RESEARCH ARTICLE



MicroRNAs expression profiles in early responses to different levels of water deficit in *Setaria viridis*

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Abstract Water deficit is a major constraint for crops of economic importance in almost all agricultural regions. However, plants have an active defense system to adapt to these adverse conditions, acting in the reprogramming of gene expression responsible for encoding microRNAs (miRNAs). These miRNAs promote the regulation to the target gene expression by the post-transcriptional (PTGS) and transcriptional gene silencing (TGS), modulating several pathways including defense response to water deficit. The broader knowledge of the miRNA expression profile and its regulatory networks in response to water deficit can provide evidence for the development of new biotechnological

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tools for genetic improvement of several important crops. In this study, we used Setaria viridis accession A10.1 as a C4 model plant to widely investigate the miRNA expression profile in early responses to different levels of water deficit. Ecophysiological studies in Setaria viridis under water deficit and after rewatering demonstrated a drought tolerant accession, capable of a rapid recovery from the stress. Deep small RNA sequencing and degradome studies were performed in plants submitted to drought to identify differentially expressed miRNA genes and their predicted targets, using in silico analysis. Our findings showed that several miRNAs were differentially modulated in response to distinctive levels of water deficit and after rewatering. The predicted mRNA targets mainly corresponded to genes related to cell wall remodeling, antioxidant system and drought-related transcription factors, indicating that these genes are rapidly regulated in early responses to drought stress. The implications of these modulations are extensively discussed, and higher-effect miRNAs are suggested as major players for potential use in genetic engineering to improve drought tolerance in economically important crops, such as sugarcane, maize, and sorghum.

Keywords Abiotic stress · Drought · C4 grass bioenergy crops · microRNAs · Degradome · *Setaria viridis*

Introduction

Climate change has become increasingly global and accentuated, imposing strong evolutionary challenges for plants (Burney and Ramanathan 2014; Lawrence and Vandecar 2015; Rosenzweig et al. 2014). Water deficit is one of the most severe abiotic stresses that impairs several economically important crops, negatively impacting growth and productivity, or preventing their cultivation in regions with prolonged drought period (Farooq et al. 2009). However, plants have their own defense systems to adapt to adverse weather conditions (Liu et al. 2016). A particular mechanism is the reprogramming of gene expression encoding microRNAs (miRNAs) (Ferdous et al. 2015a; Guerra et al. 2015). Recent studies have provided evidence that miRNAs are indeed drought-responsive (Ferdous et al. 2015a; Hackenberg et al. 2015) and play critical roles in modulation of the several mechanisms of adaptation and tolerance to water deficit in plants (Liu et al. 2016).

The miRNAs are described as non-coding small RNAs with typically 21-24 nucleotides (nt) and are encoded by genes located in both the intergenic and intragenic regions. The action of a miRNA is based on perfect or partial complementary base pairing between it and one or more target messenger RNA (mRNA) molecules, enabling the the modulation of gene expression by mRNA site-specific cleavage, deacetylation of the poly(A) tail or steric inhibition of the gene translation process (Post-Transcriptional Gene Silencing pathway; PTGS) (Pacak et al. 2015; Borges and Martienssen 2015; Ferdous et al. 2015a; Guerra et al. 2015; Hackenberg et al. 2015; Jeong et al. 2011). In addition, they also act in transcriptional gene silencing (TGS; RNAdirected target DNA methylation) and targeted methylation of genomic regions (introns, exons or promoter sequences) to affect gene expression (Matzke and Mosher 2014; Matzke et al. 2015). miRNA deep sequencing (small RNAseq analysis) (Lu et al. 2007) and analysis of RNA ends resulting from miRNA cleavage using a high-throughput deep sequencing method (Addo-Quaye et al. 2008), stem-loop RT-qPCR (Chen et al. 2005) followed by real time RT-qPCR has proven to be an important tool that has been used to identify and quantify the expression of a given miRNA and its target mRNA in several biological systems (Basso et al. 2019).

The knowledge of the miRNA expression profile and its regulatory networks in plants under water deficit may provide important information to deepen our understanding of molecular mechanisms involved in defense response. Several miRNAs and their targets associated with abiotic stress responses have been identified using overexpression, silencing, and mutation techniques in plant species including sugarcane (Wang et al. 2022), maize (Fatma and Aydinoglu 2020), rice (Yue et al. 2017) and millets (Chakraborty et al. 2020). A profiling of the salt stress responsive miRNAs in Setaria viridis identified an abundance of alterations of miR-NAs, where miR169, miR395, miR396, miR397, miR398 and miR408 contributed for elucidation of the regulatory network in salt stress response (Pegler et al. 2020). In Setaria italica (foxtail millet), Wang et al. (2016) identified several miRNAs under drought conditions. A more recent study, conducted by Chakraborty et al. (2020), used five millet species to identify miRNAs conserved within them, in addition to novel micro RNAs potentially involved in drought response. The overexpression in *Arabidopsis thaliana* of Sit-miR394 indicated an increase in tolerance to drought stress, suggesting that Sit-miR394 is involved in the response to *drought* (Geng et al. 2021). Furthermore, these findings can contribute to the development of biotechnology tools focused on plant genetic improvement aimed at drought tolerance (Hajyzadeh et al. 2015; Kim et al. 2009; Ni et al. 2012; Song et al. 2013; Zhou et al. 2013).

Here, we used *Setaria viridis* as a model plant to extensively investigate the miRNA expression profile in early responses to drought and after rehydration. *S. viridis* is a diploid, C4 monocot grass that belongs to the *Poaceae* family and is commonly used as a model plant for grasses (Brutnell et al. 2015, 2010; Ermawar et al. 2015; Li and Brutnell 2011). In fact, this model plant has been widely used for functional genomics and proof of concepts in bioenergy feedstocks and panicoid food crops (Brutnell et al. 2015; Liand Brutnell 2011; Ribeiro et al. 2017).

In this study, we aim to evaluate the expression profile of drought responsive miRNA genes, and to identify their target mRNAs in plants subjected to different water levels in the soil. Small RNA and degradome sequencing from A10.1 accession using Illumina platforms were performed, resulting in small RNAseq and degradome sequencing libraries. The expression profile of the conserved miRNAs retrieved from miRBase database (Kozomara and Jones 2014) and novel miRNA identified by in silico prediction from this study were evaluated. Our findings showed that several miRNA genes were differentially modulated in early responses to decreasing levels of available water. The implications of these modulations are extensively discussed, and higher-effect miRNAs are highlighted as major players for potential use in genetic engineering to improve drought tolerance in economically important crops.

Materials and methods

Plant and growth conditions

Seeds of wild-type *S. viridis* accessions A10.1 were treated with concentrated sulfuric acid to promote dormancy break. After blotted on sterile filter paper, seeds were placed on sterile 1/2 Murashige and Skoog (MS) agar media (Murashige and Skoog 1962) and incubated for seven days in a growth chamber (Conviron®) under 16 h photoperiod with 150 µmol m⁻² s⁻¹ light intensity and 25 °C. Seedlings were transplanted and acclimated in pots containing 250 g of soil, substrate (Plantmax®) and vermiculite in a mixture of 3:1:0.5 (v/v/v). Plants were maintained in the growth chamber (Fitotron®) under 16 h photoperiod with 500 $\mu mol~m^{-2}~s^{-1},$ 26 °C and 65% relative humidity.

