Discovery of Anthocyanin Acyltransferase1 (AAT1) in Maize Using Genotyping-by-Sequencing (GBS)

Michael N. Paulsmeyer,* Patrick J. Brown,[†] and John A. Juvik*

*Department of Crop Sciences, University of Illinois at Urbana-Champaign, Urbana, Illinois, 61801 and [†]Department of Plant Sciences, University of California at Davis, Davis, California, 95616 ORCID ID: 0000-0003-1332-711X (P.J.B.)

ABSTRACT The reduced acylation phenotype describes the inability of certain accessions of maize (Zea

mays [L.]) to produce significant amounts of acylated anthocyanins, which are typically the most abundant

pigments. Acylated anthocyanins are important for their association with stability and are therefore impor-

tant for the various industries using anthocyanins as natural colorants to replace synthetic dyes. Many

anthocyanin acyltransferases have been characterized in other species; however, no anthocyanin acyltrans-

ferases have been characterized in maize. Therefore, a mapping population was developed from a cross between mutant stock 707G and wild-type acylation line B73 to identify the locus associated with the reduced acylation trait. High-performance liquid chromatography was used to assay the pigment content and composition of 129 F₂ lines generated in the mapping population. Recessive alleles of *Colorless1*, *Colored1*, and the reduced acylation mutant all decreased anthocyanin content while *Intensifier1* increased anthocyanin content in aleurone tissue. The association of increased proportions of acylation with increased anthocyanin content indicates acylation may be important for increasing the stability of anthocyanins *in vivo*. Genotyping-by-sequencing was used to create SNP markers to map the reduced acylation locus. In the QTL analysis, a segment of Chromosome 1 containing transferase family protein GRMZM2G387394 was found to be significant. A UniformMu *Mu* transposon knockout of GRMZM2G387394 demonstrated this gene has anthocyanidin malonyltransferase activity and will therefore be named *Anthocyanin Acyltransferase1* (AAT1). AAT1 is the first anthocyanin acyltransferase characterized in a monocot species and will increase

KEYWORDS

Acyltransferase intensifier1 Acylation anthocyanins

Anthocyanins are the colorful molecules responsible for most of the red, blue, pink, and purple colors exhibited in plants. Anthocyanins are a diverse class of secondary metabolites with over 635 unique compounds discovered to date (He and Giusti 2010). The anthocyanin biosynthetic pathway is the most thoroughly studied secondary metabolite pathway in the plant kingdom (Irani *et al.* 2003). In maize, all the essential genes in the anthocyanin biosynthetic pathway have been cloned and sequenced to date, with *Purple aleurone1* completing the core pathway

our knowledge of all acyltransferase family members.

Supplemental material available at Figshare: https://doi.org/10.25387/g3.7108748.

(Sharma *et al.* 2011). However, the genes involved with increasing the diversity of anthocyanin compounds in maize have not all been discovered.

The most common modification to anthocyanins in maize is acylation. Acylation is the esterification of organic acids, usually coumaroyl or malonic acid, to the glycoside of an anthocyanin molecule (Zhao *et al.* 2017). Most interest in acylated pigments is for their role in stability. Acylation has been shown to increase the stability of the anthocyanin molecule under heat stress, intense light, and high pH under processing conditions (Zhao *et al.* 2017). *In vivo*, acylation sterically hinders enzymatic breakdown and nucleophilic attack under cytosolic and vacuolar conditions (Suzuki *et al.* 2002; Bakowska-Barczak 2005). Addition of acyl groups to anthocyanins directly increases anthocyanin content (AC) by enhancing anthocyanin solubility and increasing uptake into the vacuoles (Suzuki *et al.* 2002; Zhao *et al.* 2011). Acylated anthocyanins may also have a beneficial role in health promotion. In a study analyzing the effect of blue maize extracts on various cancer cell lines, certain acylated anthocyanins showed strong correlations with



Copyright © 2018 Paulsmeyer et al.

doi: https://doi.org/10.1534/g3.118.200630

Manuscript received August 1, 2018; accepted for publication September 18, 2018; published Early Online September 26, 2018.

This is an open-access article distributed under the terms of the Creative Commons Attribution 4.0 International License (http://creativecommons.org/ licenses/by/4.0/), which permits unrestricted use, distribution, and reproduction in any medium, provided the original work is properly cited.

¹Corresponding author: Email: juvik@illinois.edu

antiproliferation (Urias-Lugo *et al.* 2015). Overall, increasing proportions of acylated anthocyanins in plant extracts would benefit human health and benefit the industries seeking to use anthocyanins as natural alternatives to synthetic dyes like FD&C Red 40.

Maize pigment extracts are an abundant source of acylated anthocyanins. The proportions of these compounds is usually greater than half of the total anthocyanins according to a survey of pigmented maize accessions (Paulsmeyer et al. 2017). Some pigmented accessions in the survey, however, exhibited a unique phenotype referred to as "reduced acylation" where acylated anthocyanins were drastically reduced or missing. It is hypothesized that this phenotype may be involved with the anthocyanin acyltransferase (AAT) synthesizing these compounds (Paulsmeyer et al. 2017). The diverse family of AATs belong to the BAHD superfamily of acyltransferases that acylate many diverse secondary metabolites (D'Auria 2006). Fortunately, several AATs have been characterized to date in other plant species (Unno et al. 2007). Specificity of AAT function is limited to particular acyl group substrates and sites of acylation. In maize, the acyl group substrate is most often malonic acid. The primary site of acylation in maize is at the 6"-position of the 3-glucoside. The secondary site of acylation occurs on the 3"position to form various anthocyanidin 3-O-(3",6"-dimalonyl) glucosides. Only one enzyme with the capability to produce these compounds has been characterized and sequenced: Dendranthema × morifolium (Chrysanthemun morifolium) anthocyanidin 3-O-3'',6"-Odimalonyltransferase (Dm3MaT2) (Suzuki et al. 2004). Candidate AATs in maize should have some homology to Dm3MaT, although sequence identity among BAHD members can be as low as 25-34% (St-Pierre and De Luca 2000).

To map the locus associated with the reduced acylation phenotype, a mapping population was created by crossing B73, the maize reference line with normal acyltransferase function, to reduced acylation genetic stock 707G from the Maize Genetics Cooperation Stock Center (MGCSC; Urbana, IL, USA). High-performance liquid chromatography (HPLC) was used to phenotype the AC and composition in the 129 F₂ progeny generated from this cross. The same individuals were genotyped using a double restriction enzyme digest modification of genotyping-by-sequencing (GBS) to generate SNPs. Genotyping-by-sequencing is a high-throughput SNP genotyping protocol that reduces the complexity of the genome by only sequencing fragments associated with restriction enzyme cut sites (Elshire *et al.* 2011). The protocol allows for the use methylationsensitive restriction enzymes for enrichment of euchromatic regions and allows for hundreds of samples to be multiplexed in one sequencing run with the ligation of unique barcodes (Elshire et al. 2011). Presented here is a demonstration of how GBS can be effectively used to discover candidate genes even with small mapping populations and highly multiplexed individuals. The discovery of the AAT in this study, which will be designated Anthocyanin Acyltransferase1 (AAT1), helps expand our knowledge of the anthocyanin biosynthetic pathway in maize and also our knowledge of AATs in general.

