

## Clonal evolution in relapsed acute myeloid leukaemia revealed by whole-genome sequencing

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Most patients with acute myeloid leukaemia (AML) die from progressive disease after relapse, which is associated with clonal evolution at the cytogenetic level<sup>1,2</sup>. To determine the mutational spectrum associated with relapse, we sequenced the primary tumour and relapse genomes from eight AML patients, and validated hundreds of somatic mutations using deep sequencing; this allowed us to define clonality and clonal evolution patterns precisely at relapse. In addition to discovering novel, recurrently mutated genes (for example, WAC, SMC3, DIS3, DDX41 and DAXX) in AML, we also found two major clonal evolution patterns during AML relapse: (1) the founding clone in the primary tumour gained mutations and evolved into the relapse clone, or (2) a subclone of the founding clone survived initial therapy, gained additional mutations and expanded at relapse. In all cases, chemotherapy failed to eradicate the founding clone. The comparison of relapse-specific versus primary tumour mutations in all eight cases revealed an increase in transversions, probably due to DNA damage caused by cytotoxic chemotherapy. These data demonstrate that AML relapse is associated with the addition of new mutations and clonal evolution, which is shaped, in part, by the chemotherapy that the patients receive to establish and maintain remissions.

To investigate the genetic changes associated with AML relapse, and to determine whether clonal evolution contributes to relapse, we performed whole-genome sequencing of primary tumour–relapse pairs and matched skin samples from eight patients, including unique patient identifier (UPN) 933124, whose primary tumour mutations were previously reported³. Informed consent explicit for whole-genome sequencing was obtained for all patients on a protocol approved by the Washington University Medical School Institutional Review Board. We obtained  ${>}25\times$  haploid coverage and  ${>}97\%$  diploid coverage for each sample (Supplementary Table 1 and Supplementary Information). These patients were from five different French–American–British haematological subtypes, with elapsed times of 235–961 days between initial diagnosis and relapse (Supplementary Table 2a, b).

Candidate somatic events in the primary tumour and relapse genomes were identified<sup>4,5</sup> and selected for hybridization capture-based validation using methods described in Supplementary Information. Deep sequencing of the captured target DNAs from skin (the matched normal tissue), primary tumour and relapse tumour specimens<sup>6</sup> (Supplementary Table 3) yielded a median of 590-fold coverage per site. The average number of mutations and structural variants was 539 (range 118–1,292) per case (Fig. 1a).

The general approach for relapse analysis is exemplified by the first sequenced case (UPN 933124). A total of 413 somatic events from tiers

1 to 3 were validated (see ref. 7 for tier designations; Supplementary Fig. 1a and Supplementary Tables 4a and 5). Of these, 78 mutations were relapse-specific (63 point mutations, 1 dinucleotide mutation, 13 indels and 1 translocation; relapse-specific criteria described in Supplementary Information and shown in Supplementary Fig. 1b), 5 point mutations were primary-tumour-specific, and 330 (317 point mutations and 13 indels) were shared between the primary tumour and relapse samples (Fig. 1a, b and Supplementary Fig. 2). The skin sample was contaminated with leukaemic cells for this case (peripheral white blood cell count was 105,000 cells mm<sup>-3</sup> when the skin sample was banked), with an estimated tumour content in the skin sample of 29% (Supplementary Information). In addition to the ten somatic nonsynonymous mutations originally reported for the primary tumour sample<sup>3</sup>, we identified one deletion that was not detected in the original analysis (DNMT3A L723fs (ref. 8)) and three mis-sense mutations previously misclassified as germline events (SMC3 G662C, PDXDC1 E421K and TTN E14263K) (Fig. 1b, Table 1 and Supplementary Table 4b).

A total of 169 tier 1 coding mutations (approximately 21 per case) were identified in the eight patients (Table 1 and Supplementary Tables 4b and 6), of which 19 were relapse-specific. In addition to mutations in known AML genes such as DNMT3A (ref. 8), FLT3 (ref. 9), NPM1 (ref. 10), IDH1 (ref. 7), IDH2 (ref. 11), WT1 (ref. 12), RUNX1 (refs 13, 14), PTPRT (ref. 3), PHF6 (ref. 15) and ETV6 (ref. 16) in these eight patients, we also discovered novel, recurring mutations in WAC, SMC3, DIS3, DDX41 and DAXX using 200 AML cases whose exomes were sequenced as part of the Cancer Genome Atlas AML project (Table 1, Supplementary Table 4b and Supplementary Fig. 3; T.J.L., R.K.W. and The Cancer Genome Atlas working group on AML, unpublished data). Details regarding the novel, recurrently mutated genes are provided in Table 1, Supplementary Tables 4b and 7 and Supplementary Figs 3 and 4. Structural and functional analyses of structural variants are presented in the Supplementary Information (Supplementary Figs 5-10 and Supplementary Tables 2, 8 and 9).

