# Linkage Disequilibrium and Association Mapping of Fibre Quality Traits in Elite Asiatic Cotton (Gossypium arboreum) Germplasm Populations

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### **Abstract**

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Cotton productivity has been hindered by the narrow genetic base of cultivated cotton. Linkage disequilibrium-based association mapping has become a powerful molecular tool to dissect and exploit genetic diversity. In the present study, population structure and marker-trait associations for fibre quality traits in genotypes belonging to six races of *Gossypium arboreum* were assessed. Out of 300 simple sequence repeat (SSR) markers, 100 were found polymorphic, yielding a total of 240 alleles (all polymorphic). Structure analysis revealed allelic admixtures between genotypes. A Q-matrix exhibited mixed ancestry for the majority of genotypes, the race indicum forming a significant percent ancestry for almost all genotypes. At significant threshold values of  $r^2 \ge 0.05$ , 7.37% of SSR loci showed significant linkage disequilibrium (LD), while at highly significant threshold of  $r^2 \ge 0.1$ , the value was reduced to 5.31%. LD clearly decayed within the genetic distance of 9–10 cM, with  $r^2 \ge 0.1$ . Twenty-eight SSR markers were found associated with six fibre quality traits using general linear model and mixed linear model.

Keywords: general linear model; genetic distance; genetic diversity; mixed linear model; simple sequence repeat

Cotton (the genus *Gossypium*), one of the most important fibre crops in the world, has 45–50 species. Of these only four are cultivated (two allotetraploids – *G. hirsutum* L. and *G. barbadense* L. and two diploids – *G. herbaceum* L. and *G. arboreum* L.). At present, *G. hirsutum* is the most widely cultivated species worldwide (> 90%) because of suitability to industrial production and hence designated as primary cotton. Currently, there is an intense concern over the declines in yields and quality of primary cotton due to the narrow genetic base. A strong need is felt for enrichment of the gene pool with genetic diversity, for molecular understanding of desired traits and efficient transfer of allelic variation to breeding germplasm (Abdurakhmonov *et al.* 2008).

The *G. arboreum* (Asiatic cotton) germplasm collection is an important genetic resource for primary

cotton improvement. It has inherent resistance to various biotic (Akhtar *et al.* 2010) and abiotic stresses (Tahir *et al.* 2011); tetraploids lack these qualities (Kulkarni 2002). Natural *G. arboreum* fibres display various colours (e.g. white, off-white and tan) and some of the accessions also produce fibres with unusually high strength (Mehetre *et al.* 2003).

With the extensive development and easy availability of simple sequence repeats (SSRs) through cotton marker data base (CMD) (http://www.cottonmarker.org), successful efforts have been made in cotton for genetic diversity analysis and mapping and tagging of desired traits (ABDALLA *et al.* 2001; ABDURAKHMONOV *et al.* 2008). Linkage mapping has some major limitations including high running costs, poor resolution in detecting quantitative trait loci (QTL), consideration of only two alleles per locus and

there is an extreme disequilibrium between linked loci (Mather *et al.* 2004; Salvi & Tuberosa 2005).

Association mapping, based on linkage disequilibrium (LD), is emerging out as a better alternative. In cotton, association studies are limited; LD has been measured in a collection of tetraploid genotypes (Wang et al. 2013; Cai et al. 2014; Saeed et al. 2014; Zhao et al. 2014; Nei et al. 2016), while a single report exists on the association analysis of fibre traits in *G. arboreum* accessions (Kantartzi & Stewart 2008). In the present study, 95 genotypes representing six races of *G. arboreum* were explored for population structure, kinship, and genome-wide LD measurement using SSR markers. LD-based association mapping for fibre quality traits was applied using mixed linear model (MLM) as well as general linear model (GLM).