Setting of water deficit levels and time of plant sampling

The soil hydric potential (Ψ_w) was previously determined by a water retention curve using a psychrometer WP4C Dewpoint PotentiaMeter (Decagon WP4, Pullman, WA, USA). Four levels of available water in the soil were used: 0% (Ψ_{w} -1.50 MPa; permanent wilting point or PWP), 25% (Ψ_{w} -1.125 MPa; severe deficit), 50% (Ψ_{w} -0.75 MPa; moderate deficit) and 100% (Ψ_w – 0.03 MPa; field capacity or FC). Water deficit treatments were applied in adult plants in the onset of flowering, which were maintained in the growth chamber (Fitotron®) in the same conditions described above. Moreover, an additional plant set maintained at - 1.4 MPa (right before PWP) for 24 h was rewatered to FC (rewatering or rehydration; RW) and evaluated after 24 h. All samples from each treatment (0, 25, 50 and 100%) were collected 24 h after the onset of the stress, while the rehydrated plant tissues were collected 24 h after rewatering. The trials were carried out in a randomized block design with three biological replicates for both drought treatments and each biological replicate was composed of six plants.

Ecophysiology analysis

Gas exchange measurements were carried out using a conventional infrared gas analyzer system with a 6×6 cm² clamp-on leaf cuvette (LICOR, LI-6400). Photosynthetic photon flux density (PPFD) was fixed at 1500 μ mol m⁻² s⁻¹, using a red-blue LED light source built into the leaf cuvette. The vapor pressure deficit in the cuvette was maintained below 2.5 kPa to prevent stomatal closure due to the low air humidity effect. Carbon dioxide was supplied from a highpressure liquefied CO₂ cylinder, with mean CO₂ concentration of 400 µmol mol⁻¹. All measurements were performed in the leaves + 2 (younger and fully expanded leaf) with three biological replicates and six plants in each replicate. Net photosynthetic rate (A), stomatal conductance (g_s) , leaf transpiration rate (E), intercellular CO₂ and water-use efficiency (WUE) were measured. Leaf water potential (Ψ_{I}) and osmotic potential (Ψ_s) were measured from three plants from each experimental plot (six drought treatments, three biological replicates each and three plant for each replicate), using a thermocouple psychrometry with a 14 channel Wescor/ Campbell Water Potential System [C-52 sample chambers, plus the CR7 Measurement and 700X Control System]. Leaf discs of 0.5 cm^2 from leaves + 2 were placed in the sampling chamber and analyses were performed according to standard procedure.

RNA isolation, cDNA synthesis and RT-qPCR

The same leaves +2 used for physiological measurements were transferred to liquid nitrogen and stored at - 80 °C until analyses. Total RNA was isolated using TRIzol reagent according to the manufacturer's instructions. RNA samples were treated with RNase-free RQ1 DNase I (Promega) according to the manufacturer's instructions. Then, 2 µg of RNA were used as template for cDNA synthesis using Oligo-(dT)₂₀ primer and SuperScript III RT, according to the manufacturer's instructions. Reactions were performed using 200 ng of cDNA, 0.2 µM of each gene-specific primer and PlatinumTM SYBRTM Green qPCR SuperMix-UDG with ROX, in a final volume of 10 µL. All samples were carried out in technical triplicate. Primers efficiencies and targetspecific amplification were confirmed by a single and distinct peak in melting curve analysis. Thermocycling conditions were performed according to Martins et al. (2016). The relative expression levels of the genes were analyzed by the $2^{-\Delta\Delta Ct}$ method (Schmittgen and Livak 2008), using *transla*tion factor SUI1 (SvSUI; Sevir.2G348300) as an endogenous reference gene. Previous molecular characterization of the plant set submitted to different levels of water deficit was performed based on the expression profile of delta-1-pyrroline-5-carboxylate synthetase (SvP5CS; Sevir.5G386300) and galactinol synthase 2 (SvGolS2; Sevir.2G450900) genes. All assays were performed using three biological replicates with three technical replicates each and a non-template control. All primers used are listed in Table S1.

Small RNA isolation and NGS

Small RNAs were isolated from 16 samples of control/ treated plants using mirVana miRNA Isolation Kit, according to manufacturer's instructions. Then, 10 µg from each sample were homogenized and dried in GenTegra RNA tubes, according to manufacturer's instructions. Libraries were prepared with small RNAs of 15–36 nucleotides (nt) in length retrieved from 15% polyacrylamide gel and using TruSeq small RNA SBS kit v.3, according to manufacturer's instructions. NGS was performed using the Illumina HiSeq 2500 platform, generating 15 libraries, which were demultiplexed using CASAVA v.1.8.4 pipeline, allowing one mismatch in the index selection.

Stem-loop RT-qPCR and RT-qPCR of predicted miRNA targets

One differentially expressed miRNA gene was chosen and validated. RNA samples treated with DNase I were reverse transcribed (RT) by the pulsed method using SuperScript



Fig. 1 Phenotyping of *Setaria viridis* under different levels of water deficit. **a** *Setaria viridis* (accession A10.1) maintained under available water levels of 100%, 50%, 25% and 0%. Rewatering consists of plants maintained at -1.4 MPa for 24 h and then rewatered to field capacity, which were evaluated 24 h after rehydration. Photographs were taken in two stages: 24 h after the onset of plant stress and 24 h

after rewatering. **b** Matrix water retention curve to determine the relationship between water levels and water soil potential (MPa). **c** Expression profile of the drought molecular marker genes *Sv*P5CS and *Sv*GolS2. Letters above the bars indicate statistically significant difference between different conditions (*P-value* < 0.05, Tukey's HSD test)

III RT and stem-loop adaptors/primers (1 μ M each), and Oligo-(dT)₂₀ primers (100 μ M) were used for internal controls in each single RT reaction. The samples were incubated at 16 °C for 30 min followed by pulsed RT of 60 cycles at 30 °C for 30 s, 42 °C for 30 s and 50 °C for 1 s. Then the reaction was stopped by incubating the samples at 85 °C for 5 min as described by Gasic et al. (2007). Thermocycling conditions were carried out according to Ferdous et al. (2015b). The relative expression levels of these miRNAs were analyzed by the 2^{- $\Delta\Delta$ Ct} method (Schmittgen and Livak 2008) using *GAPDH* as an endogenous reference gene. The miRNA specific stem-loop RT primers were designed following the method described by Chen et al. (2005) and Gasic et al. (2007). All primers used are listed in Table S1.

NGS data mining

Information present in the supplemental methods file.

Degradome sequencing of plants submitted to severe stress

Information present in the supplemental methods file.

Degradome data mining

Information present in the supplemental methods file.

Results

Assessment of physiological and molecular responses to different levels of soil water content in *S. viridis*

To assess the responses of *S. viridis* to drought stress, we performed molecular and ecophysiology studies in plants under different levels of water deficit and subsequent rewatering (RW). Four levels of soil water were applied (Fig. 1A): 100%, 50%, 25%, and 0%. An additional set of plants was also evaluated after rewatering, which was carried out in plants maintained at– 1.4 MPa for 24 h. Previously, the soil hydric potential (Ψ_w) was determined by a water retention curve (Fig. 1B).

