## RESEARCH



# QTL and genetic analysis controlling fiber quality traits using paternal backcross population in upland cotton



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## Abstract

**Background:** Genetic improvement in fiber quality is one of the main challenges for cotton breeders. Quantitative trait loci (QTL) mapping provides a powerful approach to dissect the molecular mechanism in fiber quality traits. In present study, F<sub>14</sub> recombinant inbred line (RIL) population was backcrossed to paternal parent for a paternal backcross (BC/P) population, deriving from one upland cotton hybrid. Three repetitive BC/P field trials and one maternal backcross (BC/M) field trial were performed including both two BC populations and the original RIL population.

**Results:** In total, 24 novel QTLs are detected for fiber quality traits and among which 13 QTLs validated previous results. Thirty-five QTLs in BC/P populations explain 5.01%-22.09% of phenotype variation (PV). Among the 35 QTLs, 23 QTLs are detected in BC/P population alone. Present study provides novel alleles of male parent for fiber quality traits with positive genetic effects. Particularly, *qFS-Chr3-1* explains 22.09% of PV in BC/P population, which increaseds  $0.48 \text{ cN}\cdot\text{tex}^{-1}$  for fiber strength. A total of 7, 2, 8, 2 and 6 QTLs explain over 10.00% of PV for fiber length, fiber uniformity, fiber strength, fiber elongation and fiber micronaire, respectively. In RIL population, six common QTLs are detected in more than one environment: *qFL-Chr1-2*, *qFS-Chr5-1*, *qFS-Chr9-1*, *qFS-Chr2-1*, *qFM-Chr9-1* and *qFM-Chr9-2*. Two common QTLs of *qFE-Chr2-2* (TMB2386-SWU12343) and *qFM-Chr9-1* (NAU2873-CGR6771) explain 22.42% and 21.91% of PV. The region between NAU4034 and TMB1296 harbor 30 genes (379 kb) in A05 and 42 genes (49 kb) in D05 for fiber length along the QTL *qFL-Chr5-1* in BC/P population, respectively. In addition, a total of 142 and 46 epistatic QTLs and QTL × environments (E-QTLs and QQEs) are identified in recombinant inbred lines in paternal backcross (RIL-P) and paternal backcross (BC/P) populations, respectively.

**Conclusions:** The present studies provide informative basis for improving cotton fiber quality in different populations.

Keywords: Fiber quality traits, Common QTL, Paternal backcross population, Upland cotton

## Background

Upland cotton (*Gossypium hirsutum* L.) is one of the most important sources of natural textile fiber. Among four cultivated Gossypium species, upland cotton shows higher yield potential and stronger adaptation to diverse environments than sea island cotton (*G. barbadense*), and accounts for more than 92% output of world cotton cultivation (Zhang et al. 2015a). However, fiber quality of upland cotton is not as good as that of sea island cotton. To meet the diverse demands of textile industry, improving fiber quality is a key target in upland cotton breeding projects.

Generally, main fiber quality traits consist of fiber length (FL), fiber uniformity (FU), fiber strength (FS), fiber elongation (FE), and fiber micronaire (FM). Each trait has its own genetic mechanism (Ijaz et al. 2019).



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Among 4 892 QTLs in Cotton QTLdb database (Yu et al. 2014), 494, 289, 470, 287 and 395 were detected for FL, FU, FS, FE and FM, respectively (http://www2.cot-tonqtldb.org:8081/, Cotton QTLdb, the newly released version V2.3 on January 24, 2018).

A total of 151, 132, 91, 118 and 234 QTLs were metaanalyzed for QTL-rich regions for FL, FU, FS, FE and FM, respectively (Said et al. 2013). A number of OTLs were located on Chr 5, Chr 19 and Chr 21 (Said et al. 2013, 2015). For fiber quality, numerous QTLs were detected based on mapping in recombinant inbred lines (RIL) populations of upland cotton (Wu et al. 2009; Sun et al. 2012; Ning et al. 2014; Tan et al. 2015; Shang et al. 2015; Tang et al. 2015; Zhang et al. 2015b; Jamshed et al. 2016; Li et al. 2016; Ma et al. 2017; Ijaz et al. 2019). However, RIL population can only be dissected additive and additive × additive effects, not to be dissected dominance and dominance-related genetic effects due to lacking heterozygous genotypes. Recently, the permanent RIL populations were used to develop backcross populations in rice (Mei et al. 2005) and in cotton (Shang et al. 2016d). The backcross populations allow performing repetitive trials as doing in 'immortalized' F<sub>2</sub> population (Hua et al. 2002, 2003). Seven QTLs were detected for fiber length and fiber strength by using backcross population deriving from Guazuncho 2× VH8-4602 (Lacape et al. 2005). A total of 44 QTLs were detected for fiber quality traits on Chr 1, Chr 9 and Chr 21 using (CCRI  $8 \times Pima 90-53$ ) × CCRI  $8 BC_1F_1$  interspecific population (Yang et al. 2015). Shang et al. (2016d) detected 17, 6, 15, 11 and 21 QTLs for FL, FU, FS, FE and FM, respectively, in F<sub>9</sub> RIL and F<sub>9</sub>BC<sub>1</sub> progenies of a hybrid 'Xinza 1'. Wang et al. (2016) detected 22, 14, 17, 3 and 20 QTLs for the five traits in two parental F<sub>8</sub>BC<sub>1</sub> populations deriving from another hybrid of upland cotton. In previous study, two markers of NAU5530 and CIR099 flanking QTLs qFL-c19-2, qFU-LG3-1 and qFS-LG3 were the same as those in Shang's work (2016d). Using a map of single nucleotide polymorphism (SNP) markers, one fiber length hotspot was observed on Chr 5 carrying three QTLs (Li et al. 2016). Nineteen clusters harbored favorable alleles from G. barbadense for two or three fiber quality traits (Shi et al. 2020). Additionally, four potential candidate genes for fiber length on Chr Dt7 were found using genotyping by sequencing by genome-wide association studies (GWAS) (Su et al. 2016). Previous studies indicated that one RIL population and its two BCF<sub>1</sub> populations could increase the power of QTL detection (Shang et al. 2016d; Wang et al. 2016). It offers opportunity to dissect QTLs for fiber quality traits using multiple populations of upland cotton.