MATERIALS AND METHODS

Plant Materials

Most reduced acylation mutants used in this study were first discovered in Paulsmeyer *et al.* (2017), but the list was expanded to include newly found mutant accessions M142X and M741I from the MGCSC, and Apache Red Cob from Siskiyou Seeds (Williams, OR, USA). UniformMu stock UfMu-09775 was donated by the MGCSC and was generated in a *Mutator* (*Mu*) transposon mutagenesis study

(McCarty et al. 2005). Genetic stock 707G was also donated by the MGCSC and was chosen as the reduced acylation mutant parent for the F₂ mapping population. B73 was chosen as the normal acylation parent, since the genome has been published for this line (Youens-Clark et al. 2011). All genetic stocks are available upon request by the corresponding author. Genetic stock 707G contributed many of the alleles for genes that influenced pigment production in the population. Photos of these traits can be seen in Figure S1. Pericarp color1 (P1) was responsible for the red/white cob phenotype. P1ww with white cobs was contributed by 707G, while functional allele *P1-wr* with red cobs was contributed by B73 (Grotewold *et al.* 1994). Genetic stock 707G contains a recessive Intensifier1 gene known to increase AC in aleurone tissues when recessive (Burr et al. 1996). The stock also donated functional copies of two transcription factors that are required for aleurone pigmentation: Colorless1 (C1) and Colored1 (R1) (Andorf et al. 2010). 707G was selfed for three generations before crossing to B73, meaning it was not fully inbred (M. Sachs, personal communication, August 1, 2018). The cross between B73 and 707G was made in a winter nursery and pigmented F₂ kernels were grown the next summer with 7.62 m plots spaced 0.76 m apart at the University of Illinois Vegetable Research Farm (40° 04' 38.89" N, 88° 14' 26.18" W). These plants were selfed to generate F_{2:3} kernels for analysis. Harvested ears were dried in a forced air dryer at \sim 38° for five days before further analyses.

HPLC Analyses

Approximately 50 F2:3 colored kernels of each F2 family were ground with a coffee grinder into a fine powder. Samples containing less than 50 kernels had approximately half of their colored kernels sampled. Following the extraction procedure from Paulsmeyer et al. (2017), a 2.0 g subsample of corn powder was added to 10 mL ACS reagent grade 2% (ν/ν) formic acid within a 15 mL centrifuge tube. The mixture was extracted overnight in the dark on an Innova 4000 incubator shaker (New Brunswick Scientific, Edison, NJ, USA) set at room temperature and 200 RPM. Extracts were filtered through a 25 mm 0.45 µm Millex Millipore (EMD Millipore, Merck KGaA, Darmstadt, Germany) LCR PTFE Syringe Filter after centrifugation at approximately 7500 x g on a Beckman J2-21M floor centrifuge with a JA-20.1 rotor (Beckman Coulter, Inc, Brea, CA, USA). For the UniformMu cross analyses, single kernels (\sim 0.2 g) were ground and extracted overnight in 5 mL 2% (ν/ν) formic acid as above. A 20 µL aliquot of each extract was injected into a Hitachi L-7200 HPLC (Hitachi High Technologies, Inc. Schaumburg, IL, USA) equipped with a Grace Prevail (W. R. Grace & Co., Columbia, MD, USA) C₁₈ 5 μ m analytical column (250 mm × 4.6 mm) and a Hitachi L-7455 Diode Array Detector quantifying absorbances at 520 nm. The column was heated to a constant 30.0°. The mobile phase consisted of 2% formic acid and 100% HPLC grade acetonitrile at a flow rate of 1 mL/min in the following linear gradient: 15% acetonitrile at 0 min, 30% acetonitrile at 10 min, and 15% acetonitrile at 15 min. After each sample, the column was allowed to equilibrate with 15% acetonitrile for 10 min. Samples were all run twice and averaged.

Identification of Anthocyanins

Pigment identification was inferred from the method used in Paulsmeyer *et al.* (2017). A list of identified compounds in this study is in Figure 1. One limitation of this method is that several unknown compounds would co-elute with peonidin 3-glucoside (Pn3G; Figure 2). All peaks found under Pn3G would be summed together to simplify quantification. In addition, an unidentified peak arbitrarily labeled "ID #6" would appear next to pelargonidin 3-(6"-malonyl) glucoside (Pg3MG; Figure 2). This



Figure 1 Structure of the most common anthocyanin molecules in maize. R1:H, R2:H, R3:H = Pelargonidin 3-Glucoside (Pg3G, ID #2); R1: OH, R2:H, R3:H = Cyanidin 3-Glucoside (C3G, ID #1); R1:CH₃, R2:H, R3: H = Peonidin 3-Glucoside (Pn3G, ID #3); R1:H, R2:malonyl, R3:H = Pelargonidin 3-(6"-malonyl)glucoside (Pg3MG, ID #5); R1:OH, R2: malonyl, R3:H = Cyanidin 3-(6"-malonyl)glucoside (C3MG, ID #4); R1: CH₃, R2:malonyl, R3:H = Peonidin 3-(6"-malonyl)glucoside (C3MG, ID #4); R1: CH₃, R2:malonyl, R3:H = Peonidin 3-(6"-malonyl)glucoside (Pn3MG, ID #7*); R1:H, R2:malonyl, R3:malonyl = Pelargonidin 3-(3",6"-dimalonyl) glucoside (Pg3DMG, ID #8); R1:OH, R2:malonyl, R3:malonyl = Cyanidin 3-(3",6"-dimalonyl)glucoside (C3DMG, ID #7*); R1:CH₃, R2:malonyl, R3: malonyl = Peonidin 3-(3",6"-dimalonyl)glucoside (Pn3DMG, not detected). **Pigments co-elute and cannot be separated*.

peak was considered as a separate acylated anthocyanin compound because it eluted with other known acylated anthocyanins. This peak may be an isomer of an identified acylated anthocyanin.

Phenotypic Evaluation

The Hitachi HPLC System Manager 4.0 software was used to integrate chromatogram peak areas. Phenotypes for individual anthocyanin compounds used these peaks areas as a measure. Anthocyanin content (AC) was quantified using the Maíz Morado external standard method in Paulsmeyer et al. (2017). The AC of Angelina's Gourmet Maize Morado (Swanson, CT, USA) was determined to be 1000 mg/kg using cyanidin 3-glucoside (C3G) standard purchased from Phytolab GmbH & Co. (Vestenbergsgreuth, Germany) in a concentration gradient of 1 -1000 µg/ml. The percentage of acylated anthocyanins of total anthocyanins was chosen as the phenotype to best describe reduced acylation mutants. Acylation percentage was calculated by summing peak areas of all acylated compounds in the sample, then dividing those by the total integrated area of the chromatogram and multiplying by 100. Alleles of R1 were scored as 1/0 for the presence or absence of speckled kernels, respectively. The speckling phenotype is due to imprinting and forms when aleurone receives one R1 allele from the pollen parent in a female r1r1 endosperm (Kermicle 1970). The presence of recessive C1 alleles was scored if the sample had yellow kernels without speckling, or if the proportion of colorless kernels per ear was approximately 50%.