## MATERIAL AND METHODS

Plant materials and DNA extraction. Ninety-five cotton genotypes (Table S1 in Electronic Supplementary Material (ESM)) were selected. The plants belonging to the races bengalense and cernuum were cultivated in two rows of 6 m length with 30 cm interplant distance in an experimental field. Plants of the remaining 4 races (being non-native to the experimental place) were cultivated in controlled conditions of a polyhouse of the Central Institute of Cotton Research (CICR), Sirsa, Haryana, India, in a completely randomized design (CRD) with 3 replications. Fresh leaves from a single plant, selected randomly from three replicates of each genotype, were used for DNA extraction using the CTAB method (SAGHAI-MAROOF et al. 1984) with certain modifications, followed by qualitative and quantitative analysis using gel electrophoresis and UV-spectrophotometer.

Phenotypic analysis. The trials were conducted in the autumn season (starting from early rainy season) from April to October for three consecutive years (2012, 2013 and 2014). The phenotypic traits (2.5% span length, fibre strength, fibre fineness, maturity coefficient, fibre elongation and uniformity ratio) were determined at CIRCOT (Central Institute for Research on Cotton Technology), C.I.C.R., Sirsa as per the calibration-cotton-standards (http://circot.res.in/circot/services/calibration-cotton-standards).

**SSR genotyping**. Three hundred microsatellite primer pairs based on even distribution across 13 chromosomes (PARK *et al.* 2005; Guo *et al.* 2007;

MA et al. 2008; Yu et al. 2012) were taken for initial screening. Of these, 100 primers were selected on the basis of polymorphic and reproducible band pattern (Table S2 in ESM; the sequence information available at http://www.cottonmarker.org). PCR amplification was performed in a volume of 20  $\mu l$  containing 2  $\mu l$  of DNA (50 ng/ $\mu l$ ), 0.5  $\mu M$  of primer (Sigma-Aldrich, India), 200  $\mu M$  of dNTPs (Sigma-Aldrich), 0.5U Taq polymerase (Sigma-Aldrich) and 1X PCR buffer (Sigma-Aldrich). The PCR products were separated by electrophoresis at 100 V for 4 h in 4% metaphor gel and fragment sizes were calculated by interpolation from the migration distance of marker fragments of 100-bp DNA ladder (Thermo-Scientific; India).

Population structure analysis. Population structure analysis was carried out using the STRUCTURE 2.3.4 program (PRITCHARD et al. 2000). Evaluation of all possible K's (i.e. K = 2 to 8) was done using the simulation of 10 iterations, with each iteration consisting of 100 000 burn-in followed by 100 000 Markov Chain Monte Carlo (MCMC) replications, with default settings for both the Ancestry Model (Admixture Model) and the Frequency Model (allele frequencies correlated among populations; assumed different standardized variance in allele frequency  $(F_{ST})$  values for subpopulations). The most likely number of clusters (K) was evaluated considering the plateau criterion proposed by PRITCHARD and FALUSH (2007) using the non-parametric Wilcoxon test (Rosenberg et al. 2001) and the  $\Delta K$  method (EVANNO et al. 2005). The CLUMPP 1.1.2 software (JACOBSON & ROSENBERG 2007) was used to find optimal alignments of independent runs and the output was used directly as an input into DISTRUCT 1.1, a program for cluster visualisation (Rosenberg 2004).

Pairwise linkage disequilibrium and LD decay. TASSEL 4.0 was used to measure the extent of LD as squared allele frequency correlations estimates  $(r^2)$  (Weir 1996) and to measure significance of  $r^2$  for each pair of loci. Only alleles with frequencies equal or greater than 0.05 were considered for LD calculations (Thornsberry *et al.* 2001). Significance of LD for SSR pairs was determined by 100 000 permutations for each pair. The LD values between all pairs of SSR loci were plotted as triangle plots. LD decay (at  $r^2 < 0.1$ ) was estimated by plotting  $r^2$  values for pairs of SSR loci plotted as a function of map distances (cM) using GGT 2.0.

Analysis of marker-trait associations (MTAs). MTAs were conducted using both GLM and MLM using TASSEL 4.0 software (BRADBURY *et al.* 2007).

The magnitudes of marker-trait associations were evaluated by  $R^2$  values for the markers at a significance level of  $P \le 0.05$ ,  $P \le 0.01$  and  $P \le 0.001$ .