Cotton genomes for diploid species (Paterson et al. 2012; Wang et al. 2012a; Li et al. 2014; Du et al. 2018)

and tetraploid genomes (Li et al. 2015; Liu et al. 2015; Yuan et al. 2015; Zhang et al. 2015a) have been released recently. New versions of reference genomes have recently been released in cotton (Fang et al. 2017a; Wang et al. 2019; Hu et al. 2019). These genomic analyses in cotton facilitate applications of SNP markers (Ali et al. 2018) and GWAS for fiber quality (Fang et al. 2017b; Ma et al. 2018b). It is very important to detect novel QTLs and to validate the reported QTLs using diverse populations or accessions. In previous studies, serial genetic analyses were performed in multiple segregating populations across multiple years and various locations, including F<sub>2</sub>, F<sub>2: 3</sub>, RIL and BC/M population deriving from the hybrid 'Xinza 1' (Liang et al. 2013; Liang et al. 2015; Shang et al. 2015, 2016a, 2016b, 2016c, 2016d; Ma et al. 2017, 2018a, 2019). A total of 111 quantitative trait loci (QTLs) were detected for fiber quality traits using four populations derived from RIL (XZ) and backcross (XZV) hybrids (Shang et al. 2016d). A total of 55 OTLs were detected and found distributed in 21 chromosomes using BC/M population in three locations (Ma et al. 2017). In addition, 32 QTLs at five stages, 24 conditional QTLs at four intervals were both detected for plant height at different stages (Ma et al. 2018a). Meanwhile, 26 and 27 QTLs including heterotic loci were identified in BC/P and BC/M populations, respectively (Ma et al. 2019). In addition, 10 and 16 clusters were improved more than one trait for fiber quality and yieldcomponents, respectively (Ma et al. 2017; Ma et al. 2019). In order to dissect genetic components of fiber quality, we developed BCF<sub>1</sub> progenies population based on RIL population by backcrossing with the paternal parent of 'Xinza 1'. Here we term as paternal backcross population (BC/P population for short). We generated additional 177 BCF<sub>1</sub> crosses for BC/P populations by backcrossing the 177 RI lines as current female parents to GX100-2 (the original male parent), respectively. Detection of novel QTLs and comparison analysis were performed for fiber quality traits using BC/P, BC/M and RIL populations.

#### Materials and methods

#### Plant materials and populations development

The intraspecific  $F_{14}$  recombinant inbred lines (RIL) were inbred for 177 individuals by single seed descent method, which were derived from an upland cotton hybrid "Xinza 1" (GX 1135 × GX 100–2) (Shang et al. 2016a). The parental backcross (BC/P) population was obtained by backcrossing the original male parent (GX100–2) to 177 RIL, respectively. The maternal backcross (BC/M) population is referred to previous studies (Ma et al. 2017; Ma et al. 2019). The GX100–2, "Xinza 1", GX1135 and a competition hybrid "Ruiza 816" in the Yellow River Region were performed in every

experimental trial as the control set. In present study, we name the maternal and paternal backcross populations as BC/M and BC/P populations, respectively, so as RIL-M and RIL-P populations for the RIL population in four BC/M and BC/P field trials.

#### Field trial arrangement, sampling and trait evaluation

Four trials were performed at two locations in Hebei province, China: E1. Quzhou Experimental Station in Handan city; E2, Guoxin Seed Company Ltd. in Cangzhou city. Three BC/P field trials were conducted in 2015E2 (year + location), 2016E1, 2016E2. At the same time, one maternal BC trial was conducted in 2016E2 as control trial. The field trials were designed and planted identical to previous studes for BC/M field trials in 2012E1, 2012E2 and 2012E4 (E4, Xiangyang city in Hubei province, China; Shang et al. 2016a), same as 2015E1, 2015E2, and 2015E3 (E3: Wuhan city in Hubei province, China; Ma et al. 2017, 2018a, 2019). Field management followed local conventional standard field practice.

Twenty-five naturally opening bolls in the middle of plants were hand-harvested for each plot at mature stage in all three environments. Fiber samples were ginned and sampled for measurements of fiber quality traits with HVI 900 instrument (Uster\_HVISpectrum, Spinlab, USA) at Cotton Fiber Quality Inspection and Testing Center of Ministry of Agriculture and Rural Affairs (Anyang, China) (Shang et al. 2016d; Shahzad et al. 2019). Five fiber quality traits were measured, containing 2.5% fiber span length (FL, mm), fiber uniformity (FU, %), fiber strength (FS, cN·tex<sup>-1</sup>), fiber elongation (FE), and fiber micronaire (FM) as usual (Zhang et al. 2005).

