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Predictors of Primary Imatinib Resistance in Chronic Myelogenous Leukemia Are Distinct From Those in Secondary Imatinib Resistance

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A B S T R A C T

Purpose

A subset of patients with chronic myelogenous leukemia (CML) do not respond to the tyrosine kinase inhibitor (TKI) imatinib mesylate. Such primary imatinib resistance is distinguished from secondary resistance which reemerges after attainment of cytogenetic remission.

Patients and Methods

We studied gene expression patterns in total WBCs using a panel of 21 genes previously implicated in TKI handling, resistance, or progression comparing patients who had newly diagnosed TKI-naive CML that had optimal (n = 41), or suboptimal (n = 7) responses to imatinib, or primary resistance (n = 20). Expression patterns were compared to those in secondary TKI-resistant chronic phase CML without ABL1 kinase domain mutations (n = 29), and to lymphoid (n = 15) or myeloid blast phase disease (n = 12).

Results

Fifteen genes in the panel distinguished blast phase from chronic phase disease, and 12 genes distinguished newly diagnosed CML from TKI-resistant CML without ABL1 kinase domain mutations, but only a single gene, prostaglandin-endoperoxide synthase 1/cyclooxgenase 1 (*PTGS1/COX1*; P = .005), differentiated imatinib-responsive from primary imatinib-resistant CML. The association of primary imatinib resistance with higher transcript levels of the drug metabolism gene *PTGS1* was confirmed in a separate data set of 68 newly diagnosed, imatinib-treated CML (P = .008). In contrast, up to 11 different genes were identified in a multivariate model that optimally discriminated secondary imatinib resistance lacking ABL1 kinase domain mutation from imatinib-responsive cases, likely related to the more complex pathogenesis of secondary resistance.

Conclusion

Gene expression profiling of CML at diagnosis for *PTGS1* may be useful in predicting imatinib response and in selecting alternate therapy.

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INTRODUCTION

The tyrosine kinase inhibitor (TKI) imatinib mesylate (Gleevec; Novartis Pharma, Basel, Switzerland) is an effective treatment for chronic myelogenous leukemia (CML) which acts by inhibiting the BCR-ABL kinase arising from the t(9;22) chromosomal translocation which is the hallmark of this leukemia. Therapeutic resistance to imatinib is seen in approximately 10% to 15% of patients and can be classified as primary or secondary depending on whether an initial decline in disease levels are observed or not.¹ A major factor mediating secondary resistance is the emergence of acquired point mutations in the ABL kinase domain (KD) and *BCR-ABL1* gene amplification, although other molecular mechanisms of resistance are also important.²

In contrast, the factors contributing to primary resistance are less well characterized.³ The initial response rates to imatinib are much lower in those patients presenting with CML already in accelerated phase (AP) or blast phase (BP) suggesting that factors mediating blast transformation compromise response to imatinib. Other postulated mechanisms of primary resistance among CML patients presenting in chronic phase (CP) include low activity of imatinib uptake transporter cation transporter 1 (OCT1)⁴⁻⁶ and increased activity of imatinib efflux transporters.⁷⁻⁹

The goal of this study was to evaluate the utility of a clinical-grade limited gene expression panel for

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predicting response to imatinib in newly diagnosed CML, and assessing the mechanisms of secondary imatinib resistance when ABL KD mutations were absent. We used a targeted approach selecting genes involved in the pharmacogenomics of imatinib and other TKIs, and in CML progression. We show that such an approach can identify genes differentially associated with primary and secondary imatinib resistance.

PATIENTS AND METHODS

Patient Characteristics and Therapy Response Criteria

The first CML study set was composed of diagnostic samples before the initiation of imatinib therapy from 68 patients presenting to University of Texas M. D. Anderson Cancer Center (Houston, TX) between June 2003 and February 2007, including all patients with excess samples who had suboptimal imatinib response or imatinib failure, and a randomly chosen group of patients with optimal imatinib response, secondary resistance, and blast transformation. A second set of 68 newly diagnosed CML patients was composed of patients with initial imatinib treatment before June 2003 or after February 2007, with all patients having at least 12 months of follow-up. Diagnostic work-up on all patients included CBC, bone marrow biopsy and aspiration, G-banded karyotypic study from short-term cultures of aspirate material, fluorescent in situ hybridization using a dual-fusion BCR-ABL1 probe on short-term culture of peripheral blood, and quantitative reverse transcription polymerase chain reaction (QRT-PCR) for the BCR-ABL1 fusion transcript on leukocytes from blood, as described.^{10,11} The study was performed according to an approved laboratory protocol and in accordance with the Declaration of Helsinki.

