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Ancestry and Pharmacogenomics of Relapse in Acute Lymphoblastic Leukemia

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Although five-year survival rates for childhood acute lymphoblastic leukemia (ALL) are now over 80% in most industrialized countries¹, not all children have benefited equally from this progress². Ethnic differences in survival after childhood ALL have been reported in many clinical studies³⁻¹¹, with poorer survival observed among African Americans or those with Hispanic ethnicity when compared with European American or Asian patients³⁻⁵. The causes of ethnic differences remain uncertain, although both genetic and non-genetic factors are likely important^{4,12}. Interrogating genome-wide germline SNP genotypes in an unselected large cohort of children with ALL, we observed that the component of genomic variation that co-segregated with Native American ancestry was associated with the risk of relapse ($P=0.0029$), even after adjusting for known prognostic factors ($P=0.017$). Ancestry-related differences in relapse risk were abrogated by the addition of a single extra phase of chemotherapy, indicating that modifications to therapy can mitigate ancestry-related risk of relapse.

After applying quality control measures (Supplementary Note), we analyzed 444,044 germline genetic single nucleotide polymorphisms (SNPs) in an ethnically diverse group of 2,534 children with ALL. To summarize genetic variation, we applied principal component analysis (PCA) to genotypes of 2,849 individuals, including 2534 patients with ALL, plus 210 HapMap samples from descendants of Northern Europeans (CEU, $N=60$), West Africans (YRI, $N=60$), East Asians (CHB, $N=45$; JPT, $N=45$), and 105 Native American (NA)¹³ reference groups (Fig. 1). The top ranked principal component (PC1) separated self-reported black patients ($N=250$) and the YRI HapMap samples from all other groups (Fig. 1A); PC2 separated self-reported Asian patients ($N=76$) and the CHB/JPT HapMap samples from non-Asian populations (Fig. 1B). PC3 primarily captured genetic variation characteristic of NA ancestry, and self-reported Hispanics ($N=405$) exhibited a cline in PC3 between NA reference populations and other ancestral groups (Fig. 1C), consistent with the extensive ancestral admixture in Hispanics. Because the components of genomic variation (e.g. PCs) clearly co-segregated with geographic ancestries, we applied STRUCTURE¹⁴ to quantitatively determine ancestral composition of children with ALL. Patients encompassed a wide array of self-declared ethnic groups (Table 1) and we observed substantial variability in the ancestral genetic background of this unselected group of 2,534 children (Fig. 2A and Table 2).

We tested whether genetic ancestry itself was associated with treatment outcome, after stratifying for treatment protocols, and found that the cumulative incidence of relapse was significantly associated with higher NA ancestry, treated as a continuous variable (Fig. 2B, $P=0.0029$, $N=2,534$, Supplementary Table S1). NA ancestry was also negatively associated with event-free survival ($P=0.018$). Within patients self-reporting as whites, there was a trend for higher NA ancestry to be related to a higher risk of ALL relapse (Fig. 2C, $P=0.08$, $N=1,687$). In a multivariate analysis adjusting for known risk factors for relapse (e.g. leukocyte count [\geq or $<50,000/\mu\text{l}$], age [\geq or <10 years], ALL lineage and molecular ALL subtypes [T or B-cell ALL, presence or absence of *MLL* rearrangements, *ETV6-RUNX1*, *TCF3-PBX1*, and *BCR-ABL*], DNA index [\geq or <1.16], and minimal residual disease [MRD, \geq or $<0.01\%$]), NA ancestry remained prognostic ($P=0.017$ when NA ancestry was treated as continuous variable [Table 3]). To dichotomize NA ancestry in a manner similar to the dichotomization used for other ALL prognostic features such as leukocyte count, we divided patients into those with low ($<10\%$) vs high ($\geq 10\%$) NA ancestry (see Supplementary Fig. S1 and Supplementary Note for details), and NA ancestry remained associated with relapse ($P=3.6 \times 10^{-4}$, Supplementary Table S2) in the context of other dichotomized prognostic features. The same multivariate analysis that include self-declared Hispanic ethnicity instead of NA ancestry also showed Hispanic ethnicity associated with relapse risk ($P=3.4 \times 10^{-3}$, Supplementary Table S2). Unfavorable clinical features were not associated with NA genetic ancestry (Table 1). An important clinical indicator of relapse risk in ALL is the early

