

DArTseq molecular markers associated with the piping leaf margin phenotype in pineapple (*Ananas comosus* L.)

Garth M. Sanewski¹

Received: 13 February 2022 / Accepted: 21 June 2022 / Published online: 22 July 2022 © Crown 2022

Abstract

This study sought to understand the genetic basis of the piping leaf margin phenotype in pineapple. To achieve this aim, a genome-wide association study (GWAS) using mixed linear regression and logistic regression analysis was conducted on three pineapple diversity panels including seedling populations segregating for spiny, spiny-tip and piping leaf margins. This study identified single nucleotide polymorphism (SNP) markers associated with the piping and spiny-tip leaf margin phenotypes. A broad quantitative trait locus (QTL) positioned on chromosome 23 between positions 240,475 and 2,369,197 bp was the most highly associated with piping leaf margin in all analyses. Major candidate genes proposed are a Zinc finger protein 2, a Zinc finger protein 3, a WUSCHEL-related homeobox 2, a WUSCHEL-related homeobox 1 and a Zinc finger protein CONSTANS-like. Some other genes of a lower association, linked or nearby genes of interest, are also considered potentially involved to varying degrees. All candidate genes are known to be involved in aspects of stem cell maintenance, cell proliferation, epidermal cell differentiation, organogenesis, leaf polarity, cell wall modification or hormone signalling. It is possible each plays a role in either differentiation or morphological aspects of the spiny-tip and piping leaf margin phenotypes. It is expected the relative role of each associated gene might vary with genetic background.

Keywords Spines \cdot Piping leaf \cdot ZFP \cdot Abaxial \cdot WUSCHEL \cdot Zinc finger \cdot WOX \cdot Leaf margin

Abbreviations

ABA	Abscisic acid
BGLR	Bayesian Genetic Linear Regression
BLINK	Bayesian-information and Linkage-
	disequilibrium Iteratively Nested Keyway
FarmCPU	Fixed and Random Model Circulating Prob-
	ability Unification
DArT	Diversity Arrays Technology
GAPIT	Genomic Association and Prediction Inte-
	grated Tool
GMMAT	Generalized linear Mixed Model Association
	Tests
GWAS	Genomic-wide Association Study
iPat	Intelligent Prediction and Association Tool
KNNi	K-nearest neighbour imputation
LD	Linkage disequilibrium

Communicated by Robert Henry

Garth M. Sanewski garth.sanewski@daf.qld.gov.au

¹ Queensland Department of Agriculture and Fisheries, Maroochy Research Facility, Nambour, Australia

MAF	Minor allele frequency
MMLM	Multi-locus mixed linear model
PIC	Polymorphism information content
PRI	Pineapple Research Institute
QTL	Quantitative trait loci
SNP	Single nucleotide polymorphism
SAM	Shoot apical meristem

Introduction

Pineapple exhibits five leaf margin types and all, except complete spiny, are considered the product of domestication (Coppens d'Eeckenbrugge and Sanewski 2011). Genotypes exhibiting this phenotype are typically found in the north-western regions of Brazil (Coppens d'Eeckenbrugge et al. 2018a), the country of origin of *Ananas*. The piping margin typically exhibits a thin white border along the leaf margins and is devoid of any spines (Fig. 1A and B). Leaves with a spiny margin are considered the natural state as all wild genotypes possess this phenotype and it is reasonable to assume piping represents a mutation selected at some stage in the estimated 6,000 to 10,000 years of domestication of pineapple (Coppens d'Eeckenbrugge et al. 2018b).



Fig. 1 A and **B**. The piping leaf margin typically exhibits a thin white border along the leaf margin (1A) and is devoid of spines even at the tip. On some leaves of some genotypes, it might also be characterised by an upward fold in the margin (1B)

The piping leaf margin does not appear to offer any obvious evolutionary advantage and hence its widespread existence in the western Amazon is likely all attributable to mankind. Because the trait exists in several different genotypes which are considered to have arisen from clonal selection and sexual recombination (Chen et al. 2019), the piping phenotype most likely has been selected multiple times.

The first obvious sign of the piping phenotype occurs about 8 cm behind the tip and extends to the base of the leaf where it emerges from the meristematic zone. The demarcation or boundary between adaxial and abaxial 'domains' appears clear but a narrow strip of abaxial surface has been folded onto the adaxial surface to present a new 'false' margin (Collins 1960). The piping strip will vary in width in different genotypes from almost non-existent to a strip approximately 2 mm wide. The width can also vary on different leaves of the same plant or on different margins of the same leaf possibly revealing an environmental effect on gene penetrance, meristematic cell development or leaf cell turgor. The fold can be exaggerated and obvious or, in some cases, only present as a shallow valley. There are however no published studies describing the botanical nature of piping leaf margin.

Leaf margin spines do not usually occur with piping suggesting an additional genetic mechanism. According to Collins (1960), the piping gene is epistatic to the spiny and spiny-tip alleles. He goes further to say, plants homozygous for piping have a more pronounced piping margin, suggesting a dosage effect and plants homozygous recessive for the piping alleles will display as either spiny or spiny-tip. The piping phenotype appears dominant over spiny and spiny-tip phenotypes. The piping leaf margin appears very stable and there are few reports of reversion to spiny, unlike the spinytip phenotype which frequently reverts to spiny and displays considerable variability in gene penetrance (Sanewski 2020).

This study examined the botanical nature of piping leaf margin and identified SNP markers associated with spiny-tip and piping leaf margin phenotypes. The use of three diversity panels, independently analysed, was a novel approach that enabled testing between pairs of phenotype states; viz, piping and spiny, piping and spiny-tip and spiny and spinytip. Putative candidate genes associated with the piping leaf margin, all located on chromosome 23, are discussed.

Methods

In this study, the use of the term 'piping' is meant to encompass smooth margins with or without folding and/or an obvious white edge. Plants were phenotyped by visually inspecting the leaf margins and carefully feeling the margin to the very tip for the presence of small spines. Those without any spines anywhere on the leaf were considered as piping, those with small spines at the tip as spiny-tip, and plants with spines completely over the margins were classed as spiny.

Histology

10 µm thick transverse leaf margin sections were prepared from cultivars, 'Tapiricanga' (piping) and 'Smooth Cayenne' (spiny-tip), using a freezing microtome to examine the differences between a piping margin and a margin with spine suppression but no piping. The sections were fixed in 4% formalin and mounted in Mowiol [®] solution for brightfield microscopy.

