

CLINICAL TRIALS AND OBSERVATIONS

Spectrum of somatic mutation dynamics in chronic myeloid leukemia following tyrosine kinase inhibitor therapy

TaeHyung Kim,^{1,2} Marc S. Tyndel,^{2,3} Hyeoung Joon Kim,^{4,5} Jae-Sook Ahn,^{4,5} Seung Hyun Choi,⁴ Hee Jeong Park,⁴ Yeo-kyeoung Kim,⁴ Soo Young Kim,⁴ Jeffrey H. Lipton,⁶ Zhaolei Zhang,^{1,2,7} and Dennis (Dong Hwan) Kim⁶

¹Department of Computer Science, ²The Donnelly Centre for Cellular and Biomolecular Research, and ³The Edward S. Rogers Sr. Department of Electrical and Computer Engineering, University of Toronto, Toronto, ON, Canada; ⁴Genome Research Center for Hematopoietic Disease, Chonnam National University, Hwasun, Korea; ⁵Department of Hematology-Oncology, Chonnam National University Hwasun Hospital, Hwasun, Korea; and ⁶Department of Medical Oncology, Princess Margaret Cancer Center, University Health Network, Faculty of Medicine and ⁷Department of Molecular Genetics, University of Toronto, Toronto, ON, Canada

Key Points

- Mutation clearance in CML does not directly result in successful treatment in CML.
- Clinical implications of patterns of mutation acquisition, persistence, and clearance in CML should be interpreted with caution.

Somatic mutations commonly detected in a variety of myeloid neoplasms have not been systematically investigated in chronic myeloid leukemia (CML). We performed targeted deep sequencing on a total of 300 serial samples from 100 CML patients; 37 patients carried mutations. Sixteen of these had evidence of mutations originating from preleukemic clones. Using unsupervised hierarchical clustering, we identified 5 distinct patterns of mutation dynamics arising following tyrosine kinase inhibitor (TKI) therapy. This study demonstrates that patterns of mutation acquisition, persistence, and clearance vary but have a number of interesting correlations with clinical outcomes. Mutation burden often persisted despite successful TKI response (pattern 1), providing indirect evidence that these mutations also originated from preleukemic mutations, whereas patients exhibiting mutation clearance (pattern 3) showed mixed clinical outcomes. Unsurprisingly, patients acquiring new mutations during treatment failed

TKI therapy (pattern 2). These patterns show that CML mutation dynamics following TKI therapy are markedly distinct from other myeloid neoplasms. In summary, clinical implications of mutation profiles and dynamics in CML should be interpreted with caution. (*Blood*. 2017;129(1):38-47)

Introduction

Chronic myeloid leukemia (CML) is characterized by a translocation event t(9;22)(q34;q11.2) which rearranges the Abelson murine leukemia viral oncogene homolog 1 (*ABL1*) and breakpoint cluster region (*BCR*) genes, yielding a *BCR-ABL* gene rearrangement.¹ The development of tyrosine kinase inhibitors (TKIs) targeting the *BCR-ABL* fusion protein has had an incredible impact on the treatment of CML.²⁻⁴ A majority of CML cases now have better long-term outcomes than cases of most other myeloid malignancies. However, some patients show resistance to these treatments through *BCR-ABL*-dependent or -independent mechanisms, and as a result, have a much higher risk of progression to an accelerated phase (AP) or blastic phase (BP) of disease. The survival of patients who progress to BP is comparable to the pre-TKI era, even with other salvage treatment modalities such as allogeneic stem cell transplantation.⁵

Taking advantage of high-throughput technologies, extensive investigations into other myeloid malignancies have uncovered commonly mutated genes and their affected pathways.⁶⁻¹⁰ The Cancer Genome Atlas (TCGA) Consortium has compiled a list of commonly

mutated genes found in 199 of 200 adult de novo acute myeloid leukemia (AML) cases; these mutations were then classified into 8 categories based on the biological pathways they affect (activated signaling, chromatin modification, cohesion complex, DNA methylation, myeloid transcription factors, tumor suppressors, NPM1, and splicing machinery).⁶ Genomic studies in myelodysplastic syndromes, myeloproliferative neoplasms, chronic myelomonocytic leukemia, and atypical CML have since demonstrated that most patients with myeloid malignancies carry somatic mutations that fall within these 8 pathway categories.^{7,11-13}

In CML, the most well-understood mechanisms of TKI resistance are caused by mutations within the kinase domain (KD) of *ABL1*, which account for approximately half of nonresponsive patients.¹⁴ Clones that develop *ABL1* KD mutations, whether they exist prior to treatment or develop later, block the binding of TKI, accounting for TKI resistance.¹⁵⁻²⁰ Although many studies have investigated *ABL1* KD mutations,²¹⁻²⁶ less is known about the mutation spectrum in other genes in TKI-resistant cases before and after treatment.

Submitted 4 April 2016; accepted 28 September 2016. Prepublished online as *Blood* First Edition paper, 12 October 2016; DOI 10.1182/blood-2016-04-708560.

The sequencing data reported in this article have been deposited in the Sequence Read Archive (study accession number SRP090804).

The online version of this article contains a data supplement.

There is an Inside *Blood* Commentary on this article in this issue.

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Previous studies have shown that progression of CML into AP or BP is associated with the acquisition of genetic or epigenetic abnormalities in addition to *BCR-ABL* gene rearrangement.²⁷⁻³¹ In particular, somatic mutations in genes associated with chromatin modification and DNA methylation are often enriched; in contrast, the other 6 pathways are not enriched in CML.^{27-29,32} The origins, clinical implications, and associations with *BCR-ABL* transcript changes of relevant somatic mutations remain mostly unknown.

In addition, the potential role of preleukemic somatic mutations in CML has been investigated in relatively few studies.³² Preleukemia is a stage of the evolution of cancer in many patients, characterized by the growth of cells carrying a subset of genetic or epigenetic mutations necessary for leukemogenesis.³³ Leukemic transformation occurs upon the acquisition of additional genetic lesions. The preleukemic clone can be retained or expand during leukemogenesis while differentiation potential is maintained.³³

To investigate how mutation acquisition, persistence, and clearance affect the treatment outcomes in CML, we used targeted deep sequencing on serial samples from 100 CML patients (Table 1) to profile somatic variants in 92 genes commonly mutated in myeloid malignancies. For each patient, samples taken at the initial diagnosis (prior to TKI therapy) and after TKI treatment, as well as corresponding T-cell fraction, were subjected for sequencing.

Patients and methods

The study was approved by the research ethics board at Chonnam National University, Hwasun, Korea.

Patients

Samples from a total of 100 patients were sequenced, of whom 78 were treated with imatinib, 11 with nilotinib, 8 with dasatinib, and 3 with radotinib. Clinical information is detailed in Table 1. With a median follow-up duration of 55 months (range, 6-158 months), response outcomes were as follows: 68.3% (57.7%-76.7%) of complete cytogenetic response at 12 months, 49.9% (39.5%-59.5%) of major molecular response at 18 months, 43.5% (33.2%-53.3%) of molecular response of 4.5 log reduction at 3 years. Treatment failure was estimated as 10.2% (0.3%-15.9%) at 3 years whereas progression-free survival at 5 years was 91.0% (82.7%-95.5%). The overall survival at 5 years was 92.6% (83.8%-96.7%). According to the response, 74 patients were determined to have optimal response by European LeukemiaNet (ELN),³⁴ 18 failed but remained in chronic phase, and 8 had progressed to AP or BP. We will henceforth refer to these outcome categories as the responsive group, the resistant group, and the progressed group.