response to therapy, determined by the level of MRD at the end of remission induction therapy. Even within the group of patients with negative MRD status, higher NA genetic ancestry was linked to a higher risk of relapse ($P=0.08$ when NA ancestry was treated as a continuous variable, $P=0.006$ for dichotomous NA ancestry [\geq or $<10\%$], $N=1,834$, Supplementary Fig. S2). This is of clinical relevance, in that identifying a subgroup of patients who may need more intensive therapy despite negative MRD (good response to initial therapy) would provide additional prognostic information.

Notably, the prognostic impact of NA ancestry varied dependent upon specific treatment regimens. In the Children's Oncology Group (COG) P9904/P9905 study, patients were either randomized or non-randomly assigned to receive or not to receive a delayed intensification phase (i.e. an 8-week multi-agent treatment, Supplementary Table S3). Higher NA ancestry was associated with higher relapse risk in children who did not receive delayed intensification ($P=0.015$, $N=938$, Fig. 2D), but not in those who did receive this phase of therapy ($P=0.73$, $N=667$, Fig. 2E). Similar results were observed when NA ancestry was dichotomized as a prognostic feature (\geq or $<10\%$): $P=0.0016$ for those who did not receive the delayed intensification and $P=0.51$ for those who received the delayed intensification.

Delayed intensification consists of 8 weeks of chemotherapy involving 7 widely-used anticancer drugs: dexamethasone, vincristine, daunorubicin, asparaginase, thioguanine, cyclophosphamide, and cytarabine. For patients at lower risk of relapse, there has been some controversy as to whether the increased intensity of this phase of therapy (and its attendant slightly increased risk of complications such as infection¹⁵) is worth the benefit of lower relapse rates, which have been observed in most but not all settings¹⁶⁻¹⁸. Delayed intensification is relatively well-tolerated; it has been associated with an extra 5 days of hospitalization for its attendant toxicity (out of a total of ~ 134 weeks of ALL therapy)¹⁹. Thus, the benefits of delayed intensification are likely to outweigh the costs among the subset of patients with $\geq 10\%$ NA ancestry, exemplifying the importance and possibility of individualizing ALL therapy on the basis of genetic variation. Additional insights will be gained from clinical trials to examine the therapeutic efficacy of various phases of therapy (delayed intensification and other phases), set in the context of other therapeutic regimens, in patients with high versus low % NA ancestry.

To further illustrate the evidence for the association between ancestry and relapse, we examined local NA ancestry across the genome for association with ALL relapse, using admixture mapping²⁰. Of 3,682 genomic segments with unique NA ancestry status, local NA ancestry at several loci was associated with relapse, with a locus at 2p25.3 (rs17039396) exhibiting the strongest association between local NA ancestry and relapse (nominal $P=3.2\times 10^{-7}$, genome-wide threshold for significance is $P=1.4\times 10^{-5}$ based on 3,682 independent loci tested, Supplementary Note and Supplementary Fig. S3). Likewise, admixture mapping using a previously published admixture map for US Hispanics¹³ also identified 2p25.3 as having genome-wide significance for association with relapse (nominal $P=1.1\times 10^{-6}$, genome-wide threshold is $P=2.4\times 10^{-5}$, Supplementary Fig. S3).