The generation of high-depth sequencing data allowed us to quantify accurately mutant allele frequencies in all cases, permitting estimation of the size of tumour clonal populations in each AML sample. On the basis of mutation clustering results, we inferred the identity of four clones having distinct sets of mutations (clusters) in the primary tumour of AML1/UPN 933124 (Supplementary Information). The median mutant allele frequencies in the primary tumour for clusters 1 to 4 were 46.86%, 24.89%, 16.00% and 2.39%, respectively (Fig. 1b and Supplementary Table 5c). Clone 1 is the 'founding' clone (that is, the other subclones are derived from it), containing the cluster 1 mutations; assuming that nearly all of these mutations are heterozygous, they must

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AML15/UPN758168

Relapse

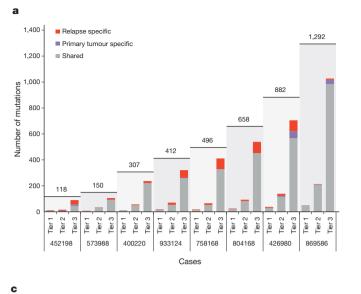
89.6% purity

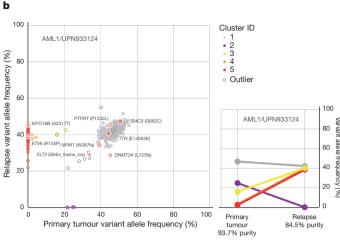
Cluster

=1

**2** 

**3** 





20

Primary tumour

90.8% purity

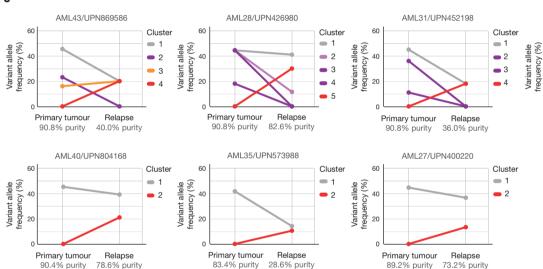


Figure 1 | Somatic mutations quantified by deep sequencing of capture validation targets in eight acute myeloid leukaemia primary tumour and relapse pairs. a, Summary of tier 1–3 mutations detected in eight cases (not including translocations). All mutations shown were validated using capture followed by deep sequencing. Shared mutations are in grey, primary tumour-specific mutations in blue and relapse-specific mutations in red. The total number of tier 1–3 mutations for each case is shown above the light-grey rectangle. b, Mutant allele frequency distribution of validated mutations from tier 1–3 in the primary tumour and relapse of case UPN 933124 (left). Mutant allele frequencies for five primary-tumour-specific mutations were obtained from a 454 deep read-count experiment. Four mutation clusters were identified

in the primary tumour, and one was found at relapse. Five low-level mutations in both the primary tumour and relapse (including four residing in known copy number variable regions) were excluded from the clustering analysis. Nonsynonymous mutations from genes that are recurrently mutated in AML are shown. The change of mutant allele frequencies for mutations from the five clusters is shown (right) between the primary tumour and relapse. The orange and red lines are superimposed. c, The mutation clusters detected in the primary tumour and relapse samples from seven additional AML patients. The relationship between clusters in the primary tumour and relapse samples are indicated by lines linking them.

