



## High-Resolution Linkage Map With Allele Dosage Allows the Identification of Regions Governing Complex Traits and Apospory in Guinea Grass (*Megathyrsus maximus*)

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Forage grasses are mainly used in animal feed to fatten cattle and dairy herds, and guinea grass (Megathyrsus maximus) is considered one of the most productive of the tropical forage crops that reproduce by seeds. Due to the recent process of domestication, this species has several genomic complexities, such as autotetraploidy and aposporous apomixis. Consequently, approaches that relate phenotypic and genotypic data are incipient. In this context, we built a linkage map with allele dosage and generated novel information of the genetic architecture of traits that are important for the breeding of M. maximus. From a full-sib progeny, a linkage map containing 858 single nucleotide polymorphism (SNP) markers with allele dosage information expected for an autotetraploid was obtained. The high genetic variability of the progeny allowed us to map 10 quantitative trait loci (QTLs) related to agronomic traits, such as regrowth capacity and total dry matter, and 36 QTLs related to nutritional guality, which were distributed among all homology groups (HGs). Various overlapping regions associated with the quantitative traits suggested QTL hotspots. In addition, we were able to map one locus that controls apospory (apo-locus) in HG II. A total of 55 different gene families involved in cellular metabolism and plant growth were identified from markers adjacent to the QTLs and APOSPORY locus using the Panicum virgatum genome as a reference in comparisons with the genomes of Arabidopsis thaliana and Oryza sativa. Our results provide a better understanding of the genetic basis of reproduction by apomixis and traits

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important for breeding programs that considerably influence animal productivity as well as the guality of meat and milk.

Keywords: apospory, double reduction, forage, polyploidy, quantitative trait locus, single nucleotide polymorphism, trait correlations

## INTRODUCTION

Forage grasses play a fundamental role in the global beef production chain. Brazil is the country with the greatest emphasis on this sector, being the main exporter of beef and having the largest commercial herd of beef cattle in the world, with approximately 215 million heads distributed in 162 million hectares of pasture (ABIEC, 2019). The main factor that led to this scenario was the beginning of tropical forage breeding in the 1980s in Brazil, which although recent, permitted the country to become the world's largest exporter of tropical forage seeds (ITC, 2018).

The African forage grass species *Megathyrsus maximus* (Jacq.) B. K. Simon & S. W. L. Jacobs (syn. *Panicum maximum* Jacq.), also known as guinea grass, is one of the most productive forage grasses reproduced by seeds in the Brazilian market and is also grown in other Latin American countries (Jank et al., 2011). It has been used mainly in intensive systems with high-fertility soils (Valle et al., 2009). Moreover, this forage has a high biomass potential and is promising as a biofuel feedstock (Odorico et al., 2018). The polyploidy and domestication process of this forage grass ensure high genetic variability to be explored (Jank et al., 2011); however, a lack of knowledge of the biology and genetics of the species, including its autotetraploidy and facultative apomictic mode of reproduction (Warmke, 1954), may make breeding more difficult and thus stimulate a need to invest in genetic studies.

The polysomic inheritance in autopolyploids makes genetic research difficult because several types of segregation may be involved (Field et al., 2017) and complexity increases as ploidy increases. Thus, in a segregating population, genetic complexity may influence the segregation and the frequencies of expected genotypes (Field et al., 2017), even causing distortions such as double reduction (DR), which is a type of meiosis in which the sister chromatids are duplicated, forming an unexpected combination of gametes. For example, an autotetraploid genotype with the "abcd" alleles at a locus that can form six expected combinations of gametes, namely, "ab", "ac", "ad", "bc", "bd", and "cd", but a homozygous gamete can be generated, e.g., "aa", "bb", "cc", or "dd" (Haldane, 1930; Mather, 1935; Haynes and Douches, 1993). How to accommodate DR and its implications in a breeding program as well as the use of these marker loci in linkage mapping has been discussed for a long time (Butruille and Boiteux, 2000; Luo et al., 2000; Xu et al., 2013; Layman and Busch, 2018; Bourke et al., 2019) for some economically important species, such as potato (Bradshaw, 2007; Bourke et al., 2015) and alfalfa (Julier et al., 2003), but has not yet been reported in guinea grass.

Linkage maps have been used as the primary source of genetic information for nonmodel species that do not have their genome

sequenced, such as M. maximus. The construction of dense linkage maps allows the identification of the structure and evolution of the genome by mapping traits with polygenic and monogenic inheritance and may even contribute to the assembly of the genome of a species (Doerge, 2002; Flint-Garcia et al., 2003; Luo et al., 2004). The majority of linkage maps available for autotetraploids are based on single-dose segregating markers for a parent (Aaaa x aaaa) or a single dose for both parents (Aaaa x Aaaa). Despite the use of complex statistical methods to obtain integrated maps that combine information from both marker patterns, these maps cover only part of the genome because higher-dose markers (AAaa, AAAa, and AAAA) are not included. This limitation results in a considerable loss of genetic information. To overcome this limitation, a new approach allows the assignment of allele dosage information for single nucleotide polymorphism (SNP) markers through exact allele sequencing depth, which generates linkage maps from markers in multiple doses with higher quality, more information and greater applicability, including more efficient detection of loci related to traits of economic importance (Serang et al., 2012; Hackett et al., 2014; Pereira et al., 2018; Mollinari and Garcia, 2019).

Mapping of the aposporous apomixis region is extremely important for the genetic breeding of M. maximus and other forage grasses, such as Urochloa spp., Paspalum spp., and Cenchrus ciliaris. These species undergo asexual propagation by seeds (Nogler, 1984), which allows the fixation of hybrid vigor in apomictic individuals and their use in the creation of uniform pastures (Jank et al., 2011). Experimental field data showed that aposporous apomixis in tropical forage grasses follows 1:1 Mendelian segregation, indicating monogenic inheritance (Savidan, 1981; Valle et al., 1994; Chen et al., 2000; Savidan, 2000), although a recent study suggests that this reproductive mode should be treated as a quantitative trait (Marcón et al., 2019), and provide evidence of the uncoupling of apomixis in neo-apomictic species, such as guinea grass (Kaushal et al., 2008; Kaushal et al., 2019). Molecularly, the apospory-specific genomic region (ASGR), which is responsible for apospory, is highly conserved among apomictic species (Gualtieri et al., 2006). The influence of some factors, such as epigenetics (Kumar, 2017), the presence of retrotransposons (Akiyama et al., 2011), and gene duplication (Conner et al., 2008), in this region has been reported for other species. Due to the laborious and time-consuming methods required to phenotype apomixis, several studies on forage grasses have searched for markers intrinsically linked to the chromosomal region for this trait (Pessino et al., 1998; Ebina et al., 2005; Bluma-Marques et al., 2014; Thaikua et al., 2016; Vigna et al., 2016; Worthington et al., 2016; Worthington et al., 2019); however, a 100% efficient marker for use in M. maximus breeding programs has not yet been identified.

In guinea grass there are no mapping studies of loci related to complex traits, such as those involved in forage yield and nutritional quality. Forage yield results from the continuous emission of leaves and tillers, ensuring the restoration of the leaf area after grazing in perennial pastures. Additionally, the nutritional value of a forage is directly related to animal performance and is measured by the crude protein, *in vitro* digestibility, neutral and acid detergent fiber, and lignin percentages (Jank et al., 2011). Thus, the mapping of these and other important quantitative trait loci (QTLs) may provide information about the genetic architecture of *M. maximus*.

In this context, given the importance of new genomic studies in guinea grass for both biological knowledge and support for breeding programs, our goals were to (i) construct an integrated consensus linkage map from a full-sib progeny of *M. maximus* using allele dosage information, (ii) detect QTLs related to important agronomic and nutritional traits in this progeny, (iii) map the apo-locus, and (iv) search for similarity in regions of the markers adjacent to the QTLs and APOSPORY locus in *Arabidopsis thaliana, Panicum virgatum* and *Oryza sativa*.

#### MATERIAL AND METHODS

#### Plant Material

A full-sib progeny of 136  $F_1$  hybrids was obtained from a cross between a facultative apomictic genotype of *M. maximus* cv. Mombaça and an obligate sexual genotype, S10. For the crosses, 100 m<sup>2</sup> of cv. Mombaça was sown in lines with a space of 1 m between the lines. One plant of S10 was planted in each 5 m x 5 m grid. The sexual plants were monitored to ensure the synchronization of flowering with the cv. Mombaça, and the inflorescences that flowered before cv. Mombaça were cut. According to Savidan (1982), 25 m<sup>2</sup> of the apomictic parent is sufficient to pollinate one sexual plant and to impede contamination from neighboring plants. The S10 plants are wind-pollinated, and the S10 seeds were harvested as they matured.

The sexual parent was derived from sexual x apomictic crosses of an original diploid sexual plant that was duplicated with colchicine (Savidan and Pernès, 1982); thus, both parents were autotetraploid (2n = 4x = 32) (Savidan et al., 1989). In addition to the reproductive mode, the parents have contrasting agronomic and nutritional quality traits (Braz et al., 2017). S10 is a medium sized plant (1.4 m tall) with medium width leaves (2.4 cm wide). Both its leaves and stems are glabrous, and its inflorescences consist of a panicle with short primary ramifications and long secondary ramifications throughout. Its spikelets are glabrous and purplish. The cv. Mombaça is a tall plant (1.7 m tall) with wide leaves (3 cm). Its leaves have small amount of hairs, and its stems are glabrous. Its inflorescences comprise a panicle with short primary ramifications and long secondary ramifications only on the inferior ramifications, and its spikelets are glabrous and light purple.

DNA extraction followed the protocol described by Doyle and Doyle (1987), with modifications. DNA samples were visualized

on 2% agarose gels to check their quality and integrity, and their concentrations were estimated using a Qubit 3.0 fluorometer (Thermo Scientific, Wilmington, USA).

To retain only true full-sibs, all possible hybrids were previously genotyped with microsatellite markers. This analysis revealed 24 false hybrids, which were excluded at the construction stage of the GBS library.

#### **Experimental Design**

A field experiment following an augmented block design (ABD) with 160 regular treatments (full-sib progeny) and two checks (the parents 'Mombaça' and S10) distributed in eight blocks with two whole replicates was performed at Embrapa Beef Cattle (Brazilian Agricultural Research Corporation), in Campo Grande city, Mato Grosso do Sul state, Brazil (20°27'S, 54° 37'W, 530 m). Each block consisted of a total of 22 plots (20 individuals and two checks).

Each plant was evaluated for agronomic and nutritional quality traits, totaling 22 traits: i) agronomic traits: green matter (GM-g/plant), total dry matter (TDM-g/plant), leaf dry matter (LDM-g/plant), stem dry matter (SDM-g/plant), regrowth capacity (RC), and percentage of leaf blade (PLB-%) and ii) nutritional quality traits for the leaf and stem: organic matter (OM\_L and OM\_S, respectively-%), crude protein (CP\_L and CP\_S-%), in vitro digestibility of organic matter (IVD L and IVD S-%), neutral detergent fiber (NDF L and NDF\_S-%), acid detergent fiber (ADF\_L and ADF\_S-%), cellulose (CEL L and CEL S-%), silica (SIL L and SIL S-%), and permanganate lignin (PL\_L and PL\_S-%). The agronomic traits were evaluated for six harvests (three harvests in 2013 and three harvests in 2014), but RC was evaluated for only three harvests (one harvest in 2013 and two harvests in 2014). The nutritional quality traits were evaluated for only one harvest in 2014.

#### Statistical Analysis of Phenotypic Data

Descriptive analyses were performed, and the Box-Cox transformation (Box and Cox, 1964) was applied to correct for nonnormality of the residuals. For traits with multiple harvests (agronomic traits), we fitted the following longitudinal linear mixed model:

$$y_{ijkl} = \mu + h_l + r_{k(l)} + b_{j(l)} + rb_{kj(l)} + t_{i(l)} + \epsilon_{ijkl}$$

where  $y_{ijkl}$  was the phenotypic value of the  $i^{th}$  treatment in the  $j^{th}$ block and  $k^{th}$  replicate at the  $l^{th}$  harvest;  $\mu$  was the fixed overall mean;  $h_l$  was the fixed effect of the  $l^{th}$  harvest (l = 1, ..., L, with L =3 for RC and L = 6 for the other traits);  $r_{k(l)}$  was the fixed effect of the  $k^{th}$  replicate (k = 1, ..., K, with K = 2) at harvest  $l; b_{j(l)}$  was the random effect of the  $j^{th}$  block (j = 1, ..., J, with J = 8) at harvest l, with  $b_{j(l)} \sim N(0, \sigma_b^2)$ ;  $rb_{kj(l)}$  was the random interaction effect of replication k and block j at harvest l, with  $rb_{kj(l)} \sim N(0, \sigma_{rb}^2)$ ;  $t_{i(l)}$ was the effect of the  $i^{th}$  treatment (i = 1, ..., I, with I = 162) at harvest l; and  $\varepsilon_{ijkl}$  was the random environmental error. The treatment effects  $(t_{i(l)})$  were separated into two groups:  $g_{i(l)}$  was the random effect of the  $i^{th}$  individual genotype  $(i = 1, ..., I_g)$  with  $I_g = 160$  at harvest l, and  $c_{i(l)}$  was the fixed effect of the  $i^{th}$  check  $(i = 1, ..., I_c$ , with  $I_c = 2$ ) at harvest *l*. For genotype effects, the vector  $\mathbf{g} = (g_{11}, ..., g_{IgL})$  was assumed to follow a multivariate normal distribution with a mean of zero and genetic variance-covariance (VCOV) matrix  $\mathbf{G} = \mathbf{G}_L \otimes \mathbf{I}_{Ig}$ , i.e.,  $\mathbf{g} \sim N(\mathbf{0}, \mathbf{G})$ . For residual effects, the vector  $\boldsymbol{\varepsilon} = (\varepsilon_{1111}, ..., \varepsilon_{IJKL})$  followed a multivariate normal distribution with a mean of zero and residual VCOV matrix  $\mathbf{R} = \mathbf{R}_L \otimes \mathbf{I}_{I_{IFK}}$ , i.e.,  $\boldsymbol{\varepsilon} \sim MVN(\mathbf{0}, \mathbf{R})$ .

The VCOV matrices  $G_L$  and  $R_L$  were analyzed considering seven different structures: identity (ID), diagonal (DIAG), compound symmetry (CS), heterogeneous compound symmetry (CS<sub>Het</sub>), first-order autoregressive (AR1), heterogeneous first-order autoregressive (AR1<sub>Het</sub>), first-order factor analytic (FA1), and unstructured (US). First, the genetic VCOV matrix ( $G_L$ ) was analyzed considering the ID for the residual matrix ( $R_L$ ), and posteriorly, the residual matrix ( $R_L$ ) was analyzed considering the selected VCOV matrix for genetic effects. Model selection was performed based on the Akaike information criterion (AIC) (Akaike, 1974) and Schwarz information criterion (SIC) (Schwarz, 1978).