Sample preparation

Marrow samples at the time of diagnosis were prospectively procured and banked. Follow-up marrow samples while on TKI therapy were also collected 1 to 1.5 years after starting TKI therapy in the responsive group, whereas it was taken at the time of confirmation of resistance in the resistant group or confirmation of progression to AP/BP in the progressed group. Isolated T-cell samples ($CD3^+$) were procured from the diagnostic samples using the $CD3^+$ monoclonal antibody magnetic bead-based isolation method. DNA was extracted per samples and processed for targeted deep sequencing. DNA for all 300 bone marrow mononuclear cells was extracted using the QIAamp DNA Blood Mini kit (Qiagen). Each case had a trio of samples: T-cell fraction taken at diagnosis, the diagnostic leukemic sample, and a follow-up sample. The median

duration from diagnosis to blood sampling was 12.0 months without any significant differences among 3 subgroups (12.0 months in responsive, 12.5 months in resistant, and 6.5 months in progressed group; $P = .3$ by median test).

Definition of end points

Complete cytogenetic response (CCyR) was defined using the conventional criteria of 0% Philadelphia chromosome-positive (Ph^+) cells in marrow by conventional cytogenetics of 20 metaphases, whereas major molecular response (MMR) was defined as <0.1% of the *BCR-ABL* transcript level by polymerase chain reaction. Molecular response with 4.5 log reduction (MR4.5) was defined as 0.0032% or less *BCR-ABL* transcript level. Treatment failure includes primary and secondary resistance, defined as transformation to the AP or BP, loss of CCyR, appearance of an *ABL1* KD mutation, or additional cytogenetic abnormalities in the Ph^+ clone. Progression-free survival was defined as the interval between the initiation of TKI therapy and progression to AP or BP, or death from any cause, whereas overall survival was defined as the time from initiation of the TKI therapy until the time of death from any cause or time of last follow-up.

List of genes associated with epigenetic regulation

1. Chromatin modifiers (14 genes): *ASXL1*, *BCOR*, *CREBBP*, *EED*, *EZH2*, *KAT6A*, *KAT6B*, *KMD6A*, *KMT2A (MLL)*, *KMT2D (MLL2)*, *KMT2C (MLL3)*, *MECOM*, *PRDM9*, *PRDM16*.
2. DNA methylation (7 genes): *DNMT1*, *DNMT3A*, *DNMT3B*, *IDH1*, *IDH2*, *TET1*, *TET2*.

Targeted NGS and sequencing read processing and computational analyses

Available in supplemental Methods (see supplemental Data available on the *Blood* Web site).

Definition of preleukemic mutations

The presence of mutation in T-cell samples as well as the bulk cell at diagnosis implies the presence of such mutations in hematopoietic stem cells. Less directly, the presence of mutations in follow-up samples for responsive patients also implies that Ph^- cells carried the mutation. The most natural interpretation is that the Ph^- clone descended from a preleukemic (Ph^-) clone carrying the mutation. We classify patients as having evidence of preleukemic mutations if they carried somatic mutations in their T-cell samples and/or if the mutation in responsive patients had a variant allele frequency (VAF) >5% at follow-up.

Results

Mutational landscape of 100 CML patients in serial samples

Targeted deep sequencing of 92 myeloid malignancy-associated genes (supplemental Table 1) in 300 serial samples from 100 CML patients chosen retrospectively (74 responsive, 18 resistant, and 8 progressed; Table 1) revealed a total of 63 variants in 37 patients. Three of these patients carried only silent mutations in these genes. The remaining 63 patients did not carry mutations at any disease stage. The average read depth over the targeted regions was 840x (456x-944x) (supplemental Table 2).

The 63 variants consisted of 37 nonsynonymous single nucleotide variants (SNVs), 12 synonymous SNVs, 8 frameshift deletions, 2 stop-gain mutations, 2 nonframeshift deletions, and 2 splicing variants from 32 genes (supplemental Table 3). Among the 32 genes, 5 genes were nonsilently mutated in >1 patient (*ABL1* in 6 patients, *ASXL1* in 9 patients, *DNMT3A* in 2 patients, *RUNX1* in

Table 1. Patients' demographics and clinical characteristics

	All	Responsive	Resistant	Progressed
No. of patients (%)	100 (100)	74 (74)	18 (18)	8 (8)
Age median (range), y	55 (19-80)	56 (19-80)	55 (31-77)	50.5 (20-67)
Sex, male/female (%)	66/34 (66:34)	49/25 (66:34)	11/7 (61:39)	6/2 (75:25)
Disease stage, CP/AP/BC (%)	94/4/2 (94:4:2)	72/2/0 (97:3:0)	18/0/0 (100:0:0)	4/2/2 (50:25:25)
WBC counts at diagnosis median (range), $\times 10^9/L$	99 (9.3-520)	74 (9.3-520)	139 (19-327)	107 (12-196)
Hb at diagnosis median (range), g/L	112 (55-175)	115 (55-175)	97 (63-156)	99 (61-142)
Platelet at diagnosis median (range), $\times 10^9/L$	503 (96-2990)	506 (108-2990)	617 (96-1599)	282 (127-507)
Peripheral blasts at diagnosis median (range), %	1 (0-16)	1 (0-10)	1 (0-9)	3 (0-16)
Additional cytogenetic abnormalities at diagnosis besides Ph chromosome, present/absent (% present)	4/96 (4)	1/72 (1)	2/17 (12)	1/7 (14)
Sokal risk group at diagnosis, low/intermediate/high/unknown (%)	28/39/31/2 (28:39:31:2)	24/28/21/1 (32:38:28:1)	2/9/6/1 (11:50:33:6)	2/4/4/0 (25:25:50:0)
Subtype of TKI therapy, imatinib/2GTKI (%)	78/22 (78:22)	56/18 (76:24)	16/2 (89:11)	6/2 (75:25)
Follow-up duration after TKI therapy median (range), mo	55 (3-157)	54 (3-105)	81 (8-157)	39 (5-145)
Interval between initial sampling at diagnosis and follow-up sampling median (range), mo	12.5 (3-63)	12.5 (3-37)	11.5 (6-63)	6.5 (3-37)

2GTKI, second-generation TKI; BC, blastic crisis; CP, chronic phase; F, female; Hb, hemoglobin; M, male; Ph, Philadelphia; WBC, white blood cell.

2 patients, and *TET2* in 6 patients). *ABL1* (16%, 6 of 37) and genes related to chromatin modification and DNA methylation (51%, 19 of 37) were the most commonly mutated (65%, 24 of 37 patients in total). Surprisingly, aside from a single *SF1* variant, we did not observe any mutation within splicing machinery pathway genes, which are common in other myeloid disorders. As seen in Figure 1, *ABL1* KD mutations were specific to nonresponsive patients. As expected, the frequency of somatic variants was highest among progressed patients (maroon, 8 of 8, 100%), second-highest among resistant patients (orange, 11 of 18, 61.1%), and lowest in the responsive group of patients (blue, 18 of 74, 24.3%; Fisher exact test, $P < .00001$), showing a clear association of increasing mutation burden with poor TKI response and progression to advanced disease (Figure 1).

Lastly, 10 patients (6 responsive patients, 3 resistant patients, and 1 progressed patient) carried a nonsilent mutation in their T-cell samples. Each of the 10 patients carried exactly 1 T-cell mutation (VAF $> 1\%$). The mean VAF for all variants in T-cell samples was 10.57%. Eight of these 10 patients carried a mutation in genes associated with epigenetic regulation (4 in *TET2*, 3 in *ASXL1*, 1 in *DNMT3A*). All T-cell mutations were detected in the corresponding diagnosis samples.

Hierarchical clustering to deconvolute mutation dynamics patterns following TKI therapy

Unsupervised hierarchical clustering on a 51-by-3 matrix (the number of nonsilent mutations by the number of series samples per patient) for the 34 patients with nonsilent variants suggested that different mutation patterns are clinically relevant and can provide important insights into the roles of somatic mutations beyond *BCR-ABL* gene rearrangement (Figure 2). VAFs of each mutation were linearly normalized to the maximum VAF among the 3 time points in order to measure the relative expansion/reduction without biasing the algorithm toward grouping mutations with similar absolute VAFs. Clearly, we see 5 patterns based on relative mutation burden at each of the 3 time points. Combinatorially, there are 8 possible broad patterns of high VAF vs low VAF across time points (ordered by T-cell, diagnosis, and follow-up samples). No high-low-high patterns and high-low-low

patterns were apparent. We labeled the observed patterns as patterns 1 through 5, and refer to the lack of mutations (the low-low-low pattern) as pattern 0. With the exception of 2 cases (CML-37 and CML-99), only 1 pattern of clone dynamics was observed per patient, suggesting a relatively simple clonal architecture of CML compared with other hematologic malignancies such as AML. Patterns 4 and 5 contained too few cases and variants to make strong generalizations about, leaving 3 very distinctive and common clinically associated mutation dynamics patterns.