Table 1 | Coding mutations identified in eight primary tumour-relapse pairs

UPN	Total tier 1 mutations (primary/relapse)	Recurrently mutated genes in primary tumour	Relapse-specific non-synonymous somatic mutations
452198	9/9	DNMT3A, NPM1, FLT3, IDH1	None
573988	6/8	NPM1, IDH2	STOX2
804168	22/26	FLT3, WT1, PHF6, FAM5C, TTC39A	SLC25A12, RIPK4, ABCD2
933124	14/17	DNMT3A, NPM1, FLT3, TTN, SMC3, PTPRT	ETV6*, MYO18B*, WAC*†, STK4
400220	12/13	FLT3, RUNX1, WT1, PLEKHH1	None
426980	32/35	IDH2, MYO1F, DDX4	GBP4, DCLK1, IDH2*, DCLK1*, ZNF260
758168	15/19	DNAH9, DIS3, CNTN5, PML-RARA†	ENSG00000180144, DAGLA*
869586	51/50	RUNX1, WT1, TTN, PHF6, NF1, SUZ12, NCOA7, EED, DAXX, ACSS3, WAC, NUMA1	None

Tier 1 mutation counts exclude RNA genes.

<sup>\*</sup> Recurrent mutations occurring in relapse sample

<sup>†</sup> Translocations were not included in tier 1 mutation counts.

be present in virtually all the tumour cells at presentation and at relapse, as the variant frequency of these mutations is  $\sim\!40\text{--}50\%$ . Clone 2 (with cluster 2 mutations) and clone 3 (with cluster 3 mutations) must be derived from clone 1, because virtually all the cells in the sample contain the cluster 1 mutations (Fig. 2a). It is likely that a single cell from clone 3 gained a set of mutations (cluster 4) to form clone 4: these survived chemotherapy and evolved to become the dominant clone at relapse. We do not know whether any of the cluster 4 mutations conferred chemotherapy resistance; although none had translational consequences, we cannot rule out a relevant regulatory mutation in this cluster.

Assuming that all the mutations detected are heterozygous in the primary tumour sample (with a malignant cellular content at 93.72% for the primary bone marrow sample, see Supplementary Information), we were able to calculate the fraction of total malignant cells in each clone. Clone 1 is the founding clone; 12.74% of the tumour cells contain only this set of mutations. Clones 2, 3 and 4 evolved from clone 1. The additional mutations in clones 2 and 3 may have provided a growth or survival advantage, as 53.12% and 29.04% of the tumour cells belonged to these clones, respectively. Only 5.10% of the tumour cells were from clone 4, indicating that it may have arisen last (Fig. 2a). However, the relapse clone evolved from clone 4. A single clone

containing all of the cluster 5 mutations was detected in the relapse sample; clone 5 evolved from clone 4, but gained 78 new somatic alterations after sampling at day 170. As all mutations in clone 5 appear to be present in all relapse tumour cells, we suspect that one or more of the mutations in this clone provided a strong selective advantage that contributed to relapse. The *ETV6* mutation, the *MYO18B* mutation, and/or the *WNK1-WAC* fusion are the most likely candidates, as *ETV6*, *MYO18B* and *WAC* are recurrently mutated in AML.

We evaluated the mutation clusters in the seven additional primary tumour–relapse pairs by assessing peaks of allele frequency using kernel density estimation (Supplementary Fig. 11 and Supplementary Information). We thus inferred the numbers and malignant fractions of clones in each primary tumour and relapse sample. Similar to UPN 933124, multiple mutation clusters (2–4) were present in each of the primary tumours from four patients (UPN 869586, UPN 426980, UPN 452198 and UPN 758168). However, only one major cluster was detected in each of the primary tumours from the three other patients (UPN 804168, UPN 573988 and UPN 400220) (Fig. 1c and Supplementary Table 10). Importantly, all eight patients gained relapse-specific mutations, although the number of clusters in the relapse samples varied (Fig. 1).

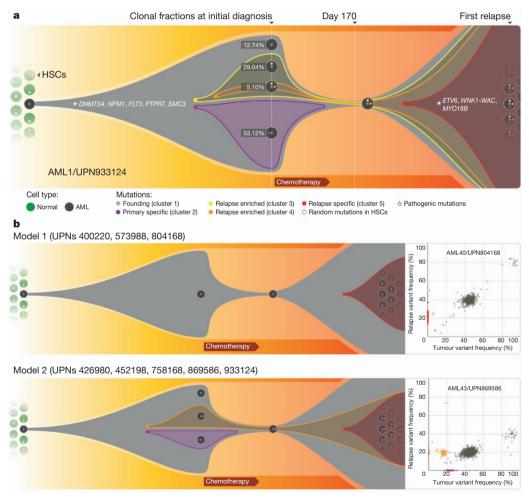


Figure 2 | Graphical representation of clonal evolution from the primary tumour to relapse in UPN 933124, and patterns of tumour evolution observed in eight primary tumour and relapse pairs. a, The founding clone in the primary tumour in UPN 933124 contained somatic mutations in *DNMT3A*, *NPM1*, *PTPRT*, *SMC3* and *FLT3* that are all recurrent in AML and probably relevant for pathogenesis; one subclone within the founding clone evolved to become the dominant clone at relapse by acquiring additional mutations, including recurrent mutations in *ETV6* and *MYO18B*, and a *WNK1-WAC* fusion gene. HSC, haematopoietic stem cell. b, Examples of the