#### Genetic map and data analysis

Genetic map is based on RIL population published before (Shang et al. 2016c), in which a total of 653 loci based on SSR markers distributed on 31 linkage groups and anchored on 26 chromosomes, covering 3 889.9 cM (88.20%) of cotton genome with average interval of 6.2 cM (Ma et al. 2017, 2018a, 2019). The genotype for each maternal  $F_{14}BC_1$  was deduced on the basis of the RIL genotype (Shang et al. 2016a, 2016b, 2016c).

Basic statistical analysis was implemented by the software SPSS (Version 19.0, SPSS, Chicago). Using variance analysis, heritability was calculated according to the equation as  $h^2 = \delta^2_G / [\delta^2_G + (\delta^2_{G \times E}) / env]$ , where  $\delta^2_G, \delta^2_{G \times E}$  and *env* refer to the genotypic variance, genotype-by-environment interaction variance and the number of the environments, respectively.

Composite interval mapping (CIM) method was used for QTL mapping in the confidence interval of 95%. The software QTL Cartographer (Version 2.5) (Zeng 1994; Wang et al. 2012b) was used to map single-locus QTL and to estimate the genetic effect. The threshold of logarithm of odds (LOD) was estimated to declare a suggestive QTL after 1 000 permutation times, whereas QTL in another environment or population with LOD of at least 2.0 was considered as common QTL (Liang et al. 2013; Shang et al. 2015, 2016d). According to the position linking and sharing of common markers, QTLs detected in different populations were regarded as one common QTL (Shao et al. 2014; Shang et al. 2016d; Ma et al. 2017).

The QTL IciMapping 4.1 (www.isbreeding.net) was conducted by two-locus analysis using inclusive composite interval mapping (ICIM) method (Shang et al. 2016d; Ma et al. 2017). The main-effect QTL (M-QTL) and its environmental interaction (QTL × environment, QE), epistatic QTLs (E-QTLs) and its environmental interactions (QTLs × environment, QQE) were conducted using RIL-P and BC/P datasets under multiple environments in three BC/P trials. A threshold LOD 2.5 and 5 scores were used to declare significant M-QTL and E-QTLs, respectively.

### Results

#### Trait performance in two populations

The phenotype of five fiber quality traits performed differently between the 'original' maternal parent 'GX1135' of Xinza 1 and the 'original' male parent 'GX100–2' (Table 1). The hybrid 'Xinza 1'showed no significant hybrid vigor of  $F_1$  for fiber quality traits ranging from – 3.17% to 1.53% of mid-parent heterosis (MPH). Phenotypic variation ranged from 2.63% to 8.53% in both BC and RIL populations for fiber length (FL), fiber strength (FS) and fiber micronaire (FM). However, the values ranged from 0.87% to 1.23% for fiber uniformity (FU) and fiber elongation (FE).

Genotype variance and environment variance showed significant variation for five traits at level of 0.05 in RIL and BC populations (Table 2). Fiber length (FL) and fiber uniformity (FU) increased in BC/P population in comparison with that in BC/M population, whereas fiber micronaire (FM) reduced. Fiber length (FL) and fiber strength (FS) showed larger heritability of 91.82% and 91.10%, respectively, in RIL-P population. The heritability decreased to 86.63% and 81.93% for FL and FS, respectively, in BC/P population (Table 2). The results indicated wider range of phenotypic variation and larger heritability in RIL-P population than those in BC/P population for five fiber quality traits.

## Correlation analysis among fiber quality traits in multiple populations

The significant correlation coefficients were calculated for five fiber quality traits in BC/P, BC/M, RIL-P and RIL-M populations in 2015E2, 2016E1 and 2016E2 (Table 3). Fiber length (FL) correlated significantly and positively

Trait	Env.	BC/P		BC/P CV-/%	RIL-P		RIL-P CV/%	GX1135	GX100-2	Xinza 1	Ruiza 816
		Mean	Range		Mean	Range					
FL/mm	2016E1	$30.38 \pm 0.80$	27.70–32.95	2.63	30.36 ± 1.07	26.35-33.75	3.54	31.15	30.40	30.73	31.15
	2015E2	$31.08 \pm 0.69$	29.20-33.00	2.21	$30.95 \pm 0.95$	28.60-33.20	3.07	30.44	30.10	31.05	31.15
	2016E2	29.42 ± 0.78	26.65-31.45	2.64	29.15 ± 1.08	26.00-31.60	3.70	28.92	28.80	30.35	30.35
	2016E2 <sup>*</sup>	$29.26 \pm 0.95$	26.50-31.70	3.25	29.14 ± 1.2	26.05-32.75	4.12	29.28	29.38	28.90	29.80
FU	2016E1	$86.28 \pm 0.76$	83.75-88.30	0.88	$85.99 \pm 0.85$	82.85-88.05	0.98	86.43	85.43	85.78	86.43
	2015E2	86.06 ± 0.70	83.70-87.90	0.81	85.79±0.82	82.70-88.35	0.96	85.28	86.50	86.13	86.08
	2016E2	85.29 ± 1.02	81.75-87.40	1.20	84.95 ± 1.05	80.85-87.05	1.23	84.60	85.35	85.45	86.00
	+2016E2*	$85.14 \pm 0.98$	82.25-87.40	1.15	<b>84.90 ± 1.21</b>	80.2-87.45	1.42	85.43	86.05	85.05	86.20
FS/(cN·tex <sup>-1</sup> )	2016E1	28.81 ± 0.94	26.05-30.85	3.25	28.99 ± 1.25`	24.65–32.30	4.32	31.85	30.13	30.23	31.85
	2015E2	$30.63 \pm 0.99$	28.15-33.60	3.22	30.80 ± 1.42	27.50-34.30	4.62	29.20	28.57	28.15	30.85
	2016E2	29.11 ± 1.02	26.45-32.45	3.50	29.03 ± 1.38	25.6-33.90	4.75	28.50	28.70	30.18	31.08
	2016E2*	29.39±1.08	26.75-31.85	3.68	29.12 ± 1.41	25.5-32.75	4.83	29.20	28.35	29.28	31.10
Ш	2016E1	$6.81 \pm 0.06$	6.55-7.00	0.87	$6.80 \pm 0.07$	6.55-6.95	1.09	6.98	6.90	6.90	6.98
	2015E2	6.99 ± 0.06	6.85-7.20	0.84	$6.99 \pm 0.08$	6.80-7.25	1.16	6.78	6.77	6.83	6.78
	2016E2	$6.74 \pm 0.06$	6.55-6.90	0.88	$6.72 \pm 0.07$	6.50-7.00	1.08	6.67	6.70	6.75	6.80
	2016E2*	$6.72 \pm 0.07$	6.55-6.90	0.99	$6.71 \pm 0.08$	6.55-6.90	1.17	6.73	6.70	6.70	6.75
FM	2016E1	4.81 ± 0.34	3.95-5.70	7.12	4.86 ± 0.41	3.80-5.75	8.53	5.33	5.10	4.50	5.33
	2015E2	$4.76 \pm 0.27$	4.15-5.40	5.59	$4.71 \pm 0.36$	3.65-5.65	7.65	5.06	5.10	5.35	5.18
	2016E2	4.93 ± 0.24	4.30-5.70	4.92	$4.97 \pm 0.37$	4.10-5.90	7.45	5.33	4.55	4.98	5.55
	2016E2*	$5.18 \pm 0.25$	4.60-5.80	4.80	$5.02 \pm 0.36$	3.90-5.90	7.04	5.40	5.13	5.00	5.38