Pattern 1 contains mutations that were detected at the time of diagnosis and persisted after TKI therapy, but were absent in the T-cell samples; this is in the face of successful molecular response to TKI therapy in all cases whose variants exhibited this pattern. Pattern 2 contains mutations that were absent in both T-cell and diagnosis samples and only present in the follow-up samples. All patients with pattern 2 mutations were in non-responsive groups. Pattern 3 contains mutations that appeared at diagnosis (or significantly increased between the T-cell samples and diagnosis samples) and significantly decreased at the time of follow-up. Patients with pattern 3 mutations had mixed clinical outcomes with no outcome group significantly overrepresented.

Pattern 1: Mutation persistence after TKI therapy does not correspond to treatment failure

The 7 patients with pattern 1 mutations all responded despite failing to achieve mutation clearance after TKI treatment. Nine of the 16 genes in this group are involved in transcription (*ASXL1*, *ATRX*, *BCOR*, *CREBBP1*, *CUX1*, *EP300*, *JAK3*, *SF1*, *TRRAP*), all of which except for *ASXL1* are rarely reported in CML, but are more commonly found in myelodysplastic syndromes and AML.³⁵⁻³⁷ All pattern 1 mutations and genes were unique within the pattern. Because the mutations were not cleared in spite of significant reduction of *BCR-ABL* transcript level at the time of follow-up, they are likely to be indicative of a preleukemic *Ph*⁻ clone that existed independent of *Ph*⁺ clones. The presence of mutations in these genes at diagnosis did not have any significant association with treatment failure or progression, except in the case of *ASXL1* (5 of 9 patients, 55.6%).

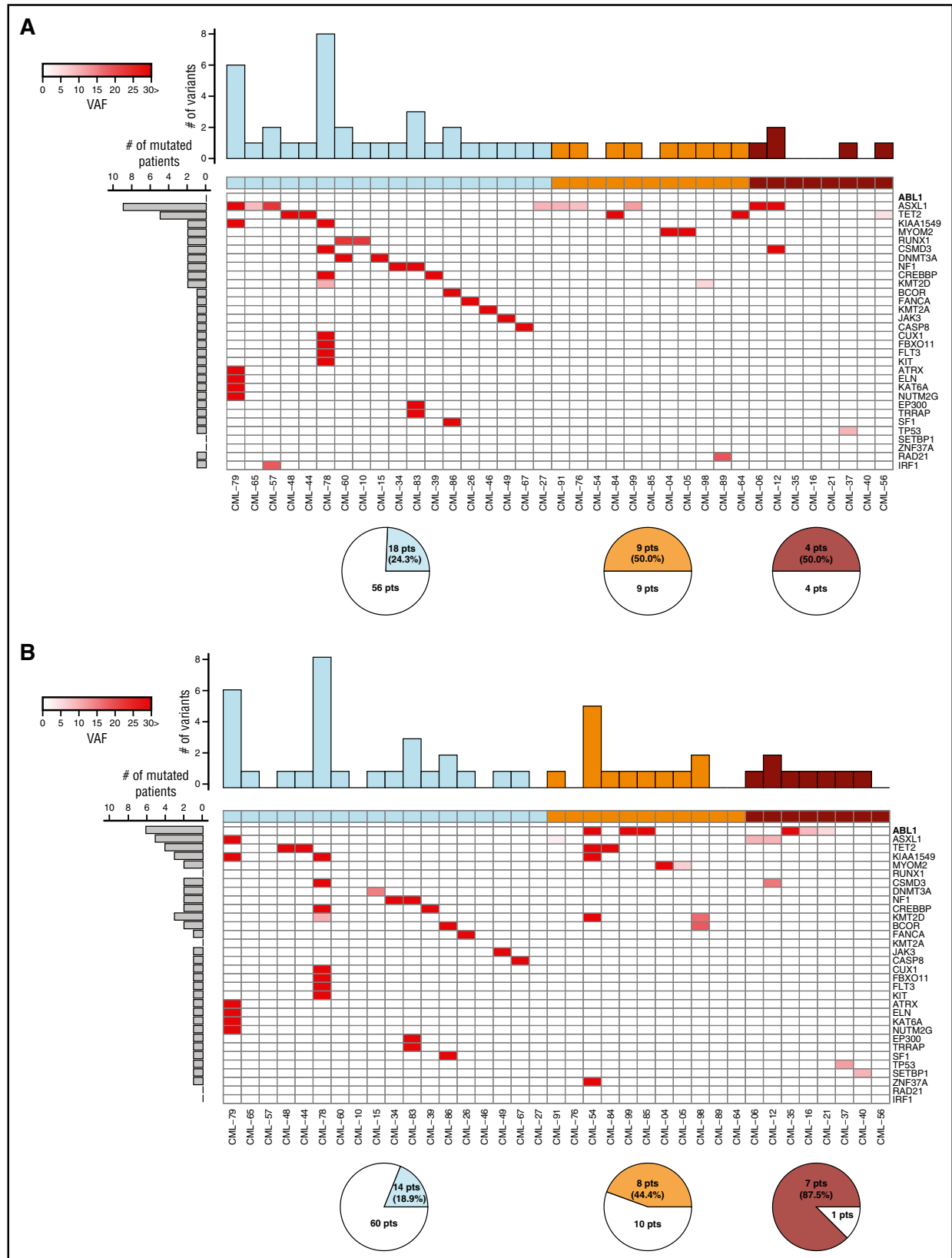


Figure 1. Landscape of somatic variants in 100 CML patients in serial samples. (A) At the time of initial diagnosis and (B) at the time of follow-up. Bar plots above each table indicate the number of variants each patient carried; bar plots on the left indicate the number of patients with variant in each gene. Intensities of heatmap cells indicate the VAFs of each somatic variant. Pie charts below the first 3 subplots indicate the portion of patients from each response group with mutations at the relevant stage. Columns (patients) are first sorted by their patient subgroup (responsive, resistant, and progressed), then by the mutation burden in all stages combined within their subgroup. Rows are sorted by cohort occurrence frequency in the diagnosis and follow-up samples combined. Row and column order is the same for all subfigures.