Sokal risk scores were calculated as described.¹² Imatinib response criteria were as previously described.¹ Complete hematologic response was defined as a WBC count of lower than 10×10^9 /L, a platelet count lower than $450 \times$ 10⁹/L, no immature cells (blasts, promyelocytes, myelocytes) in the peripheral blood, and disappearance of all signs and symptoms related to leukemia (including palpable splenomegaly). Cytogenetic responses were defined as complete (0% t(9;22)/Philadelphia chromosome [Ph] positive), partial (pCvR, 1% to 35% Ph positive), minor (36% to 65% Ph positive), and minimal (66% to 95% Ph positive). A major cytogenetic remission included complete plus partial cytogenetic remissions (ie, < 35% Ph positive). Cytogenetic remission was judged by standard cytogenetic analysis in 20 metaphases. Major molecular response was defined as a BCR-ABL1/ABL1 transcript ratio of lower than 0.05% by QRT-PCR, representing more than 3-log reduction from the baseline for untreated patients in our laboratory. Complete molecular response was defined as undetectable levels of BCR-ABL1 transcript, representing at least 4.5-log reduction from baseline levels. Optimal treatment response at 12 months is defined by complete cytogenetic response, suboptimal treatment response at 12 months is defined by pCyR, and treatment resistant at 12 months is defined by less than pCyR (three patients assessed at slightly earlier time points 9, 10, and 11 months, respectively). ABL KD mutations were assessed in TKI-resistant samples using a nested PCR strategy covering codons 221 to 500 and a screening strategy as previously described.^{13,14}

Selection of Genes for Transcript Profiling

The 24 genes in the panel included two normalizing genes (*GUSB* and *18S RNA*) and 22 test genes with known influences on TKI entry, handling, and efflux as well as genes known to be related to disease progression in CML identified in previously published microarray studies. Genes influencing import, binding, and export of TKIs (and imatinib specifically) included the cation drug transporters OCT1 (*SLC22A1*), OCT2 (*SLC22A2*), and OCT3 (*SLC22A3*), drug metabolism genes including the P450 isoforms *ABCB1* (multidrug resistance [MDR]-1), *ABCC1*, and *ABCG2*,¹⁵ and prostaglandinendoperoxide synthase (*PTGS)1* and *PTGS2*, and the blast marker CD34. Previously identified progression factors in CML included the granulocytemacrophage colony-stimulating factor (CSF2),¹⁵ JAK/STAT signaling components JAK2, STAT5A, STAT5B,¹⁶ STAT3,^{17,18} the kinases ABL1, TEC,

BTK,¹⁹ and LYN,^{20,21} and transcription factors CEBPA,²² RUNX1, and RUNX3.²³ Also included were the three genes most highly associated with lack of response to imatinib in a previous microarray study of primary resistance, namely *PTGS1*, protein tyrosine phosphatase, nonreceptor type 22 (*PTPN22*), and frizzled homolog 7 (*FZD7*).²⁴

Low-Density ORT-PCR Array

Expression profiling was done on RNA extracted from CML samples using a custom-designed TaqMan low-density QRT-PCR array containing one gene-specific forward and reverse primer pair and one TaqMan MGB probe (6-FAM dye-labeled) in each well (Applied Biosystems, Foster City, CA). Total RNA was extracted from WBCs following RBC lysis using the guanidium solubilization method (Trizol, Invitrogen, Carlsbad, CA) and complementary (c)DNA synthesized using Superscript III reverse transcriptase (Invitrogen) using random hexamers for priming. QRT-PCR was performed with 800 ng of cDNA from each sample, as described previously.²⁵ Thermal cycling conditions were as follows: 2 minutes at 50°C, 10 minutes at 95°C, 40 cycles of denaturation at 95°C for 15 seconds, and annealing and extension at 60°C for 1 minute. Measurements of the *ABL1* genes on the arrays were correlated with the singe tube QRT-PCR *BCR-ABL1* assays previously performed on these samples.