The molecular characterization of plants submitted to different levels of soil water content was performed based on the expression profile of *delta-1-pyrroline-5-carboxylate synthetase* (SvP5CS; *Sevir.5G386300*) and *galactinol*

Fig. 2 Changes in physiological parameters of Setaria viridis under different levels of water deficit. Water and osmotic potentials, CO2 assimilation (A), transpiration rate (E) and stomatal conductance (gs), water use efficiency (WUE), were measured as described in materials and methods. The measurements were taken 24 h after the onset of drought stress or rewatering. Available water levels used were 100%, 50%, 25% and 0%. Rewatering (red squares) consisted of plants maintained at -1.4 MPa (0%) soil water level, right before PWP) for 24 h and then rehydrated to field capacity



synthase 2 (SvGolS2; *Sevir.2G450900*) genes. As observed in Fig. 1C, both *SvP5CS* and *SvGolS2* were up-regulated in plants under water deficit, especially in severe stress conditions. The rewatering of the plants drastically decreased the expression levels of these genes, suggesting a rapid osmotic adjustment after plant recovery from drought.

The ecophysiological analyses of plants submitted to drought stress and after recovery is demonstrated in Fig. 2. Gas exchange measurements demonstrated the robustness of the drought stress assays, as the CO₂ assimilation (A), stomatal conductance (gs) and the transpiration rate (E) decreased proportionally to the water level applied. Water use efficiency (WUE), determined by A/E relation, increased under moderate and severe stress, a response that is typical of photosynthetically efficient C4 plants. The leaf water potential and the osmotic potential also decreased proportionally to decreased water levels. After rewatering, the plants were able to restore the physiological levels of A, E, gs leaf water and osmotic potential, a response indicative of drought-tolerant plants (Fig. 2).

Overview of sRNAs in S. viridis under drought stress

To identify differentially expressed miRNA genes in S. viridis under different levels of drought stress, small RNA deep sequencing was performed. The quality of the pooled RNA from each library and the quality of the downstream analysis were assessed as described in the materials and methods of this manuscript. An overview of the raw data quality and amount of total and unique reads from trimmed and filtered (18 to 26 nucleotides length) libraries is shown in Table S2. It was possible observe a similar read distribution of lengths in all libraries (Fig. 3A and 3B), with the 24 nt reads being the most abundant in total (~350,000 RPM) and unique reads (~150,000 RPM), followed by the 22 nt in total (~250,000 RPM) and 23 nt in unique reads (~20,000 RPM). The total and unique reads, as the number of reads successfully mapped to S. viridis genome in each library are presented in Supplementary File 1. For subsequent analysis, only matching reads to Setaria were used.

Fig. 3 Amount of total **a** and unique **b** reads (18 to 26 nucleotides length) per treatment from normalized data (reads per million; RPM). **c** Venn diagrams showing overlapping of differentially expressed conserved and novel miRNAs genes in plants submitted to different

Identification and expression profile analysis of conserved and novel miRNAs in *S. viridis* submitted to different levels of drought stress

To identify conserved and novel miRNAs in *S. viridis*, filtered reads from RNA sequencing were mapped against conserved mature miRNAs retrieved from miRBase 22.1 database (Kozomara et al. 2019) and SIFGD Database (You et al. 2015). Reads unmapped in these miRNAs were used to predict novel miRNA using miRCat algorithm (Stocks et al. 2012). A total of 302 conserved and 753 novel miRNAs, comprising 65 different families, were identified in *S. viridis* (Supplementary Files 2 and 3).

The number of reads mapped without mismatches in conserved and predicted mature miRNAs was used for the analysis of differentially expressed genes (DEGs), based on the number of occurrences of its respective reads/sequence in each library. As shown in Fig. 3C and in Tables 1 and 2, a total of 31 conserved miRNAs were differentially expressed under moderate stress compared to control conditions, while 18 and 26 conserved miRNAs were differentially expressed under severe stress and the PWP, respectively. In addition, a total of 34, 19 and 42 novel miRNAs were differentially expressed under moderate, severe and the PWP conditions, respectively, compared to control plants. After rewatering, 17 conserved and 14 novel miRNAs genes were differentially expressed compared to control plants. A total of 53 miRNA families are identified in moderate stress, while 34 and 62 families in severe and PWP, respectively, and 29 in up- or down-regulated by the water deficit or after rewatering compared to control plants were determined when fold-change of magnitude < -0.8 or > 0.8 and *P-value* < 0.05 was observed

water deficit levels and after rewatering (RW). The miRNA genes

re-watering (Table S3). Venn diagrams showing the number of overlapped differentially expressed miRNAs genes in the different conditions tested are shown in Fig. 3C.

The expression profile of conserved and novel DEGs of miRNAs is presented in Tables 1 and 2 and Supplementary Files 4 and 5. The expression profile of the miRNA genes appears to be highly dynamic, changing according to the level of water deficit applied. Some miRNA genes are exclusively up- or down-regulated only in drought stress conditions but are not significantly expressed after plant rehydration. Among the conserved miRNA genes exclusively up-regulated in drought stress (moderate, severe and at the PWP) were aly-miR165b-3p, gmamiR171t, gma-miR6300, mes-miR535a, stu-miR171b-3p, stu-miR172c-3p, zma-miR164f-5p and zma-miR172d-3p, while the exclusively down-regulated miRNA genes in all stress conditions were ppt-miR894, tcc-miR396d and zmamiR396f-5p (Table 1). The novel miRNA genes exclusively up-regulated during the stress conditions but not after rewatering comprised SvmiRp175, SvmiRp351, SvmiRp571, SvmiRp605, SvmiRp620 and SvmiRp629, while the exclusively down-regulated novel miRNA gene in these conditions was SvmiRp108 (Table 2). After rewatering, nine exclusive conserved miRNA genes were up-regulated, with nov-sit-miR96, osa-miR408-5p and zma-miR528-3p being extremely up-regulated (\log_2 -fold > 2.0), in addition to six conserved miRNA genes only down-regulated during rehydration, including nov-sit-miR143, Sit-miR5568.20, Sit-miR5568.74, vvi-miR171f, zma-miR167g-3p and