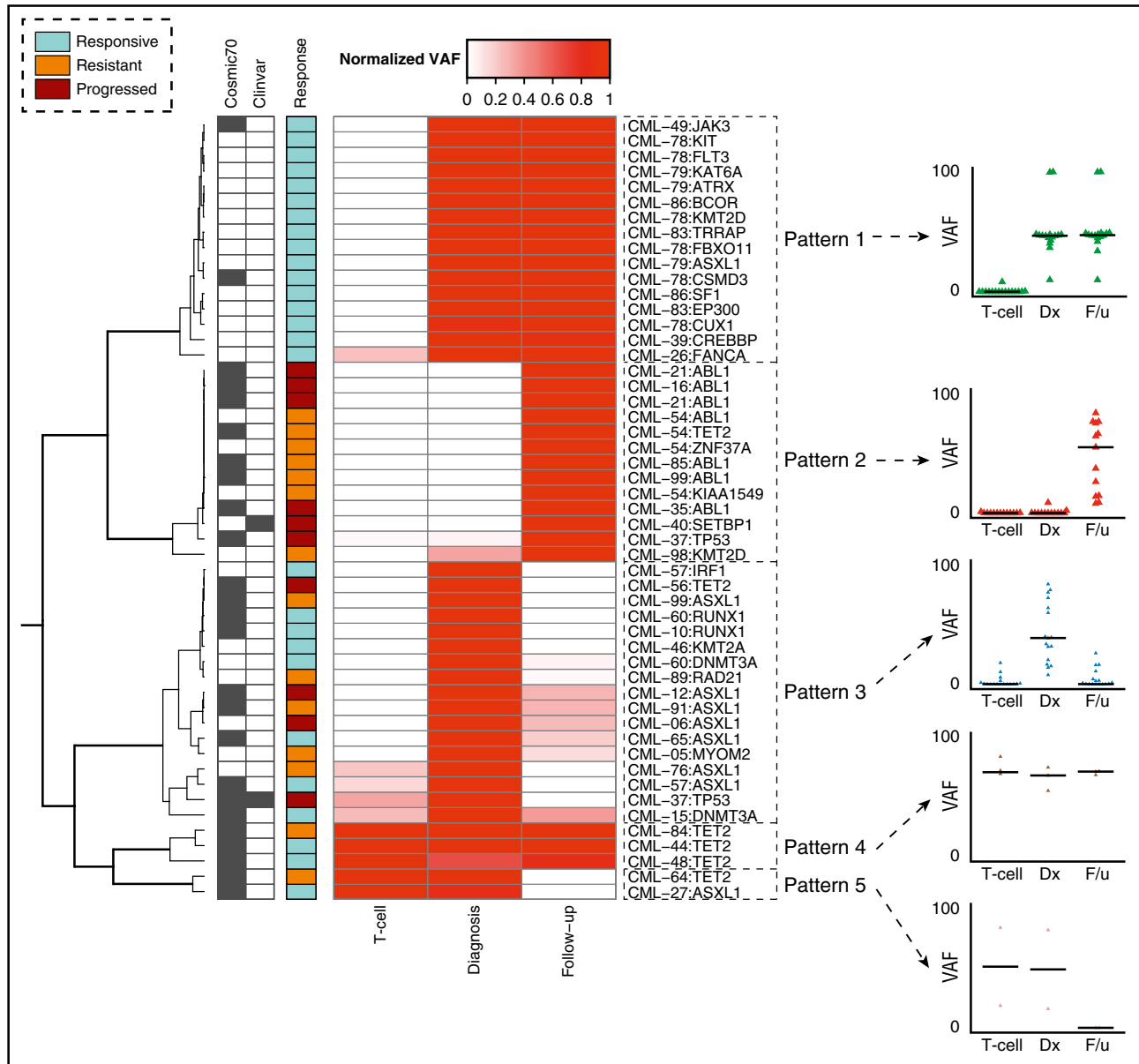


Figure 2. Mutation dynamics of somatic variants sorted and grouped using unsupervised hierarchical clustering. Rows are the gene names of all nonsilent variants found in the cohort (sorted by the clustering algorithm). Columns are the sample time points: T-cell, diagnosis, and follow-up (fixed temporal order). Color intensity indicates the row-normalized VAF. Major pattern groups are highlighted and labeled. The dot plot on the right represents the raw VAFs of the variants within each pattern group. Cells on the left indicate mutation presence in Catalogue of Somatic Mutations in Cancer (COSMIC) and Clinvar databases.

Pattern 2: Acquisition of new mutations is a strong indicator of TKI treatment failure

The 9 patients with pattern 2 mutations acquired 13 new somatic variants after TKI treatment (Figure 2). Perhaps unsurprisingly, all 9 patients either showed resistance to TKI therapy, or progressed to more advanced disease stages (Figure 3). This pattern contained a high portion of *ABL1* KD mutations (7 of 13 mutations in 6 patients including Q252H, F317L, E355G, F359V, and H396P); these mutations were also completely absent from the other patterns. All of these *ABL1* KD mutations have been previously reported in association with TKI resistance.^{38,39} Other mutations were within genes known to be commonly mutated in myeloid disorders including CML such as *TP53*, *KMT2D* (*MLL2*), and *TET2*.^{27-29,32,40} Our results clearly indicate that the acquisition of new mutations during TKI therapy was strongly correlated with treatment failure.

Pattern 3: Mutation dynamics of *Ph*⁺ clone

The 17 mutations of pattern 3 in 15 patients have VAFs that rise significantly at the time of initial diagnosis and vanish or decrease following TKI therapy. Two patients with pattern 3 mutations also had pattern 2 mutations. Preleukemic mutations were more frequently detected in the T-cell samples of patients with pattern 3 mutations than in the rest of the cohort, at 27% (4 of 15 patients) vs 7% (6 of 85 patients; $P = .038$ by Fisher exact test). Because TKI targets the *BCR-ABL* oncoprotein, these mutations are likely to concurrently exist in *Ph*⁺ clones as well as *Ph*⁻ clones in some cases. As such, there is a linear relationship between the rate of allelic burden and *BCR-ABL* reduction rate for most pattern 3 mutations in responsive patients. However, *DNMT3A-I705T* from patient 15 was detectable with a moderate VAF (14.79%) at follow-up even though the patient showed successful response

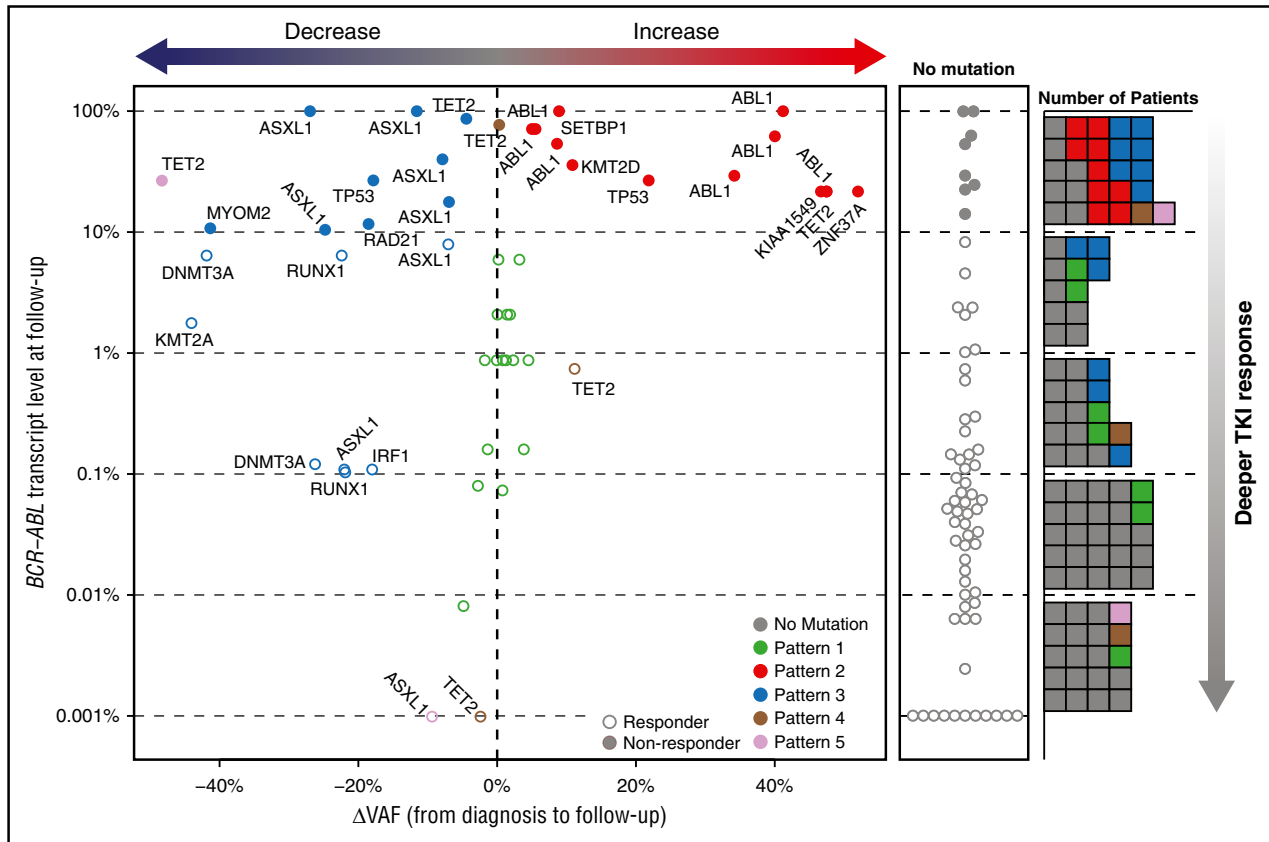


Figure 3. BCR-ABL transcript level at follow-up compared with changes in VAF. BCR-ABL level indicated on a log10 percentage scale for both subplots. Each circle in the left bee swarm plot represents a variant. Filled circles indicate TKI treatment failure in the patient that had that variant; empty circles indicate successful response. The right bee swarm plot shows the BCR-ABL transcript reduction level for patients without extra mutations. Each dot indicates an individual patient. The boxes on the far right indicate the number of patients within each decade of TKI response colored by pattern (patients with both pattern 2 and pattern 3 mutations are labeled here as pattern 2).