Panel Descriptions for GWAS

Three diversity panels were used. Diversity panel one was a sub-set of 90 plants from a population of seedlings exhibiting piping (33 plants) or completely spiny leaf margins (57 plants). This panel was intended to reveal the genetic difference between spiny and piping margin. The population was developed using the parents that included spiny, spinytip and piping genotypes. Sixty-two of these plants were of the parent combination 'PRI 59–656' (pollen) and 'MD-2' (seed). It is considered that the piping margin trait in all progenies used was inherited from the piping margin 'Smooth Guatemala' component and the spiny trait was derived from 'MD-2'.

Panel two comprised 516 genotypes with 12 full sib families and some of their parental varieties. There were 440 plants with piping leaf margins and 76 with spiny-tip. The population had all derived from varieties from the Pineapple Research Institute (PRI) of Hawaiian breeding program as for panel one. Panel two differed from panel one in that it represented a larger number of recombinant events and spiny leaf margin plants were not included. This panel was intended to reveal the genetic difference between spiny-tip and piping margin genomes.

Diversity panel three was an amalgamation of panel two seedlings (508 seedlings) and a reciprocal bi-parental population (367 seedlings) ('MD2' × 'Cayenne', and 'Cayenne' × 'MD2') of seedlings segregating for spiny and spinytip margin. Panel three also included 76 parental genotypes and several unrelated genotypes including wild accessions. Panel three was the most diverse of the populations used. There were 492 plants with piping margins, 351 with spinytip and 108 with spiny margins to give a total of 951 plants.

Molecular Marker Development

Freeze-dried leaf base samples (white tissue) were supplied to Diversity Arrays Pty Ltd for DArTseq marker development. Marker development followed the procedure described in Sanewski et al. (2017). The methylation-sensitive restriction enzymes PstI and MseI were used to avoid highly repetitive regions that bias GWAS, and to reduce the genome complexity. The marker sequences were trimmed to 69 bp.

Marker sequences for panel one genotypes were referenced against the revised genome of the spiny-tip pineapple cultivar 'Smooth Cayenne' clone 153 (Acomosus_321_v3; https://genomevolution.org/CoGe/NotebookView.pl?nid= 937) (Ming et al. 2015).

Subsequent to the sequencing of panel one genotypes, a revised version of this genome sequence became available and was used for panels two and three. Marker sequences for panel two and panel three genotypes were referenced against the revised genome of the spiny-tip pineapple cultivar 'Smooth Cayenne' clone 153 (Acomosus_321_v7.1, assembly GCA_902162155.1 at European Nucleotide Archive; https://www.ebi.ac.uk/ena/browser/home). This version of the genome is slightly different from the previous version. Chromosome 24 and 25 have been amalgamated as a larger chromosome 25. Chromosome one was divided and the later portion re-labelled as chromosome 24. This was done by the

authors of that work to correct for an error in the original assembly (Chen et al. 2019). These two reference genomes should be identical for chromosomes two to 23 and hence the different panel results are comparable where markers of interest are positioned only on chromosomes two to 23.

Before analysis, the SNP data sets were filtered on reproducibility (>0.99), call rate (>0.75) and MAF (>0.025) before imputation using the LD KNNi approach in TASSEL 5.2.44 (Bradbury et al. 2007; Money et al. 2015). The accuracy of imputation was tested by masking 10% of SNPs and comparing the imputed file with the original.

Principal Component Analysis (PCoA)

Principal component covariates were generated in TASSEL 5.2.54 (Bradbury et al. 2007). The number of covariates for GWAS was determined based on either the Bayesian Information Criterion (BIC) approach (Schwarz 1978) performed in GAPIT, or the QQ and Scree plots. The smallest number of covariates that produced a QQ plot that was neither inflated or under-inflated and had the smallest P values and was consistent with the Scree plot (visualized in TASSEL but not reproduced) was used in the GWAS.

Association Analyses

The SNP marker data was analysed by genome-wide association study methods (GWAS) using mixed linear models (MLM) with structure correction. The multi-locus mixed linear models (MMLM) of Segura et al. (2012), FarmCPU (Liu et al. 2016) and BLINK (Huang et al. 2019) and the single loci ECMLM model, all in the GAPIT R package version 3 (Zhang et al. 2010; Tang et al. 2016) were used. Kinship was estimated using the Van Raden method in GAPIT (Van Raden 2008).

The phenotype data was binary and coded as 0 and 1 for panels one and two and 0, 1 and 2 for panel three. The Bonferroni-adjusted P value of $P \le 0.01$ was used as the level of significance.

The R package Bayesian Genomic Linear Regression (BGLR) was used, through the graphic user interface, Intelligent Prediction and Association Tool (iPat v1.3) (Chen and Zhang 2017) to test SNP markers in panels one, two and three. The Bayes A model was used with a probit link to optimise analysis of binary or ordinal data through logistic regression. The algorithm was run with 50,000 iterations and the first 3,000 discarded. The Van Raden kinship matrix and principal components were used to adjust for relatedness. The marker effects posterior values were converted to absolute values and the Z-score calculated by dividing the absolute marker effect by its standard deviation. The P value was then calculated by the following equation according to Campbell et al. (2019), $P = 2^*(1\text{-pnorm}(Z\text{-Score}))$. A Bonferroni-adjusted $P \le 0.05$ was used as the cut-off for significance.

A mixed model logistic regression was also performed using the R program Generalized Linear Mixed Model Association Test (GMMAT v1.1.2) (Chen et al. 2016) for panels one and two data. This model uses a Bernoulli distribution and logit function with covariate adjustment by principal components as a fixed effect and kinship (Van Raden) as a random effect to adjust for population structure. Logistic models such as GMMAT that can include fixed and random effects to account for population structure are considered more suitable for binary traits than linear mixed models especially if some populations have more or less 'affected' status rather than 'control' status. In such situations there is an increased risk of type I errors with mixed linear models as they assume error terms are normally distributed (Shenstone et al. 2018). The model 10 algorithm in GMMAT was used for to perform score tests on marker associations. The data were treated as binomial.

Logistic regression was also performed in gPLINK using a logit function (Purcell et al. 2007) for panel one only.

Linkage Analysis

Linkage disequilibrium (LD) for the linkage decay curve was estimated for the entire genome for panel one data using the software package TASSEL 5.2.44 using a sliding window of 100 SNPs. The r^2 of SNP marker pair frequencies and their distance was used to generate a linkage decay curve. A Loess curve was fitted using the package SigmaPlot 14. Linkage disequilibrium decay distance was calculated as the point on the x axis corresponding to where the Loess curve passed 50% of the maximum r^2 (Noble et al. 2018).