two major patterns of tumour evolution in AML. Model 1 shows the dominant clone in the primary tumour evolving into the relapse clone by gaining relapse-specific mutations; this pattern was identified in three primary tumour and relapse pairs (UPN 804168, UPN 573988 and UPN 400220). Model 2 shows a minor clone carrying the vast majority of the primary tumour mutations survived and expanded at relapse. This pattern was observed in five primary tumour and relapse pairs (UPN 933124, UPN 452198, UPN 758168, UPN 426980 and UPN 869586).

Two major patterns of clonal evolution were detected at relapse (Fig. 2b and Supplementary Fig. 3): in cases with pattern 1, the dominant clone in the primary tumour gained additional mutations and evolved into the relapse clone (UPN 804168, UPN 573988 and UPN 400220). These patients may simply be inadequately treated (for example, elderly patients who cannot tolerate aggressive consolidation, like UPN 573988), or they may have mutations in their founding clones (or germline variants) that make these cells more resistant to therapy (UPN 804168 and UPN 400220). In patients with pattern 2, a minor subclone carrying the vast majority (but not all) of the primary tumour mutations survived, gained mutations, and expanded at relapse; a subset of primary tumour mutations was often eradicated by therapy, and were not detected at relapse (UPN 758168, UPN 933124, UPN 452198, UPN 426980 and UPN 869586). Specific mutations in a key subclone may contribute to chemotherapy resistance, or the mutations important for relapse may be acquired during tumour evolution, or both. Notably, in cases 426980 and 758168, a second primary tumour clone survived chemotherapy and was also present at relapse (Fig. 1c and Supplementary Fig. 3). Owing to current technical limits in our ability to detect mutations in rare cells (mostly related to currently achievable levels of coverage with whole genome sequencing), our models represent a minimal estimate of the clonal heterogeneity in AML.

All eight patients received cytarabine and anthracycline for induction therapy, and additional cytotoxic chemotherapy for consolidation; treatment histories are summarized in Supplementary Table 2 and described in Supplementary Information. To investigate the potential impact of treatment on relapse mutation types, we compared the six classes of transition and transversion mutations in the primary tumour with the relapse-specific mutations in all eight patients (Fig. 3a). Although  $C \bullet G \rightarrow T \bullet A$  transitions are the most common mutations found in both primary and relapse AML genomes, their frequencies are significantly different between the primary tumour mutations (51.1%) and relapse-specific mutations (40.5%)  $(P = 2.99 \times 10^{-7})$ . Moreover, we observed an average of 4.5%, 5.3% and 4.2% increase in  $A \bullet T \to C \bullet G$   $(P = 9.13 \times 10^{-7})$ ,  $C \bullet G \to A \bullet T$  (P = 0.00312) and  $C \bullet G \rightarrow G \bullet C$  (P = 0.00366) transversions, respectively, in relapsespecific mutations. Notably, an increased A•T→C•G transversion rate has also been observed in cases of chronic lymphocytic leukaemia with mutated immunoglobulin genes¹7. C•G→A•T transversions are the most common mutation in lung cancer patients who were exposed to tobacco-borne carcinogens<sup>18</sup> (Fig. 3b and Supplementary Table 11). We

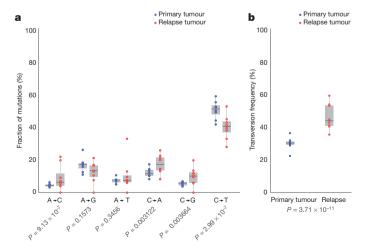


Figure 3 Comparison of mutational classes between primary tumours and relapse samples. a, Fraction of the primary tumour and relapse-specific mutations in each of the transition and transversion categories. b, Transversion frequencies of the primary tumour and relapse-specific mutations from eight AML tumour and relapse pairs. 456 relapse-specific mutations and 3,590 primary tumour mutations from eight cases were used for assessing statistical significance using proportion tests.