to TKI therapy (BCR-ABL measured at 0.12% at follow-up), suggesting its presence in a *Ph*⁻ clone as well. Most notably, their clinical outcomes were diverse: 6 of the 15 patients responded well to TKI treatment whereas the other 9 cases did not have a meaningful response to treatment (Figure 3). Unlike pattern 1 and 2 mutations, pattern 3 mutations were frequently within genes associated with chromatin modification and DNA methylation, which are epigenetic regulation pathways (11 of 17, 64.7%).

Patterns 4 and 5: Two patterns characterized by the presence of preleukemic mutations

The common trait of pattern 4 and 5 mutations was the presence of mutations in T-cell samples with high relative VAFs. These mutations were likely early events that preceded CML leukemogenesis, which are more directly measurable than the preleukemic mutations implied by mutation persistence alone (ie, pattern 1). All 5 mutations from 5 patients were located in genes associated with epigenetic regulation (4 in *TET2* and 1 in *ASXL1*). The mutations of both patterns plateaued at the time of diagnosis (average change in VAF between T-cell and diagnosis samples of <5%). The patterns were distinguished from each other by persistence (pattern 4) or clearance (pattern 5) at follow-up. The small number of patients exhibiting mutations with these patterns makes generalization difficult, however, the presence of preleukemic mutations in the *Ph*⁺ clone at least did not have

an obvious effect on treatment outcomes (3 responsive and 2 resistant patients).

Mutations in genes associated with epigenetic regulation pathways

Because 11 of the epigenetic pathway regulation mutations belonged to pattern 3, and 5 more belonged to the other 2 mixed-outcome groups, patterns 4 and 5, we compared the treatment outcomes of patients with these mutations at diagnosis to the rest of the cohort (Figure 4). Patients with mutations in epigenetic regulation pathways at diagnosis had a significantly lower response to TKI therapy, regardless of mutation clearance by the follow-up (Fisher exact test, *P* = .02 for CCyR by 12 months, *P* = .04 for MMR by 24 months, and *P* = .03 for MR4.5 by 36 months, respectively).

Multivariate analysis revealed that the presence of mutations in epigenetic regulators at the time of diagnosis predicted poor response to TKIs independent of other clinical factors with respect to CCyR at 12 months (*P* = .015; odds ratio, 0.204; 95% confidence interval, 0.057-0.737) (supplemental Table 4).

Pattern 0: Patients without mutations other than BCR-ABL transcript

Of the 100 patients included in this study, 63 did not carry mutations other than the BCR-ABL fusion transcript. Three additional patients only carried 1 synonymous mutation each, which did not have a clear

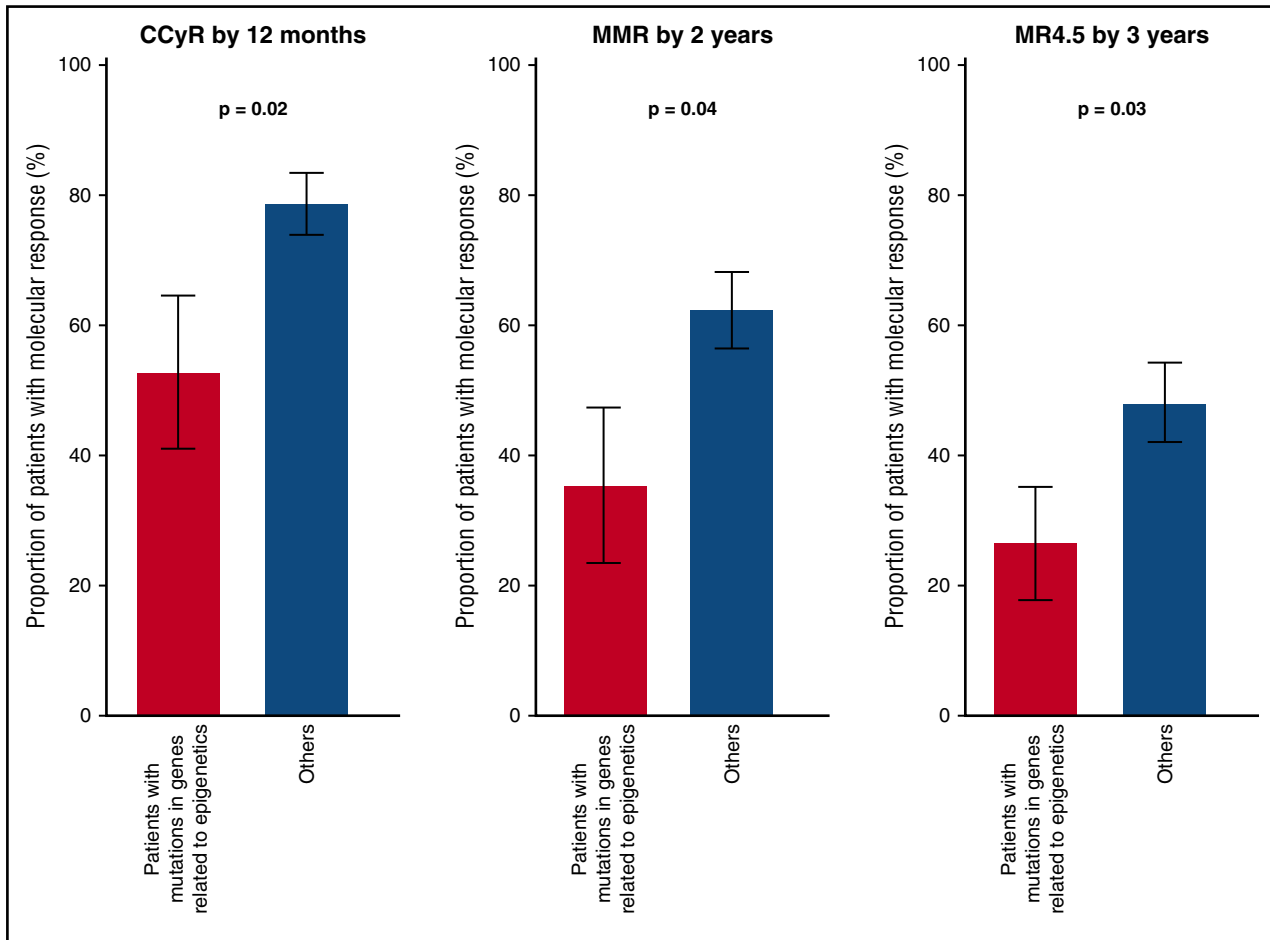


Figure 4. Presence of mutation in genes associated with epigenetic regulation confer poor long-term TKI response. Barplots comparing percentage of patients that successfully achieve 3 treatment response milestones (1 per barplot) in patients that had mutations in genes associated with epigenetic regulation (DNA methylation and chromatin modifiers) vs all other patients.

influence on TKI response (2 responsive patients and 1 resistant patient). Eight of the 63 patients were in the TKI-resistant group. None were progressed by the time of follow-up.

Discussion

The present study used targeted sequencing on 300 serial samples from 100 CML patients with varying TKI responses to investigate the frequency and dynamics of somatic mutations in genes commonly mutated in other myeloid neoplasms as well as the clinical implications of these mutations on TKI therapy outcomes. Our result showed that longitudinal follow-up of somatic mutations using a custom myeloid gene panel (supplemental Table 1) illustrates a useful genetic spectrum of somatic mutation dynamics during TKI therapy in CML patients as well as providing insight on the origin of mutations.

