



## King's Research Portal

DOI:

[10.1182/bloodadvances.2017009811](https://doi.org/10.1182/bloodadvances.2017009811)

*Document Version*

Publisher's PDF, also known as Version of record

[Link to publication record in King's Research Portal](#)

*Citation for published version (APA):*

Gardner, K., Fulford, T., Silver, N., Rooks, H., Angelis, N., Allman, M., Nkya, S., Makani, J., Howard, J., Kesse-Adu, R., Rees, D. C., Stuart-Smith, S., Yeghen, T., Awogbade, M., Sangeda, R. Z., Mgaya, J., Patel, H., Newhouse, S., Menzel, S., & Thein, S. L. (2018). g(HbF): a genetic model of fetal hemoglobin in sickle cell disease. *Blood Advances*, 2(3), 235-239. <https://doi.org/10.1182/bloodadvances.2017009811>

### **Citing this paper**

Please note that where the full-text provided on King's Research Portal is the Author Accepted Manuscript or Post-Print version this may differ from the final Published version. If citing, it is advised that you check and use the publisher's definitive version for pagination, volume/issue, and date of publication details. And where the final published version is provided on the Research Portal, if citing you are again advised to check the publisher's website for any subsequent corrections.

### **General rights**

Copyright and moral rights for the publications made accessible in the Research Portal are retained by the authors and/or other copyright owners and it is a condition of accessing publications that users recognize and abide by the legal requirements associated with these rights.

- Users may download and print one copy of any publication from the Research Portal for the purpose of private study or research.
- You may not further distribute the material or use it for any profit-making activity or commercial gain
- You may freely distribute the URL identifying the publication in the Research Portal

### **Take down policy**

If you believe that this document breaches copyright please contact [librarypure@kcl.ac.uk](mailto:librarypure@kcl.ac.uk) providing details, and we will remove access to the work immediately and investigate your claim.

## *g(HbF)*: a genetic model of fetal hemoglobin in sickle cell disease

Kate Gardner,<sup>1,2</sup> Tony Fulford,<sup>3</sup> Nicholas Silver,<sup>1</sup> Helen Rooks,<sup>1</sup> Nikolaos Angelis,<sup>1</sup> Marlene Allman,<sup>2</sup> Siana Nkya,<sup>4</sup> Julie Makani,<sup>4</sup> Jo Howard,<sup>5</sup> Rachel Kesse-Adu,<sup>5</sup> David C. Rees,<sup>1,2</sup> Sara Stuart-Smith,<sup>2,6</sup> Tullie Yeghen,<sup>7</sup> Moji Awogbade,<sup>2</sup> Raphael Z. Sangeda,<sup>4</sup> Josephine Mgaya,<sup>4</sup> Hamel Patel,<sup>8,9</sup> Stephen Newhouse,<sup>8-10</sup> Stephan Menzel,<sup>1,\*</sup> and Swee Lay Thein<sup>1,2,\*</sup>

<sup>1</sup>School of Cancer & Pharmaceutical Sciences, King's College London, London, United Kingdom; <sup>2</sup>King's College Hospital National Health Service (NHS) Foundation Trust, London, United Kingdom; <sup>3</sup>Behavioural Ecology, Department of Zoology, University of Cambridge, Cambridge, United Kingdom; <sup>4</sup>Muhimbili University of Health and Allied Sciences, Dar es Salaam, Tanzania; <sup>5</sup>Department of Haematology, Guy's and St Thomas' Hospitals NHS Foundation Trust, London, United Kingdom; <sup>6</sup>Queen Elizabeth Hospital and <sup>7</sup>University Hospital Lewisham, Lewisham and Greenwich NHS Trust, London, United Kingdom; <sup>8</sup>Department of Biostatistics and Health Informatics, Institute of Psychiatry, Psychology, and Neuroscience, King's College London, London, United Kingdom; <sup>9</sup>National Institute for Health Research Biomedical Research Centre at South London and Maudsley NHS Foundation Trust and King's College, London, United Kingdom; and <sup>10</sup>Farr Institute of Health Informatics Research, UCL Institute of Health Informatics, University College London, London, United Kingdom

