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RESEARCH ARTICLE

Mixed linear model association mapping for low chloride accumulation rate in oriental-type tobacco (*Nicotiana tabaccum* L.) germplasm

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Chloride is an essential micronutrient in tobacco (*Nicotiana tabaccum* L.) cultivation. However, large amounts of it have many adverse effects on burning quality of tobacco leaves. The objective of this study was to evaluate the genetic variability among 70 oriental-type tobacco genotypes and determine the genomic regions associated with chloride accumulation rate using mixed linear model (MLM) procedure. A total number of 66 alleles were detected by 26 simple sequence repeat (SSR) loci with an average of 2.53 alleles per locus. A model-based Bayesian approach subdivided 70 tobacco genotypes into the three subgroups. Almost 5.85% of the 325 marker pairs showed a significant level of linkage disequilibrium ($P \le 0.01$). Using MLM procedure, 1 SSR locus (pt30027) from linkage group 13 was identified to be associated with the gene(s) controlling low chloride accumulation in oriental tobacco genotypes. Identified markers could be of great interest in marker-assisted selection in tobacco breeding programs.

Keywords: Nicotiana tabaccum; simple sequence repeat; genetic variability; linkage disequilibrium; mixed linear model

Introduction

Tobacco (Nicotiana tabaccum L.) with 2n = 4x = 48chromosomes is one of the most important non-food crops widely cultivated worldwide (Moon et al. 2009). Turkish or oriental tobacco is a sun-cured, highly aromatic, and small-leafed type which is grown in Iran, Turkey, Greece, Bulgaria, Lebanon and the Republic of Macedonia. It has the ability to grow in low-fertility soils (Davis & Nielson 1999). In order to get an American Blend type of cigarette, it is mixed with more robust tobacco such as Virginia and Burley tobaccos. Chloride is recognized as an essential micronutrient in tobacco cultivation. When required in small amounts, it improves yield and certain quality factors, such as color, moisture content, elasticity, and burning capacity (Davis & Nielson 1999). However, large amounts of chloride accumulation have many adverse effects on the quality of tobacco leaves, such as poor burning capacity, muddy appearance, and undesirable odor as well as high hygroscopicity, causing discoloration during storage. Thus, the chloride content in tobacco leaves is considered as a major factor determining the quality of tobacco leaves. If the chloride content rises above 2.0%, it results in nearly incombustible tobacco leaves (Darvishzadeh & Alavi 2011). High genetic variability has been reported for chloride accumulation in Iranian oriental tobacco germplasm (Darvishzadeh et al. 2011). Darvishzadeh and Alavi (2011) by using parental genotypes and their F1 hybrids showed that both additive and nonadditive

genetic effects control chloride accumulation rate in tobacco leaf.

Molecular breeding has revolutionized conventional breeding techniques in all areas within the last 20 years. As a prerequisite, identifying tightly linked markers is important for the successful deployment of DNA marker technology in breeding programs. The first DNA marker applied to plants was restriction fragment length polymorphism. With the advent of polymerase chain reaction (PCR), several other DNA marker systems, such as random amplified polymorphic DNA, simple sequence repeat (SSR), inter-simple sequence repeat, and amplified fragment length polymorphism were introduced (Godwin et al. 1997). SSR markers, due to their high polymorphism, random distribution and codominant Mendelian inheritance, are one of the most reliable markers for genetic studies (Kalia et al. 2011). Mapping quantitative trait loci (QTL) in plants has been mainly obtained through systematic biparental breeding populations such as backcrosses, F2-intercrosses, or recombinant inbred lines (RILs) (Parrisseaux & Bernardo 2004; Russo et al. 2012). However, due to few recombination events occurring in these populations, the associated markers are not often tightly linked to the QTL of interest (Myles et al. 2009). Association mapping offers a good alternative approach for detecting tightly linked markers to the QTL of interest in natural populations, germplasm collections, and even routinely generated breeding programs (Parrisseaux & Bernardo 2004; Abdurakhmonov & Abdulkarimov 2008). This method has been used in several plants species, including maize

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(Thornsberry et al. 2001), barley (Kraakman et al. 2006), hexaploid wheat (Breseghello & Sorrells 2006), sunflower (Darvishzadeh et al. 2008; Davar et al. 2012), chickpea (Saeed et al. 2013), and long life span forest plants (Wilcox et al. 2007).