Statistical Analysis

The relative expression level of a particular gene of a given sample on the array was calculated by the delta (Δ) threshold cycle (Ct) method. Using the approach previously described for linear discriminant analysis (LDA),²⁵ the Δ Ct value was obtained by normalizing against the median Ct value of all 22 test genes for each sample except for OCT2 (SLC22A2) which was expressed at very low levels.

One-way analysis of variance (ANOVA) or *t* test were used to test against null hypothesis of no significant difference for any given gene expression among three treatment response groups, optimal, suboptimal, and resistant group, or between two groups when combining the optimal and the suboptimal into one group. Holm's method was applied to adjust *P* values of ANOVA and *t*-tests to correct multiple comparisons.²⁶

LDA²⁷ was used to model multiple gene effects regarding two response groups, resistant versus combination of optimal and suboptimal groups. A series of linear discriminant models were built to sequentially include the increasing number of genes, starting from one to 21 genes. The order of gene selection was decided by their *t*-statistics in training set. In order to perform a robust analysis, 3-fold cross validation with random assignment of training and test set was repeated 500 times for each model. The accuracy of training or of test set was measured by comparing predicted with observed group labels. Our statistical analyses, including unsupervised hierarchical clustering, were performed in R, version 2.7.0 (www.r-project.org), a freely available statistical software package.

RESULTS

Pathway-Based Gene Expression Panel Distinguishes CP CML From Lymphoid and Myeloid Blast Phases

The gene expression profiles of total WBCs from 68 patients with newly diagnosed CML (63 patients in CP, five patients in AP), 29 patients with secondary TKI-resistant CML without *ABL1 KD* mutations (23 patients receiving imatinib, six patients receiving other TKIs), 15 patients with CML in lymphoid BP (LBP, six newly diagnosed) and 12 patients with secondary myeloid BP (MBP) were compared. All of the genes in the transcript panel except *OCT2* were significantly expressed in the samples tested. *ABL1* levels detected in this panel were highly correlated with those detected in the single tube *BCR-ABL1/ABL1* QRT-PCR assay (r = 0.81). Table 1 lists the mediannormalized absolute expression levels for all genes for each sample group.

	Median Normalized Expression Levels			TKI-r CML From New CML		TKI-r CML From CML-MBP		TKI-r CML From CML-LBP		
Gene Expression	New CML (54 CP, 14 AP)	TKI-r CML	CML MBP	CML LBP	Р	P adj*	P	P adj*	Р	P adj"
Most increased with blast transformation										
ABCC1	0.479	0.910	1.617	2.697	< .001	< .001	< .001	.005	< .001	< .001
CD34	0.166	0.008	3.194	4.67	< .001	< .001	< .001	< .001	< .001	< .001
FZD7	0.025	0.020	0.09	0.083	.198	.99	.001	.01	.002	.01
Most decreased with blast transformation										
CEBPA	1.458	0.635	0.439	0.472	< .001	< .001	< .001	.005	.001	.01
JAK2	2.762	1.604	0.720	0.884	< .001	< .001	< .001	< .001	< .001	< .001
LYN	53.190	18.375	4.076	2.897	< .001	< .001	< .001	< .001	< .001	< .001
PTPN22	13.944	4.513	2.759	1.686	< .001	< .001	< .001	.005	< .001	< .001
SLC22A1	0.180	0.328	0.02	0.040	.01	.084	< .001	< .001	< .001	< .001
STAT3	6.364	6.916	4.286	4.877	.446	1	< .001	.002	.003	.014
STAT5B	2.542	2.670	0.993	1.000	.47	1	< .001	< .001	< .001	< .001

To examine the ability of this panel to distinguish CP CML at diagnosis from KD-unmutated, secondary TKI-resistant CML, LBP, and MBP, we performed unsupervised clustering analysis using 21 genes (normalizers *18S RNA* and *GUSB* as well as *OCT2/SLC22A2* were excluded). As shown in Figure 1, LBP and MBP could be easily distinguished in all but three cases from CML-CP/AP. In contrast, secondary TKI-resistant CML (light blue) clustered with newly diagnosed cases of CML that showed resistance to imatinib but generally away from those cases that responded to imatinib.

phase; AP, accelerated phase.