For the nutritional quality traits, we fitted the following linear mixed model:

$$y_{ijk} = \mu + r_k + b_j + rb_{kj} + t_i + \epsilon_{ijk}$$

where  $y_{ijk}$  was the phenotypic value of the *i*<sup>th</sup> treatment in the *j*<sup>th</sup> block and *k*<sup>th</sup> replication;  $\mu$ ,  $r_k$ ,  $b_j$ ,  $rb_{kj}$ ,  $t_i$ , and  $\varepsilon_{ijk}$  were as described above but not nested within harvest and with  $\varepsilon_{ijk} \sim N(0,\sigma_e^2)$ . The treatment effects  $(t_i)$  were separated into two groups:  $g_i$  as a random effect,  $g \sim N(0,\sigma_g^2)$ , and  $c_i$  as a fixed effect. All analyses were performed with the R package ASReml-R (Butler et al., 2009).

The heritability of each trait was calculated using the same model as previously mentioned but considering the  $G_L$  and  $R_L$ matrices as the ID. The equation was

$$\hat{H}^2 = \frac{\sigma_g^2}{\sigma_p^2}$$

where  $\sigma_g^2$  is the genetic variance and  $\sigma_P^2$  is the phenotypic variance. The network analysis was carried out using the R package 'qgraph' (Epskamp et al., 2012).

#### Identification of the Reproductive Mode

The aposporic or sexual reproductive mode was determined for 106 hybrids of the progeny (**Supplementary Table 1**). From the flowers collected during anthesis, we performed an analysis of 30 ovules per hybrid using the clarified ovary method described by Young et al. (1979). Nomarski differential interference contrast microscopy was used to view the ovaries. A chi-square test was performed to verify the Mendelian segregation of this trait according to the expected model of monogenic inheritance in the base package of R (version 3.5.0) (R Core Team, 2018).

#### GBS Library Preparation and Sequencing

From the extracted DNA, genotyping-by-sequencing (GBS) libraries were built according to Poland et al. (2012),

containing 12 replicates for each parent. A total of 200 ng of genomic DNA per sample was digested with a combination of a rare-cutting enzyme (PstI) and a frequently cutting enzyme (MspI). DNA fragments were ligated to the common and barcode adapters, and the libraries were sequenced as 150-bp single-end reads using the High Output v2 Kit (Illumina, San Diego, CA, USA) for the NextSeq 500 platform (Illumina, San Diego, CA, USA).

#### SNP Calling and Allele Dosage Analysis

First, raw data were checked for quality using NGS QC Toolkit (Patel and Jain, 2012). SNP calling analysis was performed using the TASSEL-GBS v.4 pipeline (Glaubitz et al., 2014) modified for polyploids (Pereira et al., 2018) that use exact read depths. The default parameters were changed as follows: the minimum number of times a GBS tag must be present was changed to 5, and the minimum count of reads for a GBS tag was changed to 2. This pipeline requires a genome as a reference for SNP calling, but no genome sequence of M. maximus is available. To overcome this limitation, the switchgrass genome (P. virgatum v1.0, produced by the US Department of Energy Joint Genome Institute) available in the Phytozome database (http:// phytozome.jgi.doe.gov/) (Goodstein et al., 2012) was chosen because this species is phylogenetically closely related to M. maximus (Burke et al., 2016). GBS tags were aligned to the reference genome with Bowtie2 2.3.1 (Langmead et al., 2009) using the following settings: very-sensitive-local, a limit of 20 dynamic programming problems (D) and a maximum of 4 times to align a read (R). Subsequently, only tags that aligned exactly one time were processed. Then, SNP calling was performed under the conditions that the minor allele frequency was greater than 0.05 and the minor allele count was greater than 1,000. Mismatches of duplicated SNPs greater than 0.2 were not merged. Then, in R software (version 3.5.0) (R Core Team, 2018), we selected only the SNPs with a minimum average allele depth equal to or greater than 60 reads. The updog package (Gerard et al., 2018) was used to estimate the allele dosage of these markers, with a fixed ploidy parameter of 4 and the flexdog function considering the F<sub>1</sub> population model. SNPs with less than 0.15 of the posterior proportion of individuals incorrectly genotyped were selected. GBS sequences of each individual were deposited in the NCBI database under number PRJNA563938.

#### **Quality Filtering of SNPs**

We removed markers with more than 25% missing data and monomorphic markers manually in R software (version 3.5.0) (R Core Team, 2018). Subsequently, we followed Bourke et al. (2018a) to ensure the retention of reliable markers. We first verified the shifted markers for the polysomic inheritance model from which SNP markers that did not correspond to an expected segregation type were removed. A threshold of 5% was used for missing values per marker and per individual. Duplicated markers, which provided no extra information about a locus, were also removed in this step. Finally, a principal component analysis (PCA) was performed to identify individuals who deviated from the progeny as well as possible clones.

#### Linkage Map Construction

A linkage map was constructed using TetraploidSNPMap version 3.0 (Hackett et al., 2017), which allows the use of SNP markers with allele dosage data for autotetraploid species. SNP markers were checked with a chi-square test for goodness of fit, and only markers with a simplex configuration value greater than 0.001 and a segregation value greater than 0.01 for higher dosage were selected for mapping. Some unselected markers were classified as having segregation distortion (SD), being incompatible with the parental dosages (NP) and having DR. To order the selected markers, two-point analysis and multidimensional scaling analysis (MDS) were used to calculate recombination fractions and logarithm of odds (LOD) scores. Outlier markers were removed in this step. Some phases of the linked SNPs were inferred by TetraploidSNPMap software, and other phases were determined manually. The integrated consensus map represented by homology groups (HGs) was plotted using MapChart 2.32 (Voorrips, 2002), in which SNP configurations were identified with different colors.

#### Monogenic and Polygenic Trait Analysis

QTL mapping of six agronomic traits and sixteen nutritional quality traits was performed with TetraploidSNPMap, applying an interval mapping model (Hackett et al., 2014; Hackett et al., 2017). Analyses were conducted for each HG separately using three data files: phenotypic trait data, genotypic data and map data with phase information. The phenotypic data for the reproductive mode, i.e., aposporic or sexual, were considered qualitative due to the evaluation method applied; i.e., apomictic individuals were coded as one, and sexual individuals, as zero. The other phenotypic traits were analyzed as quantitative. QTL positions and significance were evaluated with a 1,000 permutation test. A QTL was declared significant if its LOD score was above the 90% threshold. Simple models were tested for each significant QTL to verify the best QTL model. The lowest SIC (Schwarz, 1978) was the criterion used to define the best model. Using TetraploidSNPMap software, if two or more significant QTLs were identified on the same chromosome, only the one with the greatest effect was considered.

# Search for Similarity in Aposporic and QTL Regions

We performed a search for similarity of candidate genes located close to the detected QTL/apospory locus regions. Using the switchgrass genome as a reference and based on chromosomal locations of the markers adjacent to the detected QTLs and apospory locus, we aligned the sequences found in 100-kb regions with Basic Local Alignment Search Tool (BLAST) (evalue cutoff of 1e-0.5) against the *A. thaliana* and *O. sativa* genomes through the JBrowse tool in Phytozome (http:// phytozome.jgi.doe.gov/) (Goodstein et al., 2012).

## RESULTS

### **Phenotypic Data**

Different VCOV matrices were selected for the agronomic and nutritional traits (Supplementary Tables 2 and 3). When the AIC and SIC were not in agreement, we selected the matrices based on the largest difference between the models. For example, considering the GM trait and the  $G_L$  matrix, US was selected based on the AIC, and CS was selected based on the SIC (US had 567.32 for the AIC and 702.21 for the SIC, and CS had 581.66 for the AIC and 598.53 for the SIC). The differences between these two selected models were 14.34 for the AIC (581.66-567.32) and 103.68 for the SIC (702.21-598.53). As the SIC produced the largest difference, this criterion was used, and the CS matrix was selected for the  $G_L$  matrix of the GM trait. The heritabilities ranged from 0.19 (PLB) to 0.64 (GM) for the agronomic traits and from 0.06 (SIL S) to 0.31 (OM L and CEL S) for the nutritional quality traits (Table 1). Box-Cox transformation was performed for agronomic traits (GM, TDM, LDM, SDM, RC, PLB) and nutritional traits of the leaves and stems (OM\_L, OM\_S, CP\_S, IVD\_L, IVD\_S, NDF\_S, ADF\_L, CEL\_L, SIL\_L, SIL\_S, PL\_L, and PL\_S).

The correlations between the agronomic and nutritional traits are presented in **Figure 1**. Significant and positive correlations were observed among GM, TDM, SDM, LDM, and RC.

PLB presented a negative correlation with other agronomic traits and a positive correlation with NDF, but these correlations were weaker than those found for the other pairs of traits. Complex correlations between nutritional traits were obtained.

**TABLE 1** | Broad-sense heritability obtained for the agronomic and nutritional traits for the F1 mapping population of guinea grass (*Megathyrsus maximus*) evaluated in this study.

	Traits	H <sup>2</sup>
Agronomic	Green matter (GM)	0.64
	Total dry matter (TDM)	0.57
	Leaf dry matter (LDM)	0.58
	Stem dry matter (SDM)	0.35
	Percentage of leaf blade (PLB)	0.19
	Regrowth capacity (RC)	0.36
Nutritional	Leaf organic matter (OM_L)	0.31
	Stem organic matter (OM_S)	0.15
	Leaf crude protein (CP_L)	0.13
	Stem crude protein (CP_S)	0.28
	Leaf neutral detergent fiber (NDF_L)	0.14
	Stem neutral detergent fiber (NDF_S)	0.14
	Leaf acid detergent fiber (ADF_L)	0.25
	Stem acid detergent fiber (ADF_S)	0.30
	Leaf in vitro digestibility of organic matter (IVD_L)	0.18
	Stem in vitro digestibility of organic matter (IVD_S)	0.26
	Leaf cellulose (CEL_L)	0.26
	Stem cellulose (CEL_S)	0.31
	Leaf permanganate lignin (PL_L)	0.18
	Stem permanganate lignin (PL_S)	0.18
	Leaf silica (SIL_L)	0.17
	Stem silica (SIL_S)	0.06



traits, and the red lines correspond to negative correlations between the traits. The agronomic traits were green matter (GM), total dry matter (IDM), leaf dry matter (LDM), stem dry matter (SDM), percentage of leaf blade (PLB), and regrowth capacity (RC). The leaf and stem nutritional quality traits were the following: organic matter (OM\_L and OM\_S), crude protein (CP\_L and CP\_S), neutral detergent fiber (NDF\_L and NDF\_S), acid detergent fiber (ADF\_L and ADF\_S), in vitro digestibility of organic matter (IVD\_L and IVD\_S), cellulose (CEL\_L and CEL\_S), permanganate lignin (PL\_L and PL\_S), and silica (SIL\_L and SIL\_S).

In particular, stem-related traits were most tightly correlated with leaf-related traits, and NDF\_L and NDF\_S were closely correlated. The ADF, CEL and PL traits exhibited a significant and positive correlation. The same pattern was observed for the leaf and stem nutritional traits: CP and IVD exhibited a strong negative correlation with PL, ADF, CEL and NDF.

## Genotyping and Linkage Analysis

A total of 23,619 SNPs were identified through alignment using the *P. virgatum* genome as the reference, and these presented a mean depth per individual of 247.8 (SD  $\pm$  121.7). After the genotypic analysis, 2,804 SNPs with an average allele depth greater than 60 were selected for further filtering. After allele dosage estimation, 275 SNPs were discarded, in addition to 15 monomorphic markers and four markers with missing data identified manually in R software. Using the updog package, we obtained the allele dosage information for 2,510 SNPs, considering an autotetraploid species (**Table 2**). Simplex (AAAA × AAAB, ABBB × BBBB) was the most commonly found configuration, with 1,654 markers, followed by the duplex (AAAA × AABB, AABB × BBBB) and double-simplex (AAAB × AAAB, ABBB × ABBB) configurations, with 334 and 226 SNPs, respectively. The simplex-duplex (AAAB × AABB) configuration was the most represented among the higher dosages, with 155 markers, and the duplex-simplex (AABB  $\times$  ABBB) configuration was the least represented, with only six SNPs. Analysis with the polymapR package revealed that all offspring were 95% compatible with the parents. Two individuals (B107 and C39) were very genetically similar to the parent cv. Mombaça and were removed, one clone (C49) of individual C44 was also removed, and another clone (B127) similar to B126 was also excluded (Figure 2). We subsequently discarded another 37 SNPs with missing values and 1,151 duplicated SNPs. This filtering resulted in 132 genotyped offspring with 1,322 markers that were used at the beginning of the linkage analysis in TetraploidSNPMap software. In this step, incompatible markers with the parental allele dosages, SNPs with DR and markers showing SD were not considered. In addition, two-point analysis identified 149 SNPs as duplicated, and MDS analysis identified 27 outliers, which were then excluded. In total, 858 reliable SNPs were included in the linkage map. The apomictic parent, cv. Mombaça, presented 368 exclusive alleles; the sexual parent, S10, presented 275 exclusive alleles; and the two parents shared 215 alleles. TetraploidSNPMap software was used again to rank the 2,510 SNPs based on their expected segregation. The analysis resulted in a total of 114 SNPs with SD, 183 with NP and 243 with DR (Table 2).

Marker class	Genotype of the parents	Segregation ratio	Number	DR	NP	Distorted	Mapped
Null	AAAA x BBBB	0	0	0	0	0	0
Simplex	AAAA x AAAB, ABBB x BBBB	1:1	1,654	111	125	18	491
Duplex	AAAA x AABB, AABB x BBBB	1:4:1	334	0	58	40	136
Triplex	AAAA x ABBB, AAAB x BBBB	1:1	35	18	0	0	17
Double-Simplex	AAAB x AAAB, ABBB x ABBB	1:2:1	226	60	0	5	106
X-Double-Simplex	AAAB x ABBB	1:2:1	26	16	0	0	9
Simplex-Duplex	AAAB x AABB	1:5:5:1	155	38	0	9	72
Duplex-Simplex	AABB x ABBB	1:5:5:1	6	0	0	0	1
Double-Duplex	AABB x AABB	1:8:18:8:1	74	0	0	42	26
Total			2510	243	183	114	858

TABLE 2 | Distribution of SNP markers among genotype classes for a mapping population of guinea grass (Megathyrsus maximus).

Significant distortion at (P < 0.001) and (P < 0.01) for simplex and higher-dosage markers. DR corresponds to double reduction, and NP indicates incompatible SNPs with the parental dosages. SNPs with missing data, outliers and duplicates were not considered.



### Linkage Map

We constructed an integrated consensus linkage map consisting of 858 SNP markers distributed over 756.69 cM in eight HGs, with all possible allele dosage configurations for an autotetraploid species. (**Table 2, Figure 3** and **Supplementary Table 4**). Considering all integrated consensus HGs, an average density of ~1.13 SNPs/cM was obtained. The largest HG was VII, with 159 SNPs distributed over 108.573 cM, and the smallest HG was VIII, with 49 SNPs present over 70.05 cM. The interlocus intervals were relatively small, with a minimum value of 0.003 cM for the majority of the HGs (I, II, IV, VI and VII) and a maximum of 8.65 cM and 7.24 cM on HG V and HG I, respectively (**Table 3**). Among the markers, we identified approximately 30 double-duplex markers (AABB x AABB), which contained all types of doses for autotetraploid progenies (**Table 2, Figure 3** and **Supplementary Table 4**) (Hackett et al., 2014).

