózek K. Acute myeloid leukemia with a complex karyotype. *Semin Oncol* 2008; **35**: 365–377.
- 36 Duployez N, Marceau-Renaut A, Boissel N, Petit A, Bucci M, Geffroy S et al. Comprehensive molecular profiling of core binding factor acute myeloid leukemia. Blood 2016; 127: 2451–2459.
- 37 Eisfeld A-K, Kohlschmidt J, Schwind S, Nicolet D, Blachly JS, Orwick S *et al.* Mutations in the *CCND1* and *CCND2* genes are frequent events in adult patients with t(8;21)(q22;q22) acute myeloid leukemia. *Leukemia* 2017; **31**: 1278–1285.
- 38 Faber ZJ, Chen X, Gedman AL, Boggs K, Cheng J, Ma J et al. The genomic landscape of core-binding factor acute myeloid leukemias. Nat Genet 2016; 48: 1551–1556.
- 39 Bhatnagar B, Blachly JS, Kohlschmidt J, Eisfeld AK, Volinia S, Nicolet D et al. Clinical features and gene- and microRNA-expression patterns in adult acute leukemia patients with t(11;19)(q23;p13.1) and t(11;19q23;p13.3). Leukemia 2016; **30**: 1586–1589.
- 40 Lavallee V-P, Baccelli I, Krosl J, Wilhelm B, Barabé F, Gendron P et al. The transcriptomic landscape and directed chemical interrogation of MLL-rearranged acute myeloid leukemias. Nat Genet 2015; 47: 1030–1037.
- 41 Slovak ML, Gundacker H, Bloomfield CD, Dewald G, Appelbaum FR, Larson RA et al. A retrospective study of 69 patients with t(6;9)(p23;q34) AML emphasizes the need for a prospective, multicenter initiative for rare 'poor prognosis' myeloid malignancies. *Leukemia* 2006; **20**: 1295–1297.
- 42 Nacheva EP, Grace CD, Brazma D, Gancheva K, Howard-Reeves J, Rai L *et al*. Does *BCR/ABL1* positive acute myeloid leukaemia exist? *Br J Haematol* 2013; **161**: 541–550.
- 43 Gröschel S, Sanders MA, Hoogenboezem R, Zeilemaker A, Havermans M, Erpelinck C et al. Mutational spectrum of myeloid malignancies with inv(3)/t(3;3) reveals a predominant involvement of RAS/RTK signaling pathways. Blood 2015; 125: 133–139.
- 44 Eisfeld A-K, Kohlschmidt J, Mrózek K, Blachly JS, Nicolet D, Kroll K et al. Adult acute myeloid leukemia with trisomy 11 as the sole abnormality is characterized by the presence of five distinct gene mutations: MLL-PTD, DNMT3A, U2AF1, FLT3-ITD and IDH2. Leukemia 2016; 30: 2254–2258.
- 45 Lee SC, Dvinge H, Kim E, Cho H, Micol JB, Chung YR et al. Modulation of splicing catalysis for therapeutic targeting of leukemia with mutations in genes encoding spliceosomal proteins. Nat Med 2016; 22: 672–678.
- 46 Breems DA, Van Putten WLJ, De Greef GE, Van Zelderen-Bhola SL, Gerssen-Schoorl KBJ, Mellink CHM *et al.* Monosomal karyotype in acute myeloid leukemia: a better indicator of poor prognosis than a complex karyotype. J Clin Oncol 2008; 26: 4791–4797.
- 47 Pasquini MC, Zhang MJ, Medeiros BC, Armand P, Hu ZH, Nishihori T et al. Hematopoietic cell transplantation outcomes in monosomal karyotype myeloid malignancies. Biol Blood Marrow Transplant 2016; 22: 248–257.
- 48 Mrózek K, Marcucci G, Nicolet D, Maharry KS, Becker H, Whitman SP et al. Prognostic significance of the European LeukemiaNet standardized system for reporting cytogenetic and molecular alterations in adults with acute myeloid leukemia. J Clin Oncol 2012; 30: 4515–4523.
- 49 Schoch C, Schnittger S, Kern W, Dugas M, Hiddemann W, Haferlach T. Acute myeloid leukemia with recurring chromosome abnormalities as defined by the WHO-classification: incidence of subgroups, additional genetic abnormalities, FAB subtypes and age distribution in an unselected series of 1,897 patients with acute myeloid leukemia. *Haematologica* 2003; 88: 351–352.
- 50 Moorman AV, Roman E, Willett EV, Dovey GJ, Cartwright RA, Morgan GJ. Karyotype and age in acute myeloid leukemia. Are they linked? *Cancer Genet Cyto*genet 2001; **126**: 155–161.

Supplementary Information accompanies this paper on the Leukemia website (http://www.nature.com/leu)