GBS Library Construction

Tissue from six to eight germinating $F_{2:3}$ seedlings was collected into 1.2 mL microtiter tubes from the developing leaf whorl one week after planting. The six to eight $F_{2:3}$ kernels used to represent F_2 plants were chosen to emulate the sample from which they came in terms of pigmentation. A CTAB extraction protocol optimized for 96-well plates was used to isolate DNA. DNA quantification was completed using the PicoGreen assay (Molecular Probes, Eugene, OR). The GBS protocol outlined by Elshire *et al.* (2011) was used for library construction with a double restriction enzyme modification from Poland *et al.* (2012). Restriction enzymes chosen for library construction were *Hin*P1I and *Pst*I. In addition to the 129 samples from the reduced acylation mapping population, 201 other samples from an independent experiment were multiplexed during sequencing for 330 total samples. The independent population was for a separate mapping population not described here. Libraries were read in one sequencing lane on an Illumina HiSeq 2500 System (San Diego, CA, USA) at the Roy J. Carver Biotechnology Center at the University of Illinois in Urbana, IL, USA.

SNP Discovery Pipeline

Genetic markers in the population were generated using the TASSEL 5.0 GBS v2 pipeline (Bradbury et al. 2007). Bowtie 2 (Langmead and Salzberg 2012) was used to align fragments to Zea mays B73 reference genome version 3 (Youens-Clark et al. 2011). Minor allele frequency (MAF) was set to 0.05. This resulted in 4,660,000 total SNPs for all 330 samples. Missing data ranged from 13.2 to 99.7% per sample. Samples with greater than 80% missing data were excluded. This changed the dataset to 328 samples, with one sample being lost from the reduced acylation population. The overall proportion of missing sites in the dataset was 36.32%. Next, insertion-deletions were removed and imported into Beagle 4.1 (Browning and Browning 2016). The options defined in Beagle 4.1 were a window length of 200 and a step size of 50. After imputation, the reduced acylation population was separated from the independent mapping population within TASSEL 5.0. A MAF of 0.05 was applied once again to the imputed SNPs resulting in a total of 8062 SNPs per sample for the reduced acylation population. Markers per chromosome ranged from 584 for Chromosome 10 to 1212 for Chromosome 1. Alleles were converted in TASSEL 5.0 to numerical genotypes 1 vs. 0 for major vs. minor or 0.5 for heterozygotes based on allele frequency in the population. Since 707G was a genetic stock and not completely inbred, some sites had



Figure 2 HPLC chromatograms of wild type and reduced acylation samples. A) Wild type profile with the structure of cyanidin 3-(6"-malonyl) glucoside inset. B) Profile of a reduced acylation mutant with the structure of cyanidin 3-glucoside inset. *Note*: Peak labels correspond to the "ID #" listed in Figure 1.

three to four alleles, which were considered minor alleles. Numerical genotypes were multiplied by two to remove decimals and imported into R (R Core Team 2015) to perform QTL analyses.

Statistical Analyses

To determine if genes of interest (C1, In1, P1, R1, and the reduced acylation mutant) were significantly altering the concentrations of individual pigments or total AC, ANOVAs were calculated using either Proc Reg or Proc Mixed in SAS 9.4 (SAS institute Inc., Cary, NC, USA) depending on the outputs needed. C1, P1, R1, and reduced acylation mutants were coded as 0 or 1 depending on if the sample contained dominant or homozygous recessive alleles, respectively, based on the phenotypes previously described. Genotypes of In1 were inferred from alleles at the most significant site in the QTL analysis for log-transformed AC. All genes of interest were included in a linear model in Proc Reg to determine significance. Genes that were statistically significant were regressed to AC in Proc Reg to estimate the change in AC attributed by the significant genes. Variance components for the statistically significant genes of interest and the proportion of variation attributed by each gene were calculated in Proc Mixed with method equal to Type 3 using each gene as a random independent variable. All QTL analyses were run using the linear model (lm) function in R (R Core Team 2015) using phenotypes as the dependent and SNPs as the independent variable. A stepwise QTL analysis was used to find significant markers involved with the phenotype of interest. The first model run would assume a single QTL. The most significant marker from a single-QTL model would then be used as a covariate (\mathbf{Q}) and the process repeated until no more markers were significant. The general model for stepwise QTL analysis is shown in Equation 1. The term $\sum_{k=2}^{p} \beta_{k} Q_{ki}$ represents the summation of the kth significant marker as a covariate for p covariates, while $\beta_1 SNP_i$ represents the numerical genotypes at a SNP site.

Equation 1: Phenotype =
$$\beta_0 + \beta_1 SNP_i + \sum_{k=2}^{p} \beta_k Q_{ki} + \varepsilon_i$$

The threshold for significant marker *p*-values in Equation 1 was determined by a Bonferroni correction of $\alpha = 0.05/n$ where *n* is the number of SNPs (n = 8062) and 0.05 is 95% confidence. All figures were generated in R (R Core Team 2015). All supplementary material, custom code, and datasets are available at https://figshare.com/projects/Discovery_of_Anthocyanin_Acyltransferase1_AAT1_in_maize_using_genotyping-by-sequencing_GBS_/38900.

Data availability

The authors affirm that all data necessary for confirming the conclusions of this article are represented fully within the article and its tables and figures. Supplemental material available at Figshare: https://doi.org/10.25387/g3.7108748.

RESULTS

Inheritance of the Trait

Ten accessions have been found to date that exhibit the reduced acylation trait. Pedigree analysis determined that all the reduced acylation MGCSC stocks are all derived from E. Coe's *in1* genetic stocks developed in 1965 (E. Coe and P. Stinard, personal communication, August 1, 2018). The remaining stocks (50%) are all from diverse backgrounds suggesting that the mutation has occurred several times independently. The reduced acylation trait has no visual effect on the

kernel phenotype, so selection for this trait is apparently indirect in these accessions. Reciprocal crosses of reduced acylation accessions to wild-type accessions returned normal acylation abundance meaning the trait is recessive to normal acylation. Several reduced acylation accessions were then crossed with each other to see if the trait was determined by the same loci in every accession. Accessions Ames 14276, Jerry Peterson Blue Dent, M142X, M741I, and X19EA failed to return normal acylation abundance when crossed to mapping population parent 707G indicating they are allelic.