To explore the mechanisms by which ancestry may affect ALL relapse risk, we also examined which individual SNP genotypes were significantly associated with relapse risk, with the phenotype defined as "any" relapse (hematologic plus extramedullary) as well as more narrowly defined as the most common (and deadly) form of relapse, hematologic relapse. A SNP in *PDE4B* (rs6683977) was the highest-ranked SNP associated with hematologic relapse ($P=2.2\times 10^{-6}$), and also associated with any relapse risk (Supplementary Fig. S4 and S5), and admixture mapping indicated that local NA ancestry at 1p32.2-31.3 that encompassed SNPs in *PDE4B* (including rs6683977) exhibited a significant association

signal ($P=3.2\times 10^{-6}$ for that locus, P value threshold for genome-wide significance= 1.4×10^{-5} , Supplementary Note and Supplementary Fig. S3). Interestingly, primary ALL cells expressing higher levels of *PDE4B* were also more resistant to prednisolone (Supplementary Fig. S6), indicating that *PDE4B* might play a role in glucocorticoid response in ALL.

The association we observed between genomically-defined NA ancestry and relapse is consistent with higher ALL relapse risk among Hispanics³⁻⁵. The high risk of relapse associated with NA ancestry was not explained by an association of NA ancestry with known ALL relapse risk factors (Tables 1 and 3). The association was similar when we confined the analysis to self-declared whites (Fig. 2C), which is consistent with a genetic (rather than cultural or environmental) basis for the elevated risk of leukemia relapse in Hispanics. However, we cannot exclude the possibility that environmental, sociocultural, or dietary differences that are associated with NA ancestry also or even primarily influenced relapse risk.

Although current risk classification schemes identify children with more aggressive ALL, a substantial portion of patients are not cured with contemporary chemotherapy, and a substantial portion of patients who ultimately relapse are considered at “low risk” for relapse or do not exhibit MRD^{21,22}. For these reasons, it was interesting that NA ancestry identified a group of patients who benefited by the use of an extra phase of chemotherapy (delayed intensification, Fig. 2D and E), and there was a trend for prognostic importance of NA ancestry even within the group exhibiting negative MRD (Supplementary Fig. S2), indicating that germline genomic variation may add prognostic value to current ALL risk stratification schema.

There are likely many mechanisms by which ancestry-related germline polymorphisms could affect drug response: our data illustrate that ancestry-related genomic variation could affect the probability of cure in part by affecting drug resistance. However, all such outcomes (and therefore the identification of genetic prognostic features) are also dependent upon therapy. Our data illustrate that giving additional chemotherapy can overcome the negative prognostic impact conferred by a set of ancestry-related polymorphisms, and thereby mitigate ethnic disparities in outcome of childhood ALL.

Methods

Patients and treatment

Included in this study were all 2,534 children with newly diagnosed ALL treated on St. Jude Children’s Research Hospital (St. Jude) Total Therapy XIII^B²³ or XV (N=707)²⁴, the Children’s Oncology Group (COG) P9906 (N=222)²², or COG P9904/P9905 clinical trials (N=1,605)²² who had successfully-genotyped germline DNA (Supplementary Note). None of the children received any ALL treatment prior to enrollment on these clinical trials. The studies were approved by the Institutional Review Boards and informed consent was obtained from the parents, guardians, or patients, as appropriate. Risk-directed treatment was described previously for St. Jude^{23,24} and COG²² trials (Supplementary Table S3). Minimal residual disease (MRD) was determined in bone marrow at the end of remission induction therapy^{22,25}.

Genotyping

Genotyping was performed using the Affymetrix GeneChip Human Mapping 500K Array sets or the Genome-Wide Human SNP Array 6.0; a subset of genotypes was validated using Illumina GoldenGate assays (see Supplementary Note). Genotypes were coded as 0, 1, 2 for AA, AB, BB genotypes. Genotype calling and quality control were performed as

described²⁶ (Supplementary Note). The final analyses included 444,044 SNPs in 2,534 patients.

Race/ethnicity and ancestry

Self-reported race/ethnicity was designated in mutually exclusive categories of white, black, Hispanic, or Asian based on criteria in place for the original clinical trials (Table 1). An individual designated as self-reported Hispanic was considered in the Hispanic race/ethnicity category regardless of his or her racial background (which was usually not noted). Remaining patients included Native American/Native Alaskans, Native Hawaiian/Pacific Islanders, and individuals for whom race/ethnicity was not noted, or reported as “other.”