Table 1 Descriptive statistical analysis of fiber quality traits in multiple populations and the control set

Trait	Source	MS							MS			
	of variation	MS <sup>a</sup> RIL-P	H <sup>2</sup> /% <sup>b</sup>	MS <sup>a</sup> BC/P	<i>H</i> ² /% b	BC/P	MS <sup>a</sup> RIL-M	H² /%	MS <sup>a</sup> BC/M	H <sup>2</sup> /%		
FL	G	4.753**	91.82	2.072**	86.63	2.072**	5.213**	91.78	2.021**	79.62		
	E	291.886**		240.054**		240.054**	269.064**		297.752**			
	$G \times E$	0.864		0.652		0.652	0.955		1.053			
	Error	0.814		0.615		0.615	0.888		0.998			
FU	G	1.880*	71.06	1.490*	69.35	1.490*	2.828**	78.69	1.785*	72.00		
	E	110.536**		95.792**		95.792**	259.923**		272.103**			
	G×E	1.55		1.368		1.368	1.524		1.364			
	Error	1.494		1.214		1.214	1.548		1.437			
FS	G	7.906**	91.10	3.044**	81.93	3.044**	8.901**	89.71	4.039**	81.95		
	E	369.073**		333.408**		333.408**	159.82**		85.482**			
	$G \times E$	1.625*		1.365		1.365	2.07		1.71			
	Error	1.381		1.298		1.298	1.989		1.919			
FE	G	0.022**	86.83	0.010**	79.87	0.010**	0.032**	88.26	0.014**	78.81		
	E	6.779**		6.063**		6.063**	6.453**		6.614**			
	$G \times E$	0.007		0.005		0.005	0.009**		0.008			
	Error	0.006		0.005		0.005	0.007		0.007			
FM	G	0.576**	89.00	0.261**	81.25	0.261**	0.439**	85.33	0.202**	76.37		
	E	6.24**		2.636**		2.636**	11.665**		13.089**			
	$G \times E$	0.154**		0.117		0.117	0.158		0.131			
	Error	0.119		0.128		0.128	0.137		0.112			

Table 2 Results of ANOVA and heritability for yield and its com	ponents in different populations from two backcross trials
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G genotype, E environment,  $G \times E$ , genotypexenvironment. <sup>a</sup>Mean square. <sup>b</sup>Heritability. '\*' and '\*\*' indicate that the correlation is significant at 0.05 and 0.01 probability levels, respectively

Trait	Env.	FL		FU		FS	FS		
		RIL	BC	RIL	BC	RIL	BC	RIL	BC
FU	2016E1	0.013	-0.096						
	2015E2	0.226**	0.222**						
	2016E2	0.497**	0.381**						
	2016E2*	0.438**	0.178*						
FS	2016E1	0.656**	0.616**	-0.030	-0.083				
	2015E2	0.718**	0.699**	0.217**	0.075				
	2016E2	0.754**	0.581**	0.403**	0.060				
	2016E2*	0.784**	0.525**	0.305**	0.043				
FE	2016E1	0.659**	0.617**	0.128	0.105	0.530**	0.511**		
	2015E2	0.627**	0.476**	0.369**	0.163*	0.507**	0.533**		
	2016E2	0.754**	0.737**	0.454**	0.252**	0.710**	0.696**		
	2016E2*	0.813**	0.535**	0.414**	0.249**	0.751**	0.486**		
FM	2016E1	-0.237**	-0.202**	0.295**	0.314**	-0.320**	- 0.404**	- 0.015	0.016
	2015E2	-0.439**	- 0.334**	0.088	0.049	-0.428**	- 0.390**	- 0.102	0.047
	2016E2	-0.443**	-0.124	- 0.053	0.093	- 0.497**	-0.261**	- 0.206**	0.004
	2016E2*	-0.426**	-0.277**	0.063	0.142	-0.434**	-0.482**	- 0.219**	-0.020

<sup>+\*\*</sup>, '\*\*\*' indicate that the correlation is significant at 0.05 and 0.01 probability levels, respectively. RIL, recombinant inbred line population in maternal and paternal testcross trials, respectively; BC, backcross populations including maternal and paternal BC (BC/M and BC/P) populations. \*: referred to QTLs identified in one BC/M trial, the remaining QTLs identified in three BC/P trials

with fiber uniformity (FU), fiber strength (FS) and fiber elongation (FE) in these populations except FU in 2016E1. However, fiber micronaire (FM) showed significant negative correlation with FL and FS in the populations. These results are similar to the previous researches (Liang et al. 2013; Shang et al. 2016d; Ma et al. 2019).