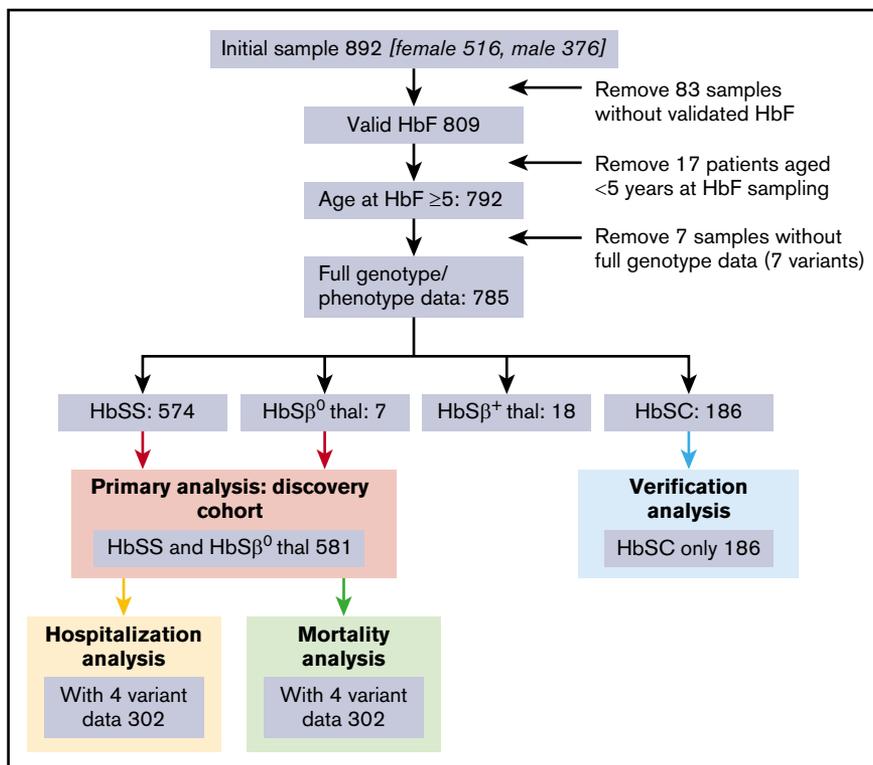
### Key Points

- The 3 established HbF genetic loci can be summarized into 1 quantitative variable, *g(HbF)*, in SCD and influence markers of SCD severity.
- *g(HbF)* provides a quantitative marker for the genetic component of HbF% variability, potentially useful in genetic and clinical studies in SCD.

Fetal hemoglobin (HbF) is a strong modifier of sickle cell disease (SCD) severity and is associated with 3 common genetic loci. Quantifying the genetic effects of the 3 loci would specifically address the benefits of HbF increases in patients. Here, we have applied statistical methods using the most representative variants: *rs1427407* and *rs6545816* in *BCL11A*, *rs66650371* (3-bp deletion) and *rs9376090* in *HMIP-2A*, *rs9494142* and *rs9494145* in *HMIP-2B*, and *rs7482144* (*Xmn1-HBG2* in the  $\beta$ -globin locus) to create *g(HbF)*, a genetic quantitative variable for HbF in SCD. Only patients aged  $\geq 5$  years with complete genotype and HbF data were studied. Five hundred eighty-one patients with hemoglobin SS (HbSS) or HbS $\beta^0$  thalassemia formed the “discovery” cohort. Multiple linear regression modeling rationalized the 7 variants down to 4 markers (*rs6545816*, *rs1427407*, *rs66650371*, and *rs7482144*) each *independently* contributing HbF-boosting alleles, together accounting for 21.8% of HbF variability ( $r^2$ ) in the HbSS or HbS $\beta^0$  patients. The model was replicated with consistent  $r^2$  in 2 different cohorts: 27.5% in HbSC patients (N = 186) and 23% in 994 Tanzanian HbSS patients. *g(HbF)*, our 4-variant model, provides a robust approach to account for the genetic component of HbF in SCD and is of potential utility in sickle genetic and clinical studies.