Marker linkages were also analysed for individual chromosomes for panel one SNP markers using Haploview 4.2 (Barrett et al. 2005). In the case of Haploview, the Hardy–Weinberg p value cut-off was set at zero.

Nearby Genes

Genes within the LD decay distance were identified using the annotated 'Smooth Cayenne' v3 genome for panel one genotypes and v7 genome for panels two and three in the software package 'Geneious R10'. This differential use of genome versions was because these different genomes were used as the reference for marker positioning in those marker datasets. Likely candidate genes were selected based on proximity and supporting published reports of gene/protein biological function.

Results

Histology

The section for spiny-tip cv. 'Smooth Cayenne' (Fig. S1) shows the co-ordinated adaxial and abaxial layers. The abaxial layer is characterized by a corrugated epidermal surface which appears slightly thinner than the adaxial surface. The transition between the adaxial and abaxial layers dissects the vascular bundles such that the phloem bundle and its sclerenchyma sheath are in the abaxial layer, and the xylem bundle and its sclerenchyma sheath are in the adaxial layer. Alternating between the phloem-xylem bundles, but only in the abaxial layer, are aeration canals. Both the abaxial and adaxial layers have a line of fibre bundles relatively close to the epidermal layer. Both the adaxial and abaxial layers converge to the leaf margin.

The piping leaf margin section shows the abaxial piping 'bulge' consists of one to two repeats of the phloem vascular bundle and fibre strands in two different directions (Fig. S2A and B). The piping section therefore appears to be one or two repeats of the abaxial layer at the margin sandwiched on top of each other before the terminating epidermal cell layer.

Molecular Marker Datasets

The original seedling SNP dataset for panel one comprised 3,574 markers with 18% heterozygosity and an average minor allele frequency (MAF) of 0.23. The average PIC was 0.31, one ratio 0.47 and call rate 0.85. There were 13.5% null alleles before imputation. Imputation accuracy was 91% and there were 2,141 SNP markers with an average MAF of 0.23 and 0.18 heterozygosity after imputation. 77 genotypes remained for association analyses. The original SNP dataset for panel two comprised 516 genotypes and 40,686 markers and contained 4.8% null alleles. After imputation, with an accuracy of 88%, 516 genotypes and 16,393 markers remained with heterozygosity of 0.32, average MAF of 0.29 and average PIC of 0.18. After filtering for MAF \leq 0.05 and imputation (accuracy 0.88), the panel three dataset included 16,393 SNP markers for 952 genotypes and had an average MAF of 0.29 and heterozygosity of 0.33.

Principal Component Analysis (PCoA)

Based on the PCoA analysis, zero to four principal components (PCs) were used as covariates for panel one depending on the algorithm, up to nine for panel two depending on the algorithm and three for panel three. For panel one, the first four PCs accounted for 27% of the genotypic variance. For panel two, the first 9 PCs accounted for 37% and for panel three, the first three PCs accounted for 18%.

Marker Density

Density for SNP markers for chromosome 23 using the panel three dataset after filtering and imputation is shown in Fig. 2. Figure 2 showed that marker density was high on chromosome 23 at the starting end up to mid-way around position 4,504,232 bp. Chromosome 23 appears to be telocentric.

Linkage Disequilibrium

LD decay distance for the entire genome using panel one SNPs indicated an effective decay distance of 1,222 kb for the entire genome (Fig. S3). This LD decay distance was used as a guide for selecting candidate genes in all analyses. For panel one, most of the significant markers were intergenic and linkages were generally not strong between associated SNPs.

Association Analyses

Panel one comprised piping and spiny phenotypes only. The highest associated SNP marker (#4714214) was the most significantly associated in all panel one mixed linear model (MLM) analyses (Table 1). Genes close to this position include a Zinc-finger protein 2 (ZFP2), Zinc-finger protein 3 (ZFP3), Ras-related protein Rab-8B, and WUSCHEL-related homeobox 2 (WOX2) genes (Table S1). The WOX2 and ZFP2 are considered the main candidates associated with piping and spiny leaf phenotypes in this panel of genotypes. SNP marker #4714214 was homozygous for the reference allele (spiny-tip 'Smooth Cayenne') in spiny genotypes and

homozygous for the SNP or heterozygous in piping genotypes. SNP marker #4713909 was homozygous for the SNP allele or heterozygous in spiny genotypes and homozygous for the reference allele in piping genotypes. Several other markers on chromosomes one and two were also significantly associated but most were intergenic and not matched to genes. Several other genes of interest were however positioned close to these markers. The Manhattan and QQ plots for GWAS of panel one SNPs are shown in Figs. 3A and 4A. Figure 5 shows the significantly associated SNP markers by ECMLM and gPlink for the main QTL on chromosome 23. SNP marker #4714214, at position 798,190 bp on chromosome 23, was the most highly associated SNP marker by GMMAT and gPlink. SNP marker #4713909 was the only significantly associated SNP marker using Bayes A in BGLR (Table 1). This intergenic marker is positioned on chromosome 23 at 762,438 bp and was close to the most significantly associated SNP marker (#4714214). Both #4714214 and #4713909 are positioned close to a WOX2 (Aco015463.1) and ZFP2 (Aco015474.1) (Table S1). Linkage data for the most highly associated SNP markers in panel one (spiny and piping margins) is shown in table S2. The highest associated SNP marker by BGLR, #4713909, was close to the WOX2 and ZFP2 but also highly linked to #100067496 which was also close to the WOX2 and ZFP2. There were no other strong linkages with associated SNP markers.

Panel two comprised spiny-tip and piping margin plants. SNP marker #54316030 was the most significantly associated in all panel two GWAS analyses and logistic regression by BGLR and GMMAT (Table 2). This marker was positioned on chromosome 23 at 1,068,662 bp, 9.3 kb from a WUSCHEL-related homeobox 1 (WOX1) (Aco007021.1) and 31.6 kb from a Zinc finger CONSTANS-like protein

Fig. 2 SNP marker density (number of markers within 1 Mb sliding window) for all 25 chromosomes, panel 3 after filtering for MAF < 0.025 and imputation by LD-KNNi



Table 1 SNP markers significantly associated with spiny and piping leaf margin phenotypes for panel one genotypes using the GAPIT algorithms ECMLM, MLMM, FarmCPU and BLINK and logistic regressions in GMMAT, gPLINK and BGLR. All markers are significant at the Bonferroni-adjusted P<0.01 except the BGLR and gPLINK values* which are significant at P<0.05. 17 of the SNPs with the lowest association significance, all on chromosome 23 or not positioned, have been omitted. The direction of the allelic effect for the ECMLM algorithm is shown