## **Apospory Mapping**

The mode of reproduction of 106 hybrids in the mapping population was determined and indicated that apospory had a

segregation ratio of 1:1 based on a chi-square test ( $X^2 = 5.43$ ,  $p \ge 0.01$ ), consistent with the model expected for monogenic inheritance. The apo-locus was mapped in the HG II at a peak position of 65 cM, with a high LOD score of 50.06 (**Supplementary Figure 1**). More than 80% of the phenotypic variation in the apomictic reproductive mode was explained, and the simple models best classified the apo-locus as a simplex genotype (BBBB x ABBB). As expected, this locus was linked to the apomictic parent, cv. Mombaça. Two SNP markers exclusive to this parent, namely, S\_14\_29023868 and S\_10\_48091934, were linked to the apo-locus at 0.8 cM (**Figure 3**).

## **Agronomic Trait Mapping**

Ten significant QTLs were mapped for GM, TDM, LDM, SDM, PLB, and RC, which were distributed in HGs II, IV, V and VI (**Table 4** and **Supplementary Figure 2**). Here, we will report the QTLs that were identified for the main traits targeted in the *M. maximus* breeding program. TDM was associated with two QTLs in HGs II (qTDM3) and V (qTDM4) with LOD scores of 3.4 and 4.4 and that explained 5.8 and 9.4% of the phenotypic variation,



Complex Trait Mapping in Guinea Grass

of the phenotypic variation, respectively.

respectively. For LDM, we detected two QTLs in HGs V (qLDM5)

and VI (qLDM6) with LOD scores of 3.9 and 3.0 and that

explained 7.9 and 4.5% of the phenotypic variation, respectively.

PLB was associated with one QTL in HG IV (qPLB8) with LOD

score of 3.8 and that explained 6.8% of the phenotypic variation.

We identified two QTLs for RC in HGs II (qRC9) and VI (qRC10)

with LOD scores of 4.7 and 3.8 and that explained 10.4% and 6.3%

The simple models that best represented the QTLs for each

agronomic trait were identified based on the lowest SIC values.

The QTL with the greatest effect on TDM, which was present in

HG VI, followed a duplex model (AAaa x aaaa) with an additive

effect of the A allele from the S10 parent. The same model was

verified for LDM with qLDM5, a QTL associated with the S10

parent, and qLDM6, a QTL associated with the cv. Mombaça

parent. The QTL with the smallest effect for TDM and the single

**TABLE 3** | Summary of the linkage map of guinea grass (*Megathyrsus maximus*) obtained with the S10  $\times$  cv. Mombaça population.

HG*	No. mapped SNPs	Length (cM)	Smallest interval (cM)	Longest interval (cM)
I	144	101.74	0.015	7.24
п	128	103.53	0.031	3.43
Ш	85	94.06	0.027	5.24
IV	115	87.66	0.003	6.34
v	104	96.08	0.008	8.65
VI	74	94.99	0.013	6.42
VII	159	108.57	0.009	5.63
VIII	49	70.05	0.072	6.93
Total	858	756.69		

\*Homology group.

**TABLE 4** | QTLs identified for agronomic traits from the sexual genotype S10 and apomictic cv. Mombaça of guinea grass (*Megathyrsus maximus*).

Agronomic trait	QTL	HG	Position (cM)	LOD	R <sup>2</sup>	Parents
Green matter (GM)	qGM1	V	71.0	3.56	6.78	both
	qGM2	VI	87.0	2.91	4.29	'Mombaça'
Total dry matter (TDM)	qTDM3		75.0	3.37	5.79	both
	qTDM4	V	70.0	4.41	9.40	S10
Leaf dry matter (LDM)	qLDM5	V	70.0	3.90	7.93	S10
	qLDM6	VI	88.0	2.97	4.53	'Mombaça'
Stem dry matter (SDM)	qSDM7	V	71.0	3.73	7.24	'Mombaça'
Percentage of leaf blade (PLB)	qPLB8	IV	17.0	3.81	6.84	both
Regrowth capacity (RC)	qRC9 qRC10	li Vi	75.0 87.0	4.73 3.77	10.37 6.25	S10 'Mombaça'

QTL for PLB followed the double-simplex model (Aaaa x Aaaa) with an additive effect of both parents. The two QTLs detected for RC followed the simplex model, with the S10 parent contributing the allele for qRC9 and the 'Mombaça' parent contributing the allele for qRC10.

### **Nutritional Trait Mapping**

Thirty-six significant preliminary QTLs were identified for OM, CP, NDF, ADF, IVD, PL, CEL, and SIL for the leaf and stem. These QTLs were distributed in all HGs (Table 5 and Supplementary Figures 3, 4). For CP\_L, two QTLs were detected in HGs III (qCP\_L6) and V (qCP\_L7) with LOD scores of 3.4 and 4.3 and that explained 5.1% and 9.7% of the phenotypic variation, respectively. For CP\_S, two QTLs were detected in HGs V (qCP\_S8) and VIII (qCP\_S9) with LOD scores of 3.8 and 2.8 and that explained 8.4% and 3.2% of the phenotypic variation, respectively. For NDF\_L and NDF\_S, we detected five QTLs each, all at the same positions in HGs I (qNDF\_L10/qNDF\_S15), II (qNDF\_L11/qNDF\_S16), III (qNDF\_L12/qNDF\_S17), IV (qNDF\_L13/qNDF\_S18), and VII (qNDF\_L14/qNDF\_S19). The QTLs with the largest effect on NDF were found in HGs II and IV and were identified with LOD scores of 5.5 and 4.3, respectively; qNDF\_L11/qNDF\_S16 in HG II explained more phenotypic variation (12%). For the IVD\_L trait, only one QTL was found in HG III (qIVD\_L27) with LOD score of 3.8 and that explained 5.9% of the phenotypic variation. For IVD\_S, two QTLs were obtained in HGs V (qIVD\_S28) and VIII (qIVD\_S29) with LOD scores of 3.6 and 3.9 and explaining 7.3 and 5.8% of the phenotypic variation, respectively. We detected a single QTL for PL\_L located in HG III (qPL\_L33) with LOD score of 3.9, and it explained 6.2% of the phenotypic variation. Additionally, PL\_S was associated with only one QTL, which was identified in HG VIII (qPL\_S34) with LOD score of 2.7 and explained 2.8% of the variation in the trait.

According to the simple model analysis, the best model for the two QTLs of CP\_L was the double-simplex model (Aaaa x Aaaa) with an additive effect of both parents. In contrast, qCP\_S8 was best represented by a duplex model (AAaa x aaaa) with a dominant effect of cv. Mombaça. The CP\_S9 QTL was represented by a double-simplex model with an additive effect of the S10 parent. The QTL with the greatest effect on NDF was best represented by the double-simplex model with an additive effect from both parents. For IVD\_L, a simplex allele was verified in the sexual parent (Aaaa x aaaa). The same model was also observed for IVD\_S and PL\_L, with the A allele from the apomictic parent associated with the trait. The single QTL for PL\_S was explained by a double-simplex model with a dominant effect from both parents.

# Search for Similarity in Aposporic and QTL Regions

Some genes that contain conserved protein domains were found in regions flanking the apo-locus located in HG II, such as the Spc97/Spc98 family of spindle pole body (SBP) components, whose proteins assist in the control of the microtubule network (Lin et al., 2015), and the inner centromere protein (ARKbinding region). These two genes play an important role in the segregation of chromosomes during cell division (Kirioukhova et al., 2011; Lin et al., 2015). In addition, a gene possibly involved in the aposporic reproductive mode was similar to somatic embryogenesis receptor-like kinase 1 (SERK1), which is part of a complex associated with the induction of embryo development (Albrecht et al., 2008).

A total of 23 regions were found due to the overlap of QTLs in common regions in the linkage map. In these regions, 55 different gene families from *P. virgatum*, *A. thaliana* and *O. sativa* were identified. Most of these genes may play important roles in cellular metabolism and may be associated with plant growth and development (**Table 6**). Further details about the locations of the candidate genes in their respective QTL regions are provided in **Supplementary Table 5**.

Among the putative genes, many participate in hormonal signaling pathways, such as auxin efflux carrier component in HG I region 2 (qADF\_L20/qCEL\_L30), which is related to the intercellular directionality of auxin (Friml et al., 2002); RING/U-box (XERICO) in HG II region 5 (qNDF\_L11/ qNDF\_S16), which is involved in the regulation of abscisic acid (ABA) (Ko et al., 2006); gibberellin-regulated family members (GAST1, GASR2, GASR3, and GASR9) in HG III region 9 (qPL\_L33), which are associated with the regulation of gibberellic acid (GA) and ABA (Hedden and Thomas, 2016); ent-copalyl diphosphate synthase in HG IV region 11 (qNDF\_L13/qNDF\_S18/qPLB8),

TABLE 5	OTLs identified for traits re	lated to nutritional quali	ty from the sexual (	renotype "S10"	and anomictic cv	'Mombaca' of qu	inea grass (Megathyrsu	s maximus)
TADLE 3		ומנכט נט חטנוזנוטוזמו קטמו	ty itotti tile sevual (	Jenotype 010		morribaça orgu	inea grass (megalinyisu	s maximusj.

Nutritional trait	QTL	HG	Position (cM)	LOD	R <sup>2</sup>	Parents
Leaf organic matter (OM_L)	qOM_L1	V	87.0	4.15	8.3	S10
	qOM_L2	VI	48.0	3.81	6.7	'Mombaça'
Stem organic matter	qOM_S3	I.	63.0	3.85	7.85	S10
(OM_S)	qOM_S4	VII	68.0	4.76	11.44	both
	qOM_S5	VIII	36.0	4.35	7.19	both
Leaf crude protein (CP_L)	qCP_L6		34.0	3.43	5.10	both
	qCP_L7	V	65.0	4.32	9.68	both
Stem crude protein (CP_S)	qCP_S8	V	33.0	3.84	8.40	'Mombaça'
	qCP_S9	VIII	6.0	2.84	3.17	S10
Leaf neutral detergent fiber (NDF_L)	qNDF_L10	I.	15.0	3.64	6.09	both
	qNDF_L11	П	48.0	5.49	12.08	both
	qNDF_L12	111	33.0	3.51	6.83	both
	qNDF_L13	IV	14.0	4.30	6.84	both
	qNDF_L14	VII	69.0	3.74	7.81	'Mombaça'
Stem neutral detergent fiber	qNDF_S15	I.	15.0	3.61	6.01	both
(NDF_S)	qNDF_S16	П	48.0	5.50	12.07	both
	qNDF_S17	Ш	33.0	3.5	6.81	both
	qNDF_S18	IV	14.0	4.31	6.87	both
	qNDF_S19	VII	69.0	3.75	7.85	'Mombaça'
Leaf acid detergent fiber (ADF_L)	qADF_L20	I.	57.0	3.98	8.84	S10
	qADF_L21	V	59.0	4.0	8.07	both
	qADF_L22	VI	45.0	3.08	2.46	both
Stem acid detergent fiber (ADF_S)	qADF_S23	V	45.0	3.48	6.21	'Mombaça'
	qADF_S24	VI	88.0	2.86	4.05	'Mombaça'
	qADF_S25	VII	93.0	3.41	5.90	Both
	qADF_S26	VIII	41.0	3.04	4.05	S10
Leaf in vitro digestibility of organic matter (IVD_L)	qIVD_L27	III	20.0	3.8	5.85	S10
Stem in vitro digestibility of organic matter (IVD_S)	qIVD_S28	V	37.0	3.55	7.31	'Mombaça'
	qIVD_S29	VIII	6.0	3.91	5.84	2
Leaf cellulose (CEL_L)	qCEL_L30	I.	55.0	4.69	10.85	both
Stem cellulose (CEL_S)	qCEL_S31	VIII	37.0	3.02	3.37	both
Leaf permanganate lignin (PL_L)	qPL_L33	III	74.0	3.86	6.18	'Mombaça'
Stem permanganate lignin (PL_S)	qPL_S34	VIII	7.0	2.7	2.78	both
Leaf silica (SIL_L)	qSIL_L35	Ш	94.0	3.70	5.68	'Mombaca'
,	qSIL_LF36	VII	36.0	4.63	10.63	S10
Stem silica (SIL_S)	qSIL_S37	VIII	61.0	2.96	4.23	both

which plays a role in GA biosynthesis (Koksal et al., 2011); and ethylene insensitive 3 (EIN3) in HG VIII region 21 (qCP\_S9/ qIVD\_S29/ qPL\_S34), which is associated with cell growth and senescence processes (Munné-Bosch et al., 2018) (**Table 6** and **Supplementary Table 5**).

In addition, other genes with a role in plant physiology were also identified, such as the gene encoding the enzyme phosphoenolpyruvate carboxylase (PEPC) in HG I region 2 (qADF\_L20/qCEL\_L30), whose function is the catalysis of primary metabolic reactions in plants (Toledo-Silva et al., 2013). Glycosyltransferase was found in HG III region 7 (qIVD\_L27) and is associated with the biosynthesis of polysaccharides and glycoproteins (Hansen et al., 2012). Pectinesterase/pectin methylesterase, which was detected in HG V region 14 (qGM1/qTDM4/qLDM5/qSDM7/qADF\_L21/ qCP\_L7) and HG VIII region 23 (qSIL\_S37) is related to cellular adhesion and stem elongation (Damm et al., 2016). In addition to these genes, we found a chloroplast envelope transporter in HG 7 region 19 (qOM\_S4/qNDF\_L14/qNDF\_S19). Phosphatidylinositol-4-phosphate 5-kinase, which was present in HG VIII region 22 (qOM\_S5/qADF\_S26/qCEL\_S31), is involved in coordinating plant growth (Kusano et al., 2008).

Many putative candidate genes present in lignan biosynthesis pathways were verified in some regions of QTLs. Glycosyl hydrolase family 16 was located in HG III region 8 (qCP\_L6/ qNDF\_L12/qNDF\_S17), and the genes associated with secoisolariciresinol dehydrogenase and the NAD(P)-binding Rossmann-fold superfamily were located in region 9 (qPL\_L33). UDP-Glycosyltransferase superfamily protein was present in HG V region 13 (qADF\_S23). The 4-coumarate:CoA ligase 3 gene was obtained in HG VI region 16 (qOM\_L2/ qADF\_L22). The gene encoding NAD(P)-binding Rossmannfold superfamily was also detected in HG VIII region 21 (qCP\_S9/qIVD\_S29/ qPL\_S34).

### DISCUSSION

#### Linkage Map

We obtained a satisfactory representative linkage map for *M. maximus*, with a large genetic distance observed between the parents, namely, cv. Mombaça. (Figure 2, quadrant I) and S10 (Figure 2, quadrant IV). This genetic distance and the distribution of hybrids can be visualized in the PCA performed

#### TABLE 6 | Description and function of the genes identified in APOSPORY and QTL regions from linkage map of guinea grass.