Table 1Expression profile of
differentially expressed genes
(DEGs) of conserved miRNAs
in *Setaria viridis* submitted to
different levels of soil water
content

miRNA	log ₂ fold-change				
	0%	25%	50%	RW	
aly-miR165b-3p	1.151983446*	1.012605716*	0.892616281*	ns	
ata-miR393-3p	ns	ns	- 0.968149018	ns	
bdi-miR159a-3p	ns	ns	-0.913555819	ns	
bdi-miR3951-5p	ns	ns	ns	1.223304767*	
bdi-miR395p-3p	ns	0.967035523*	ns	ns	
cln-miR162	-0.850837852	ns	ns	ns	
gma-miR171t	1.331887334*	1.131051949*	1.342237739*	ns	
gma-miR6300	2.01889291*	1.447189411*	2.265043697*	ns	
lus-miR159b	0.828150217*	ns	ns	ns	
lus-miR166b	ns	ns	0.874396598*	ns	
mes-miR535a	0.996896815*	0.958292529*	0.903942002*	ns	
nov-sit-miR105	-1.227726156	ns	ns	-1.082398654	
nov-sit-miR111	- 1.162111401	-0.871268448	ns	ns	
nov-sit-miR114	ns	ns	ns	1.561004191*	
nov-sit-miR143	ns	ns	ns	-0.872384283	
nov-sit-miR31	ns	ns	ns	0.957178187*	
nov-sit-miR47	ns	ns	ns	0.95382021*	
nov-sit-miR49	ns	ns	1.015459986*	ns	
nov-sit-miR96	ns	ns	ns	2.520905706*	
osa-miR162b	ns	ns	-0.822447429	ns	
osa-miR408-5p	-1.558102725	-1.603259615	ns	3.326834737*	
osa-miR444c.1	ns	ns	1.193728631*	ns	
osa-miR444e	0.833137913*	ns	1.107606389*	ns	
osa-miR5083	1.771981217*	ns	1.680395109*	1.21024424*	
ppe-miR171h	ns	ns	0.983923495*	ns	
ppt-miR894	-0.811765715	-0.82873338	-0.982908836	ns	
Sit-miR5568.20	ns	ns	ns	-0.861100777	
Sit-miR5568.74	ns	ns	ns	- 0.966894943	
55444b.2	0.879880375*	ns	1.029320063*	ns	
stu-miR171b-3p	1.343835443*	1.207245195*	1.463976114*	ns	
stu-miR172c-3p	1.54739639*	1.405652789*	1.924135568*	ns	
stu-miR399i-3p	ns	ns	1.886586791*	ns	
stu-miR408b-3p	ns	ns	1.166325045*	ns	
tcc-miR396d	-1.110965812	-0.994725429	- 1.455297138	ns	
tcc-miR530a	ns	ns	1.487756635*	ns	
vvi-miR167c	0.856572179*	ns	ns	ns	
vvi-miR171f	ns	ns	ns	-0.906008138	
vvi-miR393b	ns	0.929210495*	-0.840344625	ns	
vvi-miR398c	ns	ns	ns	1.155220657*	
zma-miR159a-5p	1.485368344*	1.397459128*	ns	ns	
zma-miR159k-3p	ns	ns	-1.028545488	ns	
zma-miR164f-5p	1.159860736*	1.067651997*	1.077401282*	ns	
zma-miR166n-3p	-0.845921885	ns	- 0.901999665	ns	
zma-miR167g-3p	0.876182369*	0.800128853*	ns	-0.892899556	
zma-miR171j-3p	ns	ns	0.852255198*	ns	
zma-miR172d-3p	1.674693167*	1.337593853*	2.165834129*	ns	
zma-miR319d-3p	ns	ns	ns	-0.941895018	
zma-miR396f-5p	- 1.161947641	- 1.048649766	-1.527947583	ns	
zma-miR399j-3p	ns	ns	0.983365228*	ns	

Table 1 (continued)

miRNA	log ₂ fold-change				
	0%	25%	50%	RW	
ssp-miR444b.2	0.879880375*	ns	1.029320063*	ns	
zina-mik5280-5p	-1.400105074	- 1.101/0004/	115	2.226373313	
zma-miR528b-5p	ns	ns	ns	1.367163265*	
zma-miR827-3p	1.638782426*	ns	2.14573783*	ns	

*: up-regulated genes; bold: down-regulated genes; ns: not statistically significant

The values are shown as \log_2 fold-change, obtained from the comparison between expression levels observed for control plants (100% water level) *versus* moderate stress (50% water level), severe stress (25% water level), permanent wilting point (PWP; 0% water level) or rewatering (RW, 24 h after rehydration of plants maintained at -1.40 MPa)

zma-miR319d-3p (Table 1). Five novel miRNA genes were exclusively up-regulated after rewatering, SvmiRp330, SvmiRp422, SvmiRp734, SvmiRp942 and SvmiRp969, and two novel miRNA genes were exclusively down-regulated after rehydration, SvmiRp612 and SvmiRp952 (Table 2).

The miRNA genes differentially expressed only during moderate stress (50% water level) or both severe stresses (25% water level and PWP) could also be identified. The conserved miRNA genes only up-regulated during moderate stress were lus-miR166b, nov-sit-miR49, osa-miR444c.1, ppe-miR171h, stu-miR399i-3p, stu-miR408b-3p, tccmiR530a, zma-miR171j-3p and zma-miR399j-3p, while the conserved up-regulated miRNA genes only in severe stress conditions were zma-miR159a-5p and zma-miR167g-3p (Table 1). In contrast, the conserved miRNA genes only down-regulated during moderate stress were ata-miR393-3p, bdi-miR159a-3p, osa-miR162b and zma-miR159k-3p, while the exclusively down-regulated conserved miRNA genes in severe stress were nov-sit-miR111, osa-miR408-5p and zma-miR528b-3p.

It is important to highlight that two conserved miRNA genes were down-regulated in severe conditions and up-regulated during rewatering (osa-miR408-5p and zma-miR528b-3p), while zma-miR167g-3p demonstrated the reversed trend, as it was up-regulated in severe stress and down-regulated during rewatering (Table 1). These results suggest that these miRNAs could be important for the regulation of genes on stress recovery.

Regarding novel miRNA genes' differential expression exclusively in moderate or severe stresses we can highlight SvmiRp80, 453, 466, 471, 730, 751 and 826 being up-regulated only during moderate stress, while SvmiRp153 and 405 were up-regulated only in severe stress. Moreover, we also found the novel miRNA gene SvmiRp10 as being downregulated only in moderate stress while SvmiRp86, 137 and 402 genes were down-regulated exclusively in severe stress conditions. An illustrative representation of the results described above is demonstrated in Fig. 4 and a summary of the predicted gene targets of these differentially expressed miRNAs in each condition can be found in Supplementary File 6.

GO analysis and target predictions

We predicted a total of 5846 and 794 novel and conserved miRNA target pairs, respectively, and a full list of these pairs is presented in Supplementary Files 7 and 8. GO analysis of differentially expressed conserved and novel miRNA genes suggested that the enriched cellular components included membrane- and nuclear-related genes, whereas in the molecular function and biological process categories binding/DNA binding and metabolic and biosynthetic processes were enriched both in stress conditions and rewatering (Fig. 5). It is interesting to note that many categories are exclusively enriched during rewatering, indicating the plasticity of *S. viridis* to recover from drought stress.

Using in silico analysis, we were able to predict target mRNAs of the DEG miRNAs (Supplementary Files 6, 7 and 8). Predictive analyzes of the novel miRNA targets are complicated to perform, since it was found that a single novel miRNA can regulate many different genes (Supplementary File 7). However, it is noteworthy that a significant number of predicted targets for novel DEGs of miRNAs are cell wall-related genes (Supplementary File 6). A detailed analysis of miRNA DEGs associated with their predicted targets reveals a complex regulation of drought responses observed in *S. viridis*, which is highly dependent on the level of stress applied (Fig. 4A; Tables 1 and 2; Supplementary File 6 and Supplementary Fig. S1).