SNP	Position chrom: bp	Length (bp)	-log10p (Bonf)	Maf	Algorithm	Allelic effect
4714214 Fl0–52:G > A	23: 798,190	59	8.3 15.2 12.7 17.8 6.7* 12.4	0.33	ECMLM MLMM FarmCPU BLINK Plink GMMAT	pos
4713909 Fl0-63:G > A	23: 762,438	69	7.7 4.3* 2.0* 12.4	0.45	ECMLM Plink BGLR GMMAT	neg
4712886 F 0–20:A>G	23: 423,562	69	7.5 6.4* 11.0	0.26	ECMLM Plink GMMAT	pos
100044752 F 0-50:T>C	2: 16,332,302	69	6.9	0.07	FarmCPU	pos
4712964 F 0–31:C>T	23: 296,925	69	6.7 6.1* 11.1	0.27	ECMLM Plink GMMAT	pos
100058551 F 0-63:A>G	NP	69	6.7	0.50	FarmCPU	pos
100012184 F 0-68:A>G	1: 24,514,356	69	6.3	0.47	FarmCPU	pos
100067496 F 0-23:C>A	23: 678,197	69	6.2 5.3* 11.0	0.44	ECMLM Plink GMMAT	neg
4713774 Fl0-5:T>C	23: 1,970,691	69	5.6* 7.9	0.37	Plink GMMAT	pos
4716438 F 0–19:C>T	23: 1,305,909	69	5.4* 9.3	0.34	Plink GMMAT	neg
4714616 F 0-49:A>G	NP	69	5.3* 8.6	0.27	Plink GMMAT	pos
100058930 F 0-31:T>G	23: 1,473,662	69	5.3* 9.1	0.41	Plink GMMAT	neg
4724522 F 0-24:C>G	NP	41	5.2* 7.4	0.48	Plink GMMAT	pos
4717335 F 0-57:T>C	23: 240,475	69	5.2* 9.4	0.44	Plink GMMAT	pos
4724236 F 0-29:G>A	23: 2,058,488	69	5.1* 7.0	0.36	Plink GMMAT	pos
100044395 F 0-7:G>C	23: 1,999,412	69	5.0* 7.5	0.47	Plink GMMAT	pos

(Aco007020.1) (Table S3). These are considered the best candidates for the piping and spiny-tip genotype data set studied. This marker was homozygous or heterozygous for the polymorphism in piping genotypes. Spiny-tip genotypes were homozygous for the reference allele (spiny-tip cv. 'Smooth Cayenne'). Marker #28878068 positioned at 671,978 bp on chromosome 23 was highly associated by MLM only. This marker was unmatched but positioned 6.9 kb from a Myb domain protein 97 (Aco015454.1), 28 kb from an O-fucosyltransferase family protein (Aco015458.1) and 66.8 kb from a WUSCHEL-related homeobox 2 (WOX2) (Aco015463.1). Piping genotypes were homozygous for the polymorphism and null or homozygous for the reference allele (spiny-tip cv. 'Smooth Cayenne') in spiny-tip

cultivars. Other markers of relatively lower significance were also demonstrated by some algorithms on chromosome 5, 6, 12, and 13 and un-positioned. The Manhattan and QQ plots for GWAS of panel two SNP data are shown in Figs. 3B and 4B.

Panel three comprised spiny, spiny-tip and piping margin phenotypes. Marker # 54316030 at position 1,068,662 on chromosome 23 was the most significantly associated in three MLM algorithms (Table 3). This marker was only 9.3 kb from a WOX1 (Aco007021.1) and 31.6 kb from a Zinc finger CONSTANS-like protein (Aco007020.1) (Table S4). These are the same genes proposed for panel two. Marker # 4723993 on chromosome six at 14,330,763 bp was also highly associated by three



Fig. 3 A, **B** and **C**. Manhattan plots for SNP markers for panel one (3A) analysed in GAPIT using the ECMLM, MLMM, BLINK and FarmCPU algorithms for association with spiny and piping leaf margin phenotypes, panel two markers (3B) analysed for spiny-tip and piping leaf margin phenotypes and panel three markers (3C) analysed for spiny, spiny-tip and piping leaf margin phenotypes. The structure-

corrected -log10(Bonferroni-adjusted) P < 0.01 cut-off horizontal lines are shown. Markers on scaffolds and not positioned are included as fictitious chromosomes 26 and 27 respectively. Figures reproduced in the R package 'Memory-efficient, Vizualization-enhanced, and Parallel-accelerated tool for genome-wide association study' (rMVP), https://github.com/xiaoleiLiuBio/rMVP

MLM algorithms. This was close (20.5 kb) to a Zeaxanthin epoxidase (ZEP) as identified putatively associated with spiny-tip phenotypes in a previous study (Sanewski 2020). Manhattan and QQ plots for panel three SNP data are shown in Figs. 3C and 4C. Marker #54316030 was

homozygous for the reference allele in spiny-tip and spiny genotypes and homozygous for the SNP or heterozygous in piping genotypes. Bear in mind, the spiny-tip 'Smooth Cayenne' provided the reference genome. #54316030 therefore represents a dominant allele for the piping trait.



Fig. 4 A, B and C. QQ plots from the panel one (4A), panel two (4B) and panel three (4C) SNP marker GWAS analyses. Figures reproduced in the R package rMVP, https://github.com/xiaoleiLiuBio/rMVP

Marker #4723993 was homozygous for the polymorphism in spiny-tip genotypes and homozygous for the reference allele in spiny genotypes. Piping genotypes carried any of the allele states. SNP marker #4723993 which was associated with the spiny-tip phenotype in panel three, was in various allele states in piping and spiny-tip genotypes in panel two. There appeared no difference between piping and spiny-tip genotypes with respect to the allele state of this marker for the spiny-tip phenotype. SNP marker #28883264 was the only marker significantly associated by logistic regression (BGLR) (Table 3). It is positioned on chromosome six at 14,526,582 bp close to several likely candidates including a Receptor kinase 2, Zeaxanthin epoxidase, Cellulose synthase, Glycine-rich cell wall structural protein and MATE efflux family gene (Table S4).