The correlations have similar tendency among BC/P and BC/M populations. In both BC populations, no significant correlation was detected between FU and FS. However, the majority of correlation values decreased in both BC/P and BC/M populations after backcrossing to either of parents.

#### Single locus QTL analysis

In four field trials, a total of 70 QTLs controlling fiber quality were detected in three corresponding populations of BC/P, RIL-P, BC/M and RIL-M, explaining 5.01%– 22.42% of phenotypic variance (PV) (Table S1, Fig. 1). These QTLs anchored on 17 chromosomes accordingly.

For fiber length, 9, 1 and 8 QTLs were identified in BC/P, BC/M and RIL populations, respectively. The gFL-Chr5-2 was simultaneously identified in 2015E2 and 2016E1 in the BC/P population, explaining 7.46% and 7.82% of PV, respectively. The *qFL-Chr1–2* was simultaneously detected in 2016E1 and 2016E2 in RIL population, explaining 7.01% and 6.91% of PV, respectively. The qFL-Chr19-1 was verified in two different populations, explaining 17.98% of PV in BC/P population and 11.05% of PV in RIL population. Among eight QTLs detected in RIL population, three QTLs showed additive effects originated from GX1135 alleles whereas five QTLs showed additive effects offered by GX100-2 alleles. A total of three QTLs (qFL-Chr5-1, qFL-Chr5-2 and *qFL-Chr5-3*) were distributed on chromosome 5 (Chr 5), and three QTLs (qFL-Chr1-1, qFL-Chr1-2 and *qFL-Chr1–3*) were distributed on Chr 1.

A total of 14 QTLs were detected for fiber uniformity (FU) explaining 8.76%–11.86% of PV, which distributed on 11 different chromosomes. Seven and five QTLs were identified in BC/P and RIL populations, respectively. No common QTL was identified in multiple populations or multiple environments for FU. *qFU-Chr6–1* increased FU providing alleles by GX1135 in RIL population, explaining 11.86% of PV.

For fiber strength (FS), a total of 10 QTLs were detected on seven chromosomes, explaining 6.27%-22.09% of PV. Two common QTLs were identified. The *qFS-Chr3-1* was detected in BC/P population alone explaining high as 22.09% of PV in 2016E2. The *qFS-Chr21-2* was detected in BC/P, BC/M and RIL populations at the same time across 2016E1 and 2016E2, explaining 6.27%-13.37% of PV.

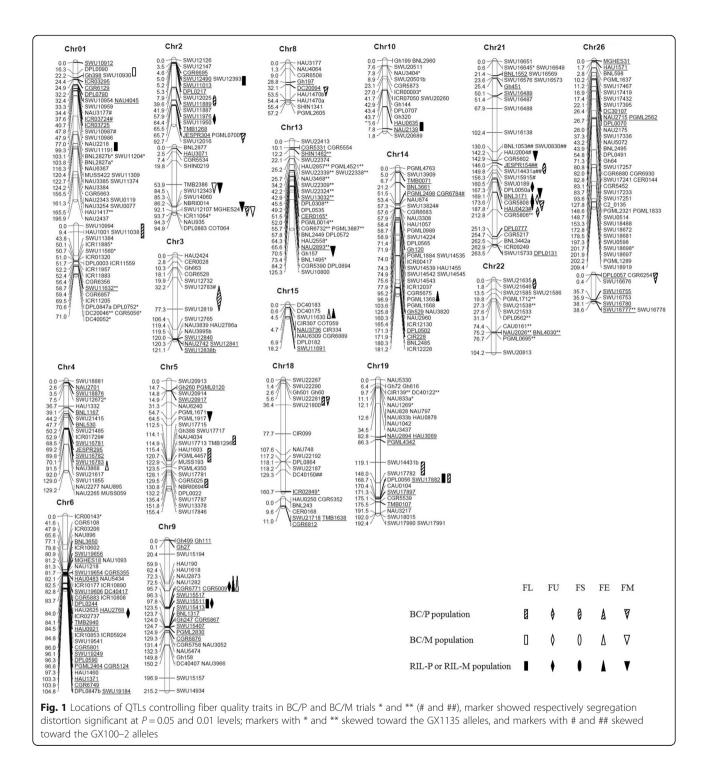
In the BC/P, BC/M and RIL populations, 8, 3 and 8 QTLs were identified for fiber elongation (FE),

respectively. Four common QTLs were detected at least in two populations, including *qFE-Chr2–2*, *qFE-Chr2–3*, *qFE-Chr3–1*, and *qFE-Chr21–2*. The *qFE-chr2–3* was detected in BC/P, BC/M and RIL populations and explained 7.02% of PV on average. The *qFE-chr3–1* was also detected in BC/M population in same environment of 2016E2, explaining 12.17% of PV in BC/P population. The *qFE-Chr2–2* explained 22.42% of PV in RIL population in 2016E1 and was identified in BC/M population in 2016E2. The *qFE-Chr21–2* was detected in BC/P and RIL populations.