### Introduction

High fetal hemoglobin (HbF) levels are clinically beneficial in sickle cell disease (SCD), being associated with longer survival<sup>1</sup> and lower pain rates.<sup>2</sup> Patients with SCD have higher HbF levels compared with nonaffected adults and, within SCD, HbF levels are higher in hemoglobin SS (HbSS) compared with HbSC individuals.<sup>3</sup> One component of HbF variability relates to the expanded erythron secondary to chronic hemolysis, and preferential survival of HbF-containing red cell precursors (F cells).<sup>4,5</sup> A second component is the innate ability for HbF synthesis based on genetic variants at 3 quantitative trait loci: *BCL11A* on chromosome 2p, *HMIP-2* on chromosome 6q, and *Xmn1-HBG2* (*rs7482144*) on chromosome 11p. Dependent upon the genetic variants investigated and analysis performed, such variants were found to account for between 8 and  $\sim 20\%$  of the HbF variability in SCD in studies from the United Kingdom, United States, Brazil, Tanzania, and Cameroon.<sup>6-13</sup> This genetic component is likely to account for much of the variability in HbF levels in SCD patients. Consequently, it may be helpful to quantify and summarize the effects of the respective genetic loci into a single genetic variable to capture the essence of genetic disease alleviation through the HbF mechanism. Here, we present



**Figure 1.** Flow chart illustrating fate of the initial 892 samples.

such a genetic HbF summary variable,  $g(HbF)$ , which will be a useful parameter to use as a covariate in genetic, biological, and clinical studies in diverse SCD populations.

## Subjects and methods

British patients are part of the South East London sickle gene bank (King's College Hospital, Guys and St Thomas' Hospitals Trust, Lewisham Hospital, and Queen Elizabeth Hospital Woolwich). Written informed consent was obtained through 3 approved study protocols (LREC 01-083, 07/H0606/165, and 12/LO/1610) and research conducted in accordance with the Helsinki Declaration (1975, as revised 2008).

Eight hundred ninety-two patients consented to the study, of which 785 aged over 5 years had a full dataset (genotypes and phenotype). These 785 comprised 581 with HbSS or HbS $\beta^0$  (the "discovery cohort" used for the primary analysis), 186 HbSC (the "validation" cohort), and 18 HbS $\beta^+$  thalassemia (Figure 1). Additional validation was performed in the Muhimbili HbSS cohort, Tanzania (N = 994).<sup>10</sup>

## Genetic variants and genotyping

We assembled an initial set of 7 known (and widely replicated) HbF modifier variants, prioritizing those where additional functional evidence had been generated (Table 1): *BCL11A-rs1427407*<sup>14</sup> and *rs6545816*<sup>10</sup>; *HMIP-2A-rs66650371*<sup>15,16</sup> and *rs9376090*<sup>17</sup>; *HMIP-2B-rs9494145*<sup>17,18</sup> and *rs9494142*<sup>16</sup>; *Xmn1-HBG2-rs7482144*.<sup>6,19,20</sup>

A combination of 3 genotyping methodologies was used: (1) "manual" genotyping in the laboratory (all variants) by the TaqMan procedure, except rs66650371, which was assayed by capillary electrophoresis (Applied Biosystems, Foster City, CA), as previously described<sup>17</sup>; (2) a genome-wide chip (Illumina Infinium Multi-Ethnic

Genotyping Array); (3) imputation with public and in-house reference haplotypes (see supplemental Methods).