Discussion

There do not appear to be any global disturbances in leaf polarity. The development of a piping margin appears consistent with a cessation of the adaxial layer while the abaxial layer is repeated an additional one to two times at the margin thus creating a thicker composite abaxial layer, an imbalance and upward folding. Piping leaf margin appears to be a lack of co-ordination between development of the abaxial and adaxial tissues at the leaf margin rather than changes in adaxial-abaxial patterning. **Fig. 5** Significantly associated SNP markers on chromosome 23 for the panel one dataset using the ECMLM and gPLINK analyses. The -log10(P) line of significance (Bonferroni-adjusted) P<0.01 is shown. The vertical arrows delineate the proposed main QTL

Marker position on LG23 (mb)

 Table 2
 SNP markers
significantly associated with spiny-tip and piping leaf margin phenotypes for panel two genotypes using the GAPIT algorithms ECMLM, MLMM, FarmCPU and BLINK and logistic regression in GMMAT and BGLR. All markers are significant at the Bonferroni-adjusted P<0.01 except the BGLR value* which is significant at P < 0.05. The direction of the allelic effect for the ECMLM algorithm is shown. Seventyone markers were found significant but only the most significant markers for each chromosome are shown

SNP	Posn chrom: bp	-log10P (Bonf)	Length bp	Maf	Algorithm	Allelic effect
54316030 F 0–11:A > C	23: 1,068,662	34.6 28.6 27.2 26.3 5.5* 27.1	29	0.46	MLMM Blink ECMLM FarmCPU BGLR GMMAT	neg
28878068 F 0–65:G > A	23: 671,978	28.4 21.9 20.9 18.0	69	0.25	MLMM Blink ECMLM FarmCPU	neg
28878068 F 0–66:C > A		18.1 16.6 12.2 14.1	69	0.32	Blink MLMM FarmCPU GMMAT	pos
4713909 F 0-63:G>A	23: 762,438	20.3 17.7	69	0.36	ECMLM GMMAT	neg
4710125 F 0–59:A>G	23: 701,343	18.6 21.5	69	0.45	ECMLM GMMAT	neg
28877781 Fl0–34:C > G	23: 506,814	16.0 11.3 6.7 10.6	69	0.23	ECMLM FarmCPU Blink GMMAT	neg
54317320 F 0-18:T>A	5: 6,727,065	10.9	69	0.20	Blink	neg
4727322 F 0-43:A>T	12: 5,152,594	7.1 6.9	69	0.36	FarmCPU Blink	neg
54316897 F 0–37:G>A	6: 9,696,245	9.7	69	0.14	ECMLM	neg
28877802 F 0-5:T>G	13: 2,431,298	6.0	69	0.08	Blink	pos

Table 3 SNP markers significantly associated with spiny, spiny-tip and piping leaf margin phenotypes for panel three genotypes using the GAPIT algorithms MLMM, FarmCPU and BLINK and logistic regression in BGLR. All markers are significant at the Bonferroni-adjusted P < 0.01 except the BGLR value* which is significant at P<0.05. The direction of the effect, either positive or negative for the ECMLM algorithm is shown, even though this algorithm is not otherwise represented in the table

SNP	Position chromo: bp	-log10p	Length (bp)	Maf	Algorithm	Allelic effect
54316030 F 0-11:A>C	23: 1,068,662	60.3 60.0 24.2	29	0.33	BLINK FarmCPU MLMM	pos
4723993 F 0–39:G > C	6: 14,330,763	56.0 24.3 8.4	69	0.47	FarmCPU MLMM BLINK	neg
28883264IFI0-10:C>A	6: 14,526,582	50.2 40.0 30.0 7.4*	69	0.20	BLINK FarmCPU MLMM BGLR	neg
4726743IFI0-6:A>T	6: 14,355,558	20.9 15.2 12.3	69	0.27	BLINK FarmCPU MLMM	pos
54314089 F 0-40:G > A	6: 14,334,819	23.7 6.7	69	0.47	BLINK FarmCPU	neg
54314200 F 0-17:G>A	6: 13,977,148	18.5	69	0.33	BLINK	neg
28881980 F 0-27:G>A	6: 13,967,023	14.0	69	0.35	FarmCPU	neg
54314646 F 0-9:G>T	13: 10,965,585	11.7	69	0.46	BLINK	neg
4716772 F 0-47:A>C	6: 14,556,931	11.2	69	0.15	MLMM	pos
28881708 F 0-8:G>A	NP	11.0 6.4	23	0.30	FarmCPU BLINK	neg
4714193 F 0-41:C>T	12: 5,141,097	11.0	69	0.29	BLINK	neg
54309331 F 0-37:T>G	6: 14,525,401	10.8	69	0.36	BLINK	neg
28876898 F 0-59:G>A	6: 13,991,970	9.9	69	0.47	MLMM	pos
28874267 F 0-22:T>C	18: 10,110,153	9.7	69	0.06	BLINK	pos
54312110 F 0-55:T>C	7: 12,303,848	9.7	69	0.18	BLINK	neg
28882074 F 0-12:G>A	5: 10,126,663	9.5	69	0.08	BLINK	neg
4716438 F 0-19:C>T	23: 1,305,909	8.9 7.3	69	0.23	BLINK MLMM	neg
54310912 F 0-23:A > G	12: 418,631	8.9	69	0.23	BLINK	pos
4726657 F 0-31:T>G	12: 4,768,435	8.7	69	0.28	FarmCPU	neg
54313753 F 0-50:G > A	7: 10,461,432	9.3 6.6	69	0.23	BLINK FarmCPU	neg
54316608 F 0-39:G>A	6: 13,991,970	9.3	69	0.31	BLINK	pos
4710241 F 0-17:A > T	6: 14,732,936	8.8	69	0.35	BLINK	neg
4709656 F 0-11:G>T	6: 14,242,751	8.6	69	0.18	FarmCPU	pos
28882522 F 0-38:A>G	4: 1,202,604	8.1	58	0.09	FarmCPU	neg
54315064 F 0-6:C>T	NP	7.7	24	0.06	BLINK	neg
4715867 F 0-68:A>T	25: 8,053,599	7.2	69	0.46	BLINK	neg
4718200 F 0-6:G > A	6: 13,796,356	7.0	69	0.32	FarmCPU	pos
28877469 F 0-16:G>C	2: 13,859,177	7.0	69	0.31	FarmCPU	neg
4713341 F 0–56:G>A	5: 11,677,507	6.9	69	0.07	MLMM	neg
28879929 F 0-25:C>T	25: 6,103,800	6.9	65	0.11	BLINK	pos
4719816 F 0-30:C>G	NP	6.8	69	0.46	BLINK	neg
4717292 F 0-51:G>T	6: 14,468,303	6.7	62	0.16	BLINK	pos
28883299 F 0-59:G>A	25: 8,864,898	6.7	69	0.27	FarmCPU	pos
4715794 F 0-33:C>G	NP	6.6	5.1	0.35	BLINK	pos
28877973 Fl0-6:T>C	4: 1,026,724	6.4	69	0.06	BLINK	neg

Diversity Panel One

Panel one comprised a population segregating for spiny and piping margin and as such is considered the definitive data set for examining polymorphisms associated with the selection of piping-leafed variants from the presumed original spiny genotypes. The assumption at the commencement of this study is that the piping phenotype arose from the spiny phenotype. Discussion of candidate genes within this context is therefore based primarily on the findings from panel one.