In moderate drought stress, osa-miR444c.1, a miRNA possibly regulating two MADS-box transcription factor genes (MADS27; *Sevir.7G133400* and MADS57; *Sevir.1G314300*) was up-regulated, while bdi-miR159a-3p, osa-miR162b and zma-miR159k-3p, possibly targeting different MYB family transcription factors, were down-regulated. Regarding novel miRNAs, it was observed that SvmiRp826, predicted to regulate a MADS25 gene (*Sevir.5G034800*), was also up-regulated exclusively during

moderate drought stress, indicating that MADS-box transcription factor genes could have an important role in these conditions. During moderate stress, two miRNA genes, bdi-miR159a-3p and zma-miR159k-3p, were down-regulated (Fig. 4A; Table 1; Supplementary File 6 and Fig. S1). The predicted targets of these miRNAs belong to a wide range of different MYB family transcription factors (*Sevir.5G360500, Sevir.1G076400, Sevir.9G180500* and *Sevir.3G193000*).

Some conserved miRNA genes demonstrated differential responses during severe stress and after rewatering, suggesting an important role of these miRNA genes in S. viridis recovery from drought. Some examples included in this classification are osa-miR408-5p, zma-miR528b-3p, zma-miR167g-3p and nov-sit-miR111 (Fig. 4A; Table 1 and Supplementary File 6). The miRNA gene osa-miR408-5p is predicted to target a stress responsive protein gene (Sevir.2G448800), two chalcone synthase genes (Sevir.7G023500 and Sevir.7G023600), a N-acetyltransferase 9 gene (Sevir.9G057500) and a putative lipid transfer protein gene (Sevir.9G057600). The miRNA zmamiR528b-3p is predicted to regulate Sevir.5G176900 and the zma-miR167g-3p gene is predicted to putatively target four uncharacterized genes: Sevir.1G201700, Sevir.3G196500, Sevir.3G231500 and Sevir.7G200100. The nov-sit-miR111 is predicted to target an ethylene-insensitive protein gene (Sevir.9G126600), and a novel miRNA gene, SvmiRp86, down-regulated exclusively in severe stress, is also predicted to target an ethylene-insensitive protein gene (Sevir.2G264700).

Identification of miRNA target genes by degradome sequencing

The degradome sequencing was applied to identify novel and conserved miRNA targets in *S. viridis* submitted to severe water stress. A total of 15.232.695 raw reads were obtained and mapped against the *S. viridis* transcriptome (Bennetzen et al. 2012). After mapping, 10.759.326 (70.63%) matched tags and 4.058.119 unique mappable reads were obtained. The unique mappable reads were cleaned and an output of 3.55.409 clean tags obtained. The clean tags mapped were used as input in CleaveLand v3.0.1 pipeline to predict cleaved sites in *S. viridis* miRNA (Addo-Quaye et al. 2009).

In *S. viridis* degradome results, we found 482 cleavage targets associated with 130 miRNAs and 307 target genes classified in five categories (0–4). The categories are separated according to the relative abundance of tags in mRNA target sites with a *P*-value < 0.05 (Supplementary File 9). Categories 0 and 1 are weighted greater due to a higher number of reads at the target position (Addo-Quaye et al. 2009). Among the identified targets, 18, 122, 151, 1 and 189 targets were detected as belonged to categories 0, 1, 2, 3 and

4, respectively. The results indicated that predicted targets interfere in the regulation of a wide range of biological process, including transcription factors, amino acid transport, posttranslational modification, protein turnover, chaperones, carbohydrate transport, translation, ribosomal structure, biogenesis, intracellular trafficking, secretion, energy production/conversion, vesicular transport, signal transduction mechanism, lipid transport, coenzyme transport, cell wall/ membrane/envelope biogenesis, replication, recombination, repair, energy production and defense mechanisms.

As expected, the results showed that a unique miRNA is capable of cleaving several target genes, but also one target might be cleaved by different miRNAs. Some of these miRNA target genes and transcription factors were associated with drought and dehydration stress responses. These transcripts and genes included NAC transcription factors (far-miR164a/far-miR164b/Sevir.3G402300), genes associated with amino acid metabolism (ggo-miR-548a/hsa-miR-548ad-5p/hsa-miR-548a/Sevir.3G024800, nta-miR6145d/nta-miR6145e/Sevir.1G359000 and tae-miR9777/Sevir.9G415200) and signal transduction SAPK-related genes (bmo-miR-2742/Sevir.5G029800, cel-miR-261/Sevir.2G037000 and tca-miR-3859-5p/Sevir.3G235900).

Two novel miRNAs candidate targets in S. viridis under severe drought stress corresponded to E3 ubiquitin ligase SUD1 gene (SvmiRp179/Sevir.4G213600) and ADP-ribosylation factor GTPase-activating protein AGD12-like gene (SvmiRp537/Sevir.2G335000). Consensus results of the degradome and small RNAseq (miRNA DEGs) in severe stress reveal only one miRNA (osa-miR408-5p) common to both analyses (Supplementary Files 8 and 9). This miRNA, which was down-regulated in severe stress and up-regulated during rewatering, putatively regulates a stress responsive protein gene (Sevir.2G448800), reinforcing that miRNA regulation of this gene could be important to S. viridis recovery after severe drought. Hence, we validated osa-miR408-5p expression levels observed from the sRNA sequencing data and the potential correlation between this miRNA and its predicted target Sevir.2G448800 (Fig. 4B and Supplementary Fig. 1).

Validation of miRNAs and their predicted targets gene expression

The qPCR results demonstrated that the expression levels of osa-miR408-5p, bdi-miR159a-3p, zma-miR396f-5p and SvmiRp86 genes corresponded to the expression profile observed for the different water deficit conditions (Fig. 4B; Fig. S2; Tables 1 and 2). In addition, the expression levels of their predicted targets were negatively correlated with the respective miRNA gene expression pattern, further Table 2Expression profile ofdifferentially expressed genes(DEGs) of novel miRNAs inSetaria viridis submitted todifferent levels of soil watercontent