### RESULTS AND DISCUSSION

Phenotypic variation. Least significant difference (LSD) (5%) and standard error (SE) were found maximum for fibre length and minimum for maturity coefficient (Table 1). The analysis of variance among genotypes showed significant differences at three P values for fibre strength, fibre elongation, 2.5% span length and fineness. Variation among years was found significant for the traits of 2.5% span length, fineness and uniformity, while interaction for genotype × year was obtained as non-significant for all the six traits. Accurate analysis of functional QTLs requires the phenotypic measurement in multiple locations; it could not be carried out during the present investigation due to different approval and administrative reasons.

**SSR genotyping and inference of population structure**. One hundred SSRs yielded a total of 240 polymorphic alleles. The mean number of alleles per locus was 2.4 while the number of alleles per locus varied from 2 to 6. Each chromosome was covered by 7–8 primer pairs.

Information on the memberships of individuals in specific clusters (Q-matrix) and the relatedness of individuals (K-matrix) are crucial when conducting LD based association mapping (Zhao *et al.* 2007). During the present study, as per Wilcoxon test, the most likelihood was obtained at K = 6 while with the delta K method, maximal  $\Delta$ K (7.83) occurred at K = 3, with the next largest peak of  $\Delta$ K occurring at K = 6 (Figure 1). Since we were interested in the

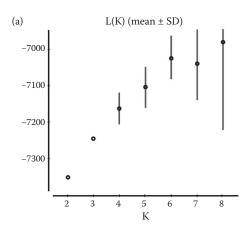
Table 1. Evaluation of six phenotypic traits in the *Gossypium arboreum* genotypes

Trait	Year	Range	Mean	5% LSD	SE
	2012	17.4–28.7	23.04	070 202	
Fiber length (mm)	2013	19.7–29.7 19.7–29.7	23.86	4.07	1.46
Fiber strength (g/tex)	2014 2012 2013	19.7–29.7 16.0–22.7 16.9–20.0	18.3 18.3	1.39	0.50
(g/tex)	2014	16.9-22.0	18.4		
Fineness (Mic)	<ul><li>2012</li><li>2013</li><li>2014</li></ul>	5.0-7.2 5.2-7.1 5.1-7.2	6.14 6.0 5.99	0.73	0.26
Maturity coefficient	2012 2013 2014	0.72-0.90 0.79-0.91 0.80-0.91	0.84 0.85 0.85	0.052	0.019
Elongation (%)	<ul><li>2012</li><li>2013</li><li>2014</li></ul>	4.0-6.4 4.7-6.4 4.4-6.7	5.6 5.5 5.5	0.68	0.24
Uniformity ratio (%)	2012 2013 2014	46–54 47–54 46–54	50.8 49.8 49.8	3.78	1.35

LSD – least significant difference; SE – standard error

structure composition of six races, we selected  $\Delta K$  at K = 6 for further analysis.

Individual membership and population membership coefficients at K = 6 were considered by means of CLUMPP software and were used to generate the structure plot using DISTRUCT (Figure 2). The race indicum almost formed a separate group from the other races (Figure 2), and genotypes from all races exhibited a comparatively high membership coefficient in indicum. It supports the most primi-



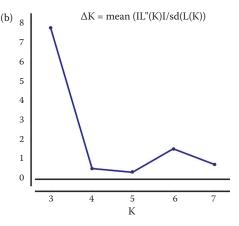


Figure 1. Structure analysis in *Gossypium arboreum* populations by Wilcoxon method (a) and  $\Delta$ K method (b) (Evanno *et al.* 2005)

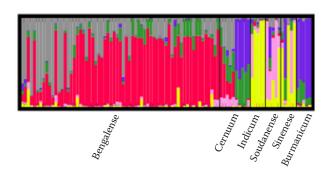


Figure 2. DISTRUCT plot of six *Gossypium arboreum* population groups

tive status of indicum by the evolutionary studies (Brubaker *et al.* 1999). With the arbitrary cut-off value of 70% ancestry for assignment of individuals to cluster (i.e. membership coefficient Q > 0.7), 44 plants (67.6%) of bengalense and 4 plants (80%) of indicum were attributed to their primary cluster. The remaining genotypes (32.3% of bengalense, 20% of indicum and 100% of the rest of races) exhibited mixed ancestry (Figure 3).