WUSCHEL-Related Homeobox 2 (WOX2)

The WOX2 (Aco015463.1) gene is 59 kb from the highest associated SNP by all four MLM models and two logistic regressions and hence considered a highly likely principal causal variant, along with the ZFP2. There are ten WOX genes in pineapple, spread across six chromosomes with three on chromosome 23 (Rahman et al. 2017). Research on WOX genes in other species supports a potential role in leaf margin morphology. Rice plants carrying a mutation in a WOX3 called LSY1, exhibited curled leaf margins suggesting greater cell growth or proliferation in the abaxial leaf tissues compared with the adaxial side. In another example, a WUS ortholog in rice is expressed mostly in leaf margins (Somssich et al. 2016). Also, overexpression of a WOX3 in rice results in adaxial curling of leaf margins. Similarly, a WOX1 double mutant in rice exhibits reduced leaf blades and thickened leaf margins (Honda et al. 2018). WOX1 promotes cell proliferation (Tadege 2016) suggesting a loss or reduced-function polymorphism would reduce cell proliferation.

Zinger Finger Proteins (ZFPs)

The highest associated SNP marker was 1.8 kb from a ZFP2 (Aco015474.1). ZFPs form a large family of transcription factors with roles in plant development and stress response and appear conserved across plant evolution (Li et al. 2013). As in the case of WOX genes, ZFPs have also been implicated in leaf morphology in other species. Superman (SUP), one of the better known ZFPs affecting morphology, suppresses cell division at a specific stage and is associated with flower organogenesis and plant morphogenesis (Jiang et al. 2008). SUP overexpression in Nicotiana tabacum produces a percentage of plants with curled-up leaf margins and thickened roots (Nibau et al. 2011). In plants with moderate expression of SUP and curly leaves, the organisation of the adaxial/ abaxial mesophyll layers was disrupted with more cells and cells of variable shape throughout. Overexpression of a ZFP in rice, OsZHD1, induced abaxial curling due to an increase in the number and abnormal arrangement of bulliform cells (Xu et al. 2014). Other ZFPs, KNUCKLES and JAGGED, have also been shown to be involved in boundary maintenance and/ or cell proliferation. In both *Arabidopsis* and tomato, the KNUCKLES transcription factor indirectly represses WUSCHEL to allow a temporary inhibition of meristematic activity (Bollier et al. 2018). Ubiquitin E3 ligases are also ZFP family genes. Plant U-box E3 ligases have been implicated in plant development and morphology. As an example, a U-box E3 ligase mutation in barley has been associated with semi-dwarfing, wavy leaf margins and erect growth (Braumann et al. 2018). Cullin4-based E3 ligases are somehow involved in aspects of plant morphology given that mutation of the gene in *Arabidopsis* causes stunted growth and aberrant leaf shapes (Chen and Hellmann 2013).

Ras-related Protein Rab-8B

The Ras-related Rab-8B gene (Aco015473.1) is positioned only 4.0 kb from the highest associated SNP marker in panel one. Again, data in other species suggests a potential role in leaf margin phenotype in pineapple. The Rab GTPase family of proteins plays an important role in cell wall synthesis and modification through trafficking of cell wall polymers to specific target membranes. Cell wall synthesis and modification such as might occur during cell expansion, are integral to plant development and possibly architecture (Speth et al. 2009; Lycell 2008). A study in Arabidopsis looked at the membrane where RabA localizes, and in conjunction with down-regulation manipulation, demonstrated a corresponding change in cell shape (Kirchhelle et al. 2016). Following on from this it was postulated by Rahni and Birnbaum (2016) that Rab proteins might mediate local wall stiffness thus affecting cell shape and consequently tissue and organ morphology. This potential role in specific cell edge mechanics, rather than that of the entire cell wall, might have implications in pineapple piping leaf margin where a weakness in one edge might allow bending or folding, given growth and turgor pressure in surrounding tissues, especially if cell proliferation is increased in some surrounding tissues. Although not studied here, it might also explain the position and direction of spines.

Diversity Panel Two

Panel two results represent a difference between spiny-tip and piping leaf margin phenotypes. It is known that the piping margin is dominant over spiny-tip (Collins 1960). The results here (table two, table S3) suggest the piping margin plants might carry a polymorphism in either a WOX1, WOX2 and/ or ZFP that the spiny-tip plants do not. There is no difference between the genotypes represented in panel two with respect to the spiny-tip polymorphisms putatively associated in a previous study (Sanewski 2020). This suggests that both piping and spiny-tip genotypes in panel two carry the spiny-tip polymorphism. Because piping margin is dominant over spiny-tip, piping margin genotypes as derived in this diversity panel must have arisen from spinytip genotypes, not spiny genotypes.

Diversity Panel Three

Because panel three contains all three phenotypes, piping, spiny-tip and spiny, it is expected that the SNPs associated with both piping margins and spiny-tip will be identified as a difference between them and/or spiny margins. Accordingly, two main QTLs were identified (Table 3), both identical to those identified previously in panels one and two. Of some interest is the fact that three different WOX genes were found close to markers associated with piping margins. These were all positioned on chromosome 23 and some distance apart. WOX1 is positioned at 1,057,435–1,059,380 bp, WOX2 is at 738,739–739,215 bp and WOX5 is at 159,566–160,802 bp. There were no linkages observed between markers near these genes and, as such, it is assumed they are complimentary or independently functional. If we assume these different WOX genes are each independently associated with the piping margin phenotype, then they are likely independent selection events. The piping margin phenotype has therefore likely been selected multiple times rather than once. It is possible however, given the panels used here, that some of this selection has occurred in the post-Columbian period.

In the case of the largest and most diverse set of genotypes used here, panel three, SNP marker #54316030 was the most highly associated. This marker was close to a WOX1 and ZFP CONSTANS. When referenced against the spiny-tip 'Smooth Cayenne', piping genotypes were homozygous or heterozygous for a polymorphism. Spinytip and spiny genotypes were homozygous for the 'Smooth Cayenne' variant.