Novel miRNA	Log ₂ Fold-change				
	0%	25%	50%	RW	
SvmiRp10	ns	ns	- 1.028948347	ns	
SvmiRp80	ns	ns	1.166635787*	ns	
SvmiRp82	1.051970631*	ns	ns	ns	
SvmiRp86	-1.032291412	-0.862637075	ns	ns	
SvmiRp108	- 2.148360101	-2.273178574	-1.894741132	ns	
SvmiRp137	- 0.816541748	-0.845186554	ns	ns	
SvmiRp153	1.483618551*	0.974012344*	ns	ns	
SvmiRp175	1.045388618*	0.923369596*	1.054719477*	ns	
SvmiRp239	- 1.132311286	ns	ns	ns	
SvmiRp273	1.451122773*	ns	1.182282851*	ns	
SvmiRp284	0.842760859*	ns	ns	ns	
SvmiRp301	2.045063895*	ns	1.803501223*	ns	
SvmiRp314	-0.829162515	ns	ns	ns	
SvmiRp330	ns	ns	ns	1.305236839*	
SvmiRp336	1.106058686*	ns	ns	ns	
SvmiRp341	1.466883866*	ns	ns	ns	
SvmiRp351	1.14926354*	1.065107387*	0.836634847*	ns	
SvmiRp361	1.863776859*	ns	1.316470888*	1.894065487*	
SvmiRp381	ns	- 0866947353	ns	ns	
SvmiRp402	- 1.634848975	-1.129200347	ns	ns	
SvmiRp405	1.802036463*	1.64352292*	ns	ns	
SvmiRp411	0.849107413*	ns	ns	ns	
SvmiRp417	1.773025093*	1.435131654*	1.919275794*	1.552627683*	
SvmiRp422	ns	ns	ns	3.780098698*	
SvmiRp424	1.636273345*	ns	1.407692661*	ns	
SvmiRp446	-0.800145992	ns	ns	ns	
SvmiRp453	ns	ns	1.17378829*	ns	
SvmiRp455	ns	- 1.150813777	ns	ns	
SvmiRp465	0.927660048*	ns	1.410966265*	ns	
SvmiRp466	ns	ns	1.684348051*	ns	
SvmiRp469	0.96064348*	ns	1.222861059*	ns	
SvmiRp471	ns	ns	1.238111654*	ns	
SvmiRp487	0.90237487*	ns	ns	ns	
SvmiRp552	2.101994029*	1.110947611*	1.85620379*	1.855862677*	
SvmiRp571	1.278906267*	1.225253922*	1.259541467*	ns	
SvmiRp582	1.107468287*	ns	ns	1.357789927*	
SvmiRp602	1.010811705*	ns	ns	ns	
SvmiRp605	1.426762984*	1.108488859*	1.170706017*	ns	
SvmiRp612	ns	ns	ns	-0.829961374	
SvmiRp620	1.469384008*	0.922448673*	1.111683453*	ns	
SymiRp621	1.915126199*	ns	1.988066343*	ns	
SymiRp629	1.609393116*	1.236114657*	1.622550862*	ns	
SymiRp641	2.103945477*	1.28750248*	1.614549461*	0.825123867*	
SymiRp644	ns	ns	0.859042029*	ns	
SymiRp646	ns	ns	1.110055356*	ns	
SymiRp699	ns	1.040071123*	2.126979282*	1.61857669*	
SymiRp727	ns	ns	ns	1.133156681*	
SvmiRp730	ns	ns	1.403078778*	ns	
SvmiRp734	ns	ns	ns	1.009056326*	

Table 2 (continued)

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Novel miRNA	Log ₂ Fold-change			
	0%	25%	50%	RW
SvmiRp747	0.83353983*	ns	0.963545181*	ns
SvmiRp750	0.809735583*	ns	1.051996181*	ns
SvmiRp751	ns	ns	1.273924669*	ns
SvmiRp752	0.864175367*	ns	ns	ns
SvmiRp758	ns	0.853641419*	ns	ns
SvmiRp793	1.494363124*	ns	1.772288701*	ns
SvmiRp826	ns	ns	0.864111672*	ns
SvmiRp835	0.81524381*	ns	ns	ns
SvmiRp839	1.275663344*	ns	1.180802752*	ns
SvmiRp843	2.277870784*	ns	2.108390512*	ns
SvmiRp852	1.009524465*	ns	0.965036485*	ns
SvmiRp942	ns	ns	ns	0.835069084*
SvmiRp952	ns	ns	ns	-1.02954983
SvmiRp968	-0.889609247	ns	ns	ns
SvmiRp969	ns	ns	ns	1.159625728*

*: up-regulated genes; bold: down-regulated genes; ns: not statistically significant

The values are shown as \log_2 fold-change, obtained from the comparison between expression levels observed for control plants (100% water level) *versus* moderate stress (50% water level), severe stress (25% water level), permanent wilting point (PWP; 0% water level) or rewatering (RW, 24 h after rehydration of plants maintained at -1.40 MPa)

corroborating the potential involvement of these modules in responses of *S. viridis* to drought.

Discussion

The osa-miR408-5p gene was down-regulated in severe stress (Table 1; Fig. 4; Supplementary Fig. S2), while its predicted target, a stress-responsive protein gene (SSR), was up-regulated compared to control plants (Fig. 4B; Fig. S2). The bdi-miR159a-3p gene was down-regulated in drought stress compared to control conditions (Table 1; Fig. 4), while the expression of its predicted targets, Sevir.5G360500 and Sevir.1G076400, both corresponding to the MYB transcription factor gene family, were negatively correlated (Fig. 4B; Fig. S2). Two growth regulator factor genes, Sevir.8G160800 and Sevir.9G140200, were down-regulated while their target miRNA, zma-miR396f-5p was up-regulated in drought conditions (Table 1; Fig. 4B; Fig. S2). Furthermore, we have chosen to validate a novel S. viridis miRNA gene, SvmiRp86, which was down-regulated during severe stress when compared to hydrated plants and demonstrated a variety of predicted targets (Supplementary File 6). As most of these targets correspond to cell wall-related genes, we were able to verify that the expression of four genes, Sevir.4G159200 (1,4-alpha glucan), Sevir.9G155700 (expansin), Sevir.2G281200 (betaglucosidase) and Sevir.7G167900 (UDP-glucuronosyl/ UDP-glucosyltransferase), all related to cell wall-modifying genes, was negatively correlated with SvmiRp86 expression (Fig. 4; Fig. S2), suggesting that these modules participate in cell wall responses to drought in S. viridis.

MicroRNAs modulate the expression of target mRNAs and regulate several plant processes, including biotic and abiotic stress responses. Understand the fine-tuning of miRNA genes is an important strategy to increase the crop's tolerance to abiotic or biotic stresses (Basso et al. 2019). *Setaria viridis* is emerging as a model plant for C4 grasses, and recent studies have demonstrated that phenotypic alterations in *S. viridis* using biotechnological approaches could be translated to sugarcane (*Saccharum* spp.), an important bioenergy crop (de Souza et al. 2018; 2019). Here, we aimed to study the fine-tuning of miRNA genes during early responses of *S. viridis* submitted to different levels of drought stress (moderate and severe drought stress and rewatering).

Physiological and molecular responses of *S. viridis* to drought stress

The robustness of the drought stress applied could be verified by ecophysiological studies demonstrating that the photosynthesis (A), stomatal conductance (gs) and the transpiration rate (E) decreased proportionally to the soil water content (Fig. 2). After rewatering of plants submitted for 24 h to -1.40 MPa, the plants were able to restore the physiological levels of A, E, gs leaf water and osmotic potential to levels similar to control

Fig. 4 Overview of differentially expressed miRNA genes and expression levels of the miRNA/target gene pairs by RTqPCR. a Illustrative representation of differentially expressed conserved or novel miRNA genes in Setaria viridis submitted to different levels of water deficit (moderate or severe). I, II and III represent well-hydrated plants, moderate and severe drought stress, respectively. The red and green colors indicate the genes down- or up-regulated in each condition, respectively. Differentially expressed genes (DEGs) in severe stress correspond to DEGs observed in plants both under 25% and 0% of soil water content. b Expression levels of miRNA genes and their predicted targets. The heatmap represents the fold-change in expression levels, calculated according to the $2^{-\Delta\Delta Ct}$ method (Schmittgen and Livak 2008). Each color in the heatmap indicate a different miRNA/target gene module



plants (Fig. 2). Moreover, the molecular markers for drought stress (*SvP5CS* and *SvGolS* genes responsible for osmolyte accumulation) were up-regulated during severe stress and down-regulated after rewatering, indicating a rapid osmotic adjustment in *S. viridis*. Overall, plants under severe water deficit shows 40–60% of the highest photosynthetic rate 24 h after rewatering, and the recovery occur in the subsequent days, regardless of the fact that full photosynthesis rates are not always reestablished (Frosi et al. 2017). Altogether, our results reinforced a study performed by Saha et al. (2016), which demonstrated that *S. viridis* (accession A10.1) is a drought tolerant plant, and therefore is an interesting model for prospecting drought tolerant-related genes.