examined the 456 relapse-specific mutations and 3,590 primary tumour point mutations from all eight cases as a group, and found that the transversion frequency is significantly higher for relapse-specific mutations (46%) than for primary tumour mutations (30.7%)  $(P=3.71\times10^{-11})$ , indicating that chemotherapy has a substantial effect on the mutational spectrum at relapse. Similar results were obtained when we limited the analysis to the 213 mutations that had 0% variant frequency in the primary tumour samples (Supplementary Fig. 1b); the transversion frequency for relapse-specific mutations was 50.4%, versus 31.4% for primary tumour samples  $(P=3.89\times10^{-9})$ . Very few copy-number alterations were detected in the eight relapse samples, suggesting that the increased transversion rate is not associated with generalized genomic instability (Supplementary Fig. 12).

We first described the use of deep sequencing to define precisely the variant allele frequencies of the mutations in the AML genome of case 933124 (ref. 3), and here have refined and extended this technique to examine clonal evolution at relapse. The analysis of eight primary AML and relapse pairs has revealed unequivocal evidence for a common origin of tumour subpopulations; a dominant mutation cluster representing the founding clone was discovered in the primary tumour sample in all cases. The relationship of the founding clone (and subclones thereof) to the 'leukaemia initiating cell' is not yet clearpurification of clonal populations and functional testing would be required to establish this relationship. We observed the loss of primary tumour subclones at relapse in four of eight cases, suggesting that some subclones are indeed eradicated by therapy (Figs 1 and 2 and Supplementary Fig. 3). Some mutations gained at relapse may alter the growth properties of AML cells, or confer resistance to additional chemotherapy. Regardless, each tumour displayed clear evidence of clonal evolution at relapse and a higher frequency of transversions that were probably induced by DNA damage from chemotherapy. Although chemotherapy is required to induce initial remissions in AML patients, our data also raise the possibility that it contributes to relapse by generating new mutations in the founding clone or one of its subclones, which then can undergo selection and clonal expansion. These data demonstrate the critical need to identify the disease-causing mutations for AML, so that targeted therapies can be developed that avoid the use of cytotoxic drugs, many of which are mutagens.

This study extends the findings of previous studies 19-21, which recently described patterns of clonal evolution in ALL patients using fluorescence in situ hybridization and/or copy number alterations detected by SNP arrays, and it enhances the understanding of genetic changes acquired during disease progression, as previously described for breast and pancreatic cancer metastases<sup>22–25</sup>. Our data provide complementary information on clonal evolution in AML, using a much larger set of mutations that were quantified with deep sequencing; this provides an unprecedented number of events that can be used to define precisely clonal size and mutational evolution at relapse. Both ALL and AML share common features of clonal heterogeneity at presentation followed by dynamic clonal evolution at relapse, including the addition of new mutations that may be relevant for relapse pathogenesis. Clonal evolution can also occur after allogeneic transplantation (for example, loss of mismatched HLA alleles via a uniparental disomy mechanism), demonstrating that the type of therapy itself can affect clonal evolution at relapse<sup>26,27</sup>. Taken together, these data demonstrate that AML cells routinely acquire a small number of additional mutations at relapse, and suggest that some of these mutations may contribute to clonal selection and chemotherapy resistance. The AML genome in an individual patient is clearly a 'moving target'; eradication of the founding clone and all of its subclones will be required to achieve cures.

## **METHODS SUMMARY**

Illumina paired-end reads were aligned to NCBI build36 using BWA 0.5.5 (http://sourceforge.net/projects/bio-bwa/). Somatic mutations were identified using SomaticSniper<sup>28</sup> and a modified version of the SAMtools indel caller. Structural



variations were identified using BreakDancer $^5$ . All predicted non-repetitive somatic SNVs, indels and all structural variants were included on custom sequence capture arrays from Roche Nimblegen. Illumina  $2\times100$ -bp paired-end sequencing reads were produced after elution from capture arrays. VarScan $^6$  and a read remapping strategy using Crossmatch (P. Green, unpublished data) and BWA were used for determining the validation status of predicted SNVs, indels and structural variants. A complete description of the materials and methods is provided in Supplementary Information. All sequence variants for the AML tumour samples from eight cases have been submitted to dbGaP (accession number phs000159.v4.p2).

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**Supplementary Information** is linked to the online version of the paper at www.nature.com/nature.

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