HG	Region	QTL	Gene Description	Function	Reference
I	1	qNDF_L10	Rhomboid family protein	Root growth, floral development and fertility	Knopf et al. (2012)
I	2	qADF_L20 qCEL_L30	Phosphoenolpyruvate carboxylase Auxin efflux carrier family protein Inorganic H pyrophosphatase family protein	CO <sub>2</sub> fixation in the cytoplasm Regulator of auxin efflux, differential growth and tropism Regulation of plant proton-pumping homeostasis	Toledo-Silva et al. (2013) Friml et al. (2002) Primo et al. (2019)
1	3	qOM_S3	Vacuolar ATP synthase subunit A Palmitoyltransferase TIP1 PINHEAD Plant stearoyl-acyl-carrier-protein	Male gametophyte development and Golgi organization Stem cell or root hair and pollen tube growth Regulation of cell division and axis determinacy Regulation of oleic acid	Dettmer et al. (2005) Hemsley et al. (2005) Newman et al. (2002) Kachroo et al. (2007)
11	4	Apo-locus	desaturase family protein Exocyst complex protein Exo70 Inner centromere protein (ABK-binding	Plant cell morphogenesis Regulation of egg and central cell fate and differentiation	Hála et al. (2008) Kirioukhova et al. (2011)
		1	region) Somatic embryogenesis receptor-like	Induction of somatic embryogenesis	Albrecht et al. (2008)
			Spc97 / Spc98 family of spindle pole body (SBP) component	Regulation of microtubule network	Lin et al. (2015)
II	5	qNDF_L11	RING/U-box domain-containing protein (XERICO)	Regulation of abscisic acid (ABA)	Ko et al. (2006)
		qNDF_S16	Wall-associated receptor kinase galacturonan-binding (GUB_WAK_bind)	Pathogen response and cell expansion	Kohorn and Kohorn (2012)
			Late embryogenesis abundant (LEA) protein-related	Seed maturation and tolerance to abiotic stress in plants	Zhang et al. (2014)
II	6	qTDM3	WRKY family transcription factor family protein	Pathogen defense, senescence and trichome development	Eulgem et al. (2000)
	7	qRC9 qIVD_L27	Eukaryotic elongation factor 5A-1 Glycosyltransferase	Regulation of cell division, cell growth, and cell death Biosynthesis of polysaccharides and glycoproteins	Feng et al. (2007) Hansen et al. (2012)
	8	qCP_L6 qNDF_L12	Xyloglucan:xyloglucosyl transferase Xyloglucan endotransglucosylase/ hydrolase	Integral plasma membrane protein and wall-loosening factor Cell wall construction	Ndamukong et al. (2009) Yokoyama and Nishitani (2001)
III	9	qNDF_S17 qPL_L33	Protein thylakoid formation 1,	Vesicle-mediated thylakoid membrane biogenesis	Wang et al. (2004)
			Gibberellin-regulated family protein NAD(P)-binding Rossmann-fold	Lignin biosynthesis Reproductive development and regulation of growth Cinnamoyl-CoA reductase activity (lignin biosynthesis)	Davin and Lewis (2003) Hedden and Thomas (2016) Pan et al. (2014)
III	10	qSIL_L35	Disease resistance protein RPS2 Stripe rust resistance protein	Immune signaling in response to pathogenic fungilmmune signaling in response to root-knot nematodes	Kourelis and van der Hoorn (2018) Dimkpa et al. (2016)
IV	11	qPLB8 qNDF_L13	Ent-copalyl diphosphate synthase Phototropic-responsive NPH3 family protein	Gibberellin biosynthesis Phototropic signal response pathway	Koksal et al. (2011) Roberts et al. (2011)
V	12	qNDF_S18 qCP_S8 qIVD_S28	Glucuronokinase WRKY DNA-binding domain P-glycoprotein Protein NRT1/ PTR family 6.2	UDP-glucuronic acid synthesis (sugar metabolism) Pathogen defense, senescence and trichome development Auxin transport Transporting different substrates, e.g., nitrate	Xiao et al. (2017) Eulgem et al. (2000) Geisler and Murphy (2006) Corratgé-Faillie and Lacombe
	13	qADF_S23	Methyl esterase UDP-Glycosyltransferase superfamily	Hydrolysis of auxin and jasmonic acid Mechanism of normal cell wall lignification	(2017) Yang et al. (2008) Lin et al. (2016)
V	14	qGM1	protein Early nodulin-like family protein	Cell differentiation and cell wall reorganization during	Mashiguchi et al. (2009)
		qTDM4	HEXOKINASE	Glucose regulation	Aguilera-Alvarado and Sánchez- Nieto (2017)
		qLDM5 qSDM7	Pectinesterase / Pectin methylesterase NAD-dependent malic enzyme	Pectin structure Metabolism in mitochondria	Pelloux et al. (2007) Tronconi et al. (2008)
		qCP_L7	(nincenonianal precursor) NADP-dependent malic enzyme (chloroplast precursor)	Metabolism in chloroplasts (C4 plants) or in cytosol	Tronconi et al. (2008)
V	15	qADF_L21 qOM_L1	Calcium-binding EF-hand family protein	Regulation of cellular and developmental processes	Day et al. (2002)

(Continued)

#### TABLE 6 | Continued

HG	Region	QTL	Gene Description	Function	Reference
VI	16	qOM_L2 qADF_L22	4-coumarate:CoA ligase 3	Lignin biosynthesis	Toledo-Silva et al. (2013)
VI	17	qGM2	Galactinol-raffinose galactosyltransferase/ stachyose synthetase	Desiccation protectant in seeds and transporter of sugar in phloem sap	Sengupta et al. (2015)
		qLDM6	Nodulin-like/major facilitator superfamily protein	Facilitators of water and ammonia transport	Routray et al. (2015)
		qRC10 qADF_S24	Peroxidase superfamily protein	Lignin biosynthesis	Toledo-Silva et al. (2013)
VII	18	qSIL_L36	FKBP-type peptidyl-prolyl cis-trans isomerase family protein	Control of cell proliferation and differentiation	Smyczynski et al. (2006)
VII	19	qOM_S4	Chloroplast envelope transporter	lons transport	Höhner et al. (2016)
		qNDF_L14	Endo-1,4-beta-xylanase/glycosyl hydrolase family 10 protein	Xylan degradation	Suzuki et al. (2002)
		qNDF_S19	Alpha-galactosidase	Regulation of cell wall loosening and cell wall expansion	Chrost et al. (2007)
VII	20	qADF_S25	Lipoxygenase	Biosynthesis of polyunsaturated fatty acids	Bannenberg et al. (2008)
VIII	21	qCP_S9	3-oxoacyl-[acyl-carrier-protein] reductase	Fatty acid biosynthesis	Ding et al. (2015)
		qIVD_S29	Sugar transporter/spinster transmembrane protein	Transport of lipidic molecules	Niño-González et al. (2019)
		qPL_S34	Ethylene insensitive 3 family protein	Modulation of plant growth	Munné-Bosch et al. (2018)
			Glycine-rich cell wall structural transmembrane protein	Component of the cell walls of higher plants	Mousavi and Hotta (2005)
			NAD(P)-binding Rossmann-fold superfamily protein	Cinnamoyl-CoA reductase activity (lignin biosynthesis)	Pan et al. (2014)
VIII	22	gOM S5	Sterol regulatory element-binding protein	Regulation of sterol biosynthesis	Seo et al. (2008)
		gADF S26	Alpha carbonic anhydrase	C4 photosynthetic pathway	Toledo-Silva et al. (2013)
		qCEL_S31	Phosphatidylinositol-4-phosphate 5- kinase	Regulator of root hair tip growth	Kusano et al. (2008)
VIII	23	qSIL_S37	Pectinesterase	Pectin structure	Pelloux et al. (2007)

with the allele dosage information of all individuals (**Figure 2**). The crossing of contrasting parents makes it possible to check the recombination frequency between loci, which is a fundamental principle for observing the segregation of traits in hybrids and promoting the detection of QTLs (Luo et al., 2000).

Because M. maximus does not yet have a sequenced genome, we aligned our GBS reads to the allotetraploid genome of P. virgatum, which is a species closely phylogenetically related to M. maximus (Burke et al., 2016), since M. maximus previously belonged to the Panicum genus. This genetic proximity was confirmed based on the consistent distribution of the markers in the genetic map (Figure 3 and Supplementary Table 4). In addition, considering our tetraploid mapping population, the use of a tetraploid genome as reference might be more informative than the use of diploid genomes because there is a greater possibility of similar chromosomal rearrangements between these species (Daverdin et al., 2015). However, the possibility of using the genome of P. virgatum as reference does not preclude the need for a sequenced genome of M. maximus, mainly due to the possibility of identifying exclusive markers of the species, and our linkage map can contribute to the assembly of this reference genome.

After allele depth estimation, only 10% of markers were retained for the next analysis, in which we prioritized a minimum average allele depth of 60 reads to suppress the probable overestimation of allele bias due to our population size. Gerard et al. (2018) recommend that more than 25 reads be used to obtain a strong correlation of true genotypes under high levels of bias and overdispersion, emphasizing that read depth requirements should be based on how many individuals are included in the study. Of the genetic mapping studies involving tropical forage grasses, only one reported the use of SNP markers with allele dosage, and in the study, a minimum overall depth of 25 reads was considered in a biparental progeny of *U. decumbens* containing 217  $F_1$  hybrids (Ferreira et al., 2019).

Updated statistical models and the recent genome sequencing technologies promoted advances in the knowledge of the genetics of polyploid organisms, as demonstrated by the comparison of our genetic map for M. maximus with the first map for this species published over ten years ago by Ebina et al. (2005). The first map contained 360 dominant markers obtained with amplified fragment length polymorphism (AFLP) and random amplified polymorphic DNA (RAPD) techniques that segregated at a 1:1 ratio and was obtained from an apomictic cultivar used for genetic breeding in Japan. These markers were distributed in 39 linkage groups, which is greater than the number expected for this species (2n = 4x = 32). In this context, the use of SNPs as codominant markers and their quantitative analysis allowed many gains in our map, such as coverage of many regions of quantitative traits important to breeders and the genetic effects that influence these traits, as well as alleles of the parents that were determinant of the characters of the hybrid.

In addition, the strategy of greater refinement of SNPs adopted after estimating allele dosage using two programs of mapping prevented overinflation among loci. We detected some markers with SD (**Table 2**), but we chose not to use them, aiming to increase the probability of obtaining an exact distance between markers in the HGs. Since genotyping errors are probable, a large

amount of missing data and a large number of distorted loci may promote the expansion of linkage maps as well as overestimate the recombination fractions and limit the accuracy of the mapping (Cartwright et al., 2007; Gerard et al., 2018). However, SD is a phenomenon commonly found in the genome, and some linkage maps contain distorted markers, including those of grasses such as pearl millet (Sehgal et al., 2012) and napiergrass (Paudel et al., 2018). Therefore, greater knowledge of the occurrence and genetic causes of SD in plants is important for inferring which genes are kept together or separated by SD (Zhu et al., 2006; Anhalt et al., 2008). Thus, future studies might aggregate information on the structure of loci with SD in the genome of *M. maximus*.

Most linkage maps in grasses include only single-dose markers with segregation ratios of 1:1 and 3:1; thus, the heterozygous classes were grouped with one of the homozygous classes, resulting in a loss of information (Bourke et al., 2018b). The use of linkage maps with simplex SNPs for most linkage groups and a high density of higher-dosage markers provides greater confidence in the modeling of allelic effects of QTLs (Hackett et al., 2014). The markers present in our map were mostly simplex, while higher-dosage markers comprised approximately 28.4% of the map, as shown in Table 2. Similar values were also verified in the genetic map of U. decumbens (Ferreira et al., 2019), probably due to the complexity of scoring and analyzing these types of markers. Our map presented a greater number of alleles exclusive to the apomictic parent than sexual parent, as observed in the previous map of M. maximus (Ebina et al., 2005) and in the genetic maps of other forage grasses (Worthington et al., 2016; Ferreira et al., 2019). This difference is likely due to the origin of the genotypes: "Mombaça" and S10 have natural tetraploid genomes, but S10 was obtained from a sexual x apomictic cross of an original diploid sexual plant that was duplicated with colchicine.

Our linkage map was sufficient for the identification of an oligogenic trait with a genomic region responsible for 80% of the phenotypic variance and polygenic traits. Therefore, our map will also be useful for the detection of other important characteristics in *M. maximus* and can contribute to the assembly of the genome of this species, as well as to studies about the biology and evolution of other phylogenetically closely related tropical forage grasses, such as those in the *Urochloa* and *Paspalum* genera.

## **Double Reduction in Guinea Grass**

We reported for the first time the occurrence of DR in *M. maximus*. Autotetraploids may undergo this type of segregation when in multivalent pairing, two pairs of chromatids pass to the same pole in anaphase I of meiosis (Haynes and Douches, 1993). In guinea grass, irregular chromosome segregation has already been verified in cytogenetic analysis in hybrids and parents from the breeding program of the Embrapa Beef Cattle (Pessim et al., 2010; Pessim et al., 2015). The distribution of the markers with DR between the dosage types was proportional to the number of SNPs with each configuration. DR has been extensively studied using SNPs with dosage data in autotetraploid linkage maps in potato (Hackett et al., 2017; Bourke et al., 2018a). Approximately

6% of markers in potato have DR (Bourke et al., 2015), corroborating our results (9.68%). Despite some studies suggesting that DR should be included in genetic map construction and in QTL analysis (Li et al., 2010), other studies verified that such markers exert only minor positive effects on the power and accuracy of mapping analysis using single-dose markers (Bourke et al., 2015) and higher-dose markers (Bourke et al., 2016). In addition, statistical models have been created to include DR in linkage mapping (Huang et al., 2019), but no software currently implements them.

The occurrence of DR in M. maximus has many implications for breeding programs, being that the effects of DR and how to handle them have been the targets of several studies (Luo et al., 2000; Xu et al., 2013; Layman and Busch, 2018). This type of segregation exposes alleles located in distal regions of the chromosomes to homozygosis and thus is effective in eliminating the lethal alleles in a population (Butruille and Boiteux, 2000). A low rate of DR is sufficient to considerably reduce the equilibrium frequency of a deleterious allele at one locus (Luo et al., 2006). As an alternative, DR could be used to accelerate the accumulation of favorable rare alleles through marker-assisted selection (MAS) (Bourke et al., 2015). In addition, it is possible to obtain genotypes with loci having a higher homozygosis rate for use in specific crosses (Bourke et al., 2015). In this context, more detailed molecular study could elucidate the influence of DR on the phenotypes of hybrids of our study species.

# Apospory Mapping and the Search for Gene Similarity

A chi-square test ( $X^2 = 5.43$ ,  $p \ge 0.01$ ) performed for qualitative analysis of the reproductive mode of the 106 hybrids followed the Mendelian inheritance model, corroborating the results obtained with progeny tests in guinea grass performed by Savidan (1980) and Savidan (1981), in which sexual x apomictic progenies exhibited a 1:1 ratio that could be explained by an Aaaa genotype for apomictic because the aposporous apomixis of M. maximus is dominant over sexuality. We also proved this finding through SNP markers. Other studies of grasses such as Pennisetum (Akiyama et al., 2011), Paspalum (Martínez et al., 2003) and Urochloa (Valle et al., 1994; Vigna et al., 2016) also verified this segregation for the reproductive mode. Evidence suggests that this locus is present in a conserved region of the plant genome; however, further molecular genomic studies on aposporous apomixis in forage grasses are needed because the recent studies have led to other hypotheses, such as a possible influence of epigenetics (Kumar, 2017). Interestingly, more advanced studies on apomixis in M. maximus genotypes from a germplasm bank of India reported the decoupling of apomixis into three components, namely, apospory, parthenogenesis and pseudogamousendosperm. These components are three distinct genetic determinants that determine an individual as apomictic, and recombination might occur among these components, supporting the hypothesis that more major genes are involved in apomixis control (Kaushal et al., 2008; Kaushal et al., 2019). This decoupling in neo-apomictics might be the target of an adaptive

mechanism to maintain variability through hybridization and could be beneficial to the breeding program (Kaushal et al., 2019).