## Phenotypes

HbF% (measured by high-performance liquid chromatography; BioRad Variant II), no red cell transfusion for >3 months, off hydroxyurea for >3 months, and not pregnant, were retrospectively collected. For the 581 HbSS/HbS $\beta^0$  discovery set, median HbF was 4.5% (interquartile range: 1.9% to 8.8%) (supplemental Figure 1).

We estimated global disease severity using "hospitalization rate" as a measure of pain frequency, mortality, and laboratory results. Mean hospitalization rates were calculated for King's College Hospital adults over 10 years (2004-2013), dividing an individual's number of hematology admissions by the number of observed years. For the 302 patients with HbSS/HbS $\beta^0$ , median mean hospitalization rate was 0.25 per year (interquartile range: 0-0.71) (supplemental Figure 2). Mortality outcome was available for the 302 adults (1 January 2004 to 31 July 2015). Steady-state laboratory values (hemoglobin, white blood cells) over a 10-year period (2004-2013) were averaged for 278 patients.

## Building and validating the genetic model for HbF%

Genetic association between the 7 genetic variants (as normalized genotype scores) and HbF [ln(%HbF)] was investigated by linear regression (using STATA12) under an additive allelic model.

Manual linear regression modeling was carried out in the HbSS/HbS $\beta^0$  thalassemia "discovery group" (see supplemental Methods). We then validated the model,  $g(HbF)$ , in 2 replication groups: (1) our own HbSC subgroup (N = 186) and (2) a Tanzanian HbSS cohort (N = 994).<sup>10</sup>

**Table 1. Seven variants representing the 3 major HbF quantitative trait loci that were rationalized to a 4-variant model ( $g(HbF)$ ) to represent the genetic component of HbF in SCD**

Gene	Variant	HbF-boosting allele	Allele frequency		$g(HbF)$ model	
			London, United Kingdom	Dar es Salaam, Tanzania	Coefficient ( $\beta$ ) (95% confidence interval)	P
<i>BCL11A</i> (Chr 2)	<i>rs6545816</i> (A>C)	C	0.34	0.36	0.14 (0.08-0.19)	<.001
	<i>rs1427407</i> (G>T)	T	0.26	0.21	0.30 (0.26-0.35)	<.001
<i>HMIP</i> ( <i>HBSL1-MYB</i> intergenic polymorphism on Chr 6)						
2A	<i>rs9376090</i> (T>C)	C	0.01			
	<i>rs66650371</i> (TAC>—)	3bp del	0.04	0.02	0.13 (0.08-0.17)	<.001
2B	<i>rs9494142</i> (T>C)	C	0.05			
	<i>rs9494145</i> (T>C)	C	0.05			
<i>HBG2-Xmn1</i> ( $\beta$ -globin gene cluster on Chr 11)	<i>rs7482144</i> (G>A)	A	0.07	0.01	0.10 (0.05-0.15)	<.001

## Testing for association of $g(HbF)$ with clinical severity

Tests for genetic association of individual DNA variants with Ln(HbF%) were performed by linear regression (in STATA) with age (at sampling) and sex as covariates in an additive allelic model. Age was squared, as this was better correlated with outcome. See supplemental Methods.