Differential drought-responsive miRNA

The distinctive levels of soil water content led to a differential miRNA gene expression profile in leaves of *S. viridis*, which was highly dependent on the severity of the drought stress applied. Our experimental conditions allowed us to





Fig. 5 Gene Ontology (GO) analysis from predicted target genes of all (conserved and novel) differentially expressed miRNAs in response to water deficit or rewatering. The enriched cellular compo-

detect early responses to drought and rewatering, as the analyses were performed only 24 h after the onset of each stress or rehydration.

Moderate drought-responsive miRNA profile

During moderate drought stress, the differentially expressed genes of miRNAs (DEG miRNAs) included the up-regulated genes osa-miR444c.1, stu-miR408b-3p and tcc-miR530a, and the down-regulated bdi-miR159a-3p and zma-miR159k-3p genes. The predicted targets of osa-miR444c.1 comprise two genes related to MADS-box family genes, OsMADS27 and OsMADS57, which are members of AGL17-like clade of transcription factors known to be involved in stress responses (Arora et al. 2007). The up-regulation of osamiR444c.1 indicates that OsMADS27 and OsMADS57



nents included membrane- and nuclear-related genes, whereas in the molecular function and cellular component

could be silenced during moderate drought. In rice, OsMADS27 was not responsive to moderate osmotic stress, while OsMADS57 was down-regulated in these conditions (Puig et al. 2013). In Arabidopsis, miR156 overexpression was shown to silence a MADS-box protein (AGL79), to modulate leaf morphology and lateral root development (Gao et al. 2018). Comp6823, which encodes for a MADS-box gene in C. colocynthis, is up-regulated markedly only at final stages of drought in this species (Wang et al. 2014). These results suggest that some MADS-box genes are turned off during early stages of drought. In contrast, bdi-miR159a-3p and zma-miR159k-3p genes were downregulated in moderate stress conditions. The predicted targets of these miRNAs belong to the MYB-like transcription factor family, and a few MYB members have been demonstrated involvement in plant responses to biotic and abiotic stress conditions (Cao et al. 2013). In Arabidopsis, AtMYB96 mediated abscisic acid (ABA) signaling during drought stress (Seo et al. 2009), while AtMYB88 was able to control stomatal development during abiotic stress (Xie et al. 2010). Moreover, overexpression of different members of MYB-like transcription factor family improved drought stress tolerance in some species (Zhang et al. 2012; Cao et al. 2013; Tang et al. 2019). The antagonistic responses between miRNAs putatively regulating two different families of drought-related transcription factors (TFs MADSbox and MYB) during moderate stress in *Setaria* might be interesting to investigate, with hopes to establish the precise relationship between specific miRNA and its TF target.

During moderate drought stress, it was also observed that two miRNA genes were up-regulated, stu-miR408b-3p and tcc-miR530a, both possibly regulating cell wallrelated genes (Supplementary File 6). The predicted target of stu-miR408b-3p refers to a laccase precursor protein (Sevir.9G440800), and the putative target of tcc-miR530a is an uncharacterized glycine-rich cell wall structural protein (Sevir.3G220100). Laccases are glycoproteins potentially involved in cell wall lignification, phenolic metabolism and H₂O₂ dynamics (Yu et al. 2017; Simões et al. 2020). Interestingly, the novel miRNA SvmiRp471 was also upregulated in moderate stress and putatively targets a laccase gene (Sevir.8G221600), suggesting that laccases are downregulated in early stages of moderate drought conditions. In sugarcane, ssp-miR397, a miRNA targeting a laccase gene, was up-regulated under early stages of drought stress, but it was down-regulated in late stages of dehydration, indicating a dynamic pattern of expression in stress conditions (Ferreira et al. 2012). In addition, several novel miRNA genes up-regulated in early responses of moderate stress appeared to target cell-wall related genes (Supplementary File 6), an indicative that cell wall signaling could be one of the first responses to dehydration.

miRNA-responsive genes during both moderate and severe drought stresses

The analysis of miRNA genes exclusively expressed in all stress conditions (moderate and severe), compared to well-irrigated plants, revealed two miRNA genes from the miR396 family (tcc-miR396d and zma-miR396f-5p) that were strongly down-regulated (Table 1; Supplementary File 6). It is known that miR396 controls the expression of differents growth-regulating factors (GRF), which are plant-specific transcription factors important for the maintenance of growth processes under unfavorable environmental conditions (Omidbakhshfard et al. 2015). In our in silico analysis, the predicted targets for tcc-miR396d and zma-miR396f-5p were observed as belonging to GRF family (*Sevir*.4G085500, *Sevir*.8G160800 and *Sevir*.9G140200; GO: 0,032,502). The

miR396/GRF regulatory module controls a wide range of stress conditions, including high salinity and drought (Zhou et al. 2012; Liu et al. 2014; Omidbakhshfard et al. 2015), and the expression of these miRNA genes in early drought responses in *S. viridis* corroborates these previous studies.

miRNA-responsive genes during plant rehydration

After rehydration of plants, two miRNA genes that were strongly down-regulated in severe drought appeared to be up-regulated during recovery: osa-miR408-5p and zmamiR528b-3p (Fig. 4A; Table 1). The predicted targets of osa-miR408-5p are a stress responsive protein gene (SRP; Sevir.2G448800), coding for an unknown protein highly expressed in abiotic stress responses in maize (Vega-Arreguín et al. 2009), and a chalcone synthase gene (CHS; Sevir.7G023500), responsible for the entry point of the flavonoids pathway, representing enzymes that catalyze 4-coumaroy-CoA and malonyl-CoA to chalcone, leading the phenylpropanoids pathway to flavonoids biosynthesis (Shih et al. 2008). Flavonoid accumulation is likely to occur in regard to drought stress in several plant species (Castellarin et al. 2007; Yang et al. 2007; Ma et al. 2014) because they act as antioxidant in stressed plants (Ma et al. 2014) and overaccumulation of flavonoids improved drought tolerance in Arabidopsis and sugarcane (Wahid and Ghazanfar 2006; Nakabayashi et al. 2014). It is well established that one of the first responses to drought stress is the production of reactive oxygen species (ROS). Since antioxidant systems tightly regulate ROS signaling, even small changes in ROS generation or scavenging activity under drought stress are expected to have an instantaneous impact on signal transduction (de Carvalho 2008). In this context, one can speculate that in severe drought and subsequent rewatering the antioxidant system might be rapidly activated or deactivated, respectively, through the osa-miR408-5p/CHS module. However, we did not perform any experiment to confirm this hypothesis and further studies are necessary to address this question. The other miRNA gene that was inversely expressed in severe drought/rewatering, zma-miR528b-3p, putatively targets an uncharacterized gene (Sevir.5G176900) which encodes for a protein that demonstrated 40% identity to a FK506-binding protein (FKBPs) from Panicum hallii. These proteins appeared to be chaperones playing various functions in a variety of crucial processes for plant development, growth, and abiotic stress responses (Gollan et al. 2012; Dong et al. 2018) and further investigation of the zmamiR528b-3p/ Sevir.5G176900 module could reveal its function and its role in drought stress responses.