Summary of Mapping Population Phenotypes

In the mapping population, 129 F₂ individuals generated kernels for phenotyping and sequencing. Prior to sequencing, the reduced acylation mutants in the population were defined visually based on trends in the histogram for percentage of acylation (Figure 3). A few samples were intermediate in acylation percentage but the cutoff for a reduced acylation mutant was defined as less than 50% acylation based on the bimodal distribution seen in the histogram. The summary of all visual phenotypes and inferred In1 genotypes is in Table 1. There were 32 progeny in the population displaying the reduced acylation phenotype, which is exactly the number of recessive samples expected for a population segregating at a single, recessive locus. The overall percentage of acylation in the wild-type samples averaged 70.8% while the mutant samples maintained an average of 15.0%. The overall population mean for AC was 96.2 mg/kg. The distribution of AC was skewed right (Figure 3) indicating that in1 had a profound affect on AC in this population. Since a new HPLC method was used in this study, the coefficient of variation (CV) was calculated to determine repeatability. Coefficient of variation was calculated by dividing the standard deviation of AC for the replicates by the sample mean. The overall average CV was 3.09% confirming the method is acceptably reproducible. To see which loci had an effect on AC, a linear regression was modeled using all loci as random, independent variables. All variables except P1 were significant at P < 0.05. Parameter estimates from the model calculate that in1 raises AC an estimated 105.4 mg/kg while reduced acylation, r1, and c1 lower AC 23.3 mg/kg, 24.2 mg/kg, and 29.1 mg/kg, respectively. The lowest AC sample was 11.84 mg/kg in a C1c1/R1r1/ In1X reduced acylation plant and the highest was 369.54 mg/kg in a C1C1/R1R1/in1in1 wild-type plant.

Identification of Candidate Anthocyanin Acyltransferases

Since the most likely candidate for an AAT in maize should have anthocyanidin dimalonyltransferase activity, the dimalonyltransferase from chrysanthemum, Dm3MaT2 (Suzuki et al. 2004), was used as a query to find candidate AATs in blastp. The blastp search found seventeen candidates in maize with 25% or greater identity and 15% or greater query coverage in the reference proteins database. The seventeen candidates were aligned in COBALT (Papadopoulos and Agarwala 2007) using defaults. The candidates all showed close homology to the three motifs that are present in acyltransferases: HXXXD (Motif 1), DFGWG (Motif 2), and NYFGNC (Motif 3) (Suzuki et al. 2002). Motif 3 is an AAT-specific motif. Protein sequences were filtered on whether they contained Motif 3 present in chrysanthemum's three functional anthocyanin malonyltransferases: XYF/LGNC (Suzuki et al. 2004). This filter resulted in nine candidate sequences (Table 2). Among these candidates, four were annotated as predicted AATs. One was even annotated as an anthocyanidin 3-O-glucoside 6"-O-malonyltransferase. The remaining five candidates were uncharacterized proteins or transferase family proteins.



Figure 3 Histograms of two important phenotypes in the reduced acylation mapping population. (Left) anthocyanin content and (Right) percentage of acylation.

QTL Analyses of Mapping Population Phenotypes

The GBS library constructed from the 129 individuals of this mapping population resulted in 128 genotypes with 8062 SNPs per genotype. SNPs were more prevalent in areas near the ends of chromosomes, but generally, the entire genome was represented. The average distance between SNPs in the final dataset was 255 Kb. Distance between SNPs under 1 Mb apart accounted for 95% of the dataset while 17.8% of those were under 1 Kb apart. Several control traits were mapped to assess the accuracy and robustness of the SNP dataset before the reduced acylation trait was mapped. The control loci-C1 (Paz-Ares et al. 1987), In1 (Burr et al. 1996), P1 (Grotewold et al. 1994), and R1 (Dellaporta et al. 1988)-segregating in the population have been previously mapped, sequenced, and characterized. The log-transformation of AC was used as the phenotype to map In1, since the distribution was skewed (Figure 3). Figure 4 shows the Manhattan plots generated from the four control traits. The most significant SNP correlations always corresponded to the known location of each gene. The most significant marker for *In1*, with a -log10 p-value of 21.36, was only 134 bp away from coding sequence. The most significant SNPs for loci P1, C1, and R1 were 642 Kb, 1.7 Mb, and 637 Kb away, respectively (Andorf et al. 2010).

The control genes validated the robustness of the genotype dataset so that the reduced acylation phenotype could be mapped with high confidence. The phenotype chosen to represent the reduced acylation trait was percentage of acylation, since proportions of compounds were not affected by *in1*. The most significant marker with a $-\log_{10} p$ -value of 18.7 was at position 298,042,277 of Chromosome 1 (Figure 5). The Bonferroni correction established a 22.3 Mb interval of significant markers from positions 279,188,074 to 301,476,924 (the end of Chromosome 1). The significant genomic region for the reduced acylation trait spanned only one of the candidate genes from Table 2. The candidate transferase gene designated GRMZM2G387394 in B73 reference genome version 3 is at position 300,173,138 of Chromosome 1 (Figure 5).

Pigment concentration of the grain is a trait breeders developing high anthocyanin-yielding varieties are seeking to improve. To find genomic regions associated with AC other than the transcription factors known, a model was fit with *In1* genotypes as a covariate and both log-transformed AC and raw AC as responses using Equation 1. No

significant markers could be distinguished from both models at the significance threshold established by the highly conservative Bonferroni correction, so the significance threshold was relaxed to $P < 1 \times 10^{-4}$ in accordance with Li *et al.* (2016). With untransformed AC, a SNP on Chromosome 7 was most significant at position 144,238,875 (Figure 6). Near this marker is *MYB152*, a transcription factor that has been shown to correlate with *PAL* expression (Agarwal *et al.* 2016). When both *In1* and the SNP on Chromosome 7 were considered, SNP position 137,169,800 on Chromosome 9 became significant (Figure 6). No obvious gene candidates surrounding this marker could be found at this time.

In addition to AC, QTL analyses were run on individual compounds distinguished by HPLC. All compounds besides Pn3G and pelargonidin 3-(3'',6''-dimalonyl) glucoside (Pg3DMG) had two significant QTL corresponding to AAT1 and In1 (Figure S2). Pn3G and Pg3DMG had one significant QTL at the site of In1. When Pn3G was modeled with In1 as a covariate using Equation 1, SNP markers spanning R1 became significant. Only one significant locus could be found with Pg3DMG. The inability to detect more significant regions was most likely because only 26 samples had detectable amounts of Pg3DMG.

Variance components for each AC-altering locus were estimated for all anthocyanin phenotypes to determine the phenotypic variation attributed to each loci (Table 3). The gene that explained the most variance in AC for this population was *In1* (64.7%), while *R1*, *C1*, and the reduced acylation trait accounted for 3.02%, 4.56%, and 2.67% of the total variance, respectively. In general, *In1* explained the highest proportion of variance for all compounds and ranged from 28.1 to 56.5%. The lowest proportion of variance that could be detected as a significant QTL was 5.55% for *R1* with Pn3G.