Population structure was determined using EIGENSTRAT²⁷ and was compared with geographic ancestral reference populations (HapMap samples from descendants of Northern Europeans, West Africans, East Asians, and NA¹³). We also estimated ancestral composition using STRUCTURE¹⁴ (version 2.2.3) on the basis of the genotypes at 30,000 SNPs (Supplementary Note and Supplementary Table S4). European, African, Asian, and Native American genetic ancestries were assumed to sum to 100% in each patient.

Association between genetic variation and risk of relapse

Relapse was defined as bone marrow relapse and/or extramedullary relapse. Lineage switch, second malignancy, and death during remission were incorporated as competing events. We evaluated associations between genetic ancestries (as a continuous variable, with each ancestry varying from 0 to 100%) and the risk of relapse using the Fine and Gray's regression model²⁸ and stratifying by 9 risk-adapted treatment arms: St. Jude Total XIIIB low risk²³, St. Jude Total XIIIB high risk²³, St. Jude Total XV low risk²⁴, St. Jude Total XV standard/high risk²⁴, COG P9906, and COG P9904/9905 regimens A, B, C, and D (Supplementary Table S3)²². When noted, NA ancestry was also analyzed as a dichotomous variable (i.e. \geq or $<$ 10%). The basis of the dichotomization is described in detail in the Supplementary Note. A threshold of 10% was the antimode that discriminated 2 major modes in the US ALL population (Supplementary Fig. S1)²⁹, and approximately the same 10% value maximally differentiated relapse risk (see Supplementary Note). In multivariate analyses, known risk factors (leukocyte count [\geq or $<$ 50,000/ μ l], age [\geq or $<$ 10 years], ALL lineage and molecular ALL subtypes [T-cell ALL, *MLL* rearrangements, *ETV6-RUNX1*, *TCF3-PBX1*, *BCR-ABL*, or other B-lineage ALL], DNA index [\geq or $<$ 1.16], and MRD [\geq or $<$ 0.01%]) were included together with genetic ancestries. When evaluating the association between genotypes at individual germline SNPs and the risk of relapse, we adjusted for treatment arms and also included genetic ancestry as covariates to account for population stratification (Supplementary Note).

Spearman rank correlation test was used to determine the relationships between MRD (classified as negative [$<$ 0.01%] or positive [\geq 0.01%]) and genetic variation (genetic ancestry or genotypes at individual SNPs), as previously described²⁶.

Statistical and computational analyses were performed using S-Plus software, version 7.0 (Insightful Corp, Seattle, WA), R version 2.6.1 (www.r-project.org), and SAS software, version 9.1 (SAS Institute Inc, Cary, NC).

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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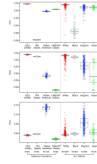


Figure 1. Principal Component Analysis of Genome-wide Germline SNP Genotypes in Children with ALL

Comparison of the top 3 axes of variation (PCs) among patients with ALL of different self-reported races/ethnicities and among different reference populations (CEU, N=60; YRI, N=60; CHB/JPT, N=90 samples from the HapMap and 105 Native American samples). Descriptions on X-axes represent self-declared designations. Boxes include data between the 25th and the 75th percentiles. Note that the first (PC1, Panel A), second (PC2, Panel B), and third axis (PC3, Panel C) reflect genetic variation characteristic of African, East Asian, and Native American ancestry, respectively. Also note that self-reported Asians consisted of both South Asians and East Asians (top and bottom cluster of far right bar in Panel B, respectively), with varying levels of East Asian genetic ancestry.