A total of 16 QTLs were detected for fiber micronaire. They were located on 12 different chromosomes. The qFM-Chr9-2 was identified in BC/M and RIL populations in 2016E2, explaining 21.91% of PV. At the same time, the QTLs were detected in three environments of 2015E2, 2016E1 and 2016E2. The QTL qFM-Chr15-1 was simultaneously detected in RIL population in 2016E1 and in BC/M population in 2016E2, explaining 12.36% and 5.46% of PV, respectively. All of six QTLs were detected in RIL population and fiber micronaire increased over 0.10 value, which donated increasing additive effect alleles by GX1135, containing *qFM-Chr9–1*, qFM-Chr9-2, qFM-Chr12–1, qFM-Chr14–1, qFM-Chr14-2, and qFM-Chr15-1. In summary, 35 QTL explained 5.01%-22.09% of PV on average in BC/P population in 2015E2, 2016E1 and 2016E2. Among them, a total of 19 QTLs explained larger than 10.00% of PV. Then, we identified 10 QTLs in BC/M population, explaining 5.31%-14.53% of PV. Thirty-five QTLs existed in RIL-P and RIL-M populations explaining 5.13%-21.91% of PV in four environments above. In total, 12 common QTLs were detected in multiple environments or in multiple populations of BC/P, BC/M, RIL-P or RIL-M populations including previous studies (Table S1, S5).

#### **Pleiotropic effects**

We also observed 5 pleiotropic regions controlling at least two fiber quality traits on Chr 9, Chr 18 and Chr 21(Fig. 1). A pleiotropic region flanking with SWU15511- SWU15413 on Chr 9 increased the values for FL and FS, showing increased additive effects originated from alleles of GX100-2. The NAU2873-CGR6771 on Chr 9 contributed alleles to FS but also increased the FM. The region of SWU0830-HAU2004-CGR5602 contained qFU-Chr21-1 in BC/P population and *qFE-Chr21-1* in RIL-P population. SWU0189-CGR5808 on Chr 21 flanked along qFS-Chr21-1, qFS-Chr21-2 and qFE-Chr21-2, all of which showed increasing additive effects originated from alleles of GX100-2. The region of SWU15511- SWU15413 on Chr 18 controlled fiber length and fiber elongation at the same time.



Digenic and environmental interaction in three BC/P traits In three repetitive BC/P trials, a total of 38 and 56 M-QTLs and environmental interactions (QTL × environment, QE) were identified in BC/P and RIL-P populations, respectively (Table 4, Table S2, Table S3). The result explained 2.53%-3.13% and 2.63%-3.41% of PV, respectively, on average in the populations. Environmental effect prevailed in both BC/P and RIL-P populations. However, environment and M-QTL interacted with 1.24% of PV in the BC/P population while with 0.90% of PV in RIL-P population.

Forty-six E-QTLs and 142 QQE (digenic interactions × environment) were respectively identified in BC/P and RIL-P populations (Table S4, Table S5). Eighteen E-QTLs and QQE explained 4.17% of PV on average in RIL-P population, while nine E-QTLs and QQE

**Table 4** Summary on M-QTL and E-QTLs controlling fiber

 quality traits in BC/P and RIL-P datasets in BC/P trials

Trait	BC/I	P		RIL-P				
M-QTL <sup>a</sup>	n <sup>b</sup>	V(A)% <sup>c</sup>	V(AE) /% $^{\circ}$	n <sup>b</sup>	V(A)% <sup>c</sup>	V(AE) /% <sup>c</sup>		
FL	11	3.13	0.70	13	2.63	0.27		
FU	3	3.02	3.00	7	3.15	2.40		
FS	11	2.53	0.67	14	2.92	0.25		
FE	0	-	-	12	2.77	0.59		
FM	13	2.61	0.99	10	3.41	1.01		
Mean	-	2.82	1.34	-	2.98	0.90		
E-QTL <sup>a</sup>	n <sup>b</sup>	V(AA) /% <sup>c</sup>	V(AAE)% <sup>c</sup>	n	V(AA)% <sup>c</sup>	V(AAE) /% <sup>c</sup>		
FL	16	3.44	0.30	52	4.33	0.22		
FU	11	1.93	2.12	0	-	-		
FS	5	3.32	0.52	44	4.15	0.24		
FE	1	0.76	0.01	18	4.42	0.24		
FM	13	3.44	0.73	28	3.77	0.23		
Mean	-	2.58	0.74	-	4.17	0.23		

<sup>a</sup> M-QTLs and E-QTLs refer to the main effect QTL and epistasis QTLs by environments. <sup>b</sup> The number of QTLs. <sup>c</sup> V(A) /%, V(AAE) /%, V(AA) /% and V(AAE) /%, the total proportion of phenotypic variation on average explained by single QTL, epistatic QTLs (AA) and them by environments (AE or AAE) at the current scanning position, respectively

explained 2.58% of PV on average in BC/P populations (Table 4). On average, the number of both types of M-QTL and E-QTL was larger in RIL populations than that in BC populations. The epistatic interactions contributed more to fiber quality than M-QTLs did in RIL-P population.