QTL Simulation

The dataset was sampled and simulated to determine the lowest number of samples possible to confirm a QTL. The two traits assessed were the presence of speckled kernels (*R1* phenotype, Figure S1) and percentage of acylation. Speckled kernels were represented in 75 of the 128 genotyped samples, while 32 of the 128 genotyped samples were determined to have the reduced acylation trait. Subsamples of 20, 40, 60, 80, and 100 genotypes were selected at random from the dataset. Sampling was

Table 1 SUMMARY OF PHENOTYPES IN THE MAPPING POPULATION

	Allele	Reduced Acylation	In1	R1	C1	P1	Total
AC (mg/kg)	Dominant	103.40	71.17	112.70	107.52	98.66	96.19
	Recessive	74.35	178.80	83.92	87.23	89.30	
Acylation (%)	Dominant	70.79	56.56	58.28	55.32	57.12	56.92
	Recessive	15.02	58.27	55.98	58.26	56.37	
Recessive Count		32	30	75	72	34	129

Table 2 CANDIDATE AATs IN MAIZE AFTER FILTERING

Gene Annotation	Gene Identifier (B73 RefGen_v3)	Chr	Start Position	End Position
Transferase	GRMZM2G387394	1	300173138	300174772
Malonyl-CoA:anthocyanin 5-O-glucoside-6'''- O-malonyltransferase-like	GRMZM2G341253	2	165106367	165108162
Anthocyanin 5-aromatic acyltransferase	GRMZM2G075513	4	170843898	170845760
Malonyl-CoA:anthocyanidin 5-O-glucoside-6'''- O-malonyltransferase-like	GRMZM2G316787	4	174072855	174074677
HXXXD-type acyltransferase	GRMZM2G382785	5	50372211	50374054
HXXXD-type acyltransferase	GRMZM2G436404	6	19122956	19124662
Anthocyanidin 3-O-glucoside 6''- O-acyltransferase-like	GRMZM2G095340	6	72337117	72341167
Transferase family protein	GRMZM5G800407	10	142328397	142330129

Candidates were filtered based on homology to Dm3MaT2. Sequences had to have greater than 25% identity, greater than 15% coverage, and amino acid motif XYF/LGNC.

repeated 100 times for each subsample of genotypes. The ability to detect QTL was arbitrarily defined as the most significant SNP above the Bonferroni significance threshold ($P < 6.203 \times 10^{-6}$) being only 10 Mb away from the known locus. The summary of the simulation is presented in Table 4. For the R1 locus, forty samples were sufficient to pinpoint R1 100% of the time within 10 Mb. The average distance of the most significant SNP from the R1 locus for the forty samples was 1.62 Mb away. Of the 20-genotype simulations, 39% significantly pinpointed the locus within 10 Mb, while 36% were considered false positives. The average *p*-value for the significant markers ranged from a -log10 p-value of 10.72 to 63.47. The high p-values associated with the 20-genotype subsamples may be due to ascertainment bias. For percentage of acylation, the QTL could be detected 100% of the time with only sixty samples. The average distance from the candidate acyltransferase for sixty samples was 2.27 Mb. In 37% of the simulations, the reduced acylation QTL could be mapped to the correct location with only twenty genotypes. One simulation was able to establish

significance with only three of twenty reduced acylation mutants. The average significance for percentage of acylation ranged from 6.57 to 15.15 –log10 *p*-value. The reduced acylation simulation had more false positives then the *R1* locus. For the 40-genotype and 20-genotype subset, 6% and 25% of the significant markers were considered false positives, respectively.

UniformMu Knockout of GRMZM2G387394

To determine if the candidate acyltransferase on Chromosome 1 was associated with the formation of acylated anthocyanins, a UniformMu stock (McCarty *et al.* 2005), designated UfMu-09775, with a *Mutator* (*Mu*) transposon insertion within GRMZM2G387394 was crossed to reduced acylation mutant 707G. UfMu-09775 was heterozygous for the insertion and would theoretically confer the mutant phenotype in 50% of the kernels crossed to 707G. In the cross, 14 of 25 F₁ kernels exhibited the reduced acylation phenotype, which is indicative of the 50% ratio expected (χ^2 test, H₀ = 50%, *P* = 0.5485). Therefore, it can be concluded



Figure 4 Manhattan plots for known genes segregating in the mapping population. All major QTL correspond to the known location of each gene (Andorf et al. 2010).



Figure 5 Reduced acylation locus Manhattan plot.

that GRMZM2G387394 is at least required for anthocyanidin 3-Oglucoside 6"-O-malonyltransferase function in maize and is responsible for the reduced acylation phenotype. Given this knowledge, GRMZM2G387394 from now on will be designated *Anthocyanin Acyltransferase1* or *AAT1*.

Phylogenetics of Acyltransferase Members

At least nineteen flavonoid acyltransferases have been characterized to date (Unno *et al.* 2007; Kim *et al.* 2009). All characterized flavonoid acyltransferases are from eudicot species with the exception of one flavonoid malonyltransferase in *Oryza sativa* (Kim *et al.* 2009). The bootstrap consensus neighbor-joining phylogenetic tree constructed in Mega7 of sixteen known flavonoid acyltransferases with the maize candidate acyltransferase is shown in Figure S3 (Felsenstein 1985; Kumar *et al.* 2016; Saito and Nei 1987). Monocots formed their own clade and the phylogenetic tree otherwise matched previously reported phylogenies (Unno *et al.* 2007). The monocot clade is more closely related to the other malonyltransferases than the 5-O-glucoside or aromatic AATs. Unno *et al.* (2007) demonstrated that Thr-35, Leu-37, Ala-38, and Gln-51 are all important acyl-acceptor binding sites in Dm3MaT2. In maize, AAT1 Leu-37 and Ala-38 are conserved, while Gln-51 is functionally similar to Ser-69 in AAT1. Thr-35 is not present

in AAT1. Three additional amino acids in Dm3MaT2—Tyr-411, Ala-413, and Lys-419—were required for AAT function as well (Unno *et al.* 2007). All but Lys-419 had structurally similar counterparts in AAT1. Due to the low identity between AAT1 and Dm3MaT2, functional domains of AATs can be inferred and should be investigated for future studies.

DISCUSSION

The reduced acylation phenotype in maize is due to anthocyanin acyltransferase *AAT1* and had a significant effect on AC in the mapping population. This finding agrees with the hypothesis that aliphatic acylation has a role in protecting the anthocyanin molecule. Therefore, increasing the proportion of acylated anthocyanins could have a positive influence on increasing AC *in vivo*. In addition to the reduced acylation mutant allele of *aat1*, *In1*, *C1*, and *R1* all have a significant effect on AC. The quantifiable change in AC associated with alleles of each of these anthocyanin regulators has, to the best of our knowledge, never been studied. Here only pigmented kernels were sampled for *C1* and *R1*, which will bias the results toward higher AC. Despite this, significant differences could be found among the combinations of each gene regulator. The effect of *In1* may be inexact, given the genotypes of *In1* were inferred from low-coverage SNP sites where heterozygotes



Figure 6 Manhattan plots for step-wise QTL analysis of anthocyanin content. *Left*:anthocyanin content QTL with *in*1 as a covariate and a $P < 1 \times 10-4$ significance threshold. *Right*: anthocyanin content QTL with *in*1 and S7_144238875 covariates and a $P < 1 \times 10-4$ significance threshold.