Leitão (2018), using a small F1 population, estimated the piping locus to be between 1,177,327 and 1,976,804 bp on chromosome 23. That study used an unrelated population and different mapping strategy but was in very good agreement thus supporting the current study. The QTL identified in that study was close to the second QTL found in the current study which was positioned close to a WUSCHEL related homeobox 1 (Aco007021.1) and Zinc finger CON-STANS-like protein (Aco007020.1). Nashima et al. (2022) used a fine mapping strategy to identify approximately the same QTL on chromosome 23 between positions 2,100,182 and 2,262,401 and nominated one of the same candidate WOX genes (Aco007021.1) with supporting RNAi data but described the gene as a WOX3 not a WOX1 as annotated in the reference genome (Ming et al. 2015).

In a previous study, Sanewski (2020) identified a QTL on chromosome six associated with the spiny-tip leaf margin.

The most likely causal gene was a ZEP, a precursor to ABA, although other genes including a MATE efflux were also implicated. A much larger diversity panel used in the current study comprised of many segregating populations and unrelated genotypes, and using additional analytical methods, but identified the same broad QTL for the spiny-tip phenotype thus validating the earlier study to some extent.

No major SNP markers associated with a piping margin were positioned on chromosome six near the spiny-tip loci in the current study. The piping margin phenotype is however known to suppress other leaf margin phenotypes. This suggests the piping leaf genes function upstream of the causal gene on chromosome six, as far as determination of leaf margin is concerned, or cause a morphological change that prevents spine development as well as induce marginal rolling in the case of piping specifically. What is evident is that piping does not usually occur with spines or spiny-tip. The putative WOX and ZFP polymorphisms are therefore upstream or dominant over the putative ABA pathway polymorphisms regarding leaf morphology.

There were no significantly associated markers identified in panel two genotypes (spiny-tip and piping) on chromosome six where the spiny-tip QTL has previously been shown to be positioned. This suggests there is no difference in the spiny-tip allele between spiny-tip and piping margin plants. This then suggests most of the piping margin plants might carry the same polymorphism for spiny-tip and therefore are descendants or closely related to a spiny-tip cultivar such as 'Smooth Cayenne'. As previously stated, it is believed the piping margin genetics incorporated into the genotypes represented in this study originated from 'Monte Lirio'. This suggests 'Monte Lirio' is related to a spiny-tip cultivar like 'Smooth Cayenne'.

Conclusion

All MLM and logistic regression models were in good agreement regarding the broad QTL and in most cases specific markers most significantly associated with piping leaf margin. Positions within 0.6-1.1 mb on chromosome 23 contained the most significantly associated loci using three logistic regression models, four mixed linear models and three diversity panels. In all three diversity panels, a WOX and ZFP were positioned close to the most significantly associated markers. While other significantly associated markers on other chromosomes were demonstrated, it is likely they are of less importance in most genotypes studied. It appears there are two discreet OTLs associated depending on the diversity panel. One QTL encompasses a WOX2 and ZFP2, the other a WOX1 and ZFP CONSTANS. It is highly probable a WOX and/ or a ZFP are the main gene(s) controlling the piping leaf margin in modern pineapple varieties that originate from the Hawaiian PRI pineapple breeding program. The only piping leaf margin variety used in that program was 'Smooth Guatemala' (*syn.* 'Monte Lirio') (PRI breeding records) and it is evident that this is the source of the piping phenotype in the current study.

The relatively high level of heterozygosity in pineapple, coupled with strong selection pressure for this trait by plant breeders and early domesticators has likely led to the accumulation of genes which play a role. This raises the possibility that other piping or smooth leaf genotypes not studied in detail here might possess a slightly different genetic determinism as geographical separation and sexual recombination has likely played a role in their development. Most polymorphisms exhibiting a highly significant association for the piping phenotype in this study are all positioned on chromosome 23.

Homologues of several of the proposed candidate genes are known to have functions in important plant processes other than plant morphogenesis in other species. Further study is needed to better understand the role of 'piping leaf genes' in not only that phenotype but also other plant functions important to horticulture.

Supplementary Information The online version contains supplementary material available at https://doi.org/10.1007/s12042-022-09317-7.

Acknowledgements The project was funded by Horticulture Innovation Australia Pty Ltd (Hort Innovation) using voluntary contributions from the Department of Agriculture and Fisheries and matched funds from the Australian Government.

Funding Open Access funding enabled and organized by CAUL and its Member Institutions.

Declarations

Conflicting Interests No potential personal funding, competing or conflicting interests are reported by the author.

Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons licence and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit http://creativecommons.org/licenses/by/4.0/.