We tracked the origins of mutational burden as well as its dynamics after TKI therapy using targeted deep sequencing. In our cohort of 100 CML patients, the leukemic cells of 37 patients carried mutations. Among those 37 patients, we identified 5 distinct mutation patterns, for a total of 6 patterns after including the mutation-free pattern (pattern 0). Furthermore, this study also revealed that preleukemic mutations exist in CML patients (16%, 10 of 100 via direct T-cell evidence and an additional 6/100 due to presence in follow-up samples despite

significant *BCR-ABL* reduction), although we could not find a clear association between T-cell presence and TKI therapy response. Four of the 16 patients with preleukemic mutations carried *TET2-F868L* (3 from pattern 4 and 1 from pattern 5). An additional 2 patients carried the mutation following pattern 2 and pattern 3. It is not obvious whether *TET2-F868L* is a rare single-nucleotide polymorphism or a somatic mutation because the T-cell VAF was quite high in all 4 from patterns 4 and 5. Further investigation and functional studies would be required in order to reach a clearer conclusion. When analyzing the VAF changes of mutations in conjunction with *BCR-ABL* transcript reduction, screening serial samples provides in-depth insight into TKI response. Also, longitudinal follow-up of serial samples helped us to track the origin of mutations including preleukemic mutations and mutations that may have been induced or selected for by TKI therapy (pattern 2 mutations).

Changes of VAF in pattern 1 mutations behaved independently of *BCR-ABL* transcript changes. Pattern 1 mutations are characterized by their persistence at follow-up, although all patients carrying them responded well to TKI therapy and maintained durable response. Interestingly, the genes with pattern 1 mutations have not been commonly reported in CML, suggesting distinct function from mutations originating from *Ph*⁺ cells. Only 1 of these cases (CML-26) had a small amount of direct T-cell evidence of preleukemic mutations, which had a low enough T-cell VAF for it to be classified as pattern 1. The remaining 6 cases with pattern 1 mutations can be considered to have indirect evidence of preleukemic mutations

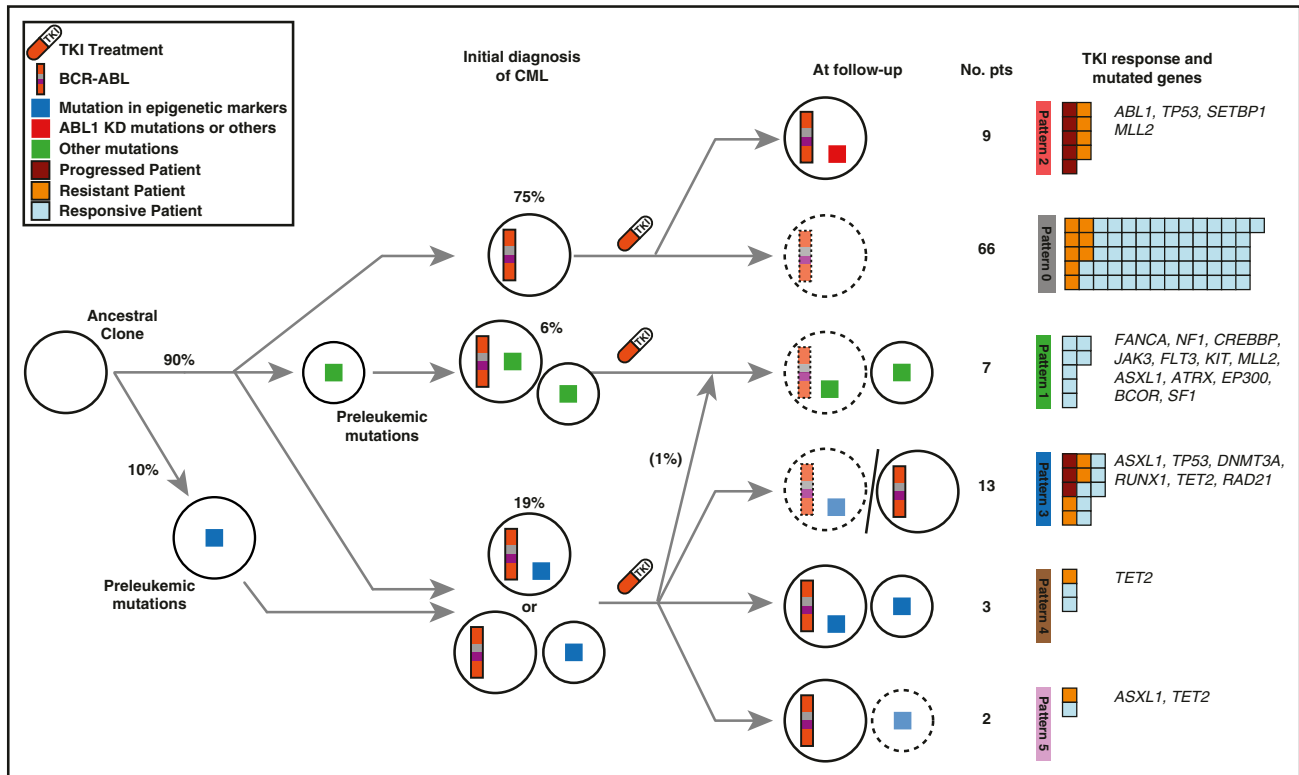


Figure 5. Clonal diversity of CML patients across disease stages. Clonal evolution models per sample stage based on our mutation pattern model. Paired circles indicate separate inferred subclones, with the smaller circle always representing Ph^- clones. Dotted lines indicate clones that were successfully treated and remain only in low levels (pattern 3 at follow-up denotes the 2 different clonal scenarios). Boxes on the right are colored to indicate TKI response per patient.

(Figure 5). Our results suggest that the presence of pre- and/or non- Ph^+ clones does not confer high risk of treatment failure following TKI therapy. Unlike pattern 4 and 5 mutations, pattern 1 mutations were absent in T-cell samples (with the exception of the 1 *FANCA* mutation from case CML-26), suggesting that these mutations may have occurred after myeloid lineage differentiation. In AML, a recent study showed significant negative association between mutation clearance and risk of relapse.⁴¹ In contrast, pattern 1 mutations show that mutation clearance in CML cannot be interpreted the same way without knowledge of the clonal origin of the mutations.

A notable finding of pattern 3 mutations is the high number of mutations in genes associated with epigenetic regulation. There are hints of a correlation between mutation clearance and reduction of *BCR-ABL* transcript level, but without obvious clinical associations. A larger number of patients with this pattern would be required to reach clearer conclusions of its prognostic implications. Of the 15 patients with pattern 3 mutations at diagnosis of CML, 9 (60%) showed resistance or progression, whereas 6 (40%) achieved good response to TKI therapy, suggesting that the clinical implications of pattern 3 mutations are different from pattern 1 or 2 mutations (Figure 3) in CML patients.

Genes in epigenetic pathways have been reported in healthy individuals without a diagnosis of hematologic malignancies.⁴²⁻⁴⁴ Cells carrying them appear to lack measurable morphological characteristics of a myeloid malignancy, but contain recurrent mutations that increase the likelihood of developing overt disease (usually by acquisition of further mutations).⁴²⁻⁴⁴ Such preleukemic mutations have been reported in other hematologic malignancies but have not been explored in CML extensively.^{32,42-47} The present study showed the presence of such mutations in CML patients (16%, 16 of 100 cases) which needs to be confirmed in a larger number of patients and investigated for its clinical relevance. Pattern 1 mutations can be considered indirect

evidence of a preleukemic Ph^- clone from which the leukemic Ph^+ clone evolved (illustrated in Figure 5). One pattern 1 mutation was detected in the patient's T-cell sample (*FANCA*-T826M in CML-26 with a VAF of 8.19%). There was no statistically significant response pattern among those 16 patients compared with the other 84. Ten of the 16 patients with preleukemic mutations had their early mutation in epigenetic regulation genes (*ASXL1*, *DNMT3A*, *KMT2D* [*MLL2*], and *TET2*). In general, epigenetic regulation genes were also most commonly mutated (57%, 21 of 37 cases), whereas genes associated with the other 6 pathways (activated signaling, cohesion complex, myeloid transcription factors, tumor suppressors, NPM1, and splicing machinery) were rare with the exception of *ABL1*, an activated signaling gene.