Compared to biparental linkage analysis, association mapping has some advantages including the following: (1) because of using all the meioses events accumulated in the breeding history of species, association mapping has high mapping resolution, (2) richness of allelic polymorphism because of the broader genetic variation represented by diverse genetic background of the genotypes, and (3) availability of populations and phenotypic data collected through multiple locations and years without any extra cost (Yu & Buckler 2006; Sorkheh et al. 2008; Zhang et al. 2012). Population structure, sample size, and frequency of specific alleles may influence the ability to detect false-positive associations between markers and traits (Zhang et al. 2012). Methods incorporating population structure (Q) and kinship (K) matrix or a combination of Q and K (Q + K)has been proposed to minimize the false-positive association in association analyses (Yu & Buckler 2006; Yu et al. 2006). The aims of the present study were to characterize the population structure within oriental tobacco genotypes and to identify SSR markers associated with low chloride accumulation using mixed linear model (MLM) procedure.

Material and methods

Plant material and phenotypic data

Seventy oriental-type and semioriental-type tobacco genotypes including RILs from the cross between Basma seres 31 and Dubec 566, some 'Chopogh' and Iranian water pipe's tobacco lines, as well as genotypes, from different countries were used in this study (Table 1). Data of chloride accumulation rates of genotypes were collected from previous studies (Darvishzadeh et al. 2011).

Genotypic data

Genomic DNA was extracted from the leaves of 70 genotypes following the method described by Doyle and Doyle (1987). Concentration of DNA samples was determined by spectrophotometer (BioPhotometer 6131; Eppendorf, Hamburg, Germany) at 260 nm. The quality of the DNA was checked by running 1 µl DNA on 0.8% (w/v) agarose gel in 0.5× TBE buffer (45 mM Tris base, 45 mM boric acid, 1 mM ethylenediaminetetraacetic acid (EDTA) pH 8.0). DNA samples with a smear in the gel were rejected. Twenty-six SSR primer pairs out of 278 from the tobacco SSR database (Bindler et al. 2007, 2011) were used for DNA fingerprinting. The choice of SSR markers was based on their known genetic locations to obtain near-uniform coverage of the tobacco genome and clarity of produced bands (Bindler et al. 2007, 2011). PCR was performed in a 20 µl volume using a 96-well Eppendorf Mastercycler Gradient (Type 5331,

Eppendorf AG, Hamburg, Germany). The reaction mixture contained 0.25 mM of each primer, 0.4 unit of Taq DNA polymerase (Cinna Gen Inc., Tehran, Iran), 100 µM of each dNTP (BioFluxbiotech, http://biofluxbiotech.com), 2 µl 10× PCR buffer, 2 mM MgCl₂ (CinnaGen, Tehran, Iran), and 25 ng of template DNA. Amplification was carried for 35 cycles consisting of a denaturing step at 94°C for 1 min, annealing at 55°C for 1 min, and an extension step at 72°C for 1.5 min. An initial denaturaing step at 94°C for 4 min and a final extension step of 10 min at 72°C were also included. The reaction products were mixed with an equal volume of formamide dves (98% formamide, 10 mM EDTA. 0.05% bromophenol blue, and 0.05% xylene cyanol) and resolved on a 3% (w/v) agarose gel in 0.5× TBE buffer. The gel was stained with 1.0 μ g ml⁻¹ ethidium bromide. Gels were photographed under UV light, using a Gel-Doc image analysis system (Gel Logic 212 PRO, USA).

Data analysis

The SSR data were scored as codominant markers in order to distinguish homozygotes and heterozygotes for each locus. Major allele frequency (MAF), polymorphic information content (PIC_l), gene diversity (D_l), and allele number were calculated using Power Marker 3.25 software (http://statgen.ncsu.edu/powermarker/). Gene diversity, referred to as expected heterozygosity, is defined as the probability of two randomly chosen alleles from the population that is different. $\hat{D}_l = (1 - \sum_{u=1}^k \tilde{P}_{lu}^2)/(1 - \frac{1+f}{n})$, where *f* is the inbreeding coefficient and estimated from the data using the method of moments. Polymorphism information content (PIC_l) is estimated following the formula proposed by Botstein et al. (1980): $PIC_l = 1 - \sum_{u=1}^k \tilde{P}_{lu}^2 - \sum_{u=1}^{k-1} \sum_{v=u+1}^k 2\tilde{P}_{lu}^2 \tilde{P}_{lv}^2$.