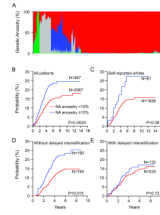


Figure 2. Genetic Ancestry and Risk of Relapse in Childhood ALL

A. Genetic ancestral composition of 2,534 children with ALL. Each patient's ancestry is depicted as a column, whereas color represents the proportion of ancestry estimated for that patient (European, red; African, gray; Asian, green; Native American [NA], blue). Genetic ancestry was estimated using STRUCTURE. Patients were clustered using Ward clustering method, based on dissimilarity in genetic ancestry measured by 1-minus pair-wise correlation (see Supplementary Note). Higher levels of NA ancestry were linked to increased risk of relapse in all patients (B), and within the self-reported whites (C), and for those who did not receive delayed intensification (D), but not within those who did receive delayed intensification in the COG P9904/9905 trial (E). Although cumulative incidence of relapse is plotted separately for patients with <10% (red) vs $\geq 10\%$ (blue) NA ancestry, all P values were estimated using Fine and Gray's cumulative incidence hazard regression model treating NA ancestry as a continuous variable (see Supplementary Note for details on NA ancestry dichotomization).

Table 1

Patient Characteristics^a

Characteristics	Clinical Trials			P Value for Relation to Native American Ancestry ^c
	St. Jude Total Therapy XIIIIB and XV (N=707)	COG P9906 (N=222)	COG P9904/9905 (N=1,605)	
Self-reported race/ethnicity ^b				<0.0001
White	493 (69.7)	131 (59)	1063 (66.2)	1.4 ± 5.2
Black	118 (16.7)	15 (6.8)	117 (7.3)	0.9 ± 2.0
Hispanic	67 (9.5)	52 (23.4)	286 (17.8)	40.8 ± 20.6
Asian	10 (1.4)	10 (4.5)	56 (3.5)	2.9 ± 6.0
Others	19 (2.7)	14 (6.3)	83 (5.2)	15.5 ± 25.2
Gender				0.15
Male	397 (56.2)	150 (67.6)	825 (51.4)	7.7 ± 17.1
Female	310 (43.8)	72 (32.4)	780 (48.6)	9.0 ± 18.9
Age at diagnosis (years)				0.17
<10	514 (72.7)	76 (34.2)	1407 (87.7)	8.5 ± 18.8
≥10	193 (27.3)	146 (65.8)	198 (12.3)	7.7 ± 16.7
Leukoocyte count at diagnosis, /ul				0.23
<50,000	527 (74.5)	123 (55.4)	1453 (90.5)	8.0 ± 17.6
≥50,000	180 (25.5)	99 (44.6)	152 (9.5)	9.8 ± 19.4
CNS status ^d				0.59
CNS1	485 (68.6)	169 (76.1)	1469 (91.5)	8.8 ± 17.6
CNS2	164 (23.2)	25 (11.3)	135 (8.4)	9.8 ± 19.6
CNS3 or traumatic puncture	58 (8.2)	28 (12.6)	0 (0)	9.9 ± 20.3
Missing	0 (0)	0 (0)	1 (0.1)	0.43
Lineage and molecular subtype of ALL ^e				3 × 10 ^{-4e}
<i>BCR-ABL</i>	14 (2)	0 (0)	0 (0)	1.7 ± 4.9
<i>TCF3-PBX1</i>	36 (5.1)	24 (10.8)	65 (4)	12.4 ± 22.2
<i>MLL</i> rearrangements	9 (1.3)	20 (9)	0 (0)	10.3 ± 19.4

Characteristics	Clinical Trials			Native American Ancestry (average % ± standard deviation)	P Value for Relation to Native American Ancestry ^c
	St. Jude Total Therapy XIII ^b and XV (N=707)	COG P9906 (N=222)	COG P9904/9905 (N=1,605)		
<i>ETV6-RUNX1</i>	127 (18)	2 (0.9)	454 (28.3)	7.3 ± 16.9	
T-cell	109 (15.4)	0 (0)	0 (0)	3.6 ± 11.9	
B-other	412 (58.3)	176 (79.3)	1086 (67.7)	8.7 ± 18.3	
DNA index ^f					0.25
<1.16	538 (76.1)	204 (91.9)	1055 (65.7)	8.8 ± 17.9	
≥1.16	166 (23.5)	14 (6.3)	502 (31.3)	7.7 ± 17.2	
Missing	3 (0.4)	4 (1.8)	48 (3)	15.7 ± 25.2	
End-of-induction MRD ^g					0.46
<0.01%	477 (67.5)	137 (61.7)	1220 (76)	8.3 ± 17.9	
≥0.01% & <1%	102 (14.4)	45 (20.3)	226 (14.1)	9.2 ± 19.2	
≥1%	26 (3.7)	21 (9.5)	34 (2.1)	11.5 ± 22.1	
Missing	102 (14.4)	19 (8.6)	125 (7.8)	6.3 ± 14.6	