Table 3 PROPORTION OF VARIANCE ATTRIBUTED	O EACH CONTROL LOCI FOR EACH ANTHOCYANIN COMPOUND
---	---

Compounds	In1 (%)	C1 (%)	R1 (%)	Reduced Acylation (%)	Residual (%)
C3G	35.32 ***	2.20 *	0.53	37.96 ***	23.99
C3MG	36.91 ***	2.45 *	2.26 *	34.43 ***	23.94
Peak ID #6	40.42 ***	2.35 *	0.62	23.26 ***	33.36
Pg3DMG	28.08 ***	0.97	3.40 *	8.14 *	59.41
Pg3G	42.11 ***	1.82 *	1.24 *	29.97 ***	24.87
Pg3MG	40.20 ***	2.55 *	2.28 *	25.32 ***	29.65
Pn3G	56.47 ***	5.55 **	5.55 **	0.38	32.04
Pn3MG	31.93 ***	2.38 *	3.22 *	37.45 ***	25.02
AC	64.66 ***	4.56 **	3.02 *	2.67 *	25.09

*** P < 0.0001 significance, ** P < 0.001 significance, * P < 0.05 significance.

may have been miscalled. The high significance $(-\log 10 p - value 21.36)$ and relative proximity (134 bp away from the transcription start site) of the most significant marker for log-transformed AC along with the approximate 1:3 Mendelian ratio of homozygous recessive *in1* genotypes to dominant *In1* genotypes provide evidence that inferred *In1* genotypes may be accurate.

GBS is a simple and robust method for reduced representation sequencing. The ability to multiplex 384 or more samples per sequencing run greatly reduces costs. In addition, all steps from DNA extraction to library constriction can be completed in 96-well plate format, which helps maximize efficiency. In this study, 330 samples from two independent mapping populations were analyzed in one sequencing lane. A problem with many highly multiplexed GBS datasets is the amount of missing and incomplete data due to low-coverage sequencing (Swarts et al. 2014). In the initial dataset with 330 samples, two samples were discarded that had missing data over 80%. These samples most likely failed in the PCR or ligation steps of GBS library preparation. The amount of missing data has implications on how imputation fills in SNPs. Despite the uncertainty in variant calling, imputation has been shown to increase power to detect QTL (Fragoso et al. 2016). Missing data not only has an effect of imputation but also on heterozygote calling. Phenotypes may not correlate with SNP markers even though flanking markers are highly significant. This issue is apparent in Manhattan plots. Log-transformed AC had the largest QTL and spanned 269 SNPs. Of those, only 155 SNPs were significant with the Bonferroni significance threshold. In contrast, ascertainment bias from lowcoverage sequences resulted in some false positive associations for some control traits. The conservative Bonferroni threshold should

Table 4 QTL SIMULATION STUDY

control false positives, but even in *P1*, a single marker on a different chromosome was significant (Figure 4). Overall, the effect of missing data and incorrectly called bases is seemingly negligible for this study since the most significant SNP markers for each control loci aligned correctly and only a single significant region was found for the reduced acylation trait.

Numerous significant marker associations may be a problem if several candidate genes resided within a single QTL. In this study, the QTL for reduced acylation only spanned a single candidate, so the width was acceptable. In the future, a new mapping approach based on linkage between markers, like bin-mapping, may be necessary to establish thresholds to differentiate candidates and establish a narrower confidence interval (Chen et al. 2014). Recombination rate in this population is partially to blame for the large number of significant markers. With more recombination events, smaller areas in the genome will remain correlated to the trait due to the breakage of linkage blocks. More recombination events can be introduced with a greater population size. For example, in a study that analyzed F₂ progeny for grain yield traits, the R1 gene was also mapped as a control, but used 611 progeny. R1 was fine-mapped to an approximately 700 Kb confidence interval, as opposed to the 27.0 Mb interval between significant markers presented here (Chen et al. 2014). In addition to increasing population size, intermating the F2 genotypes could have been a way to increase recombination events. This scheme was utilized to develop the intermated B73 x Mo17 (IBM) population in maize that is used extensively for mapping traits (Lee et al. 2002; Eichten et al. 2011). Intermating requires additional generations, which is one reason it was not utilized here.

Sample	Within	False	Avg. Proportion	Min. Proportion	Avg. <i>p</i> -value	Avg. Distance From Known
Size	10 Mb*	Positives	Recessive *	Recessive *	(–log10) *	Locus (bp) *
20	39%	36%	58.7%	40.00%	63.47	8,994,347
40	100%	0%	56.1%	37.50%	10.72	1,623,113
60	100%	0%	57.83%	46.67%	15.12	748,586
80	100%	0%	57.89%	51.25%	19.38	678,954
100	100%	0%	57.77%	53.00%	23.88	675,179
Sample	Within	False	Avg. Proportion	Min. Proportion	Avg. <i>p</i> -value	Avg. Distance From Known
Size	10 Mb*	Positives	Recessive *	Recessive *	(-log10) *	Locus (bp) *
Sample	Within	False	Avg. Proportion	Min. Proportion	Avg. <i>p</i> -value	Avg. Distance From Known
Size	10 Mb*	Positives	Recessive *	Recessive *	(-log10) *	Locus (bp) *
20	37%	25%	27.8%	15.00%	6.57	5,703,808
Sample	Within	False	Avg. Proportion	Min. Proportion	Avg. <i>p</i> -value	Avg. Distance From Known
Size	10 Mb*	Positives	Recessive *	Recessive *	(-log10) *	Locus (bp) *
20	37%	25%	27.8%	15.00%	6.57	5,703,808
40	85%	6%	24.9%	12.50%	7.80	2,790,210
Sample	Within	False	Avg. Proportion	Min. Proportion	Avg. p-value	Avg. Distance From Known
Size	10 Mb*	Positives	Recessive *	Recessive *	(-log10) *	Locus (bp) *
20	37%	25%	27.8%	15.00%	6.57	5,703,808
40	85%	6%	24.9%	12.50%	7.80	2,790,210
60	100%	0%	24.7%	16.67%	10.30	2,269,732
Sample	Within	False	Avg. Proportion	Min. Proportion	Avg. p-value	Avg. Distance From Known
Size	10 Mb*	Positives	Recessive *	Recessive *	(-log10) *	Locus (bp) *
20	37%	25%	27.8%	15.00%	6.57	5,703,808
40	85%	6%	24.9%	12.50%	7.80	2,790,210
60	100%	0%	24.7%	16.67%	10.30	2,269,732
80	100%	0%	25.2%	17.50%	12.49	2,111,612

* Only if significant with a Bonferroni correction at $-\log 10(p) \ge 5.2074$ and in the right location (within 10 Mb)

Despite the low SNP coverage relative to other GBS studies, the mapping population was able to map traits with one to three loci. The simulation here showed that QTL could be confirmed with as little as forty to sixty samples depending on the proportion of the recessive allele (Table 4). The power to correctly detect QTL is best when the dominant/recessive phenotypes are in nearly even proportions. The high power of detection presented here is in direct contrast to a previous study that could only establish significance for a single-locus trait at a chromosome-wide scale with 91 samples (Heffelfinger *et al.* 2014).