All but three (*PTGS1*, *SLC22A3*, and *STAT5A*) of the 21 genes in the panel were expressed at significantly different levels in TKI-resistant CP CML compared to LBP and MBP. Genes that were most



Fig 1. Twenty-one gene targeted transcript panel can differentiate chronic from blast phases of chronic myelogenous leukemia (CML), and imatinib-responsive newly diagnosed CML from imatinib-resistant patients. Unsupervised hierarchical clustering of newly diagnosed imatinib-responsive (yellow) and imatinibresistant (red) patients versus ABL KD-unmutated tyrosine kinase inhibitor (TKI)-resistant samples in chronic phase (CP) or accelerated phase (AP; light blue) and myeloid (green) and lymphoid blast phase (dark blue).

upregulated with blast transformation were *CD34* and *ABCC1* (P < .0001), whereas genes whose expression was downregulated on blast transformation included transcription factors *CEBPA*, *STAT3*, *STAT5A*, kinases *LYN*, *JAK2*, phosphatase *PTPN22*, and *SLC22A1* (OCT1). Most of these genes were also significantly different between newly diagnosed CML and KD-unmutated TKI-resistant CML (Table 1).

Correlations of Initial Imatinib Response With Patient and Tumor Characteristics

We separately analyzed gene expression profiles from the 68 newly diagnosed patients to determine factors that were associated with optimal and suboptimal responses and resistance to imatinib. Assessing response at 1-year, 41 patients (60.3%) had optimal response, seven patients (10.3%) had suboptimal response, and 20 patients (29.4%) were resistant to imatinib treatment (Table 2, first set). At start of imatinib treatment, 34 (90%) of 41 of the optimal response group, six (86%) of seven of the suboptimal group and 14 (70%) of 20 of the resistant group were in CP, with the rest in AP due to additional cytogenetic aberrations in 12 and low platelet count in two. No patients were in BP.

The median WBC counts and the median platelet counts at presentation and numbers of patients with elevated blood blasts or basophils were not significantly different between the three groups. However, a higher percentage of patients in the resistant group had high risk Sokal scores (30% v 3% for optimal and 0% for suboptimal) due to the higher incidence of splenomegaly in this group. The median *BCR-ABL1/ABL1* percentages in the analyzed samples, 90.9%, 65.6%, and 30.2% respectively, were significantly higher in the optimal and suboptimal response groups compared to the resistant group (Table 2).

The pattern of imatinib dosing over the first year, and outcome for each group are summarized in the legend to Table 2, with a higher median imatinib dose in the optimal response group largely due to dose-limiting toxicities precluding escalation in the other groups. Eleven of the primary resistance cases (suboptimal or failure) were

Table 2. Patient Characteristics Among Newly Diagnosed Imatinib-Treated CML					
Characteristic	Optimal	Suboptimal	Resistant		
Total patients					
First set	41	7	20		
Second set	43	15	10		
Median age, years					
First set	46	51	36		
Range	21-70	34-71	20-60		
Second set	45	40	40		
Range	18-77	24-71	32-84		
Stage at start of imatinib					
First set					
CP	34	6	14		
AP	7	1	6		
Second set					
CP	38	13	9		
AP	5	2	1		
Median BCR-ABL1/ABL1 QRT-PCR, %					
First set	90.9	65.6	30.2		
Second set	45.0	45.2	43.6		
Clonal evolution at presentation					
First set	6	1	4		
%	15	14	20		
Second set	2	0	1		
%	5		10		
Median imatinib dose over first year, mg/d					
First set	700**	500†	500‡		
Second set	600	600	500		
Median follow-up (range, months)					
First set	45.0	43.3	35.0		
Range	12-60.1§	15.4-54.3	7.3-55.4¶		
Second set	60.9	60.9	43.6		
Range	14.8-94.8	24.5-113.7	23.4-109.5		
Outcome first and second set combined	3 DOD, 1 DOOD	1 DOOD	4 DOD, 2 DOOD		
Hematologic parameters in first set					
Median presenting WBC, ×10 ⁹ /L	77	75.9	81		
Median presenting platelet count, ×10 ⁹ /L	296	337	467		
Elevated PB blasts, $> 5\%$	2	1	5		
Elevated PB basophils, $> 5\%$	6	3	5		
Splenomegaly at presentation	8	1	8		
Sokal risk score#					
Low	30	5	11		
Intermediate	9	2	1		
High	1		6		

Abbreviations: CML, chronic myelogenous leukemia; CP, chronic phase; AP, accelerated phase; QRT-PCR, quantitative reverse transcription polymerase chain reaction; DOD, died of disease-related causes; DOOD, died of other disease; WBC, white blood cell; PB, peripheral blood; TKI, tyrosine kinase inhibitor; BP, blast phase.