## Results

Summary variables combining genotypes across HbF modifier loci have been found to be associated with clinical severity in  $\beta$ -thalassemia<sup>21</sup> and have also been explored in SCD.<sup>10,22-24</sup> To represent the relationship between genetic factors and HbF more accurately and to build a summary variable that is robust across diverse SCD cohorts, we used regression modeling of the effect of 7 known modifier variants (Table 1) on HbF levels in 581 SCD patients with HbSS and HbS $\beta^0$  genotypes. We targeted genetic variants at the 3 major HbF loci that have been widely replicated and implicated as causative genetic variants. Preliminary analysis using basic regression with age/sex only yielded a model with  $r^2 = 0.11$ . Adding  $\alpha$ -thalassemia (in a subset of patients, N = 273, with  $\alpha$ -globin status available) showed that  $\alpha$ -thalassemia was not associated with HbF levels in our cohort ( $r^2 = 0.11$  with  $\alpha$ -globin status,  $P = .23$  for  $\alpha$ -globin status). We therefore did not pursue using  $\alpha$ -globin status. Basic regression with the 7 genetic variants only produced a model with  $r^2 = 0.23$ . Putting age, sex, and the 7 genetic variants together in the model increased the  $r^2$  to 0.3167 (supplemental Figure 3). As age and sex are roughly orthogonal to the variants, our subsequent analyses did not control for age/sex.

Final regression analysis resulted in a model utilizing 4 variants: *rs1427407*, *rs6545816* (both *BCL11A*), *rs66650371* (*HMIP-2A*), and *rs7482144* (*Xmn1-HBG2*) (Table 1). *rs9376090*, *rs9494142*, or *rs9494145* (all at *HMIP-2*) did not improve the model and were considered redundant. Applying this model, the predicted Ln(HbF%),  $g(HbF)$ , would be calculated as  $g(HbF) = 1.89 + 0.14 \times rs6545816 + 0.3 \times rs1427407 + 0.13 \times rs66650371 + 0.1 \times rs7482144$  (genotype for each variant = 0, 1, or 2, according to the number of HbF-boosting alleles).

To calculate a genetically predicted HbF% (rather than Ln(HbF%)), the reader should antilog the  $g(HbF)$  formula. Nevertheless, the formula stated above should be used for generating the covariate for statistical analyses.

$g(HbF)$  underlies 22% ( $r^2 = 0.2178$ ,  $P < .0001$ ) of the variability in HbF levels in our discovery group, and confirming its robustness, 23% in the Muhimbili “replication group” (N = 994) and 27.5% in HbSC patients (Table 1). In HbSC disease, the comparatively large effect of  $g(HbF)$  is likely due to the less severe pathology and thus smaller influence of nongenetic factors.

HbF levels affect the severity of SCD; patients with higher levels of HbF have fewer complications and live longer.<sup>1,2</sup> We tested the influence of  $g(HbF)$  on hospitalization rate in HbSS/HbS $\beta^0$  patients and detected tentative association (N = 304,  $\beta = 0.47$ ,  $P = .031$ ), suggesting that a 2.7-fold increase in  $g(HbF)$  would result in a 38% decrease in hospitalization frequency. Nevertheless, the  $g(HbF)$  for frequently admitted patients was not significantly changed.  $g(HbF)$  was, however, associated with hemoglobin (N = 278,  $\beta = 17.871$ ,  $P < .001$ ). We found no association of  $g(HbF)$  with mortality or white blood cells.

## Discussion

Our cohort has potential power to investigate the influence of  $g(HbF)$  on global measures of disease severity. International collaboration, larger sample sizes, adding new loci as they are discovered, and development of the formula will be required to realize the utility of the  $g(HbF)$  variable. We saw no significant benefit for including the *HMIP-2B* locus<sup>17</sup> in  $g(HbF)$ . This will be revisited once the underlying functional variant has been identified.

We believe that estimating  $g(HbF)$ , or similar genetic summary variables, will add significant value to genetic and clinical studies, either to test the influence of genetic modifiers on outcomes or to act as a covariate to adjust for such effects. The comparatively larger value of  $g(HbF)$  for HbSC patients suggests that it is able to isolate the genetic component of HbF% from the component reactive to disease severity. Using a preset formula, such as the one proposed here, will be especially useful in smaller and medium-size cohorts or clinical trials, where de novo modeling is meaningless.

## Acknowledgments

The authors thank Clive Stringer (System Delivery Manager, King's College Hospital) for help in data extraction from electronic patient records. They also thank Charles Curtis and Sanghyuck Lee for their work processing the samples for the Illumina MEGA chip.