Principal components analysis

The data for the different levels of drought stress from physiological analyses, in silico expression and RT- qPCR for the validated miRNAs was submitted to principal components analysis (PCA). For the SvmiRp86, miR159a and zmamiR396f-5p it was possible to distinguish in two different ellipses the expression of miR and their targets (Supplementary Fig. S3). In the brown ellipse the miR in silico expression in green symbols and miR RT-qPCR expression in blue symbols grouped and mostly modulated for the physiological parameters *Gs*, *E* and *WUE* in the several stress conditions (25% and 0% drought stress). The respective targets of these miRs in the different drought levels were grouped into a gray ellipse, and were not included for the physiological parameters analyzed (Supplementary Fig. S3).

Comparison of miRNA regulation in different millet species during drought stress

Setaria viridis, also known as green millet, is a diploid C4 grass member of subfamily Panicoideae, tribe Paniceae, that is emerging as a model organism due the short life cycle, small stature, large seed yield, and a small genome (510 Mb). Thus, green millet is a interesting model for research molecular mechanisms of C4 photosynthesis, as well as, validate biotechnological techniques for increase plant yields in phylogenetically related crops, such as sorghum, pearl millet, maize, and sugarcane (Cesarino et al. 2020).

Wang et al. (2016) performed small RNA and degradome sequencing to discover miRNAs and their targets in foxtail millet (Setaria italica) during drought responses. The genomes of S. *italica* and S. *viridis* are closely related (~99%), and it is tempting to assume that miRNA responses to drought stress would be similar between these two species. In fact, several miRNAs were responsive in a similar way in green and foxtail millets during drought stress. The families of conserved miRNAs belonging to miR167, 398, 159, 396, 408, 171, 395, 827, 528 and 164 were all differentially expressed in a similar pattern in both species in response to drought. For instance, miR164 was upregulated during drought stress in both species, and its predicted target corresponds to no apical meristem protein transcription factor (NAC). As discussed by Wang et al. (2016), it is believed that the increase in the expression of miR164 reduce the NAC gene expression and regulate the foxtail millet responds to drought, and our results contribute to reinforce this hypothesis in green millet. In addition, miR159 was differentially regulated in drought stress in both studies, and their predicted targets comprise MYB transcription factors, responsible for the regulation of ABA signaling. The similar responses obtained in S. italica and S. viridis corroborate the idea that green millet is a suitable model for genetic studies in C4 grasses, especially millets.

Moreover, Chakraborty et al. (2020) chosen five important millet species (pearl millet, sorghum, foxtail millet, finger millet, and proso millet) to mine stress-responsive miR-NAs using in silico analysis. The authors demonstrated that many of the miRNA families targeting drought-responsive factors were both functionally and structurally conserved between the species, showing that millets regulatory roles remained largely conserved. Several miRNA families associated with drought-responsive traits were identified in foxtail millet that are in accordance with our study in green millet, namely miR105, 171, 164, 395, 167, 319, 172, 165 and 399 (Chakraborty et al. 2020; this study, Table 1). Therefore, our results indicate that these miRNA families and their targets associated with drought stress are indeed conserved among millet species. However, it should be addressed that other miRNA families were exclusively expressed in green millet under dehydration.

Regulation of cell wall-related genes by novel miRNAs during early responses to drought

Our in silico analysis in green millet also reveals that several cell wall-related genes were predicted to be regulated by novel miRNAs differentially expressed in early responses of drought stress in Setaria viridis (Supplemenary File 6). Cell wall synthesis and remodeling is a mechanism employed by plants under abiotic stress, mainly because the major issue during a drought is to restrict the shoot development and sustain the root growth (Tenhaken 2015; Le Gall et al. 2015; Oliveira et al. 2020). As mentioned above, the production of ROS and peroxidases is a primary response to biotic and abiotic stresses (de Carvalho 2008), which are responsible for the cross-linking of phenolic compounds and glycoproteins in the cell walls, causing stiffening. Moreover, cell wallrelated enzymes are also responsible to modulate cell growth through the modification of the cell wall matrix, resulting in wall loosening to allow further growth of stressed organs (Tenhaken et al. 2015). Our results demonstrated that seven novel miRNA genes up-regulated during drought stress (SvmiRp86, 453, 466, 471, 730, 751 and 826) are predicted to target a wide range of cell wall-related genes coding for UDP-glucosyl transferase, laccase, β -mannanase, glycosil transferase, glycosil hydrolase, xyloglucan fucosyltransferase and pectin methylesterase (Supplementary File 6). A single novel miRNA, SvmiRp86, was down-regulated in severe stress, and this miRNA gene was predicted to target different cell wall genes belonging to the families of expansins, glycosil hydrolases 16, β -glucosidases and α -1,4glucanases. All these cell wall-modifying genes had their expression negatively correlated with SvmiRp86 expression, as corroborated by RT-qPCR data (Fig. 4B; Supplementary

Fig. 2). Altogether, these results indicate a strict regulation of cell wall during early responses of drought stress and recovery of *Setaria* plants. Therefore, it would be interesting to perform detailed analyses on the relationship between the miRNA, their targets and cell wall structure in plants under abiotic stress and during recovery from drought.

Conclusions

In conclusion, our results demonstrated a fine-tuning of miRNA regulation during early responses of *Setaria viridis* plants to drought and after recovery. The predicted mRNA targets mainly corresponded to genes related to cell wall remodeling, growth, antioxidant system and drought-related transcription factors. Ecophysiological studies demonstrated that the *S. viridis* accession used in this study is highly tolerant to drought and capable of a rapid recovery response, demonstrating an adaptive mechanism to cope with abiotic stress. Therefore, the genetic engineering of miRNAs and their predicted targets represents a promising strategy to improve drought stress tolerance in crops phylogenetically related to 1`*S. viridis*, such as sugarcane, maize, and sorghum.

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Author Contributions MFB, NGO, WRS and HBCM designed all the experiments; MFB, KED and NGO conducted all biological experiments; MFB, JCFS and TBC performed all bioinformatics analysis; MFB, KED, BADBC, BOG and TRS carried out molecular assays (real time RT-PCR and Stem-loop RT-PCR); MFB wrote the draft manuscript, while WRS, ALN and AKK provided intellectual inputs. WRS wrote the final version of the manuscript. All authors revised and approved the final version.

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Data availability The data were availability in https://www.ncbi. nlm.nih.gov/genbank/ and the accession numbers could be found in the supplementary file 3.

Declarations

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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