*Twelve patients were initially on 400 mg/day of imatinib, one patients on 300, six patients on 600, and 23 on 800 mg/day (including five patients also taking pegylated interferon and recombinant granulocyte-macrophage colony-stimulating factor, usually for short duration); nine of these patients had subsequent dose reductions due to toxicities, five patients had dose increases due to persistent BCR-ABL1 transcript levels.

+Six of seven patients were initially on 400 mg/day; one patient on 800, with dose limiting toxicities precluding dose escalation in five patients.

[‡]Twelve patients were initially on 300 to 500 mg/day of imatinib (most on 400 mg), seven patients were on 800 mg per day (including three taking pegylated-intron/sargramostim). In eight patients, dose escalation was attempted, in the remaining there were dose-limiting toxicities. Two patients with resistant disease at the 1 year had transient responses in the first 3 to 6 months of treatment.

SFour patients developed secondary imatinib resistance (with 1 BP, 1 AP, 2 CP) at a median of 24 months after initial therapy, with two switched to a new TKI. Three patients developed secondary imatinib resistance (2 AP, 1 CP) and were switched to a new TKI (2 dasatinib, 1 bosutinib) at 22, 24, and 33 months post-imatinib start, three patients were continued on imatinib, and one patient was lost to follow-up.

¶Eleven patients were switched to a new TKI (dasatinib in three, bosutinib in seven, and nilotinib in one) after a mean duration of imatinib of 16.9 months (range, 6 to 42.7 months), three had stem cell transplant, and five had dose escalation with imatinib. Two patients with resistant disease died before 1 year; two were lost to follow-up.

#One optimal response and two resistant patients could not be scored.

assessed at 12- to 18-month time points for *BCR-ABL1 KD* mutations before TKI change. Three of these patients showed mutations (*E255K*, *F359V*, and *E459K*); retrospective analysis did not show these mutations in the baseline samples.

PTGS1 Expression Differentiates Imatinib-Responsive and -Resistant Groups

The relative expression levels of all 21 test genes from newly diagnosed CML samples were compared based on optimal response,

suboptimal response, and resistance to imatinib assessed at the 1-year time point (Appendix Table A1, online only). The *P* values of overall difference among the three response groups for specific genes (by ANOVA) were similar to those obtained by *t*-tests when combining optimal and suboptimal imatinib response groups so further comparisons were done grouping optimal/suboptimal versus resistant patients.

When values were corrected for multiple gene testing effects, only *PTGS1* was significantly differentially expressed in the imatinib-failure/resistant group (Fig 2A). The significant association of increased *PTGS1* expression with resistance to imatinib was confirmed by a multivariate LDA model that was repeatedly run in 500 three-fold cross-validations using randomly assigned training and test sets. As shown in Figures 2B and 2C, a single gene model was identified as the optimal for accuracy of prediction, with *PTGS1* identified as that gene in 96% of runs.

We next assessed the significance of *PTGS1* transcript levels in RNA extracted from total blood WBCs before imatinib therapy in a different set of 68 patients with CML, including 43 optimal, 15 suboptimal responders, and 10 with imatinib resistance/failure (Table 2, second set). Demographic and hematologic features and *BCR*-

ABL1/ABL1 percentages in the analyzed samples were similar between the three groups (Table 2 and not shown). When normalized to *GUSB* levels, elevated *PTGS1* transcript levels were once again associated with imatinib resistance as compared to optimal responders (P = .0083, *t*-test; Fig 2D).

Differences Between the Gene Expression Profiles of Primary and Secondary Imatinib Resistance

We examined whether gene expression patterns associated with secondary imatinib resistance in the absence of ABL KD mutation were similar to those seen in primary imatinib resistance. Genes whose expression was most significantly higher in secondary imatinib resistance compared to newly diagnosed optimal imatinib responders included *ABCB1*, *ABCC1*, *STAT5A*, and *RUNX3*. Genes whose expression was lower in secondary imatinib-resistant samples included *PTPN22*, *CEBPA*, *TEC*, *JAK2*, and *LYN* (Table 3). As shown in Figure 3A, 11 genes were required to optimally distinguish secondary TKI-resistant samples from newly diagnosed optimal responders using a LDA model, with higher level of *RUNX3* transcript and lower levels of *TEC*, *PTPN22*, *ABL1*, and *CEBPA* being the most frequent discriminators in repeated cross-validations (Fig 3C).