For quantitative traits, the ability to detect multiple QTL is important. More than three QTL could not be found in this mapping population since in1 and aat1 explained most of the variability in most traits. The possible number of QTL all depends on the nature of the trait of interest. If the trait is highly heritable and controlled by many genes with smaller effects, more than three significant associations may be possible. For example, Chen et al. (2014) were able to distinguish seven QTL correlated with tassel branch number in a large population of 692 F₂ plants. The proportion of variance explained by the QTL in this trait ranged from 2.0 to 6.3%, which was the typical proportion of variance of R1 and C1 in the reduced acylation population. Moreover, another study utilizing GBS for quantitative traits found 35 QTL for plant height, ear height, and internode number with phenotypic variances ranging from 2.6 to 15.68% with 314 recombinant inbred lines (Zhou et al. 2016). Plant height, ear height, and tassel branch number are highly heritable traits as anthocyanin composition is expected to be (Paulsmeyer et al. 2017). Future work aimed at increasing AC would have to expand the mapping population to confirm the presence of the smaller effect QTL found in this study (Figure 6).

Conclusions

The anthocyanin acyltransferase in maize, AAT1, synthesizes the majority of acylated anthocyanins, which are the most common anthocyanin compounds in maize. As confirmed in this study, acylated anthocyanins are important for increasing AC in vivo and may be important for use in natural colorants or for human health. Results of this study also demonstrate the effectiveness of utilizing GBS for discovering new genes. GBS is a simple and reliable high-throughput protocol that allows for multiplexing of numerous samples. In this study, GBS was able to discover a new gene in maize involved with the production of acylated anthocyanins, even with a small mapping population size that was highly multiplexed in a single sequencing lane. Knockouts of AAT1 generated by a Mu transposon insertion returned the reduced acylation phenotype. With this it could be concluded that AAT1 is the gene responsible for the reduced acylation trait. Whether or not this gene has dimalonyltransferase activity is yet to be determined. Current work is being aimed at expressing recombinant protein and assaying enzyme activity. Overall, the discovery of AAT1 increases our understanding of the family of AATs and fills in missing steps of the anthocyanin biosynthetic pathway in maize.

ACKNOWLEDGMENTS

This work was supported by a grant from the Kraft Heinz Company of Glenview, Illinois and from DD Williamson, Inc. of Louisville, Kentucky. Fellowship support for MNP was provided by the Illinois Corn Grower's Association. MNP developed, genotyped, and phenotyped the F_2 population, interpreted the phenotype/genotype data, and drafted the manuscript. PJB assisted in genotyping the population and interpreting genotype data. JAJ assisted in conceiving the study and revised the manuscript. All authors read and approved the manuscript. We would like to thank Brown Lab members Shilpa Manjunatha and Pradeep Hirannaiah for walking us through DNA extractions and GBS library construction. Additionally, we want to thank Pradeep for providing the code used for the TASSEL 5.0 GBS v2 pipeline, Bowtie 2, and Beagle 4.1. Thanks to Laura Chatham for the photos used in Figure S1C and S1D. Finally, thanks to Dr. Tony Studer for assistance in preparing the manuscript.

LITERATURE CITED

- Agarwal, T., E. Grotewold, A. I. Doseff, and J. Gray, 2016 MYB31/MYB42 syntelogs exhibit divergent regulation of phenylpropanoid genes in maize, sorghum and rice. Sci. Rep. 6: 28502. https://doi.org/10.1038/srep28502
- Andorf, C. M., C. J. Lawrence, L. C. Harper, M. L. Schaeffer, D. A. Campbell et al., 2010 The Locus Lookup tool at MaizeGDB: identification of genomic regions in maize by integrating sequence information with physical and genetic maps. Bioinformatics 26: 434–436. https://doi.org/ 10.1093/bioinformatics/btp556
- Bakowska-Barczak, A., 2005 Acylated anthocyanins as stable, natural food colorants - a review. Pol. J. Food Nutr. Sci. 14/15: 107–116.
- Bradbury, P. J., Z. Zhang, D. E. Kroon, T. M. Casstevens, Y. Ramdoss *et al.*, 2007 TASSEL: software for association mapping of complex traits in diverse samples. Bioinformatics 23: 2633–2635.
- Browning, B. L., and S. R. Browning, 2016 Genotype imputation with millions of reference samples. Am. J. Hum. Genet. 98: 116–126. https:// doi.org/10.1016/j.ajhg.2015.11.020
- Burr, F. A., B. Burr, B. E. Scheffler, M. Blewitt, U. Wienand *et al.*, 1996 The maize repressor-like gene Intensifier1 shares homology with the R1/B1 multigene family of transcription factors and exhibits missplicing. Plant Cell 8: 1249–1259. https://doi.org/10.1105/tpc.8.8.1249
- Chen, Z., B. Wang, X. Dong, H. Liu, L. Ren et al., 2014 An ultra-high density bin-map for rapid QTL mapping for tassel and ear architecture in a large F2 maize population. BMC Genomics 15: 433. https://doi.org/ 10.1186/1471-2164-15-433
- D'Auria, J. C., 2006 Acyltransferases in plants: a good time to be BAHD. Curr. Opin. Plant Biol. 9: 331–340.
- Dellaporta, S. L., I. Greenblatt, J. L. Kermicle, J. B. Hicks, and S. R. Wessler, 1988 Molecular cloning of the maize R-nj allele by transposon tagging with Ac, pp. 263–282 in *Chromosome Structure and Function*, Springer, New York.
- Eichten, S. R., J. M. Foerster, N. de Leon, Y. Kai, C.-T. Yeh et al., 2011 B73-Mo17 near-isogenic lines demonstrate dispersed structural variation in maize. Plant Physiol. 156: 1679–1690. https://doi.org/10.1104/ pp.111.174748
- Elshire, R. J., J. C. Glaubitz, Q. Sun, J. A. Poland, K. Kawamoto *et al.*, 2011 A robust, simple genotyping-by-sequencing (GBS) approach for high diversity species. *PLoS ONE* 6: e19379. https://doi.org/10.1371/ journal.pone.0019379
- Felsenstein, J., 1985 Confidence Limits on Phylogenies: An Approach Using the Bootstrap. Evolution 39: 783–791. https://doi.org/10.1111/j.1558-5646.1985.tb00420.x
- Fragoso, C. A., C. Heffelfinger, H. Zhao, and S. L. Dellaporta, 2016 Imputing Genotypes in Biallelic Populations from Low-Coverage Sequence Data. Genetics 202: 487–495. https://doi.org/10.1534/ genetics.115.182071
- Grotewold, E., B. J. Drummond, B. Bowen, and T. Peterson, 1994 The mybhomologous P gene controls phlobaphene pigmentation in maize floral organs by directly activating a flavonoid biosynthetic gene subset. Cell 76: 543–553.
- He, J., and M. M. Giusti, 2010 Anthocyanins: natural colorants with healthpromoting properties. Annu. Rev. Food Sci. Technol. 1: 163–187. https:// doi.org/10.1146/annurev.food.080708.100754
- Heffelfinger, C., C. A. Fragoso, M. A. Moreno, J. D. Overton, J. P. Mottinger et al., 2014 Flexible and scalable genotyping-by-sequencing strategies for population studies. BMC Genomics 15: 1. https://doi.org/10.1186/ 1471-2164-15-979
- Irani, N. G., J. M. Hernandez, and E. Grotewold, 2003 Chapter three: regulation of anthocyanin pigmentation. Recent Adv. Phytochem. 37: 59–78.
- Kermicle, J. L., 1970 Dependence of the R-mottled aleurone phenotype in maize on mode of sexual transmission. Genetics 66: 69–85.