Population structure was analyzed using a modelbased Bayesian approach in the software package Structure 2.3.4 (Pritchard et al. 2000). Five independent runs were performed setting the number of subpopulations (K) from 1 to 10, burn in time, and Markov Chain Monte Carlo (MCMC) replication number both to 100,000, and a model for admixture and correlated allele frequencies. The K value was determined by the log likelihood for each K; Ln P(D) = L(K) (Rosenberg et al. 2002). Since the distribution of Ln P(D) did not show a clear number of true K, delta K (ΔK) based on the second-order rate of change in the likelihood (ΔK) (Evanno et al. 2005) was used alternatively to identify a clear peak to represent the true K value. Inferred ancestry estimates of individuals (Q-matrix) were derived for the selected subpopulation (Pritchard et al. 2000). The kinship coefficients (K-matrix), r^2 , and D' were estimated in Tassel 2.1 software. Cluster analysis based on neighbor joining method was performed in Tassel 2.1. Association mapping was performed to analyze marker-trait association using MLM approach

Code	Genotype name	Origin	Code	Genotype name	Origin	Code	Genotype name	Origin
G01	Kharmanli 163	Turkey	G27	Alborz23	Iran	G61	P.D.371	Iran
G02	Nevrokop	Bulgaria	G29	^a Mutant 3	Iran	G62	P.D.381	Iran
G03	Trabozan	Turkey	G30	^a Mutant 4	Iran	G63	^d SPT 403	Iran
G04	Krumovgraid	Bulgaria	G31	Pobeda 1	Russian	G64	SPT 405	Iran
G05	Basma Seres 31	Greece	G32	Pobeda 2	Russian	G65	SPT 406	Iran
G06	Triumph	Yugoslavia	G35	Samsun 959	Turkey	G66	SPT 408	Iran
G07	Xanthi	Greece	G36	Samsun dere	Turkey	G67	SPT 409	Iran
G08	Matianus	Iran	G41	^b C.H.T.209.12e	Iran	G68	SPT 410	Iran
G09	Immni 3000	CORESTA collection	G42	C.H.T.209.12e×F. K.40-1	Iran	G69	SPT 412	Iran
G10	Melkin 261	CORESTA collection	G43	С.Н.Т.266-6	Iran	G71	SPT 420	Iran
G11	Tyk-Kula	CORESTA collection	G44	C.H.T.283-8	Iran	G72	SPT 430	Iran
G12	ss-289-2	CORESTA	G45	C.H.T.273-38	Iran	G73	SPT 432	Iran
G13	Ohdaruma	CORESTA	G46	Basma 12-2	Iran	G74	SPT 433	Iran
G14	Ploudive 58	Bulgaria	G47	Basma 16-10	Iran	G75	SPT 434	Iran
G15	Line 20	CORESTA	G48	Basma 104-1	Iran	G76	SPT 436	Iran
010	2	collection	0.0	Buoma rolli		0,0	511 100	
G16	T-B-22	CORESTA	G49	Basma 181-8	Iran	G77	SPT 439	Iran
G17	Ts 8	CORESTA	G51	Izmir	Turkey	G78	SPT 441	Iran
G19	EK 40-1	Iran	G52	°PD 324	Iran	G80	SPT 413	Iran
G20	Pz17	CORESTA	G53	P.D.325	Iran	G82	^e Jahrom 14	Iran
G22	K.B	CORESTA	G55	P.D.328	Iran	G84	L 16	Bulgaria
G23	G.D.165	Bulgaria	G56	P.D. 329	Iran	G91	L 17	Bulgaria
G24	H.T.I	CORESTA	G57	P.D.336	Iran	G92	C.H.T.269-12e	Iran
G25	Kramograd N.H. H. 659	Bulgaria	G58	P.D.345	Iran			
G26	T.K.23	CORESTA collection	G59	P.D.364	Iran			

Table 1. List of studied oriental-type tobacco genotypes.

^aEarly maturing mutants developed in Urmia Tobacco Research Center.

^bThe 'CHT' lines known as Tikolak are semioriental tobacco developed in Tirtash Tobacco Research Centre (Iran).

"The 'PD' lines are RILs derived from the cross between Basma Seres 31 and Dubec 566 in Urmia Tobacco Research Centre.