References

- Bollier N, Sicard A, Leblond J et al (2018) AT-MINI ZINC FINGER2 and S1-INHIBITOR OF MERISTEM ACTIVITY, a conserved missing link in the regulation of floral meristem termination in *Arabidopsis* and tomato. Plant Cell. https://doi.org/10.1105/tpc. 17.00653
- Bradbury PJ, Zhang Z, Kroon DE et al (2007) TASSEL: Software for association mapping of complex traits in diverse samples. Bioinformatics 23:2633–2635
- Braumann I, Urban W, Preus A et al (2018) Semi-dwarf barley (*Hordeum vulgare* L.) *brh2* and *ari-I* mutants are deficient in a U-box ubiquitin ligase. Plant Growth Regul 86:223–234
- Campbell M, Momen M, Walia H, Morota G (2019) Leveraging values obtained from random regression models for genetic inference of longitudinal traits. The Plant Genome 12(2):8p. https://doi.org/ 10.3835/plantgenome2018.10.0075
- Chen L, Hellmann H (2013) Plant E3 ligases: Flexible enzymes in a sessile world. Mol Plant 6(5):1388–1404
- Chen H, Wang C, Conomos M et al (2016) Control for population structure and relatedness for binary traits in genetic association studies via logistic models. AJHG 98(4):653–666. https://doi. org/10.1016/j-ajhg.2016.02.012
- Chen J, Zhang Z (2017) User manual for intelligent prediction and association tool, version 1.3. https://doi.org/zzlab.net/iPat. Accessed on 07 Jan 2020
- Chen L-Y, Van Buren R, Paris M et al (2019a) The *bracteatus* pineapple genome and domestication of clonally propagated crops. Nat Genet 51:1549–1558. https://doi.org/10.1038/ s41588-019-0506-8
- Collins JL (1960) The pineapple. Botany, cultivation and utilization. Interscience Publishers Inc, New York.
- Coppens d'Eeckenbrugge G, Sanewski G (2011) Leaf margin in pineapple. Pineapple News 18: 32–37. https://www.ishs-horticulture. org/workinggroups/pineapple
- Coppens d'Eeckenbrugge G, Duval M-F, Leal F (2018a) The pineapple success story: From domestication to pantropical diffusion. In: Genetics and genomics of pineapple. Eds: Ming R. Springer Nature. Switzerland. 281
- Coppens d'Eeckenbrugge G, Duval MF, Leal F (2018b) Origin and evolution. In: The pineapple, 2nd edition; Botany, Production and Uses. Eds: Sanewski GM, Bartholomew DP and Paull RE. CABI Publishing. Oxfordshire 341
- Honda E, Yew C-L, Yoshikawa T et al (2018) LEAF LATERAL SYM-METRY1, a member of the WUSCHEL-RELATED HOME-OBOX3 gene family, regulates lateral organ development differentially from other paralogs, NARROW LEAF2 and NARROW LEAF3 in rice. Plant Cell Physiol 59(2):376–391
- Huang M, Liu X, Zhou Y, Summers RM, Zhang Z (2019) BLINK: A package for the next level of genome-wide association studies with both individuals and markers in the millions. Gigascience 8(2):giy154
- Jiang C-J, Sugano S, Takatsuji H (2008) An Arabidopsis SUPERMANlike gene, AtZFP12, expressed at shoot organ boundaries suppresses cell growth. J Plant Biol 51(6):413–417
- Kirchhelle C, Chow C-M, Foucart C, Neto H et al (2016) The specification of geometric edges by a plant Rab GTPase is an essential cell-patterning principle during organogenesis in *Arabidopsis*. Dev Cell 36:386–400
- Leitão JM (2018) Genetic mapping in pineapple. In: Ming R (ed) Plant Genetics and Genomics: crops and models. Genetics and Genomics of Pineapple. Springer, Cham. https://doi.org/10.1007/ 978-3-030-00614-3
- Li W-T, He M, Wang J, Wang V-P (2013) Zinc finger protein (ZFP) in plants A review. Plant Omics 6(6):474–480
- Liu X, Huang M, Fan B, Buckler ES, Zhang Z (2016) Iterative usage of fixed and random effect models for powerful and efficient

- Lycell G (2008) The role of Rab GTPases in cell wall metabolism. J Exp Bot 59(15):4061–4074. https://doi.org/10.1093/jxb/ern255
- Ming R, VanBuren R, Wai C-M et al (2015) The pineapple genome and the evolution of CAM photosynthesis. Nat Genet 47:1435–1442. https://doi.org/10.1038/ng.3435
- Money D, Gardner K, Migiovsky Z et al (2015) LinkImpute: Fast and accurate genotype imputation for non-model organisms. G3: Genes. Genomes, Genetics 5:2383–2390
- Nashima K, Shirawas K, Isobe S et al (2022) Gene prediction for leaf margin phenotype and fruit flesh color in pineapple (Ananas comosus) using haplotype-resolved genome sequencing. Plant J 110:720–734. https://doi.org/10.1111/tpj.15699
- Nibau C, Stilio VS, Wu H-M et al (2011) *Arabidopsis* and tobacco SUPERMAN regulate hormone signalling and mediate cell proliferation and differentiation. J of Exp Botany 62(3):949–961. https://doi.org/10.1093/jxb/erq325
- Noble TJ, Tao Y, Mace ES et al (2018) Characterization of linkage disequilibrium and population structure in a mung bean diversity panel. Front Plant Sci. https://doi.org/10.3389/fpls.2017.02102.
- Purcell S, Neale B, Todd-Brown K et al (2007) PLINK: A tool set for whole-genome association and population-based linkage analysis. Am J Hum Genet 81(3):559–575
- Rahman Z, Azam SM, Liu Y, Cheng Y (2017) Expression profiles of Wuschel-related Homeobox gene family in pineapple (*Ananas comosus* L.) Trop Plant Biol 10(4). https://doi.org/10.1007/ s12042-017-9192-9
- Rahni R, Birnbaum KD (2016) Plant cell shape: trafficking gets edgy. Dev Cell 36(4):353–354. https://doi.org/10.1016/j.devcel.2016. 02.005
- Sanewski G, Ko L, Innes D, Kilian A, Carling J, Song J (2017) DArTseq molecular markers for resistance to *Phytophthora cinnamomi* in pineapple (*Ananas comosus* L.) Australasian Plant Pathol 46(5): 499–509. https://doi.org/10.1007/s13313-017-0512-1

- Sanewski GM (2020) DArTseq molecular markers associated with the spiny-tip leaf margin in pineapple (*Ananas comosus* L.) Trop Plant Biol. https://doi.org/10.1007/s12042-019-09245-z
- Schwarz G (1978) Estimating the dimension of a model. Ann Statist $6(2){:}461{-}464$
- Segura V et al (2012) An efficient multi-locus mixed-model approach for genome-wide association studies in structured populations. Nat Genet 44(7):825–832. https://doi.org/10.1038/ng.2314
- Shenstone E, Cooper J, Rice B, Bohn M, Jamann TM, Lipka AE (2018) An assessment of the performance of the logistic mixed model for analyzing binary traits in maize and sorghum diversity panels PLoS One. https://doi.org/10.1371/journal.pone.0207752
- Somssich M, Je BI, Simon R, Jackson D (2016) CLAVATA-WUSCEL signalling in the shoot meristem. Development 143(18):3238–3248
- Speth EB, Imboden L, Hauck P, He SY (2009) Subcellular localization and functional analysis of the *Arabidopsis* GTPase RabE. Plant Physiol 149(4):1824–37. https://doi.org/10.1104/pp.108.132092.
- Tadege M (2016) WOX3 in the scene: intimacy with hormones. J Exp Bot 67(6):1605–1607. https://doi.org/10.1093/jxb/erw073
- Tang Y, Liu X, Wang J et al (2016) GAPIT version 2: An enhanced integrated tool for genomic association and prediction. The Plant Genome 9(2):1–9
- Van Raden PM (2008) Efficient methods to compare genomic predictions. J Dairy Sci 91:4414–4423
- Xu Y, Wu Y, Long Q et al (2014) Over-expression of OsZHD1, a zinc finger homeobox class homeobox transcription factor, induces abaxially curled and drooping leaf in rice. Planta 239(4):803–816. https://doi.org/10.1007/s00425-013-2009-7
- Zhang Z, Ersov E, Lai CQ et al (2010) Mixed linear model approach adapted for genome-wide association studies. Nat Genet 42(4):355–360

Publisher's Note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.