This work was supported by the Medical Research Council, United Kingdom G0001249 and ID62593 (S.L.T.) and a grant from Shire Pharmaceuticals (S.M. and S.L.T.). This work is also supported by the University College London Hospitals Biomedical Research Centre, and by awards establishing the Farr Institute of Health Informatics Research at UCL Partners, from the Medical Research Council, Arthritis Research UK, British Heart Foundation, Cancer Research UK, Chief Scientist Office, Economic and Social Research Council, Engineering and Physical Sciences Research Council, National Institute for Health Research, National Institute for Social Care and Health Research, and Wellcome Trust grant MR/K006584/1 (S. Newhouse).

## Authorship

Contribution: S.M., T.F., and S.L.T. designed the research study; K.G., H.R., J.H., and S.L.T. collected data; K.G., H.R., N.A., and N.S.

performed experiments; T.F., K.G., S.M., H.P., and S. Newhouse analyzed the data; K.G., S.M., and S.L.T. wrote the paper; S. Nkya, J. Makani, R.Z.S., and J. Mgaya provided data from the Muhimbili Sickle Cell Biorepository (Dar es Salaam, Tanzania) for analysis; M. Allman, R.K.-A., D.C.R., S.S.-S., T.Y., and M. Awogbade provided clinical materials and data; and all authors participated in editing the final version of paper.

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

The current affiliation for S.L.T. is Sickle Cell Branch, National Heart, Lung, and Blood Institute, National Institutes of Health, Bethesda, MD.

ORCID profile: S.M., 0000-0002-1590-9108.

Correspondence: Swee Lay Thein, Sickle Cell Branch, National Heart, Lung, and Blood Institute, The National Institutes of Health, Building 10-CRC, Room 6S241, 10 Center Dr, Bethesda, MD 20892; e-mail: sl.thein@nih.gov; and Kate Gardner, Red Cell Biology Programme, King's College London, Rayne Institute, 123 Coldharbour Ln, London SE5 9NU, United Kingdom; e-mail: kate.gardner@doctors.org.uk.