^dThe 'SPT' lines known as 'Chopogh' tobacco are inbred lines selected from local landraces by single-plant or pure-line selection method in Urmia Tobacco Research Centre.

^eThe 'Jahrom' line is Iranian water pipe's tobacco line selected from local landraces by single-plant or pure-line selection method in Urmia Tobacco Research Centre. CORESTA: Cooperation Center for Scientific Research Relative to Tobacco, Paris, France (http://www.coresta.org/).

in TASSEL 2.1 accounting for population structure and kinship relatedness (Q + K model).

Results

Chloride accumulation rates among oriental-type tobacco genotypes ranged from 0.33 to 2.5 with the average value of 1.35 (Darvishzadeh et al. 2011). Extensive phenotypic variation was observed for the measured quantitative trait in this oriental-type tobacco panel (Darvishzadeh et al. 2011). To evaluate the genetic diversity of the genotypes, we used SSR markers. A total number of 66 alleles were detected by using 26 SSR primer pairs on 70 oriental-type tobacco genotypes with an average of 2.53 alleles per locus. PIC ranged from 0.27 (pt30094) to 0.6 (pt30014) (Figure 1(A)). As shown in Figure 1(B), the MAF exceeding 60% values was within 0.5–0.9. Meanwhile, gene diversity ranged from 0.33 to 0.66 that shows the probability of two alleles varies between two individuals.

In order to understand the genetic structure of the association panel, a model-based Bayesian approach in the Structure software was used to assign each genotype into the corresponding subgroup. The group of 70 oriental-type tobacco genotypes was partitioned into three subgroups (Figure 2). These subgroups matched with three sorts in our association panel including the following: Chopogh (SPTs), PDs, and Tikolak (Figure 3). Eighty-one percent of PDs, 71% of SPTs, and 70% of Tikolak were assigned into the corresponding subgroups, and the remaining ones were categorized into the 'mixed' based on their Q values. Cluster analysis based on neighbor-joining algorithm, subdivided all of the 70 genotypes into three major subgroups, similar to



Figure 1. A: Diagram represents the frequency of PIC for studied SSR markers. B: Diagram represents MAF rates for studied SSR markers.

results obtained from population structure analysis using Structure software (Figure 4).

In the collection under investigation, 5.85% of the 325 SSR primer pairs showed a significant level of linkage disequilibrium (LD) ($P \le 0.01$). The r^2 values for primer pairs ranged from 0.004 to 0.29, with the average value of 0.034. The D' values ranged from 0.01 to 0.82 with the average value of 0.268. Using MLM procedure based on Q + K model 1 SSR locus (pt30027) from linkage group 13 (Bindler et al. 2007) was identified that possessed significant association ($P \le 0.04$) with the QTL controlling chloride accumulation rates in oriental-type tobacco genotypes (Table 2).

Discussion

Genetic diversity, population structure, and LD analysis

In the molecular analysis, 66 alleles were detected at 26 SSR loci and tobacco genotypes were assigned into three subgroups (PDs SPTs, and Tikolak) based on Bayesian approach using Structure software and cluster analysis. In our previous investigations, the present population panel also presented high variability for different characters, such as chloride accumulation rates in leaves (Darvishzadeh et al. 2011), partial resistance to

Orobanche (unpublished data), and powdery mildew (Darvishzadeh et al. 2010). So this population panel with high molecular and morphological genetic diversity and adverse population structure could be used for the association analysis. From breeder view, a higher variation for a character in the breeding materials increases the ability for selection toward its improvement.

Among the factors influencing marker-traits association, the admixture of populations is very important (Yu & Buckler 2006; Yu et al. 2006; Zhang et al. 2012). Association tests that do not attempt to account for the effects of population structure must be viewed with skepticism and may influence the ability to detect falsepositive associations between markers and traits. Although there is a little bit of admixture (20-30%) in the present association panel that could bias the analysis, there were many models proposed to minimize the falsepositive association analysis produced from the admixture of populations. Model Q + K is a very good model for resolving these kinds of problems (Ghavami et al. 2011). It has been shown that a Q + K matrices incorporated into the MLM model was important to minimize false-positive associations (Zhang et al. 2012). Newly, Fricano et al. (2012) by using 49 SSR markers profile could classify 312 tobacco accessions to six main clades which correspond to 'Oriental', Flue-Cured', 'Burley', 'Dark', 'Primitive', and 'Other' classes.