It is unsurprising to find pattern 2 mutations, given existing knowledge of CML patients with *ABL1* KD mutation during TKI therapy.³⁹ Another view of pattern 2 mutations is that the absence of mutations (at least using high-throughput sequencing) at diagnosis does not always indicate a higher chance of successful TKI therapy because pattern 2 mutations were absent or undetectable at diagnosis. In line with previous studies, *ABL1* KD mutations were exclusive to pattern 2.^{20,48,49} However, there were 3 patients with pattern 2 mutations that lacked *ABL1* KD mutations. Interestingly, there were also 8 TKI-resistant patients among the mutation-free group (pattern 0). Methylation profiling and/or RNA sequencing might help uncover the underlying biology behind the development of their resistance. It is also possible that these patients carry mutations in genes not targeted in our study, which whole-exome sequencing could reveal.

Utilizing mutation dynamics and *BCR-ABL* fusion transcript reduction level from the present study, we postulate possible clonal development models of CML (Figure 5). Ten cases (10%) had preleukemic mutations in their T-cell samples. Although further functional study is required to investigate the association of these

variants with *BCR-ABL* gene rearrangement, as well as TKI responses, preleukemic mutations in CML are not as rare as might be expected. Six cases (6%) carried preleukemic mutations in the *Ph*⁻ clone, inferred by the persistence of pattern 1 mutations in spite of successful TKI response. The majority of CML cases (75%, 75 of 100 cases) did not carry any nonsilent mutations other than *BCR-ABL* at the initial diagnosis. Seven of these patients, as well as 2 who had nonsilent diagnosis mutations, had *Ph*⁺ clones that acquired extra mutations by the follow-up time. All 9 did not have a meaningful response to TKI therapy. The overall clinical picture of the quarter of patients with nonsilent diagnosis mutations is not straightforward for patients with pattern 3, 4, or 5 mutations. However, pattern 3 mutations in nonresponsive patients imply the existence of additional somatic mutations in *Ph*⁺ clones, often in genes commonly mutated in other myeloid malignancies.

Overall, this study demonstrates that patterns of mutation acquisition, persistence, and clearance vary but have a number of interesting correlations with clinical outcomes. We found that 16% (16 of 100 patients) had evidence of preleukemic mutations, though no clear association between their presence and TKI response was observed. Our data show that mutation burden often persists despite successful TKI response in CML (pattern 1), whereas patients exhibiting mutation clearance (pattern 3) show mixed patterns of clinical outcomes. Patients that acquired new mutations during treatment (pattern 2) all failed TKI therapy. Diverse patterns of somatic mutations in CML patients following TKI therapy is markedly distinct from other hematologic malignancies.

Acknowledgments

The authors thank John Woolley on the insightful discussion on the manuscript. They also thank 3 reviewers for critical and helpful review on the manuscript.

References

- Rowley JD. Letter: A new consistent chromosomal abnormality in chronic myelogenous leukaemia identified by quinacrine fluorescence and Giemsa staining. *Nature*. 1973; 243(5405):290-293.
- O'Brien SG, Guilhot F, Larson RA, et al; IRIS Investigators. Imatinib compared with interferon and low-dose cytarabine for newly diagnosed chronic-phase chronic myeloid leukemia. *N Engl J Med*. 2003;348(11):994-1004.
- Lombardo LJ, Lee FY, Chen P, et al. Discovery of N-(2-chloro-6-methyl-phenyl)-2-(6-(4-(2-hydroxyethyl)-piperazin-1-yl)-2-methylpyrimidin-4-ylamino)thiazole-5-carboxamide (BMS-354825), a dual Src/Abl kinase inhibitor with potent antitumor activity in preclinical assays. *J Med Chem*. 2004;47(27):6658-6661.
- Weisberg E, Manley PW, Breitenstein W, et al. Characterization of AMN107, a selective inhibitor of native and mutant Bcr-Abl [published correction appears in *Cancer Cell*. 2005;7(4):399]. *Cancer Cell*. 2005;7(2):129-141.
- Hehlmann R. How I treat CML blast crisis. *Blood*. 2012;120(4):737-747.
- Cancer Genome Atlas Research Network. Genomic and epigenomic landscapes of adult de novo acute myeloid leukemia. *N Engl J Med*. 2013;368(22):2059-2074.
- Papaemmanuil E, Gerstung M, Malcovati L, et al; Chronic Myeloid Disorders Working Group of the International Cancer Genome Consortium. Clinical and biological implications of driver mutations in myelodysplastic syndromes. *Blood*. 2013;122(22):3616-3627.
- Walter MJ, Shen D, Ding L, et al. Clonal architecture of secondary acute myeloid leukemia. *N Engl J Med*. 2012;366(12):1090-1098.
- Sakaguchi H, Okuno Y, Muramatsu H, et al. Exome sequencing identifies secondary mutations of SETBP1 and JAK3 in juvenile myelomonocytic leukemia. *Nat Genet*. 2013; 45(8):937-941.
- Lindsley RC, Mar BG, Mazzola E, et al. Acute myeloid leukemia ontogeny is defined by distinct somatic mutations. *Blood*. 2015;125(9): 1367-1376.
- Piazza R, Valletta S, Winkelmann N, et al. Recurrent SETBP1 mutations in atypical chronic myeloid leukemia. *Nat Genet*. 2013;45(1):18-24.
- Yoshida K, Sanada M, Shiraiishi Y, et al. Frequent pathway mutations of splicing machinery in myelodysplasia. *Nature*. 2011;478(7367):64-69.
- Maxson JE, Gottlib J, Pollyea DA, et al. Oncogenic CSF3R mutations in chronic neutrophilic leukemia and atypical CML. *N Engl J Med*. 2013;368(19): 1781-1790.
- Jabbour E, Kantarjian H, Jones D, et al. Frequency and clinical significance of BCR-ABL mutations in patients with chronic myeloid leukemia treated with imatinib mesylate. *Leukemia*. 2006;20(10):1767-1773.
- Gorre ME, Mohammed M, Ellwood K, et al. Clinical resistance to STI-571 cancer therapy caused by BCR-ABL gene mutation or amplification. *Science*. 2001;293(5531):876-880.
- Hochhaus A, Kreil S, Corbin AS, et al. Molecular and chromosomal mechanisms of resistance to imatinib (STI571) therapy. *Leukemia*. 2002; 16(11):2190-2196.
- von Bubnoff N, Schneller F, Peschel C, Duyster J. BCR-ABL gene mutations in relation to clinical resistance of Philadelphia-chromosome-positive leukaemia to STI571: a prospective study. *Lancet*. 2002;359(9305):487-491.
- Branford S, Rudzki Z, Walsh S, et al. High frequency of point mutations clustered within the adenosine triphosphate-binding region of BCR/ABL in patients with chronic myeloid leukemia or Ph-positive acute lymphoblastic leukemia who develop imatinib (STI571) resistance. *Blood*. 2002;99(9):3472-3475.
- Roumiantsev S, Shah NP, Gorre ME, et al. Clinical resistance to the kinase inhibitor STI-571 in chronic myeloid leukemia by mutation of Tyr-253 in the Abl kinase domain P-loop. *Proc Natl Acad Sci USA*. 2002;99(16): 10700-10705.
- Shah NP, Nicoll JM, Nagar B, et al. Multiple BCR-ABL kinase domain mutations confer polyclonal resistance to the tyrosine kinase inhibitor imatinib (STI571) in chronic phase and blast crisis chronic myeloid leukemia. *Cancer Cell*. 2002;2(2): 117-125.
- Hughes TP, Saglio G, Quintás-Cardama A, et al. BCR-ABL1 mutation development during first-line treatment with dasatinib or imatinib for chronic myeloid leukemia in chronic phase. *Leukemia*. 2015;29(9):1832-1838.