Pairwise linkage disequilibrium and LD decay. At  $r^2 \ge 0.05$ , 7.37% (365/4950) of SSR loci showed significant LD (P < 0.05) (Table 2). In some previous reports on G. hirsutum, at the same threshold, different values of SSR loci showing significant LD (ranging from 3% to 12%) have been reported (ABDURAKHMONOV et al. 2008, 2009; SAEED et al. 2014). The level of LD depends on the number of SSR loci and factors like mutation, selection, genetic drift. Significant LD at the intra-chromosomal level (Table 2) suggested the existence of LD generating factors other than linkage. Such an observation was also made by ABDURAKHMONOV et al. (2008).

LD blocks were observed as demonstrated by triangle plots for pairwise LD between SSRs (Figure 4). Sizes of intra-chromosomal LD blocks were also calculated; at  $r^2 \ge 0.1$ , the longest LD block (104.6 cM)

Table 2. Evaluation of linkage disequilibrium (LD) between SSR loci at the whole genome level in 95 *Gossypium arboreum* accessions

Parameters	$r^2 \ge 0.1$	$r^2 \ge 0.05$
Sample size	95	95
Intrachromosomal LD% (LD/non LD)	4.59 (16/348)	7.47 (26/348)
Interchromosomal LD% (LD/non LD)	5.36 (247/4602)	7.36 (339/4602)
Total LD% (LD/non LD)	5.31 (263/4950)	7.37 (365/4950)

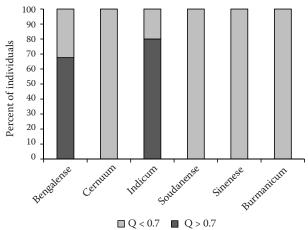


Figure 3. Assignment of *Gossypium arboreum* individuals on the basis of their membership coefficient (Q)

was observed on chromosome 3 between markers BNL-3259 and NAU-1167 (Table 3).

Genome-wide LD decay was assessed by plotting  $r^2$  values of LD as a function of genetic distance. LD clearly decayed within the genetic distance of 9–10 cM, with  $r^2 \geq 0.1$  (Figure 5). Earlier studies reported genome-wide LD decay in cotton within the genetic distance of nearly 4–7 cM (SAEED *et al.* 2014), < 10 cM (ZHAO *et al.* 2014). The extent of LD varies depending on the factors involved in a specific mode of breeding and selection pressure.

Marker-trait associations. Earlier studies on association mapping in cotton suggested the potential of conducting effective LD mapping with a lower number of markers than that needed in the majority of cases because of moderately significant LD blocks

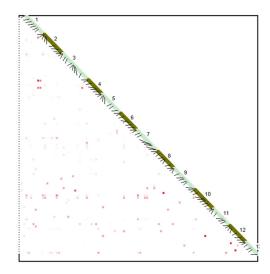


Figure 4. Triangle heat plot showing pairwise locus combinations in 13 chromosomes of *Gossypium arboreum* 

Table 3. Size of intra-chromosomal linkage disequilibrium blocks in *Gossypium arboreum* loci (at significant threshold of  $r^2 \ge 0.1$ )

		D: /			Cl
Locus 1	Locus 2	Distance (cM)	$r^2$	D'	Chromo- some
NAU-2083	BNL-3090	32.10	0.11	0.63	1
MUSS-599	NAU-5383	2.40	0.11	0.63	2
BNL-3424	MUSS-73	0.0	0.65	0.73	2
BNL-3259	MUSS-207	0.0	0.15	0.63	3
BNL-3259	NAU-1167	104.6	0.10	0.47	3
NAU-2363	NAU-3093	43.3	0.68	0.73	4
MUSS-99	BNL-542	93.8	0.11	0.30	5
BNL-3359	NAU-2580	81.7	0.15	0.63	6
NAU-933	NAU-4030	13.0	0.24	0.97	7
BNL-1395	NAU-2432	24.6	0.15	0.63	7
BNL-1395	BNL-1531	24.4	0.15	0.63	7
BNL-1694	BNL-1531	20.6	0.11	0.63	7
BNL-1694	NAU-2308	30.1	0.13	0.93	7
BNL-1531	NAU-2432	0.20	0.24	0.65	7
NAU-3590	NAU-3793	15.8	0.15	0.63	8
NAU-3454	BNL-2530	3.0	0.49	0.98	10