Figure 2. Bilateral charts to determine the optimal number of K (K = 3).



Figure 3. Genetic relatedness of 70 genotypes of oriental and semioriental tobacco with 26 simple sequence repeats (SSRs) as analyzed by the Structure program. The color of the bar indicates the three groups identified through the Structure program (Red: PD (RILs); Green: Tikolak; Blue: SPTs (Chopogh). Numbers on the y-axis indicate the membership coefficient and on the x-axis indicate the genotypes code. Genotypes with the same color belong to the same subgroup.



Figure 4. Classification of 70 oriental-type tobacco genotypes based on neighbor-joining algorithm.

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LocusSequence of primer $(5' \rightarrow 3')$ Linkage groupF-MarkerP-Markerpt30027Forward:
CCGAGAGTTGCATTTGAATTT
Reverse:
AGGGTTCTACGCAAGAGATTG13 (Bindler et al. 2007)3.4650.04

Table 2. SSR loci identified for chlorine accumulation rates in oriental-type tobacco genotypes using association mapping by MLM procedure.

Recently, LD has been used in association mapping (Zhu et al. 2008) and to locate QTL or major genes, based on the cosegregation of specific marker alleles and traits (Rafalski & Morgante 2004). In this study, 5.85% of all possible pairs of SSR loci showed a significant level of LD ($P \le 0.01$) and the two most important and frequently used statistics for describing LD pattern (r^2 and D'), showed a mean value of 0.034 and 0.268. Similar results were also reported by Jun et al. (2007) and Zhang et al. (2012) on soybean and maize, respectively. The high level of LD encouraged us to do association analysis on this association panel.

QTL mapping

Mapping a marker in close proximity of a QTL, controlling a specific trait offers an opportunity for tobacco breeders to apply marker-assisted selection (MAS) in their breeding programs. In several researches (Julio et al. 2006; Li-Hua et al. 2011; Hatami Maleki et al. 2013), biparental mapping population have been used to detect QTLs controlling chloride accumulation rate in tobacco genome. For instance, Julio et al. (2006) by using a genetic linkage map developed by a variety of molecular markers on a RILs population from the cross between two flue-cured tobacco inbred lines, detected 75 QTLs on 12 linkage groups for 59 traits including leaf quality, chemical composition of lamina, and smoke properties. In their study (Julio et al. 2006), few QTLs were detected for chemical compositions, and there was not any QTL identified for chloride accumulation rate in the leaf. In the other study, Li-Hua et al. (2011) using family-based linkage mapping approach, detected two QTLs for total chlorine concentration. Currently, Hatami Maleki et al. (2013) developed a genetic linkage map for oriental-type tobacco by using F2 individuals from the cross between two divergence oriental-type tobacco genotypes including 'SPT 406' and 'Basma seres 31'. They (Hatami Maleki et al. 2013) reported two QTLs for chloride accumulation rate in the leaf, namely, ChlIM and ChlCIM with R^2 values of 0.4 and 0.07, using interval mapping and composite interval mapping, respectively. However, current gene mapping efforts in plants are shifting from conventional biparental OTL mapping to LD-based association mapping (Sorkheh et al. 2008), which is the most effective approach to utilize natural variation in the form of ex situ conserved crop genetic resources. Some successful reports on association mapping in plants such as rice (Yan et al. 2009), barley (Kraakman et al. 2006), wheat (Ghavami

et al. 2011; Zhang et al. 2011), potato (D'hoop et al. 2008), soybean (Jun et al. 2007), maize (Andersen et al. 2007), chickpea (Saeed et al. 2013), and forage grasses (Dobrowolski & Forster 2007) are available. To our knowledge, this is the first report on the identification of responsible locus for chloride accumulation rate via association mapping in tobacco. Albeit, some of the SSR markers used in the present investigation had been applied previously by Hatami Maleki et al. (2013), but there was not detected any common linked marker between previous linkage map (Hatami Maleki et al. 2013) and association analysis.

In conclusion, the results of present study, demonstrated the significant potential of LD-based association mapping of complex traits in tobacco with a relatively small number of markers. Our results also suggest that population structure and relatedness should be taken into account to perform unbiased population-based association mapping in tobacco germplasm and highlight the potential of MLM association mapping in tobacco. SSR marker associated with chloride accumulation rate could be useful in tobacco improvement using MAS programs.

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