Kim, D. H., S. K. Kim, J.-H. Kim, B.-G. Kim, and J.-H. Ahn, 2009 Molecular characterization of flavonoid malonyltransferase from Oryza sativa. Plant Physiol. Biochem. 47: 991–997. https://doi.org/10.1016/j. plaphy.2009.08.004

Kumar, S., G. Stecher, and K. Tamura, 2016 MEGA7: Molecular Evolutionary Genetics Analysis version 7.0 for bigger datasets. Mol. Biol. Evol. 33: 1870–1874. https://doi.org/10.1093/molbev/msw054

Langmead, B., and S. L. Salzberg, 2012 Fast gapped-read alignment with Bowtie 2. Nat. Methods 9: 357–359. https://doi.org/10.1038/nmeth.1923

Lee, M., N. Sharopova, W. D. Beavis, D. Grant, M. Katt *et al.*,
2002 Expanding the genetic map of maize with the intermated B73 x
Mo17 (IBM) population. Plant Mol. Biol. 48: 453–461.

Li, X., Z. Zhou, J. Ding, Y. Wu, B. Zhou *et al.*, 2016 Combined linkage and association mapping reveals QTL and candidate genes for plant and ear height in maize. Plant Genet. Genomics 833.

McCarty, D. R., A. M. Settles, M. Suzuki, B. C. Tan, S. Latshaw *et al.*,
 2005 Steady-state transposon mutagenesis in inbred maize. Plant J. Cell.
 Mol. Biol. 44: 52–61.

Papadopoulos, J. S., and R. Agarwala, 2007 COBALT: constraint-based alignment tool for multiple protein sequences. Bioinformatics 23: 1073– 1079.

Paulsmeyer, M., L. Chatham, T. Becker, M. West, L. West *et al.*, 2017 Survey of anthocyanin composition and concentration in diverse maize germplasms. J. Agric. Food Chem. 65: 4341–4350. https://doi.org/ 10.1021/acs.jafc.7b00771

Paz-Ares, J., D. Ghosal, U. Wienand, P. A. Peterson, and H. Saedler,
1987 The regulatory c1 locus of Zea mays encodes a protein with homology to myb proto-oncogene products and with structural similarities to transcriptional activators. EMBO J. 6: 3553–3558.

Poland, J. A., P. J. Brown, M. E. Sorrells, and J.-L. Jannink,
2012 Development of high-density genetic maps for barley and wheat using a novel two-enzyme genotyping-by-sequencing approach. *PLoS* ONE 7: e32253. https://doi.org/10.1371/journal.pone.0032253

R Core Team, 2015 R: a language and environment for statistical computing, R Foundation for Statistical Computing, Vienna, Austria.

Saitou, N., and M. Nei, 1987 The neighbor-joining method: a new method for reconstructing phylogenetic trees. Mol. Biol. Evol. 4: 406–425.

Sharma, M., M. Cortes-Cruz, K. R. Ahern, M. McMullen, T. P. Brutnell *et al.*, 2011 Identification of the Pr1 gene product completes the anthocyanin biosynthesis pathway of maize. Genetics 188: 69–79. https://doi.org/ 10.1534/genetics.110.126136 St-Pierre, B., and V. De Luca, 2000 Evolution of acyltransferase genes: origin and diversification of the BAHD superfamily of acyltransferases involved in secondary metabolism, pp. 285–315 in *Recent Advances in Phytochemistry*, Elsevier, Amsterdam, Netherlands.

Suzuki, H., T. Nakayama, M. Yamaguchi, and T. Nishino, 2004 cDNA cloning and characterization of two Dendranthema × morifolium anthocyanin malonyltransferases with different functional activities. Plant Sci. 166: 89–96.

Suzuki, H., T. Nakayama, K. Yonekura-Sakakibara, Y. Fukui, N. Nakamura et al., 2002 cDNA cloning, heterologous expressions, and functional characterization of malonyl-coenzyme A:anthocyanidin 3-O-glucoside-6"-O-malonyltransferase from Dahlia flowers. Plant Physiol. 130: 2142– 2151.

Swarts, K., H. Li, J. A. Romero Navarro, D. An, M. C. Romay et al., 2014 Novel methods to optimize genotypic imputation for lowcoverage, next-generation sequence data in crop plants. Plant Genome 7: 0.

Unno, H., F. Ichimaida, H. Suzuki, S. Takahashi, Y. Tanaka *et al.*, 2007 Structural and mutational studies of anthocyanin malonyltransferases establish the features of BAHD enzyme catalysis. J. Biol. Chem. 282: 15812–15822.

Urias-Lugo, D. A., J. B. Heredia, M. D. Muy-Rangel, J. B. Valdez-Torres, S. O. Serna-Saldívar *et al.*, 2015 Anthocyanins and Phenolic Acids of Hybrid and Native Blue Maize (Zea mays L.) Extracts and Their Antiproliferative Activity in Mammary (MCF7), Liver (HepG2), Colon (Caco2 and HT29) and Prostate (PC3) Cancer Cells. Plant Foods Hum. Nutr. 70: 193–199. https://doi.org/10.1007/s11130-015-0479-4

Youens-Clark, K., E. Buckler, T. Casstevens, C. Chen, G. DeClerck *et al.*, 2011 Gramene database in 2010: updates and extensions. Nucleic Acids Res. 39: D1085–D1094. https://doi.org/10.1093/nar/gkq1148

Zhao, J., D. Huhman, G. Shadle, X.-Z. He, L. W. Sumner *et al.*,
2011 MATE2 mediates vacuolar sequestration of flavonoid glycosides and glycoside malonates in Medicago truncatula. Plant Cell 23: 1536– 1555. https://doi.org/10.1105/tpc.110.080804

Zhao, C.-L., Y.-Q. Yu, Z.-J. Chen, G.-S. Wen, F.-G. Wei *et al.*, 2017 Stability-increasing effects of anthocyanin glycosyl acylation. Food Chem. 214: 119–128. https://doi.org/10.1016/j.foodchem.2016.07.073

Zhou, Z., C. Zhang, Y. Zhou, Z. Hao, Z. Wang et al., 2016 Genetic dissection of maize plant architecture with an ultra-high density bin map based on recombinant inbred lines. BMC Genomics 17: 1–15. https://doi. org/10.1186/s12864-016-2555-z

Communicating editor: M. Scanlon