The aposporous region in *M. maximus* was previously mapped (Ebina et al., 2005; Bluma-Marques et al., 2014), and similar to our results, no markers were in perfect linkage with the region. Nonetheless, we mapped markers at a shorter distance (0.8 cM) from the apo-locus (**Figure 3**). Genetic markers linked to apomixis have been sought in other tropical forage grasses (Vigna et al., 2016; Worthington et al., 2016; Worthington et al., 2019), aiming at the efficient and rapid identification of the reproductive mode of progenies. Once identified, such markers may be transferred among forage grasses, based on evidence of conservation of the ASGR. Thus, markers near the apospory region that were identified in our map may be validated and useful for the breeding program of this species.

In addition, we observed that the markers closer to the peak region of the apo-locus were in a genomic region of P. virgatum similar to a region of the genome of A. thaliana that contains the SERK1 gene. This gene is involved in the signaling pathway active during zygotic and somatic embryogenesis in A. thaliana, and its overexpression increases the efficiency of somatic embryogenesis initiation (Hecht et al., 2001). In nucellar cells of apomictic genotypes of Poa pratensis, the SERK gene is involved in embryo sac development (Albertini et al., 2005). Recently, SERK was reported in Brachypodium distachyon grass as having a domain conserved among monocots and plays a prominent role in apomixis (Oliveira et al., 2017). Scarce studies have investigated the genes involved in the regulation of reproductive events in guinea grass, and these previous studies mainly utilized of transcriptome data (Toledo-Silva et al., 2013; Radhakrishna et al., 2018).

### **QTLs for Agronomic and Nutritional Traits**

A QTL mapping approach is required for the characterization of the genetic architecture of traits. In our study, QTL analysis of autotetraploid progeny was performed using interval mapping (IM) of markers with allele dosage. This same methodology was successfully applied in QTL mapping in signalgrass, another important forage grass (Ferreira et al., 2019). The multiple interval mapping (MIM) method was recently implemented in polyploids and is a new alternative for other mapping studies using data with allele dosage information (Pereira et al., 2019). The mapping method used here considered only the peak with the largest effect as a QTL, but it is worth mentioning that peaks were present near the peak QTL for all agronomic traits (**Supplementary Figure 2**).

QTLs associated with important agronomic traits were mapped in HGs I, III, VII and VIII, with the phenotypic variation explained ranging from 4.3% to 10.4% (**Table 4**). Because *M. maximus* is undergoing a domestication process, the crop can still be greatly improved by the selection of largeeffect QTLs. Therefore, QTL qRC9, located at 75 cM in HG II, which explained 10.3% of the phenotypic variation in RC (**Supplementary Figure 2**, HG\_2(B)) and had a predominant additive effect of the female progenitor S10, may be a candidate for the marker-assisted selection program of guinea grass.

We found more than one QTL for TDM, LDM, and RC, again supporting the hypothesis of complex genetic control. Conversely, we found only one QTL for PLB in both parents. TDM and LDM showed high broad-sense heritability (<0.5), followed by RC (0.3) and PLB (0.1), as shown in Table 1. Higher heritability values (<0.85) for LDM and RC and a value for PLB above 0.4 were recently reported in M. maximus (Lara et al., 2019), using the generalized heritability formula (Cullis et al., 2006). For this species, a greater amount (g/plant) of TDM and LDM in the progenies has been associated with considerable heritability from the most productive parents (Braz et al., 2013; Braz et al., 2017). Matias et al. (2019) also verified the same pattern in interspecific hybrids from Urochloa spp., another genus adapted to tropical conditions. The intermediate heritability of RC and the QTLs associated with this trait that were detected in both parents resulted in hybrids with a good capacity for regrowth. This trait is also considered fundamental in forage grasses because it is directly related to the persistence of the forage after defoliation (Jank et al., 2011).

The negative correlation between PLB and SDM was expected (Figure 1), and Braz et al. (2017) verified the higher PLB values in the experiment of this progeny. PLB is related to plant structure, and plants with a high percentage of leaves are desirable because this trait is related to higher forage quality. A higher PLB was observed in the male parent, cv. Mombaça, which is often used as a check in experiments. Since its release in the 1990s, along with cv. Tanzania, cv. Mombaça has promoted pasture intensification in the country due to its very high productivity and forage quality (Jank et al., 2014). Progenies whose female parent is S10 generally also present good yield (Resende et al., 2004). Breeding programs target these traits in search of superior genotypes with greater foliar mass and a higher percentage of leaves due to the higher digestibility of leaves than of stems for animals. Thus, forage breeding is not restricted to the obtaining of more productive plants; it also contributes to greater efficiency in their transformation into animal production (Valle et al., 2009).

Significant and positive correlations among the traits GM, TDM, SDM, LDM, and RC corroborated the positions of QTLs associated with agronomic traits in the linkage map (Figures 1 and 3). The traits GM and LDM exhibited high heritability (Table 1) and strong positive correlation (Figure 1), which suggests that genetic improvements in these traits could be achieved by selective phenotyping for only one of these traits, without the need to do separation of plant part. We detected qTDM3 and qRC9 in a common region in HG II; qGM1, qTDM4, qLDM5, and qSDM7 in the same region in HG V; and qGM2, qLDM6, and qRC10 in part of a common region in HG VI. Each region containing several QTLs for different traits suggests the occurrence of four QTL hotspots. Interestingly, QTLs for PLB were not detected in any region with other agronomic traits, and a negative correlation has also been observed; however, a positive correlation with NDF was verified, and such a QTL was detected in a similar region with qNDF\_L13 and qNDF\_S18 in HG IV (Figure 3), suggesting a fifth QTL hotspot.

Clustering of QTLs for genetically correlated traits in the same or adjacent regions of HGs in several organisms may be due to physical linkage, pleiotropy or natural selection for coadapted traits (Studer and Doebley, 2011; Wu et al., 2015). We have taken the first step in the identification of loci that lead to these trait correlations and the degree to which these patterns affect productivity in *M. maximus*. QTLs colocated in the same region of HGs for agronomic traits have also been identified in some grasses (Fang et al., 2016; Sartie et al., 2018).

All HGs contained QTLs related to nutritional traits, with those related to the leaf and stem being found mainly in HG III and HG VIII, respectively. Again, some traits had more than one peak that could not be considered due to the methodology adopted (**Supplementary Figures 3**, **4**). The phenotypic variance explained by these QTLs ranged between 2.5% (qADF\_L22) and 12.1% (qNDF\_L11 and qNDF\_S16). Interestingly, both parents contributed alleles for most of the identified QTLs, providing evidence that the genotypes have high nutritional quality.

The selection of a superior genotype of perennial tropical forages is based on the analysis of traits through repeated measures over a number of harvests, seasons, and years (Fernandes et al., 2017). The nutritional QTLs found in our study need further investigation because only one harvest was analyzed and interactions could not be measured. In a selection study of U. decumbens and U. humidicola, Figueiredo et al. (2019) identified a significant Genotype x Harvest Interaction (GHI) effect (p<0.05) for different agronomic and nutritional traits, which reflect differences in the relative performances of genotypes across harvests. GHI also has been reported as significant in M. maximus, and the average number of harvests needed for a reliable selection of nutritional traits, such as OM and CP, would be 3 and 5 at accuracy levels of 0.80 and 0.85, respectively (Fernandes et al., 2017). Thus, GHI directly affects the selection of the genotypes and further studies with more harvests are needed to consolidate our results about putative OTLs to nutritional traits.

The heritability of the nutritional traits varied from low (0.06), obtained for SIL\_S, to moderate (0.32), obtained for OM\_L. This result also reinforces the necessity of more harvests for the efficient selection of superior genotypes for nutritional traits (Fernandes et al., 2017). Traits IVD\_L and IVD\_S presented the same standard as the crude protein, with the H<sup>2</sup> of the stem being higher than that of the leaf (**Table 1**). Historically, cv. Mombaça has stood out due to its high productivity, but with slightly lower values for forage quality when compared to 'Tanzania', and in biparental crosses, the hybrids obtained from "Mombaça" also presented these features (Braz et al., 2017). This finding was corroborated by the heritability verified above in our study of agronomic and nutritional traits.

The nutritional quality of forage grasses is important in several aspects and is directly related to the production of meat and milk. *M. maximus* shows a high value of CP compared to other tropical forages. However, the values for lignin and fiber are expected to be low because lignin hampers the enzymatic hydrolysis of cellulose and hemicellulose and, thus, the digestion of the cell wall of the leaf tissue and the stem (Jung and Allen, 1995). The relationship between the biomasses of leaves and stems is important due to its effects on nutritional value and voluntary consumption by animals. The NDF is associated with fibrous fractions and with voluntary consumption. The fractions that are not digested by the animal take up space in the digestive tract, impairing the digestion and consumption of dry matter (Euclides et al., 1999).

NDF\_L and NDF\_S showed a strong positive correlation, and their respective QTLs were in the same regions in the HGs. In the linkage map, qCEL\_L30 and qADF\_L20 QTLs were in the same region, and qCEL\_S31 and qADF\_S26 were both located in HG VIII and were significantly correlated (Figure 1). The traits CP and IVD showed a weak positive correlation, but the qCP\_S8 and qIVD\_S28 QTLs were present in the same region of HG V, and qCP\_S9 and qIVD\_S29 were identified in the same region of HG VIII. Interestingly, qPL\_S34 was verified in HG VIII in the same region as CP and IVD QTLs, and qADF\_L21 shared a similar region with qCP\_L7 in HG V. In addition, qCP\_L7 extended to QTLs related to agronomic traits (qGM1, qTDM4, qLDM5 and qSDM7). A total of 8 probable QTL hotspots have been identified, supporting the need for further studies in search of a specific gene controlling all these traits or several genes acting together.

Notably, in the progenies of *M. maximus* from lower-yielding parents, the nutritional value is generally higher. With the identified QTLs, more in-depth studies of this correlation will be possible. In addition, QTLs related to forage quality have not been found in other important tropical species, such as *Urochloa* spp. Therefore, our results can contribute to the search for important genomic regions in other forage species.

## Search for Similarity in QTL Regions

The search for putative candidate genes was based on all 23 QTL regions. Generally, the same gene families from *A. thaliana*, *O. sativa*, and *P. virgatum* were identified for a common QTL region. These genes are also found in the literature and are described in **Table 6** and **Supplementary Table 5**.

Exploration of genes involved in plant growth and development, especially those related to hormone regulation, is crucial in forage grass breeding programs. Interestingly, the gibberellin family (GA<sub>S</sub>) was identified in HG III region 9 (qPL\_L33), whose QTL is related to lignin, a complex phenolic polymer deposited in the secondary cell wall of all vascular plants (Zhao, 2016). The interrelations between cell wall components cause cellulose and lignin to be codependent, a normal cellulose deposition pattern may be necessary for lignin assembly, and alterations of lignin content may lead to changes in the cell orientation of cellulose fibrils and, consequently, in digestibility (Anderson et al., 2015; Liu et al., 2016). GAs promote biochemical, physiological and anatomical plant changes (Hedden and Thomas, 2016). The induction of cellulose synthesis by GAs promotes the release of secondary regulators of cell wall proteins and, consequently, can boost lignin deposition and increase lignin content (Zhao, 2016). GAs at increased light

levels have been shown to promote cell wall thickness and increase lignin deposition in xylem fibers (Falcioni et al., 2018).

Other important genes identified are associated with pectinesterase/pectin methylesterase and were present in HG V—region 14 (qGM1/qTDM4/qLDM5/qSDM7/qADF\_L21/qCP\_L7) and HG VIII—region 23 (qSIL\_S37), which also contained agronomic QTLs. Pectinesterase is responsible for the hydrolyzation of pectin, the major component of cell walls (Pelloux et al., 2007). In addition, this enzyme is involved in developmental processes such as stem elongation in *A. thaliana* (Damm et al., 2016) and in *B. distachyon* grass (Feng et al., 2015). However, more in-depth research should be performed to ensure an understanding of the signaling pathways of these genes and make this understanding applicable to tropical forage breeding programs.

In conclusion, the present study produced a high-resolution linkage map with allele dosage information obtained from a fullsib progeny of *M. maximus* with high genetic variability. Even without the availability of a sequenced genome for this species, the approach adopted for the construction of our map was sufficient to detect many QTLs associated with agronomic and nutritional traits that are important for forage breeding. Our genetic map also allowed us to map the apo-locus to a single linkage group and provided a more up-to-date study of the mode of reproduction of *M. maximus*. The knowledge about the genetics of these traits that we obtained is the first step in discovering genes involved in relevant biological processes as well as understanding the genetic architecture of relevant traits in this species.

#### DATA AVAILABILITY STATEMENT

The datasets generated for this study can be found in the NCBI/PRJNA563938.

### **AUTHOR CONTRIBUTIONS**

AG, LJ, and AS conceived and designed the experiments. MS and LJ conducted the field experiments. TD, RF, AM, AP, and FO performed the laboratory experiments. TD, RF, LL, AM, AA-P, and FO analyzed the data. TD, RF, and LL wrote the manuscript. All authors read and approved the manuscript.

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#### REFERENCES

ABIEC-Associação Brasileira das Indústrias Exportadoras de Carne (2019). Beef Report Perfil da pecuária no Brasil [Online]. Available at: http://www.abiec.com.br/ controle/uploads/arquivos/sumario2019portugues.pdf. (Acessed May 30, 2019). Program), Embrapa and UNIPASTO. TD received PhD fellowships from the CAPES Computational Biology Program and an MSc fellowship from FAPESP (2017/17969-5) and the CAPES Computational Biology Program. RF, FO, and AP received postdoctoral fellowships from FAPESP (2018/19219-6, 2018/18527-9 and 2018/00036-9, respectively). LL received a postdoctoral fellowship from the CAPES Computational Biology Program. AG and AS were recipients of a Research Fellowship, and LJ was recipient of a Technological Development scholarship, all received from the Conselho Nacional de Desenvolvimento Científico e Tecnológico (CNPq).

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### SUPPLEMENTARY MATERIAL

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fpls.2020.00015/ full#supplementary-material

**FIGURE S1** | Identification of the apospory region position (cM) in HG II from guinea grass mapping population. Dotted line indicate the LOD thresholds of 90% and 95% obtained after the permutation tests.

FIGURE S2 | Interval mapping (IM) for agronomic traits from the guinea grass (Megathyrsus maximus) population in HGs II, IV, V and VI. Agronomic traits: green matter (GM), total dry matter (TDM), leaf dry matter (LDM), stem dry matter (SDM), regrowth capacity (RC) and percentage of leaf blade (PLB). Dotted lines indicate the LOD thresholds of 90% and 95% obtained after the permutation tests.

**FIGURE S3** | Interval mapping (IM) for forage quality from the guinea grass (Megathyrsus maximus) population in HGs I to IV. Nutritional quality traits for the leaf (L) and/or stem (S): organic matter (OM\_S), crude protein (CP\_L), in vitro digestibility of organic matter (IVD\_L), neutral detergent fiber (NDF\_L and NDF\_S), acid detergent fiber (ADF\_L), cellulose (CEL\_L), silica (SIL\_L), and permanganate lignin (PL\_L). Dotted lines indicate the LOD thresholds of 90% and 95% obtained after the permutation tests.