## References

1. Platt OS, Brambilla DJ, Rosse WF, et al. Mortality in sickle cell disease. Life expectancy and risk factors for early death. *N Engl J Med*. 1994;330(23):1639-1644.
2. Platt OS, Thorington BD, Brambilla DJ, et al. Pain in sickle cell disease. Rates and risk factors. *N Engl J Med*. 1991;325(1):11-16.
3. Steinberg MH. Genetic etiologies for phenotypic diversity in sickle cell anemia. *Sci World J*. 2009;9:46-67.
4. Quinn CT, Smith EP, Arbabi S, et al. Biochemical surrogate markers of hemolysis do not correlate with directly measured erythrocyte survival in sickle cell anemia. *Am J Hematol*. 2016;91(12):1195-1201.
5. Franco RS, Yasin Z, Palascak MB, Ciralo P, Joiner CH, Rucknagel DL. The effect of fetal hemoglobin on the survival characteristics of sickle cells. *Blood*. 2006;108(3):1073-1076.
6. Lettre G, Sankaran VG, Bezerra MA, et al. DNA polymorphisms at the BCL11A, HBS1L-MYB, and beta-globin loci associate with fetal hemoglobin levels and pain crises in sickle cell disease. *Proc Natl Acad Sci USA*. 2008;105(33):11869-11874.
7. Bhatnagar P, Purvis S, Barron-Casella E, et al. Genome-wide association study identifies genetic variants influencing F-cell levels in sickle-cell patients. *J Hum Genet*. 2011;56(4):316-323.
8. Bae HT, Baldwin CT, Sebastiani P, et al. Meta-analysis of 2040 sickle cell anemia patients: BCL11A and HBS1L-MYB are the major modifiers of HbF in African Americans. *Blood*. 2012;120(9):1961-1962.
9. Makani J, Menzel S, Nkya S, et al. Genetics of fetal hemoglobin in Tanzanian and British patients with sickle cell anemia. *Blood*. 2011;117(4):1390-1392.
10. Mtatiro SN, Singh T, Rooks H, et al. Genome wide association study of fetal hemoglobin in sickle cell anemia in Tanzania. *PLoS One*. 2014;9(11):e111464.
11. Wonkam A, Ngo Bitoungui VJ, Vorster AA, et al. Association of variants at BCL11A and HBS1L-MYB with hemoglobin F and hospitalization rates among sickle cell patients in Cameroon. *PLoS One*. 2014;9(3):e92506.
12. Sebastiani P, Solovieff N, Hartley SW, et al. Genetic modifiers of the severity of sickle cell anemia identified through a genome-wide association study. *Am J Hematol*. 2010;85(1):29-35.
13. Cardoso GL, Diniz IG, Silva AN, et al. DNA polymorphisms at BCL11A, HBS1L-MYB and Xmn1-HBG2 site loci associated with fetal hemoglobin levels in sickle cell anemia patients from Northern Brazil. *Blood Cells Mol Dis*. 2014;53(4):176-179.
14. Bauer DE, Kamran SC, Lessard S, et al. An erythroid enhancer of BCL11A subject to genetic variation determines fetal hemoglobin level. *Science*. 2013;342(6155):253-257.
15. Farrell JJ, Sherva RM, Chen ZY, et al. A 3-bp deletion in the HBS1L-MYB intergenic region on chromosome 6q23 is associated with HbF expression. *Blood*. 2011;117(18):4935-4945.
16. Stadhouders R, Aktuna S, Thongjuea S, et al. HBS1L-MYB intergenic variants modulate fetal hemoglobin via long-range MYB enhancers. *J Clin Invest*. 2014;124(4):1699-1710.
17. Menzel S, Rooks H, Zelenika D, et al. Global genetic architecture of an erythroid quantitative trait locus, HMIP-2. *Ann Hum Genet*. 2014;78(6):434-451.

18. Mtatiro SN, Mgaya J, Singh T, et al. Genetic association of fetal-hemoglobin levels in individuals with sickle cell disease in Tanzania maps to conserved regulatory elements within the MYB core enhancer. *BMC Med Genet.* 2015;16:4.
19. Labie D, Pagnier J, Lapoumeroulie C, et al. Common haplotype dependency of high G gamma-globin gene expression and high Hb F levels in beta-thalassemia and sickle cell anemia patients. *Proc Natl Acad Sci USA.* 1985;82(7):2111-2114.
20. Labie D, Dunda-Belkhodja O, Rouabhi F, Pagnier J, Ragusa A, Nagel RL. The -158 site 5' to the G gamma gene and G gamma expression. *Blood.* 1985;66(6):1463-1465.
21. Danjou F, Francavilla M, Anni F, et al. A genetic score for the prediction of beta-thalassemia severity. *Haematologica.* 2015;100(4):452-457.
22. Milton JN, Gordeuk VR, Taylor JG VI, Gladwin MT, Steinberg MH, Sebastiani P. Prediction of fetal hemoglobin in sickle cell anemia using an ensemble of genetic risk prediction models. *Circ Cardiovasc Genet.* 2014;7(2):110-115.
23. Leonardo FC, Brugnerotto AF, Domingos IF, et al. Reduced rate of sickle-related complications in Brazilian patients carrying HbF-promoting alleles at the BCL11A and HMIP-2 loci. *Br J Haematol.* 2016;173(3):456-460.
24. Mtatiro SN, Makani J, Mmbando B, Thein SL, Menzel S, Cox SE. Genetic variants at HbF-modifier loci moderate anemia and leukocytosis in sickle cell disease in Tanzania. *Am J Hematol.* 2015;90(1):E1-E4.