Fig 2. Higher prostaglandin-endoperoxide synthase 1 (*PTGS1*) transcript levels are associated with primary imatinib resistance in two different data sets. (A) Comparison of median-normalized *PTGS1* transcript levels in total WBCs from the first set of newly diagnosed imatinib-naïve chronic myelogenous leukemia (CML) samples that showed optimal imatinib response (opt), suboptimal imatinib response (subopt) or imatinib failure/resistance (resist), as assessed at 1 year. (B, C) The contribution of each of 21 test genes to prediction accuracy of imatinib response at 1 year among the first set of 68 newly diagnosed patients was determined by linear discriminant analysis (LDA). Plotted are the results of 500 three-fold cross validations with each box demonstrating the distribution of the prediction accuracies including increasing numbers of genes. Accuracies of prediction by LDA in randomly chosen (B) training sets and (C) test sets. Accuracy for the test sets decline with inclusion of more than one gene, with *PTGS1* identified as the predictor gene in 481 (96%) of 500 simulations. (D) Comparison of *GUSB*-normalized *PTGS1* transcript levels in total WBCs from a different set of 68 newly diagnosed imatinib-naïve CML samples. *PTGS1* transcript levels are again higher in the imatinib resistant/failure group (resist), as assessed at 1 year (*P* = .008, *t*-test). (A-D) Box and whisker plots to demonstrate data distributions. For all figures, the boxes show the interquartile range (IQR) with bar in box indicating median values. Values with whiskers indicate a range of 1.5 times of IQR, with circles representing outliers.

Table 3. Genes Differentiating Secondary Imatinib Resistance From Newly Diagnosed CML With Imatinib Response						
	Median Normalized					
Gene	CML With Secondary Imatinib Resistance (n = 23)	CML With Imatinib Response (n = 48)	<i>t</i> -test P	<i>t</i> -test <i>P</i> (adjusted)		
TEC	0.207	0.588	< .001	< .001		
ABL1	0.864	1.437	< .001	< .001		
PTPN22	4.733	14.450	< .001	< .001		
CEBPA	0.658	1.592	< .001	< .001		
RUNX3	1.662	0.683	< .001	< .001		
LYN	18.375	53.190	< .001	< .001		
BTK	1.325	2.104	< .001	< .001		
JAK2	1.648	2.734	< .001	< .001		
CD34	0.012	0.177	< .001	< .001		
STAT5A	1.643	1.000	< .001	< .001		
ABCB1	0.206	0.045	< .001	< .001		
ABCC1	0.884	0.473	< .001	< .001		
CSF2	0.002	0.001	.0252	.2015		
PTGS1	0.599	0.378	.0097	.087		
SLC22A1	0.328	0.175	.0365	.2554		
FZD7	0.022	0.029	.1548	.5621		
SLC22A3	0.000	0.000	.0685	.4111		
STAT3	6.229	6.592	.093	.465		
RUNX1	3.567	3.546	.1405	.5621		
STAT5B	2.828	2.532	.7363	1		
ABCG2	0.007	0.007	.9292	1		
Abbreviation: CML, chronic myelogenous leukemia.						

Similarly, a multivariate comparison of primary and secondary resistant samples identified multiple genes that distinguished these samples (not shown). We interpret these findings to indicate that secondary TKI-resistance is more complex and multifactorial than primary resistance, with some factors (eg, decreased expression of *LYN*, *JAK2*, *PTPN22*, and *CEBPA*) that are associated with secondary TKI resistance being common to blast phase transformation.

DISCUSSION

Using a limited panel of genes selected based on prior studies of imatinib resistance and CML progression, we present a transcript profiling approach to simultaneously distinguish all phases of CML and predict primary TKI resistance and secondary TKI resistance in patients without detectable *KD* mutation. We included genes that were identified as the most differentially expressed genes in a prior microarray study of primary imatinib resistance (eg, *FZD7*, *PTNP22*, and *PTGS1*),²⁴ or implicated in differential handling of imatinib (ABC transporter genes, and the OCT family of transporters), or repeatedly identified in studies of CML resistance. This approach provided a rapid route to clinical assay development that validates genes identified as discriminants in previous studies while assessing their interactions and ability to provide additional utility in subclassification and prognostication.