**FIGURE S4** | Interval mapping (IM) for forage quality from the guinea grass (Megathyrsus maximus) population in HGs V to VIII. Nutritional quality traits for the leaf (L) and/or stem (S): organic matter (OM\_L and OM\_S), crude (CP\_L and CP\_S), in vitro digestibility of organic matter (IVD\_S), neutral detergent fiber (NDF\_L and NDF\_S), acid detergent fiber (ADF\_L and ADF\_S), cellulose (CEL\_S), silica (SIL\_L and SIL\_S), and permanganate lignin (PL\_S). Dotted lines indicate the LOD thresholds of 90% and 95% obtained after the permutation tests.

Aguilera-Alvarado, G. P., and Sánchez-Nieto, S. (2017). Plant hexokinases are multifaceted proteins. *Plant Cell Physiol.* 58 (7), 1151–1160. doi: 10.1093/pcp/ pcx062

Akaike, H. (1974). A new look at the statistical model identification. *IEEE Trans.* Autom. Control 19, 716–723. doi: 10.1109/TAC.1974.1100705 Akiyama, Y., Goel, S., Conner, J. A., Hanna, W. W., Yamada-Akiyama, H., and

Ozias-Akins, P. (2011). Evolution of the apomixis transmitting chromosome in Pennisetum. *BMC Evolut. Biol.* 11, 289. doi: 10.1186/1471-2148-11-289

- Albertini, E., Marconi, G., Reale, L., Barcaccia, G., Porceddu, A., Ferranti, F., et al. (2005). SERK and APOSTART. *Candidate Genes Apomixis In Poa pratensis*. *Plant Physiol.* 138 (4), 2185–2199. doi: 10.1104/pp.105.062059
- Albrecht, C., Russinova, E., Kemmerling, B., Kwaaitaal, M., and de Vries, S. C. (2008). Arabidopsis SOMATIC EMBRYOGENESIS RECEPTOR KINASE proteins serve brassinosteroid-dependent and-independent signaling pathways. *Plant Physiol.* 148 (1), 611–619. doi: 10.1104/pp.108.123216
- Anderson, N. A., Tobimatsu, Y., Ciesielski, P. N., Ximenes, E., Ralph, J., et al. (2015). Manipulation of guaiacyl and syringyl monomer biosynthesis in an Arabidopsis cinnamyl alcohol dehydrogenase mutant results in atypical lignin biosynthesis and modified cell wall structure. *Plant Cell*. 27 (8), 2195–2209. doi: 10.1105/tpc.15.00373
- Anhalt, U. C. M., Heslop-Harrison, P., Byrne, S., Guillard, A., and Barth, S. (2008). Segregation distortion in *Lolium*: evidence for genetic effects. *Theor. Appl. Genet.* 117, 297–306. doi: 10.1007/s00122-008-0774-7
- Bannenberg, G., Martínez, M., Hamberg, M., and Castresana, C. (2009). Diversity of the enzymatic activity in the lipoxygenase gene family of *Arabidopsis thaliana*. *Lipids* 44 (2), 85. doi: 10.1007/s11745-008-3245-7
- Bluma-Marques, A. C., Chiari, L., Agnes, D. C., Jank, L., and Pagliarini, M. S. (2014). Molecular markers linked to apomixis in *Panicum maximum* Jacq. *Afr. J. Biotechnol.* 13, 2198–2202. doi: 10.5897/AJB2014.13703
- Bourke, P. M., Voorrips, R. E., Visser, R. G. F., and Maliepaard, C. (2015). The double-reduction landscape in tetraploid potato as revealed by a high-density linkage map. *Genetics* 201, 853–863. doi: 10.1534/genetics.115.181008
- Bourke, P. M., Voorrips, R. E., Kranenburg, T., Jansen, J., Visser, R. G., and Maliepaard, C. (2016). Integrating haplotype-specific linkage maps in tetraploid species using SNP markers. *Theor. Appl. Genet.* 129, 2211–2226. doi: 10.1007/s00122-016-2768-1
- Bourke, P. M., van Geest, G., Voorrips, R. E., Jansen, J., Kranenburg, T., Shahin, A., et al. (2018a). polymapR-linkage analysis and genetic map construction from F1 populations of outcrossing polyploids. *Bioinformatics* 34, 3496–3502. doi: 10.1093/bioinformatics/bty371
- Bourke, P. M., Voorrips, R. E., Visser, R. G. F., and Maliepaard, C. (2018b). Tools for genetic studies in experimental populations of polyploids. *Front. Plant Sci.* 9, 1–17. doi: 10.3389/fpls.2018.00513
- Bourke, P. M., Hackett, C. A., Voorrips, R. E., Visser, R. G. F., and Maliepaard, C. (2019). Quantifying the power and precision of QTL analysis in autopolyploids under bivalent and multivalent genetic models. *G3 (Bethesda)* 9, 2107–2122. doi: 10.1534/g3.119.400269
- Box, G. E. P., and Cox, D. R. (1964). An analysis of transformations. J. R. Stat. Soc Ser. B. (Methodol.) 26, 211–252. doi: 10.1111/j.2517-6161.1964.tb00553.x
- Bradshaw, J. E. (2007). The canon of potato science: 4. Tetrasomic inheritance. Potato Res. 50, 219–222. doi: 10.1007/s11540-008-9041-1
- Braz, T. G. D. S., Fonseca, D. M. D., Jank, L., Resende, M. D. V. D., Martuscello, J. A., and Simeão, R. M. (2013). Genetic parameters of agronomic characters in *Panicum maximum* hybrids. *Rev. Bras. Zootec.* 42 (4), 231–237. doi: 10.1590/ S1516-35982013000400001
- Braz, T. G., d., S., Martuscello, J. A., Jank, L., Fonseca, D. M. D., Resende, M. D. V., et al. (2017). Genotypic value in hybrid progenies of *Panicum maximum* Jacq. *Ciênc. Rural* 47, e20160599. doi: 10.1590/0103-8478cr20160599
- Burke, S. V., Wysocki, W. P., Zuloaga, F. O., Craine, J. M., Pires, J. C., Edger, P. P., et al. (2016). Evolutionary relationships in Panicoid grasses based on plastome phylogenomics (Panicoideae; Poaceae). *BMC Plant Biol.* 16 (1), 140. doi: 10.1186/s12870-016-0823-3
- Butler, D. G., Cullis, B. R., Gilmour, A. R., and Gogel, B. J. (2009). ASREML-R Reference Manual. Release 3.0. (Australia: Queensland Department of Primary Industries).
- Butruille, D. V., and Boiteux, L. S. (2000). Selection-mutation balance in polysomic tetraploids: impact of double reduction and gametophytic selection on the frequency and subchromosomal localization of deleterious mutations. *Proc. Natl. Acad. Sci. U.S.A.* 97, 6608–6613. doi: 10.1073/pnas.100101097
- Cartwright, D. A., Troggio, M., Velasco, R., and Gutin, A. (2007). Genetic mapping in the presence of genotyping errors. *Genetics* 176, 2521–2527. doi: 10.1534/ genetics.106.063982

- Chen, L., Guan, L., Kojima, A., and Adachi, T. (2000). The mechanisms of appearance of aposporous initial cell and apomictic embryo sac formation in *Paspalum notatum. Cytologia* 65, 333–341. doi: 10.1508/cytologia.65.333
- Chrost, B., Kolukisaoglu, U., Schulz, B., and Krupinska, K. (2007). An  $\alpha$ -galactosidase with an essential function during leaf development. *Planta* 225 (2), 311–320. doi: 10.1007/s00425-006-0350-9
- Conner, J. A., Goel, S., Gunawan, G., Cordonnier-Pratt, M.-M., Johnson, V. E., Liang, C., et al. (2008). Sequence analysis of bacterial artificial chromosome clones from the apospory-specific genomic region of *Pennisetum* and *Cenchrus. Plant Physiol.* 147, 1396–1411. doi: 10.1104/pp.108.119081
- Corratgé-Faillie, C., and Lacombe, B. (2017). Substrate (un) specificity of Arabidopsis NRT1/PTR FAMILY (NPF) proteins. J. Exp. Bot. 68 (12), 3107– 3113. doi: 10.1093/jxb/erw499
- Cullis, B. R., Smith, A. B., and Coombes, N. E. (2006). On the design of early generation variety trials with correlated data. J. Agric. Biol. Environ. Stat 11 (4), 381. doi: 10.1198/108571106X154443
- Damm, T., Commandeur, U., Fischer, R., Usadel, B., and Klose, H. (2016). Improving the utilization of lignocellulosic biomass by polysaccharide modification. *Process Biochem.* 51 (2), 288–296. doi: 10.1016/ j.procbio.2015.12.003
- Daverdin, G., Bahri, B. A., Wu, X., Serba, D. D., Tobias, C., Saha, M. C., et al. (2015). Comparative relationships and chromosome evolution in switchgrass (*Panicum virgatum*) and its genomic model, foxtail millet (*Setaria italica*). *BioEnerg. Res.* 8, 137–151. doi: 10.1007/s12155-014-9508-7
- Davin, L. B., and Lewis, N. G. (2003). An historical perspective on lignan biosynthesis: monolignol, allylphenol and hydroxycinnamic acid coupling and downstream metabolism. *Phytochem. Rev.* 2 (3), 257. doi: 10.1023/B: PHYT.0000046175.83729.b5
- Day, I. S., Reddy, V. S., Ali, G. S., and Reddy, A. S. N. (2002). Analysis of EF-handcontaining proteins in Arabidopsis. *Genome Biol.* 3 (10), research0056–1. doi: 10.1186/gb-2002-3-10-research0056
- Dettmer, J., Schubert, D., Calvo-Weimar, O., Stierhof, Y. D., Schmidt, R., and Schumacher, K. (2005). Essential role of the V-ATPase in male gametophyte development. *Plant J.* 41 (1), 117–124. doi: 10.1111/j.1365-313X.2004.02282.x
- Dimkpa, S. O., Lahari, Z., Shrestha, R., Douglas, A., Gheysen, G., and Price, A. H. (2015). A genome-wide association study of a global rice panel reveals resistance in Oryza sativa to root-knot nematodes. *J. Exp. Bot.* 67 (4), 1191– 1200. doi: 10.1093/jxb/erv470
- Ding, W., Lin, L., Zhang, B., Xiang, X., Wu, J., Pan, Z., et al. (2015). OsKASI, a βketoacyl-[acyl carrier protein] synthase I, is involved in root development in rice (*Oryza sativa* L.). *Planta* 242 (1), 203–213. doi: 10.1007/s00425-015-2296-2
- Doerge, R. W. (2002). Mapping and analysis of quantitative trait loci in experimental populations. *Nat. Rev. Genet.* 3, 43-52. doi: 10.1038/nrg703
- Doyle, J. J., and Doyle, J. L. (1987). A rapid DNA isolation procedure for small quantities of fresh leaf tissue. *Phytochem. Bull.* 19, 11-5.
- Ebina, M., Nakagawa, H., Yamamoto, T., Araya, H., Tsuruta, , S. i., Takahara, M., et al. (2005). Co-segregation of AFLP and RAPD markers to apospory in guinea grass (*Panicum maximum* Jacq.). *Grassl. Sci.* 51, 71–78. doi: 10.1111/ j.1744-697X.2005.00011.x
- Epskamp, S., Cramer, A. O. J., Waldorp, L. J., Schmittmann, V. D., and Borsboom, D. (2012). qgraph: network visualizations of relationships in psychometric data. *J. Stat. Softw.* 48, 1–18. doi: 10.18637/jss.v048.i04
- Euclides, V. P. B., Thiago, L. R. L., d., S., Macedo, M. C. M., and Oliveira, M. P. (1999). dConsumo voluntário de forragem de três cultivares de *Panicum* maximum sob pastejo. *Rev. Bras. Zootec.* 28, 1177–1185. doi: 10.1590/S1516-35981999000600002
- Eulgem, T., Rushton, P. J., Robatzek, S., and Somssich, I. E. (2000). The WRKY superfamily of plant transcription factors. *Trends In Plant Sci.* 5 (5), 199–206. doi: 10.1016/S1360-1385(00)01600-9
- Falcioni, R., Moriwaki, T., Oliveira, D. M. D., Andreotti, G. C., Souza, L. A., et al. (2018). Increased gibberellins and light levels promotes cell wall thickness and enhance lignin deposition in xylem fibers. *Front. Plant Sci.* 9, 1391. doi: 10.3389/fpls.2018.01391
- Fang, X., Dong, K., Wang, X., Liu, T., He, J., Ren, R., et al. (2016). A high density genetic map and QTL for agronomic and yield traits in Foxtail millet [Setaria italica (L.) P. Beauv.]. BMC Genomics 17 (1), 336. doi: 10.1186/s12864-016-2628-z