Abbreviations: MRD, minimal residual disease; CNS, central nervous system; COG, Children's Oncology Group

^aData are presented as number (%) of patients unless otherwise indicated.

^bSelf-reported race was assigned based on clinical trial databases, as described in Methods.

^cAssociations with Native American ancestry (as a continuous variable) were assessed by Wilcoxon test for all features.

^dCNS status indicates the level of leukemia penetration into the CNS, and a higher grade (e.g., CNS3) is usually associated with poor prognosis.

^eA lower percentage of NA ancestry was noted in patients with *BCR-ABL* or T-cell ALL, likely because these subtypes were excluded from the COG studies and there were differing demographics between St. Jude and COG cohorts.

^fDNA index represents the ratio of DNA content of leukemia sample/diploid human normal control, an indicator of aneuploidy in tumor. DNA index of ≥1.16 is associated with hyperdiploidy of >50 chromosomes in ALL blasts.

^gMRD was determined at day 29 in COG and day 46 in St. Jude.

Table 2

Average Genetic Ancestry by Self-reported Designations

	Genetic Ancestry ^a			
	% European	% African	% Asian	% Native American
Self-reported White (N =1,687)	96.7%	0.9%	1.0%	1.4%
Self-reported Black (N=250)	19.3%	79.0%	0.8%	0.9%
Self-reported Hispanic (N=405)	51.6%	6.1%	1.5%	40.8%
Self-reported Asian (N=76)	32.3%	1.0%	63.8%	2.9%
Other (N=116)	55.8%	9.4%	19.3%	15.5%

^aGenetic ancestry was estimated using STRUCTURE, as described in Supplementary Note.

Table 3

Multivariate Analysis for Risk of ALL Relapse

Patient Characteristics	P Value ^a	Hazard Ratio ^b (95% CI)
MRD Positive	<×10 ⁻⁶	3.73 (2.98, 4.68)
Leukocyte count at diagnosis (≥50,000/ul)	6.00×10 ⁻⁶	1.93 (1.45, 2.57)
DNA Index (≥1.16)	2.58×10 ⁻⁴	0.59 (0.45, 0.79)
Native American ancestry	0.017	1.84 (1.12, 3.04)
Age at diagnosis (≥10 years)	0.010	1.39 (1.08, 1.78)
<i>ETV6-RUNX1</i> ^c	0.012	0.67 (0.49, 0.91)
T-cell lineage ^c	0.146	0.67 (0.40, 1.15)
<i>BCR-ABL</i> ^c	0.454	1.48 (0.53, 4.12)
<i>TCF3-PBX1</i> ^c	0.793	0.93 (0.53, 1.63)
<i>MLL</i> rearrangements ^c	0.935	0.96 (0.41, 2.25)

Abbreviations: MRD: minimal residual disease; CI: confidence interval

^a Associations with risk of relapse (any relapse) were assessed using the Fine and Gray's regression model.

^b Hazard ratio: the relative difference (increase or decrease) in risk of ALL relapse when the patient is positive for the clinical feature of interest (e.g., 1.84-fold increase in relapse risk for every 100% increase in NA ancestry).

^c Terms refer to cancer characteristics of the ALL cells that may have prognostic significance and are used to subdivide cases. All prognostic features are dichotomized for presence vs absence of the patient characteristic except for NA ancestry, which is treated as a continuous variable. Supplementary Table S2 includes identical multivariate analyses with dichotomized variables used for all variables, including ancestry.