D' – linkage disequilibrium coefficient

(ABDURAKHMONOV et al. 2008). Our selected germplasm collection of predefined groups represented by an unbalanced number of accessions suggested the probability of a significant influence of population structure and kinship. Different methods have been proposed to control this structured association (Pritchard et al. 2000), stepwise regression (Seta-KIS et al. 2006) and mixed linear model (MLM) (YU et al. 2006). We employed the MLM (K + Q) model to generate more accurate correlations with less inflated type-I errors. General linear model (GLM) (K only) was also employed for comparison. Results were compared with reports of Kantartzi and Stewart (2008), Abdurakhmonov et al. (2008), FANG et al. (2014), WANG et al. (2013) only; like in other reports different marker sets were used and for some of them we could not find any common SSRs in our results.

MLM analysis revealed 32 significant marker-trait associations (MTA) (24 markers in different association with six traits); of these only four (12.5%) were validated by earlier studies (Table 4). GLM revealed 48 associations (28 markers in different association with six traits); seven of them have already been published (Table 4).

Comparative analysis of MLM and GLM results revealed a significant reduction of MTAs in MLM, suggesting the effect of population structure in stratified populations on MTA. Similar observations were also made by QIN *et al.* (2015). In the present study, except 3 associations (BNL-1440 with micronaire, BNL 3992 with micronaire and NAU-2363 with uniformity ratio), the remaining 29 associations of MLM were also detected by GLM.

Considering GLM and MLM together, a total of 51 significant MTAs (involving 28 markers – Figure 6) were observed, with 56.8% as common associations;  $R^2$  values for these associations ranged from 3.6% to 25.6% (Table 4). Interestingly, some markers associated with the same traits were located on the same chromosomes, e.g. BNL-3259, MUSS-192 and NAU 1167 present on chromosome 3 (though NAU 1167 is distantly located to the other two) were found associated with elongation; BNL-4047, BNL-530, BNL-4049 present on chromosome 4 and NAU-2580, NAU-3206, NAU-3427 present on chromosome 6 were associated with maturity coefficient; NAU-5383, BNL-3971, BNL-1897 present on chromosome 2 were associated with micronaire; NAU-2363, BNL-4047, BNL-4049 present on chromosome 4 were associated with span length; NAU-2000, BNL-3241, BNL-3992 present on chromosome 5 were associated with fibre strength.

The majority of the SSR markers associated with fibre quality traits in our diverse cotton germplasm were new markers. This could probably be attributed to the mapping of potentially new loci contributing to fibre quality traits because of the inclusion of diverse germplasm for the study. These new markers should be useful for

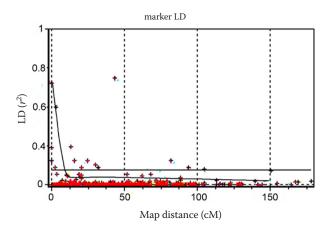


Figure 5. Scatterplot of the linkage disequilibrium (LD) ( $r^2$ ) against genetic distance (cM) between all locus pairs on the whole genome of *Gossypium arboreum* Horizontal straight line indicates the 95<sup>th</sup> percentile of the distribution of unlinked  $r^2$  values

Table 4. Association of SSR markers with fibre quality traits in *Gossypium arboreum* 