Using unsorted WBCs, this transcript panel could separate nearly all cases of CP CML from lymphoid and myeloid BP and most cases of imatinib-responsive from imatinib-resistant CML in an unsupervised clustering algorithm, validating the relevance of these previously implicated genes. In newly diagnosed CML, we identified a strong differentially increased expression of *PTGS1* in imatinib-resistant patients; a finding that was confirmed in a second test set of 68 patients. *PTGS1* has been previously shown to be upregulated in imatinib-resistant diagnostic CML samples,²⁴ imatinib-resistant CML cell lines,²⁸ and to be transcriptionally upregulated by BCR-ABL itself in vitro.²⁹ Using cross-validation multivariate analysis, we show that this single gene provides nearly all of the predictive power for primary resistance in our test gene set.

While ATP binding–cassette type drug transporters did not significantly correlate with primary resistance, they were identified as discriminators of secondary resistance and as markers of blast phase. *ABCB1 (MDR-1*; P-glycoprotein) and *ABCG2* are known to be highly expressed on primitive hematopoietic stem cells and have been shown to mediate drug resistance in many settings, including for TKI.³⁰



Fig 3. Multiple genes distinguish imatinib responsive from secondary imatinib-resistant chronic myelogenous leukemia (CML). The contribution of the 21 test genes to accurately distinguishing *ABL1 KD*-unmutated secondary resistant *CML-CP/AP* from imatinib responsive baseline *CML-CP/AP* samples was determined by LDA. The prediction accuracies were estimated using randomly chosen test and training sets in 500 three-fold cross-validations are shown in (A) for training sets and in (B) for test set. The median accuracy of a model for discriminating imatinib response from secondary imatinib resistance improves by inclusion of up to 11 genes. The symbols in this Figure are as in Figures 2B and 2C. (C) The frequency of particular genes identified in these increasing gene model are shown on a bar plot, with overall frequency in all models represented by color (red to white). Prostaglandin-endoperoxide synthase (*PTGS1*) is not identified commonly in the models as a discriminator of secondary imatinib resistance.

Transcript levels of *ABCG1* have also been associated with TKI resistance in vitro³¹ and in modeling studies.³² We show that increased *ABCB1* levels were highly correlated with secondary resistance, with statistically significantly increased levels of *ABCG2* also noted in blast phase. These associations are similar to what has been noted in sorted blasts populations,¹⁵ and suggest that transcript profiling of RNA from unsorted leukocytes can be used routinely in place of sorted material.

The solute carrier (SLC) family 22 cation drug transporters have been more specifically associated with imatinib handling. Using cell line models, activity of the *OCT1/SLC22A1* transporter has been shown to mediate resistance in vitro to imatinib, and was correlated with clinical response.^{4,5} Differential binding and handling of other TKIs, such as dasatinib, by *OCT1* has also been shown. Since dasatinib and nilotinib have been widely used in patients who are resistance or intolerant to imatinib, it has been suggested that profiling of the SLC22 family of transporters may be useful in selecting initial therapy in CML.^{5,33} However, we did not note strong correlations of *OCT I/SLC22A1* or *OCT3/SLC22A3* transcript levels with imatinib resistance indicating that in vitro drug activity assays are not directly correlative with expression of the genes in primary samples. *OCT1* transcript levels were noted to be decreased in blast phase disease.

We also examined whether primary or secondary imatinib resistance may be related to increased expression of genes which have been previously associated with blast transformation in CML. To attempt to isolate the factors associated with secondary resistance independent of ineffective blockade of BCR-ABL kinase activity, we included CML-CP/AP patients who lacked detectable *ABL KD* mutations at time of TKI shift. We identified increased expression of the transcription factors *STAT5A* and *RUNX3* as significantly correlated with such secondary resistance as compared to newly diagnosed patients, although such increased expression was at odds with their role as tumor suppressors in blast transformation.²³ Features of such secondary imatinib resistance that were shared with blast transformation included decreased expression of the kinases *LYN* and *JAK2*, the phosphatase *PTPN22*, and the transcription factor *CEBPA*. These findings

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AUTHORS' DISCLOSURES OF POTENTIAL CONFLICTS OF INTEREST

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