- Feng, H., Chen, Q., Feng, J., Zhang, J., Yang, X., and Zuo, J. (2007). Functional characterization of the Arabidopsis eukaryotic translation initiation factor 5A-2 that plays a crucial role in plant growth and development by regulating cell division, cell growth, and cell death. *Plant Physiol.* 144 (3), 1531–1545. doi: 10.1104/pp.107.098079
- Feng, Y., Yin, Y., and Fei, S. (2015). Down-regulation of BdBRI1, a putative brassinosteroid receptor gene produces a dwarf phenotype with enhanced drought tolerance in Brachypodium distachyon. *Plant Sci.* 234, 163–173. doi: 10.1016/j.plantsci.2015.02.015
- Fernandes, F. D., Braga, G. J., Ramos, A. K. B., Jank, L., Carvalho, M. A., Maciel, G. A., et al. (2017). Repeatability, number of harvests, and phenotypic stability of dry matter yield and quality traits of *Panicum maximum* jacq. *Acta Sci. Anim. Sci.* 39 (2), 149–155. doi: 10.4025/actascianimsci.v39i2.32915
- Ferreira, R. C. U., Lara, L. A., d., C., Chiari, L., Barrios, S. C. L., do Valle, C. B., Valério, J. R., et al. (2019). Genetic mapping with allele dosage information in tetraploid Urochloa decumbens (Stapf) R. D. Webster reveals insights into spittlebug (Notozulia entreriana Berg) resistance. Front. Plant Sci. 10, 1–16. doi: 10.3389/fpls.2019.00092
- Field, D. L., Broadhurst, L. M., Elliott, C. P., and Young, A. G. (2017). Population assignment in autopolyploids. *Heredity* 119, 389–401. doi: 10.1038/hdy.2017.51
- Figueiredo, U. J., de., Berchembrock, J. Y. V., Valle, J. C. B., do, Barrios., J. S. C. L., Quesenberry, K. H., Muñoz, P. R., et al. (2019). Evaluating early selection in perennial tropical forages. *Crop Breed. Appl. Biotechnol.* 19 (3), 291–299. doi: 10.1590/1984-70332019v19n3a41
- Flint-Garcia, S. A., Thornsberry, J. M., and Buckler, E. S. (2003). Structure of linkage disequilibriumin plants. Annu. Rev. Plant Biol. 54, 357–374. doi: 10.1146/annurev.arplant.54.031902.134907
- Friml, J., Wiśniewska, J., Benková, E., Mendgen, K., and Palme, K. (2002). Lateral relocation of auxin efflux regulator PIN3 mediates tropism in Arabidopsis. *Nature* 415 (6873), 806. doi: 10.1038/415806a
- Geisler, M., and Murphy, A. S. (2006). The ABC of auxin transport: the role of pglycoproteins in plant development. *FEBS Lett.* 580 (4), 1094–1102. doi: 10.1016/j.febslet.2005.11.054
- Gerard, D., Ferrão, L. F. V., Garcia, A. A. F., and Stephens, M. (2018). Genotyping polyploids from messy sequencing data. *Genetics* 210, 789–807. doi: 10.1534/ genetics.118.301468
- Glaubitz, J. C., Casstevens, T. M., Lu, F., Harriman, J., Elshire, R. J., Sun, Q., et al. (2014). TASSEL-GBS: a high capacity genotyping by sequencing analysis pipeline. *PloS One* 9, e90346. doi: 10.1371/journal.pone.0090346
- Goodstein, D. M., Shu, S., Howson, R., Neupane, R., Hayes, R. D., Fazo, J., et al. (2012). Phytozome: a comparative platform for green plant genomics. *Nucleic Acids Res.* 40, D1178–D1186. doi: 10.1093/nar/gkr944
- Gualtieri, G., Conner, J. A., Morishige, D. T., Moore, L. D., Mullet, J. E., and Ozias-Akins, P. (2006). A segment of the apospory-specific genomic region is highly microsyntenic not only between the apomicts *Pennisetum squamulatum* and buffelgrass, but also with a rice chromosome 11 centromeric-proximal genomic region. *Plant Physiol.* 140, 963–971. doi: 10.1104/pp.105.073809
- Hála, M., Cole, R., Synek, L., Drdová, E., Pečenková, T., Nordheim, A., et al. (2008). An exocyst complex functions in plant cell growth in Arabidopsis and tobacco. *Plant Cell*. 20 (5), 1330–1345. doi: 10.1105/tpc.108.059105
- Höhner, R., Aboukila, A., Kunz, H. H., and Venema, K. (2016). Proton gradients and proton-dependent transport processes in the chloroplast. *Front. Plant Sci.* 7, 218. doi: 10.3389/fpls.2016.00218
- Hackett, C. A., Bradshaw, J. E., and Bryan, G. J. (2014). QTL mapping in autotetraploids using SNP dosage information. *Theor. Appl. Genet.* 127, 1885–1904. doi: 10.1007/s00122-014-2347-2
- Hackett, C. A., Boskamp, B., Vogogias, A., Preedy, K. F., and Milne, I. (2017). TetraploidSNPMap: software for linkage analysis and QTL mapping in autotetraploid populations using SNP dosage data. J. Hered. 108, 438–442. doi: 10.1093/jhered/esx022
- Haldane, J. B. S. (1930). Theoretical genetics of autopolyploids. J. Genet. 22, 359–372. doi: 10.1007/BF02984197
- Hansen, S. F., Harholt, J., Oikawa, A., and Scheller, H. V. (2012). Plant glycosyltransferases beyond CAZy: a perspective on DUF families. *Front. Plant Sci.* 3, 59. doi: 10.3389/fpls.2012.00059
- Haynes, K. G., and Douches, D. S. (1993). Estimation of the coefficient of double reduction in the cultivated tetraploid potato. *Theor. Appl. Genet.* 85, 857–862. doi: 10.1007/BF00225029

- Hecht, V., Vielle-Calzada, J. P., Hartog, M. V., Schmidt, E. D., Boutilier, K., Grossniklaus, U., et al. (2001). The Arabidopsis SOMATIC EMBRYOGENESIS RECEPTOR KINASE 1 gene is expressed in developing ovules and embryos and enhances embryogenic competence in culture. *Plant Physiol.* 127 (3), 803–816. doi: 10.1104/pp.010324
- Hedden, P., and Thomas, S. G. (2016). "Annual Plant Review," in: The Gibberellins, 1st Edn, Vol. 49 (New York, NY: Wiley Blackwell). doi: 10.1002/9781119210436
- Hemsley, P. A., Kemp, A. C., and Grierson, C. S. (2005). The TIP GROWTH DEFECTIVE1 S-acyl transferase regulates plant cell growth in Arabidopsis. *Plant Cell*. 17 (9), 2554–2563. doi: 10.1105/tpc.105.031237
- Huang, K., Wang, T., Dunn, D. W., Zhang, P., Cao, X., Liu, R., et al. (2019). Genotypic frequencies at equilibrium for polysomic inheritance under doublereduction. G3 (Bethesda) 9, 1693–1706. doi: 10.1534/g3.119.400132
- ITC International Trade Centre (2018). Trade map List of exporters for the Seeds of forage plants for sowing. [Online]. Available at: https://www. trademap.org/Country\_SelProduct\_TS.aspx. (Acessed June 27, 2019).
- Jank, L., Valle, C. B., and Resende, R. M. S. (2011). Breeding tropical forages. Crop Breed. Appl. Biotechnol. 11, 27–34. doi: 10.1590/S1984-70332011000500005
- Jank, L., Barrios, S. C., do Valle, C. B., Simeão, R. M., and Alves, G. F. (2014). The value of improved pastures to Brazilian beef production. *Crop Pasture Sci.* 65 (11), 1132–1137. doi: 10.1071/CP13319
- Julier, B., Flajoulot, S., Barre, P., Cardinet, G., Santoni, S., Huguet, T., et al. (2003). Construction of two genetic linkage maps in cultivated tetraploid alfalfa (*Medicago sativa*) using microsatellite and AFLP markers. *BMC Plant Biol.* 3, 9. doi: 10.1186/1471-2229-3-9
- Jung, H. G., and Allen, M. S. (1995). Characteristics of plant cell walls affecting intake and digestibility of forages by ruminants. J. Anim. Sci. 73, 2774–2790. doi: 10.2527/1995.7392774x
- Köksal, M., Hu, H., Coates, R. M., Peters, R. J., and Christianson, D. W. (2011). Structure and mechanism of the diterpene cyclase ent-copalyl diphosphate synthase. *Nat. Chem. Biol.* 7 (7), 431. doi: 10.1038/nchembio.578
- Kachroo, A., Shanklin, J., Whittle, E., Lapchyk, L., Hildebrand, D., and Kachroo, P. (2007). The Arabidopsis stearoyl-acyl carrier protein-desaturase family and the contribution of leaf isoforms to oleic acid synthesis. *Plant Mol. Biol.* 63 (2), 257–271. doi: 10.1007/s11103-006-9086-y
- Kaushal, P., Malaviya, D. R., Roy, A. K., Pathak, S., Agrawal, A., Khare, A., et al. (2008). Reproductive pathways of seed development in apomictic guinea grass (Panicum maximum Jacq.) reveal uncoupling of apomixis components. *Euphytica* 164, 81–92. doi: 10.1007/s10681-008-9650-4
- Kaushal, P., Dwivedi, K. K., Radhakrishna, A., Srivastava, M. K., Kumar, V., Roy, A. K., et al. (2019). Partitioning apomixis components to understand and utilize gametophytic apomixis. *Front. Plant Sci.* 10, 256. doi: 10.3389/fpls.2019.00256
- Kirioukhova, O., Johnston, A. J., Kleen, D., Kägi, C., Baskar, R., Moore, J. M., et al. (2011). Female gametophytic cell specification and seed development require the function of the putative Arabidopsis INCENP ortholog WYRD. *Development* 138 (16), 3409–3420. doi: 10.1242/dev.060384
- Knopf, R. R., Feder, A., Mayer, K., Lin, A., Rozenberg, M., Schaller, A., et al. (2012). Rhomboid proteins in the chloroplast envelope affect the level of allene oxide synthase in Arabidopsis thaliana. *Plant J.* 72 (4), 559–571. doi: 10.1111/j.1365-313X.2012.05090.x
- Ko, J. H., Yang, S. H., and Han, K. H. (2006). Upregulation of an Arabidopsis RING-H2 gene, XERICO, confers drought tolerance through increased abscisic acid biosynthesis. *Plant J.* 47 (3), 343–355. doi: 10.1111/j.1365-313X.2006.02782.x
- Kohorn, B. D., and Kohorn, S. L. (2012). The cell wall-associated kinases, WAKs, as pectin receptors. Front. Plant Sci. 3, 88. doi: 10.3389/fpls.2012.00088
- Kourelis, J., and van der Hoorn, R. A. (2018). Defended to the nines: 25 years of resistance gene cloning identifies nine mechanisms for R protein function. *Plant Cell*. 30 (2), 285–299. doi: 10.1105/tpc.17.00579
- Kumar, S. (2017). Epigenetic control of apomixis: a new perspective of an old enigma. Adv. Plants Agric. Res. 7, 00243. doi: 10.15406/apar.2017.07.00243
- Kusano, H., Testerink, C., Vermeer, J. E., Tsuge, T., Shimada, H., Oka, A., et al. (2008). The Arabidopsis phosphatidylinositol phosphate 5-kinase PIP5K3 is a key regulator of root hair tip growth. *Plant Cell.* 20 (2), 367–380. doi: 10.1105/ tpc.107.056119
- Langmead, B., Trapnell, C., Pop, M., and Salzberg, S. L. (2009). Ultrafast and memory-efficient alignment of short DNA sequences to the human genome. *Genome Biol.* 10 (3), R25. doi: 10.1186/gb-2009-10-3-r25

- Lara, L. A., Santos, M. F., Jank, L., Chiari, L., Vilela, M. M., Amadeu, R. R., et al. (2019). Genomic selection with allele dosage in *Panicum maximum* Jacq. G3 (Bethesda). 9, 2463–2475. doi: 10.1534/g3.118.200986
- Layman, N. C., and Busch, J. W. (2018). Bottlenecks and inbreeding depression in autotetraploids. *Evolution* 72, 2025–2037. doi: 10.1111/evo.13587
- Li, J., Das, K., Fu, G., Tong, C., Li, Y., Tobias, C., et al. (2010). EM algorithm for mapping quantitative trait loci in multivalent tetraploids. *Int. J. Plant Genom.* 2010, 1–10. doi: 10.1155/2010/216547
- Lin, T. C., Neuner, A., and Schiebel, E. (2015). Targeting of g-tubulin complexes to microtubule organizing centers: conservation and divergence. *Trends In Cell Biol.* 25, 296–307. doi: 10.1016/j.tcb.2014.12.002
- Lin, J. S., Huang, X. X., Li, Q., Cao, Y., Bao, Y., Meng, X. F., et al. (2016). UDPglycosyltransferase 72B1 catalyzes the glucose conjugation of monolignols and is essential for the normal cell wall lignification in Arabidopsis thaliana. *Plant J.* 88 (1), 26–42. doi: 10.1111/tpj.13229
- Liu, J., Im Kim, J., Cusumano, J. C., Chapple, C., Venugopalan, N., Fischetti, R. F., et al. (2016). The impact of alterations in lignin deposition on cellulose organization of the plant cell wall. *Biotechnol. Biofuels* 9 (1), 126. doi: 10.1186/s13068-016-0540-z
- Luo, Z. W., Hackett, C. A., Bradshaw, J. E., McNicol, J. W., and Milbourne, D. (2000). Predicting parental genotypes and gene segregation for tetrasomic inheritance. *Theor. Appl. Genet.* 100, 1067–1073. doi: 10.1007/s001220051388
- Luo, Z. W., Zhang, R. M., and Kearsey, M. J. (2004). Theoretical basis for genetic linkage analysis in autotetraploid species. *Proc. Natl. Acad. Sci. U.S.A.* 101, 7040–7045. doi: 10.1073/pnas.0304482101
- Luo, Z. W., Zhang, Z., Leach, L., Zhang, R. M., Bradshaw, J. E., and Kearsey, M. J. (2006). Constructing genetic linkage maps under a tetrasomic model. *Genetics* 172, 2635–2645. doi: 10.1534/genetics.105.052449
- Marcón, F., Martínez, E. J., Rodríguez, G. R., Zilli, A. L., Brugnoli, E. A., and Acuña, C. A. (2019). Genetic distance and the relationship with heterosis and reproductive behavior in tetraploid bahiagrass hybrids. *Mol. Breed.* 39, 89. doi: 10.1007/s11032-019-0994-3
- Martínez, E. J., Hopp, H. E., Stein, J., Ortiz, J. P. A., and Quarin, C. L. (2003). Genetic characterization of apospory in tetraploid *Paspalum notatum* based on the identification of linked molecular markers. *Mol. Breed.* 12, 319–327. doi: 10.1023/B:MOLB.0000006868.12568.32
- Mashiguchi, K., Asami, T., and Suzuki, Y. (2009). Genome-wide identification, structure and expression studies, and mutant collection of 22 early nodulin-like protein genes in Arabidopsis. *Biosci. Biotechnol. Biochem.* 73 (11), 2452–2459. doi: 10.1271/bbb.90407
- Mather, K. (1935). Reductional and equational separation of the chromosomes in bivalents and multivalents. J. Genet. 30, 53–78. doi: 10.1007/BF02982205
- Matias, F. I., Alves, F. C., Meireles, K. G. X., Barrios, S. C. L., do Valle, C. B., and Endelman, J. B., et al. (2019). On the accuracy of genomic prediction models considering multi-trait and allele dosage in Urochloa spp. interespecific tetraploid hybrids. *Mol. Breeding* 39 (100). doi: 10.1007/s11032-019-1002-7
- Mollinari, M., and Garcia, A. A. F. (2019). Linkage analysis and haplotype phasing in experimental autopolyploid populations with high ploidy level using hidden Markov models. G3 9 (10), 3297–3314. doi: 10.1534/g3.119.400378
- Mousavi, A., and Hotta, Y. (2005). Glycine-rich proteins. Appl. Biochem. Biotechnol. 120 (3), 169–174. doi: 10.1385/ABAB:120:3:169
- Munné-Bosch, S., Simancas, B., and Müller, M. (2018). Ethylene signaling crosstalk with other hormones in Arabidopsis thaliana exposed to contrasting phosphate availability: differential effects in roots, leaves and fruits. J. Plant Physiol. 226, 114–122. doi: 10.1016/j.jplph.2018.04.017
- Ndamukong, I., Chetram, A., Saleh, A., and Avramova, Z. (2009). Wall-modifying genes regulated by the Arabidopsis homolog of trithorax, ATX1: repression of the XTH33 gene as a test case. *Plant J.* 58 (4), 541–553. doi: 10.1111/j.1365-313X.2009.03798.x
- Newman, K. L., Fernandez, A. G., and Barton, M. K. (2002). Regulation of axis determinacy by the Arabidopsis PINHEAD gene. *Plant Cell.* 14 (12), 3029– 3042. doi: 10.1105/tpc.005132
- Niño-González, M., Novo-Uzal, E., Richardson, D. N., Barros, P. M., and Duque, P. (2019). More transporters, more substrates: the arabidopsis major facilitator superfamily revisited. *Mol. Plant.* 12 (9): 1182–1202. doi: 10.1016/j.molp.2019.07.003
- Nogler, G. A. (1984). "Gametophytic apomixis," in *Embryology of Angiosperms*. Ed. B. M. Johri (Berlin, Heidelberg: Springer), 475–518. doi: 10.1007/978-3-642-69302-1\_10
  Odorico, F. H. Morandim Giannetti, A. d. A. Lucarini, A. C. and Torres, P. B.
- Odorico, F. H., Morandim-Giannetti, A., d., A., Lucarini, A. C., and Torres, R. B. (2018). Pretreatment of guinea grass (*Panicum maximum*) with the ionic liquid