To sum up, 20 (42.5%) and 101 (71.13%) pairs of E-QTLs and QQE contained M-QTLs and QEs in BC/P and RIL-P populations, respectively (Table 5). We detected about 3-fold epistatic QTLs in RIL populations than QTLs in BC/P population, and 19.01% M-QTLs participated epistasis between M-QTL and M-QTL. Three types of epistasis were checked: I) both loci were M-QTLs; II) either locus between two loci was M-QTL; III) both loci were no M-QTLs (Shang et al. 2016d; Ma et al. 2019). Apparently, 27 (57.45%) epistatic QTLs of

Trait	Type of epistasis <sup>a</sup>								
	RIL-P					BC/P			
	Ι	П		Total	Ι	П		Total	
Fiber length	8	29	15	52	2	5	9	16	
Fiber uniformity	0	0	0	0	2	5	4	11	
Fiber strength	10	22	12	44	0	1	5	6	
Fiber elongation	4	6	8	18	0	0	1	1	
Micronaire	5	17	6	28	1	4	8	13	
Total	27	74	31	142	5	15	27	47	

<sup>a</sup> type I, both loci were M-QTLs; type II, either locus among two loci was M-QTL, and type III, both loci were no M-QTLs

type III was the most popular type in epistatic styles in BC/P population whereas it was 31 (52.11%) epistatic QTLs of type II in RIL-P population (Table 5). The results indicated that epistasis played more vital role in improving fiber quality in RIL populations of upland cotton. The result was consistent to the previous result that epistatic QTLs with significant additive  $\times$  additive effects were identified for fiber quality traits (Wang et al. 2017; Ma et al. 2019).

#### Discussion

In present study, the paternal BC (BC/P) population was constructed to explore the genetic mechanism of fiber quality, following previous studies in maternal BC (BC/ M) population (Shang et al. 2016d; Ma et al. 2017, 2019). The backcross design has the obvious advantages: (I) dissecting the genetic components between paternal and maternal backcross populations; (II) identifying more novel OTLs for important traits using multiple corresponding populations (BC/P, BC/M and RIL) originated from the same hybrid; and (III) allowing to generate enough hybrid seeds when needed, similar to IF<sub>2</sub> population. Here we detected 19 and 8 QTLs alone in BC/P and BC/M populations, respectively. Three QTLs shared in both BC populations for fiber strength and fiber elongation, including qFS-Chr21-2, qFE-Chr2-3 and qFE-Chr3-1. The result indicated that the remaining elite alleles (84.21%) showed increasing additive effects originated from male parent for fiber quality in BC/P population. Therefore, present study was significant in separating novel elite alleles of male parent for fiber quality.

The identification of stable QTLs (including common QTLs) across multiple environments and multiple populations plays an essential role in marker-assisted selection (MAS) (Jamshed et al. 2016). In present study, a total of 12 common QTLs were simultaneously identified in more than one environment(s) or population(s) (Table S1). They distributed on Chr 1, Chr 2, Chr 3, Chr 5, Chr 9, Chr 15, Chr 19 and Chr 21. A total of 13 single locus QTLs (35.14%) for fiber quality were common in comparison with the previous studies in multiple years and multiple locations shown in Table S6 (Shang et al. 2016d; Ma et al. 2017). The QTLs verified each other in the RIL population and its BC progenies, suggesting that it is reasonable and effective to map QTLs using different populations across multiple environments and multiple years. The experiment design and the continuous study in our lab verified these results in present study. Among the 13 QTLs, 10 QTLs explained the larger than 10% of PV. Five QTLs were identified in Shang et al.' results (2016d) and Ma et al.' results (2017), including qFL-Chr5-1, qFL-Chr5-2, qFL-Chr5-3, qFS-Chr21-1 and qFE-Chr2-1 (Table S6). The QTL increased 0.31

mm fiber length (FL) on average, suggesting the significant roles and important regions for FL. In addition, *qLP-Chr5–3* and *qBNP-Chr5–2* increased the lint percentage and the boll number per plant, along 333 kb (48 genes) pleiotropic regions along the SSR marker TMB1296 (Ma et al. 2019). However, no gene was reported along the region. These suggested QTLs were valuable for follow-up breeding program, so as to facilitate fine mapping and favorable gene pyramiding project (Shao et al. 2014).

In addition, the marker BNL1495 flanking gFE-Chr13-1 in present study was the same to the marker flanking *qFL*chr13-2 in Liang et al.' study (2013). The marker NAU3384 of *qFS-Chr1–1* flanked to the NAU3385, which was detected for lint percentage and lint index in Chr 1 in the previous study (Zhang et al. 2013). Nine SSR markers flanking QTLs for fiber quality traits in Tang's work were in common with our genetic map (2015). The markers PGML3120 and PGML4657 flanking qFS24.1, qFE24.1 and gFM24.1, were linked to the SWU13256 and SWU13267 of *qFL-Chr24–1* and *qFE-Chr24–1* in present study. The stable qFS-Chr21-2 in present study shared a common SSR marker BNL3171 flanking a stable QTL of qUHM-21-1 controlling fiber length in previous study (Wang et al. 2017). The qFS-Chr21-2 was also detected in 2015E3 for improving fiber strength (Ma et al. 2017). The qFS07.1 controlling fiber strength was fine-mapped to a 62.6-kb region, but no same marker was found with NAU3181 and SHIN0376 for *qFU-Chr7–1* in the present study (Fang et al. 2017c). These SSR markers are valuable for fiber quality breeding in terms of previous studies in different varieties of cotton. The classic method for mapping QTL and tagging genes had improved plant improvement programs by using marker-assisted selection (MAS). Indeed, in many previous studies involving SSR markers and/or phenotypes, QTLs were obtained for important traits (Zhang et al. 2005; Zhang et al. 2015c; Xu et al. 2017). The artificial selected plants had been bred for varieties using MAS to major crop breeding programs even by long selection cycles. With the decreasing cost and increasing SNP density by nextgeneration sequencing approach, the strategy of genomic selection (GS) will consider genetic effects across whole genome. Much improvment in accuracy and efficiency could be expected if combined the results from both the classic method and GS strategy.