Trait	Marker	GLM results $R^2$ value (%)	MLM results $R^2$ value (%)	Chromosome location	Reference
	NAU-5499	4.49*	_	2	
	NAU-3427	8.92**	8.23**	6	
	NAU-3793	10.5***	9.88**	8	
	BNL-1066	4.85*	_	11	
	NAU-2038	5.15*	4.52**	13	
Elongation	NAU-1067	9.66**	7.19**	1	
	BNL-3259	3.79*	_	3	Wang <i>et al.</i> (2013)
	BNL1434	6.16**	3.97*	2	Kantartzi and Stewart (2008); Fang <i>et al.</i> (2014)
	MUSS-192	10.39***	9.50**	3	
	NAU-1167	25.60***	24.1***	3	
	BNL-4047	5.8**	_	4	
	BNL-530	16.7***	14.5***	4	
	BNL-4049	4.03*	_	4	
	NAU-2580	16.7***	15.8***	6	
	NAU-3206	5.72*	5.47*	6	
Maturity	NAU-3427	5.54*	_	6	
coefficient	NAU-2432	13.1***	6.65**	7	
	BNL-1404	25.6***	24.1***	11	
	NAU-2038	6.1**	_	13	
	BNL-686	5.9**	5.67**	9	KANTARTZI and STEWART (2008)
	NAU-5383	4.39*	4.10*	2	( )
	BNL-1434	3.67*	3.78*	2	
	BNL-3259	6.21**	5.95**	3	
	NAU-1167	3.72*	3.82*	3	
	NAU-2000	5.43**	5.13*	5	
	BNL-1440	-	3.82*	6	
	BNL-3992		4.78*	5	
Aicronaire	NAU-1067	4.17*	-	1	
viicionane	BNL-3580	5.19**		1	
	NAU-5383	9.78***	6.73**	2	
	BNL-3971	5.0**	3.6*	2	
			3.0		
	BNL-1897	5.55**	4 10*	2	V
	BNL-530	5.99**	4.18*	4	KANTARTZI and STEWART (2008)
	BNL-3259	7.92**	7.45**	3	
	NAU-2363	4.14*	_	4	
	BNL-4047	7.03**	5.32*	4	
	NAU-2000	9.58***	7.35**	5	
Span length	BNL-3992	4.39*	_	5	
	BNL-686	3.70*	_	9	Abdurakhomonov et al. (2008)
	NAU-2038	3.64*	_	13	
	NAU-5499	3.74*	3.78*	2	
	BNL-4049	4.90*	4.90*	4	
-	NAU-2000	7.83**	7.67**	5	
	NAU-3426	3.98*	3.93*	12	
Strength	BNL-686	4.80*	_	9	Abdurakhomonov et al. (2008)
	BNL-3241	7.09**	_	5	
	BNL-3992	4.76*	_	5	
	BNL-3241	6.14**	_	5	
Jniformity	BNL-1066	3.68*	_	11	
ratio	BNL-686	5.05*	4.34*	9	Abdurakhomonov et al. (2008)
	NAU-2363	_	3.79*	4	, ,

<sup>\*</sup> $P \le 0.05$ ; \*\* $P \le 0.01$ ; \*\*\* $P \le 0.001$ ; GLM – general linear model; MLM – mixed linear model

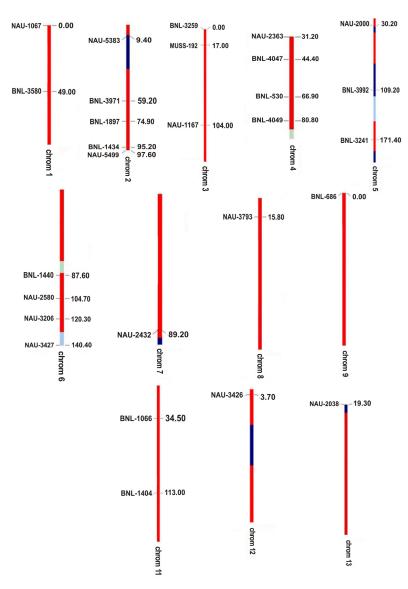


Figure 6. Positions of 28 markers, on chromosomes, involved in 51 marker-trait association as revealed by general linear model (GLM) and mixed linear model (MLM) analysis in *Gossypium arboreum* 

future marker-assisted selection (MAS) programs to mobilize potentially new QTLs from underutilized diverse germplasm resources to elite cultivars.

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