Authorship

Contribution: T.K., H.J.K., J.H.L., Z.Z., and D.K. designed the study; J.-S.A., S.H.C., H.J.P., Y.-k.K., and S.Y.K. collected samples and performed experiments; T.K., M.S.T., and Z.Z. analyzed the sequencing data; T.K., Z.Z., and D.K. interpreted the data and statistical analyses; and T.K., M.S.T., H.J.K., J.H.L., Z.Z., and D.K. wrote the paper.

Conflict-of-interest disclosure: The authors declare no competing financial interests.

Correspondence: Hyeoung Joon Kim, Genome Research Center for Hematopoietic Disease, College of Medicine, Chonnam National University, 322 Seoyang-ro, Hwasun-eup, Hwasun-gun, Jeollanam-do, 519-763, Republic of Korea; e-mail: hjoonk@chonnam.ac.kr; and Zhaolei Zhang, Donnelly Centre for Cellular and Biomolecular Research, University of Toronto, 160 College St, Rm 608, Toronto, ON, Canada, M5S 3E1; e-mail: zhaolei.zhang@utoronto.ca.

22. Branford S, Yeung DT, Parker WT, et al. Prognosis for patients with CML and >10% BCR-ABL1 after 3 months of imatinib depends on the rate of BCR-ABL1 decline. *Blood*. 2014;124(4):511-518.
23. Zabriskie MS, Eide CA, Tantravahi SK, et al. BCR-ABL1 compound mutations combining key kinase domain positions confer clinical resistance to ponatinib in Ph chromosome-positive leukemia. *Cancer Cell*. 2014;26(3):428-442.
24. Machova Polakova K, Kulvait V, Benesova A, et al. Next-generation deep sequencing improves detection of BCR-ABL1 kinase domain mutations emerging under tyrosine kinase inhibitor treatment of chronic myeloid leukemia patients in chronic phase. *J Cancer Res Clin Oncol*. 2015;141(5):887-899.
25. Branford S, Yeung DT, Prime JA, et al. BCR-ABL1 doubling times more reliably assess the dynamics of CML relapse compared with the BCR-ABL1 fold rise: implications for monitoring and management. *Blood*. 2012;119(18):4264-4271.
26. Khorashad JS, Kelley TW, Szankasi P, et al. BCR-ABL1 compound mutations in tyrosine kinase inhibitor-resistant CML: frequency and clonal relationships. *Blood*. 2013;121(3):489-498.
27. Grossmann V, Kohlmann A, Zenger M, et al. A deep-sequencing study of chronic myeloid leukemia patients in blast crisis (BC-CML) detects mutations in 76.9% of cases. *Leukemia*. 2011;25(3):557-560.
28. Menezes J, Salgado RN, Acquadro F, et al. ASXL1, TP53 and IKZF3 mutations are present in the chronic phase and blast crisis of chronic myeloid leukemia. *Blood Cancer J*. 2013;3(11):e157.
29. Makishima H, Jankowska AM, McDevitt MA, et al. CBL, CBLB, TET2, ASXL1, and IDH1/2 mutations and additional chromosomal aberrations constitute molecular events in chronic myelogenous leukemia. *Blood*. 2011;117(21):e198-e206.
30. Jelinek J, Gharibyan V, Estecio MRH, et al. Aberrant DNA methylation is associated with disease progression, resistance to imatinib and shortened survival in chronic myelogenous leukemia. *PLoS One*. 2011;6(7):e22110.
31. Uehara E, Takeuchi S, Yang Y, et al. Aberrant methylation in promoter-associated CpG islands of multiple genes in chronic myelogenous leukemia blast crisis. *Oncol Lett*. 2012;3(1):190-192.
32. Schmidt M, Rinke J, Schäfer V, et al. Molecular-defined clonal evolution in patients with chronic myeloid leukemia independent of the BCR-ABL status. *Leukemia*. 2014;28(12):2292-2299.
33. Shlush LI, Minden MD. Preleukemia: the normal side of cancer. *Curr Opin Hematol*. 2015;22(2):77-84.
34. Bacarani M, Deininger MW, Rosti G, et al. European LeukemiaNet recommendations for the management of chronic myeloid leukemia: 2013. *Blood*. 2013;122(6):872-884.
35. Dolnik A, Engelmann JC, Scharfenberger-Schmeer M, et al. Commonly altered genomic regions in acute myeloid leukemia are enriched for somatic mutations involved in chromatin remodeling and splicing. *Blood*. 2012;120(18):e83-e92.
36. Steensma DP, Higgs DR, Fisher CA, Gibbons RJ. Acquired somatic ATRX mutations in myelodysplastic syndrome associated with alpha thalassemia (ATMDS) convey a more severe hematologic phenotype than germline ATRX mutations. *Blood*. 2004;103(6):2019-2026.
37. Larsson CA, Cote G, Quintás-Cardama A. The changing mutational landscape of acute myeloid leukemia and myelodysplastic syndrome. *Mol Cancer Res*. 2013;11(8):815-827.
38. Soverini S, Martinelli G, Rosti G, et al. ABL mutations in late chronic phase chronic myeloid leukemia patients with up-front cytogenetic resistance to imatinib are associated with a greater likelihood of progression to blast crisis and shorter survival: a study by the GIMEMA Working Party on Chronic Myeloid Leukemia. *J Clin Oncol*. 2005;23(18):4100-4109.
39. Soverini S, Hochhaus A, Nicolini FE, et al. BCR-ABL kinase domain mutation analysis in chronic myeloid leukemia patients treated with tyrosine kinase inhibitors: recommendations from an expert panel on behalf of European LeukemiaNet. *Blood*. 2011;118(5):1208-1215.
40. Roy DM, Walsh LA, Chan TA. Driver mutations of cancer epigenomes. *Protein Cell*. 2014;5(4):265-296.
41. Kico JM, Miller CA, Griffith M, et al. Association between mutation clearance after induction therapy and outcomes in acute myeloid leukemia. *JAMA*. 2015;314(8):811-822.
42. Steensma DP, Bejar R, Jaiswal S, et al. Clonal hematopoiesis of indeterminate potential and its distinction from myelodysplastic syndromes. *Blood*. 2015;126(1):9-16.
43. Jaiswal S, Fontanillas P, Flannick J, et al. Age-related clonal hematopoiesis associated with adverse outcomes. *N Engl J Med*. 2014;371(26):2488-2498.
44. Shlush LI, Zandi S, Mitchell A, et al; HALT Pan-Leukemia Gene Panel Consortium. Identification of pre-leukaemic haematopoietic stem cells in acute leukaemia [published correction appears in *Nature*. 2014;508(7496):420]. *Nature*. 2014;506(7488):328-333.
45. Corces-Zimmerman MR, Hong W-J, Weissman IL, Medeiros BC, Majeti R. Preleukemic mutations in human acute myeloid leukemia affect epigenetic regulators and persist in remission. *Proc Natl Acad Sci USA*. 2014;111(7):2548-2553.
46. Jan M, Snyder TM, Corces-Zimmerman MR, et al. Clonal evolution of preleukemic hematopoietic stem cells precedes human acute myeloid leukemia. *Sci Transl Med*. 2012;4(149):149ra118.
47. Kim T, Yoshida K, Kim YK, et al. Clonal dynamics in a single AML case tracked for 9 years reveals the complexity of leukemia progression. *Leukemia*. 2016;30(2):295-302.
48. Carella AM, Garuti A, Cirmena G, et al. Kinase domain mutations of BCR-ABL identified at diagnosis before imatinib-based therapy are associated with progression in patients with high Sokal risk chronic phase chronic myeloid leukemia. *Leuk Lymphoma*. 2010;51(2):275-278.
49. Cortes J, Jabbour E, Kantarjian H, et al. Dynamics of BCR-ABL kinase domain mutations in chronic myeloid leukemia after sequential treatment with multiple tyrosine kinase inhibitors. *Blood*. 2007;110(12):4005-4011.