1-ethyl-3-methyl imidazolium acetate for efficient hydrolysis and bioethanol production. *Cellulose* 25, 2997–3009. doi: 10.1007/s10570-018-1753-z

- Oliveira, E. J., Koehler, A. D., Rocha, D. I., Vieira, L. M., Pinheiro, M. V. M., de Matos, E. M., et al. (2017). Morpho-histological, histochemical, and molecular evidences related to cellular reprogramming during somatic embryogenesis of the model grass *Brachypodium distachyon*. *Protoplasma* 254 (5), 2017–2034. doi: 10.1007/s00709-017-1089-9
- Pan, H., Zhou, R., Louie, G. V., Mühlemann, J. K., Bomati, E. K., et al. (2014). Structural studies of cinnamoyl-CoA reductase and cinnamyl-alcohol dehydrogenase, key enzymes of monolignol biosynthesis. *Plant Cell.* 26 (9), 3709–3727. doi: 10.1105/tpc.114.127399
- Patel, R. K., and Jain, M. (2012). NGS QC toolkit: a toolkit for quality control of next generation sequencing data. *PloS One* 7, e30619. doi: 10.1371/ journal.pone.0030619
- Paudel, D., Kannan, B., Yang, X., Harris-Shultz, K., Thudi, M., Varshney, R. K., et al. (2018). Surveying the genome and constructing a high-density genetic map of napiergrass (*Cenchrus purpureus* Schumach). *Sci. Rep.* 8, 14419. doi: 10.1038/s41598-018-32674-x
- Pelloux, J., Rusterucci, C., and Mellerowicz, E. J. (2007). New insights into pectin methylesterase structure and function. *Trends In Plant Sci.* 12 (6), 267–277. doi: 10.1016/j.tplants.2007.04.001
- Pereira, G. S., Garcia, A. A. F., and Margarido, G. R. A. (2018). A fully automated pipeline for quantitative genotype calling from next generation sequencing data in autopolyploids. *BMC Bioinform.* 19, 398. doi: 10.1186/s12859-018-2433-6
- Pereira, G. D. S., Gemenet, D. C., Mollinari, M., Olukolu, B. A., Wood, J. C., Diaz, F., et al. (2019). Multiple QTL mapping in autopolyploids: a randomeffect model approach with application in a hexaploid sweetpotato full-sib population. *bioRxiv*. 622951.
- Pessim, C., Pagliarini, M. S., Jank, L., Kaneshima, A. M. D. S., and Bonato, A. B. M. (2010). Meiotic behavior in Panicum maximum Jacq. (Poaceae: Panicoideae: Paniceae: hybrids and their genitors). *Acta Sci. Agron.* 32 (3), 417–422. doi: 10.4025/actasciagron.v32i3.6461
- Pessim, C., Pagliarini, M. S., Silva, N., and Jank, L. (2015). Chromosome stickiness impairs meiosis and influences reproductive success in Panicum maximum (Poaceae) hybrid plants. *Genet. Mol. Res.* 14 (2), 4195–4202. doi: 10.4238/2015
- Pessino, S. C., Evans, C., Ortiz, J. P. A., Armstead, I., Valle, C. B. D., and Hayward, M. D. (1998). A genetic map of the apospory-region in *Brachiaria* hybrids: identification of two markers closely associated with the trait. *Hereditas* 128, 153–158. doi: 10.1111/j.1601-5223.1998.00153.x
- Poland, J. A., Brown, P. J., Sorrells, M. E., and Jannink, J. L. (2012). Development of high-density genetic maps for barley and wheat using a novel two-enzyme genotyping-by-sequencing approach. *PloS One* 7, e32253. doi: 10.1371/ journal.pone.0032253
- Primo, C., Pizzio, G. A., Yang, J., Gaxiola, R. A., Scholz-Starke, J., and Hirschi, K. D. (2019). Plant proton pumping pyrophosphatase: the potential for its pyrophosphate synthesis activity to modulate plant growth. *Plant Biol.* 21 (6): 989–996. doi: 10.1111/plb.13007
- R Core Team. (2018). R: A Language and Environment for Statistical Computing (Vienna: R Foundation for Statistical Computing).
- Radhakrishna, A., Dwivedi, K. K., Srivastava, M. K., Roy, A. K., Malaviya, D. R., and Kaushal, P. (2018). Transcriptomic data of pre-meiotic stage of floret development in apomictic and sexual types of guinea grass (*Panicum* maximum Jacq.). Data Brief 18, 590–593. doi: 10.1016/j.dib.2018.03.001
- Resende, R. M. S., Jank, L., Valle, , C. B. d., and Bonato, A. L. V. (2004). Biometrical analysis and selection of tetraploid progenies of *Panicum maximum* using mixed model methods. *Pesq. Agropec Bras.* 39, 335–341. doi: 10.1590/S0100-204X2004000400006
- Roberts, D., Pedmale, U. V., Morrow, J., Sachdev, S., Lechner, E., Tang, X., et al. (2011). Modulation of phototropic responsiveness in Arabidopsis through ubiquitination of phototropin 1 by the CUL3-Ring E3 ubiquitin ligase CRL3NPH3. *Plant Cell.* 23 (10), 3627–3640. doi: 10.1105/tpc.111.087999
- Routray, P., Masalkar, P. D., and Roberts, D. M. (2015). "Nodulin intrinsic proteins: facilitators of water and ammonia transport across the symbiosome membrane" in *Biological Nitrogen Fixation* ed. F. J. de Brujin (John Wiley & Sons, Inc.), 695–704. doi: 10.1002/9781119053095.ch69
- Sartie, A. M., Easton, H. S., Matthew, C., Rolston, M. P., and Faville, M. J. (2018). Seed yield in perennial ryegrass (*Lolium perenne* L.): comparative importance

of component traits and detection of seed-yield-related QTL. *Euphytica* 214 (12), 226. doi: 10.1007/s10681-018-2307-z

- Savidan, Y. H. (1982). Nature et hérédité de l'apomixie chez Panicum maximum Jacq. (Paris: OSTROM).
- Savidan, Y., and Pernès, J. (1982). Diploid-tetraploid-dihaploid cycles and the evolution of *Panicum maximum* jacq. *Evolution* 36, 596–600. doi: 10.1111/ j.1558-5646.1982.tb05081.x10.2307/2408104
- Savidan, Y. H., Jank, L., Costa, J. C. G., and do Valle, C. B. (1989). Breeding *Panicum maximum* in Brazil. 1. Genetic resources, modes of reproduction and breeding procedures. *Euphytica* 41, 107–112. doi: 10.1007/BF00022419
- Savidan, Y. (1980). Chromosomal and embryological analyses in sexual x apomictic hybrids of *Panicum maximum* Jacq. *Theor. Appl. Genet.* 58 (2), 153–156. doi: 10.1007/BF00279706
- Savidan, Y. (1981). Genetics and utilization of apomixis for the improvement of guinea grass (*Panicum maximum*) In: INTERNATIONAL GRASSLAND CONGRESS, 14, 1981, Lexington. Proceedings Boulder : Westview Press, 1983. 182-184.
- Savidan, Y. (2000). Apomixis: genetics and breeding. *Plant Breed. Rev.* 18, 13–86. doi: 10.1002/9780470650158.ch2
- Schwarz, G. (1978). Estimating the dimension of a model. *Ann. Stat.* 6, 461–464. doi: 10.1214/aos/1176344136
- Sehgal, D., Rajaram, V., Armstead, I. P., Vadez, V., Yadav, Y. P., Hash, C. T., et al. (2012). Integration of gene-based markers in a pearl millet genetic map for identification of candidate genes underlying drought tolerance quantitative trait loci. *BMC Plant Biol.* 12 (1), 9. doi: 10.1186/1471-2229-12-9
- Sengupta, S., Mukherjee, S., Basak, P., and Majumder, A. L. (2015). Significance of galactinol and raffinose family oligosaccharide synthesis in plants. *Front. Plant Sci.* 6, 656. doi: 10.3389/fpls.2015.00656
- Seo, P. J., Kim, S. G., and Park, C. M. (2008). Membrane-bound transcription factors in plants. *Trends In Plant Sci.* 13 (10), 550–556. doi: 10.1016/ j.tplants.2008.06.008
- Serang, O., Mollinari, M., and Garcia, A. A. F. (2012). Efficient exact maximum a posteriori computation for Bayesian SNP genotyping in polyploids. *PloS One* 7, e30906. doi: 10.1371/journal.pone.0030906
- Smyczynski, C., Roudier, F., Gissot, L., Vaillant, E., Grandjean, O., Morin, H., et al. (2006). The C terminus of the immunophilin PASTICCINO1 is required for plant development and for interaction with a NAC-like transcription factor. *J. Biol. Chem.* 281 (35), 25475–25484. doi: 10.1074/jbc.M601815200
- Studer, A. J., and Doebley, J. F. (2011). Do large effect QTL fractionate? a case study at the maize domestication QTL teosinte branched1. *Genetics* 188 (3), 673–681. doi: 10.1534/genetics.111.126508
- Suzuki, M., Kato, A., Nagata, N., and Komeda, Y. (2002). A xylanase, AtXyn1, is predominantly expressed in vascular bundles, and four putative xylanase genes were identified in the *Arabidopsis thaliana* genome. *Plant Cell Physiol.* 43 (7), 759–767. doi: 10.1093/pcp/pcf088
- Thaikua, S., Ebina, M., Yamanaka, N., Shimoda, K., Suenaga, K., and Kawamoto, Y. (2016). Tightly clustered markers linked to an apospory-related gene region and quantitative trait loci mapping for agronomic traits in *Brachiaria* hybrids. *Grassl. Sci.* 62, 69–80. doi: 10.1111/grs.12115
- Toledo-Silva, G., Cardoso-Silva, C. B., Jank, L., and Souza, A. P. (2013). De novo transcriptome assembly for the tropical grass Panicum maximum Jacq. PloS One 8 (7), 1–10. doi: 10.1371/journal.pone.0070781
- Tronconi, M. A., Fahnenstich, H., Weehler, M. C. G., Andreo, C. S., Flügge, U. I., Drincovich, M. F., et al. (2008). Arabidopsis NAD-malic enzyme functions as a homodimer and heterodimer and has a major impact on nocturnal metabolism. *Plant Physiol.* 146 (4), 1540–1552. doi: 10.1104/pp.107.114975
- Valle, C. D., Glienke, C., and Leguizamon, G. O. C. (1994). Inheritance of apomixis in *Brachiaria*, a tropical forage grass. *Apomixis Newslett.* 7, 42–43.
- Valle, C. B., Jank, L., and Resende, R. M. S. (2009). O melhoramento de forrageiras tropicais no Brasil. Rev. Ceres 56, 460–472.
- Vigna, B. B. Z., Santos, J. C. S., Jungmann, L., do Valle, C. B., Mollinari, M., et al. (2016). Evidence of allopolyploidy in *Urochloa humidicola* based on cytological

analysis and genetic linkage mapping. *PloS One* 11, e0153764. doi: 10.1371/journal.pone.0153764

- Voorrips, R. E. (2002). MapChart: software for the graphical presentation of linkage maps and QTLs. J. Hered. 93, 77–78. doi: 10.1093/jhered/93.1.77
- Wang, Q., Sullivan, R. W., Kight, A., Henry, R. L., Huang, J., Jones, A. M., et al. (2004). Deletion of the chloroplast-localized Thylakoid formation1 gene product in *Arabidopsis* leads to deficient thylakoid formation and variegated leaves. *Plant Physiol*. 136 (3), 3594–3604. doi: 10.1104/pp.104.049841
- Warmke, H. E. (1954). Apomixis in *Panicum maximum. Am. J. Bot.* 41, 5–11. doi: 10.1002/j.1537-2197.1954.tb14297.x
- Worthington, M., Heffelfinger, C., Bernal, D., Quintero, C., Zapata, Y. P., Perez, J. G., et al. (2016). A parthenogenesis gene candidate and evidence for segmental allopolyploidy in apomictic *Brachiaria* decumbens. *Genetics* 203, 1117–1132. doi: 10.1534/genetics.116.190314
- Worthington, M., Heffelfinger, C., Bernal, D., Quintero, C., Zapata, Y. P., Perez, J. G., et al. (2019). Translocation of a parthenogenesis gene candidate to an alternate carrier chromosome in apomictic *Brachiaria humidicola*. *BMC Genom.* 20, 1–18. doi: 10.1186/s12864-018-5392-4
- Wu, B., Mao, D., Liu, T., Li, Z., and Xing, Y. (2015). Two quantitative trait loci for grain yield and plant height on chromosome 3 are tightly linked in coupling phase in rice. *Mol. Breed.* 35 (8), 156. doi: 10.1007/s11032-015-0345-y
- Xiao, W., Hu, S., Zhou, X., Yao, R., Luo, J., Yuan, C., et al. (2017). A glucuronokinase gene in Arabidopsis, AtGlcAK, is involved in drought tolerance by modulating sugar metabolism. *Plant Mol. Biol. Rep.* 35 (2), 298–311. doi: 10.1007/s11105-017-1023-5
- Xu, F., Lyu, Y., Tong, C., Wu, W., Zhu, X., Yin, D., et al. (2013). A statistical model for QTL mapping in polysomic autotetraploids underlying double reduction. *Brief. Bioinform.* 15, 1044–1056. doi: 10.1093/bib/bbt073
- Yang, Y., Xu, R., Ma, C. J., Vlot, A. C., Klessig, D. F., and Pichersky, E. (2008). Inactive methyl indole-3-acetic acid ester can be hydrolyzed and activated by several esterases belonging to the AtMES esterase family of Arabidopsis. *Plant Physiol.* 147 (3), 1034–1045. doi: 10.1104/pp.108.118224
- Yokoyama, R., and Nishitani, K. (2001). A comprehensive expression analysis of all members of a gene family encoding cell-wall enzymes allowed us to predict cis-regulatory regions involved in cell-wall construction in specific organs of Arabidopsis. *Plant Cell Physiol.* 42 (10), 1025–1033. doi: 10.1093/pcp/pce154
- Young, B. A., Sherwood, R. T., and Bashaw, E. C. (1979). Cleared-pistil and thicksectioning techniques for detecting aposporous apomixis in grasses. *Can. J. Bot.* 57, 1668–1672. doi: 10.1139/b79-204
- Zhang, X., Lu, S., Jiang, C., Wang, Y., Lv, B., Shen, J., et al. (2014). RcLEA, a late embryogenesis abundant protein gene isolated from *Rosa chinensis*, confers tolerance to Escherichia coli and *Arabidopsis thaliana* and stabilizes enzyme activity under diverse stresses. *Plant Mol. Biol.* 85 (4-5), 333–347. doi: 10.1007/ s11103-014-0192-y
- Zhao, Q. (2016). Lignification: flexibility, biosynthesis and regulation. *Trends Plant Sci.* 21 (8), 713–721. doi: 10.1016/j.tplants.2016.04.006
- Zhu, C., Wang, C., and Zhang, Y. M. (2006). Modeling segregation distortion for viability selection I. Reconstruction of linkage maps with distorted markers. *Theor. Appl. Genet.* 114, 295–305. doi: 10.1007/s00122-006-0432-x

**Conflict of Interest:** The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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