In present study, a total of 35 QTLs were detected in the BC/P population. Taking all the detected QTLs together, 23 (65.71%) novel QTLs were identified from BC/P populations alone, and 9 (25.71%) were detected in both BC/M and BC/P populations. The results indicated that many unique QTLs can be detected solely by backcrossing male parents to  $F_1$  plants, which are available for marker-assistant breeding. Interestingly, 5 in 10 (50%) and 28 in 35 (80%) QTLs were only detected in BC/M and RIL populations, respectively.

The epistatic effects and environmental interactions existed simultaneously for fiber quality traits as well as other traits. At two-locus level, we detected a number of interactions under environments for fiber quality traits in both populations (Table 4). Three types of epistasis combinations were observed (Table 5). However, epistasis QTLs influenced fiber quality by Type III (57.45%) in BC/P population. Differently, epistasis influenced fiber quality by Type I and Type II (71.13%) in RIL population. In addition, 3fold epistasis QTLs was detected in RIL-P population. The results indicate that epistasis played roles in different genetic modes to control fiber quality. In particular, no E-QTL was identified for fiber uniformity (FU). Another interesting result is that epistasis is another vital genetic effect affecting fiber quality traits (Shang et al. 2016d). Similar to previous study, Wang et al. (2006) indicated that both epistasis effect and single-locus effect of QTLs played an important genetic role in cotton fiber quality.

In present study, five QTLs increased fiber micronaire (FM) values from 0.06 to 0.18 (Table S1). Mean values ranged 4.71-5.18 on average in the RIL-P and BC/P populations of Xinza 1. In other words, fiber quality ranks from B grade (3.5–3.6, 4.3–4.9) to C grade (< 3.4, > 5.0) for fiber micronaire. At the same time, FM displayed negative correlation with FL, FU, FS and FE. Therefore, we should avoid exploiting the QTL regions in breeding project. Larger lint yield potential and well fiber quality are the key aims in cotton breeding program, and negative correlation between yield and fiber quality hinders genetic gains in cotton breeding (Yang et al. 2015). Many important heterotic loci were detected in our previous studies (Shang et al. 2016a; Ma et al. 2019), and some heterotic loci were also identified accounting for improving fiber quality (Shang et al. 2016d; Ma et al. 2017). The pleiotropic regions should be paying more attention in further research so as to improve fiber quality and to increase yield in breeding program.

#### Conclusions

In present study, the paternal BC (BC/P) population was constructed to explore the genetic mechanism of fiber quality, and was detected 19 and 8 QTLs alone in BC/P and BC/M populations, respectively. Three QTLs shared in both BC populations for fiber strength and fiber elongation, including *qFS-Chr21–2*, *qFE-Chr2–3* and *qFE-Chr3–1*. The present study was significant in separating novel elite alleles of male parent for fiber quality.

#### Supplementary information

Supplementary information accompanies this paper at https://doi.org/10. 1186/s42397-020-00060-6.

**Additional file 1: Table S1.** Single-locus QTLs in paternal and maternal backcross experiments by composite interval mapping method.

Additional file 2: Table S2. Main effects and environmental interactions detected for fiber guality traits in RIL-P population.

Additional file 3: Table S3. Epitasis effects and environmental interactions detected for fiber quality traits in RIL-P population.

Additional file 4: Table S4. Main effects and environmental interactions detected for fiber quality traits in BC/P population.

Additional file 5: Table S5. Epitasis effects and environmental interactions detected for yield and its components in BC/P population.

Additional file 6: Table S6. Common single locus QTLs in comparison with the previous studies in multiple years and locations.

Additional file 7: Table S7. Phenotype values of fiber quality traits of BC/P population in three field trials in this study.

Additional file 8: Table S8. Phenotype values of fiber quality traits in field trial of BC/M population in this study.

Additional file 9: Table S9. Genotypes of RIL (A), BC/M (B) and BC/P (C) populations.

#### Abbreviations

BC: Backcross; BC/P: Paternal backcross population; BC/M: Maternal backcross population; Chr: Chromosome; ClM: Composite interval mapping; E-QTLs: Epistatic QTLs; FE: Fiber elongation; FL: Fiber length; FM: Micronaire; FS: Fiber strength; FU: Fiber uniformity; GS: Genomic selection; LOD: Logarithm of odds; M-QTL: Main-effect QTL; MAS: Marker-assisted selection; PV: Phenotype variation; QE: QTL × environmental interaction; QTL: Quantitative trait loci; QQEs: Epistatic QTLs × environments; RIL: Recombinant inbred line

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#### Authors' contributions

Hua JP designed the experiment. Ma LL performed the experiments, analyzed the data and prepared the manuscript. Su Y, Nie HS, Cui YP, Cheng C and Ijaz B attended field experiments and data collection. Hua JP provided experimental platform and revised the manuscript. All authors read and approved the final manuscript.

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#### Availability of data and materials

All data generated or analyzed in this study included in published article and additional files. All of our raw data are available as Supporting Information Table S7 and Table S8 for phenotypes used in multiple populations and Supporting Information Table S9 for genotypes for RIL, BC/M and BC/P population (Shang et al. 2016a; Ma et al. 2019).

#### Ethics approval and consent to participate

Not applicable.

#### Consent for publication

Not applicable.

#### **Competing interests**

The authors declare that they have no competing interests.

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