SCIENTIFIC REPORTS

Received: 14 November 2016 Accepted: 17 May 2017 Published online: 08 June 2017

OPEN Genome-wide survey of switchgrass NACs family provides new insights into motif and structure arrangements and reveals stressrelated and tissue-specific NACs

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NAC proteins comprise of a plant-specific transcription factor (TF) family and play important roles in plant development and stress responses. Switchgrass (Panicum virgatum) is the prime candidate and model bioenergy grass across the world. Excavating agronomically valuable genes is important for switchgrass molecular breeding. In this study, a total of 251 switchgrass NAC (PvNACs) family genes clustered into 19 subgroups were analyzed, and those potentially involved in stress response or tissue-specific expression patterns were pinpointed. Specifically, 27 PvNACs were considered as abiotic stress-related including four membrane-associated ones. Among 40 tissue-specific PvNACs expression patterns eight factors were identified that might be relevant for lignin biosynthesis and/or secondary cell wall formation. Conserved functional domains and motifs were also identified among the PvNACs and potential association between these motifs and their predicted functions were proposed, that might encourage experimental studies to use PvNACs as possible targets to improve biomass production and abiotic stress tolerance.

NAC transcription factors (TFs) are the largest and plant-specific TF family^{1,2}, with the featured NAC domain firstly found in the N-terminal of petunia NAM, Arabidopsis thaliana ATAF1/2 and CUC2 and named after those three genes³⁻⁵. Typically, the conserved N-terminal DNA-binding domains (DBD) of NACs contain about 160 amino acid residues that can be further classified into five subdomains (designated as A-E subdomains), while their C-terminal regions contain the transcriptional activation/repression regions (TARs or TRRs) with highly divergent sequences^{3,6} that might also be involved in protein-protein interactions and contribute to their regulation specificities⁷. The NACs of Arabidopsis and rice (Oryza sativa) can be classified into two groups and 18 subgroups according to their primary protein structures (i.e. amino acid sequences)⁸. Within each subgroup, the TARs appear to have conserved motifs corresponding to their NAC domain structures, suggesting that NAC proteins in each subgroup might evolve to have similar functions⁸. This working model proposed by Ooka⁸ has been proven to be valid in many studies using experimental approaches, and could be used as a basis for target gene identification and characterization in switchgrass as well.

NACs play important roles in plant development and response to abiotic stresses. For examples, vascular-related NAC genes, such as VND6, VND7, SND1, NST1, and NST3, were all involved in secondary cell wall thickening in Arabidopsis9-11. Overexpression of NST1 or NST3 induced ectopic secondary wall thickening, while nst1/nst3 mutants had severely suppressed lignification in the aboveground tissues⁹. Several switchgrass NACs (PvSWNs) and a MYB gene were highly expressed in stems and closely associated with sclerenchyma cells; overexpression of some of these genes in Arabidopsis snd1/nst1 or mby46/myb83 double mutant rescued the

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secondary wall defects by activating of the biosynthetic genes for cellulose, lignin and xylan and ectopic deposition of secondary walls in parenchymatous cells¹². Many reported *NAC* family genes were involved in plant abiotic and biotic stress tolerances and the regulation of leaf senescence^{13, 14}. For examples, the abiotic stress-inducible *NAC* genes, *ATAF1* acted as a negative regulator in plant tolerance to osmotic stress¹⁵ and to biotic stress¹⁶. Another pair of stress-inducible *NAC* genes, *SNAC1 & SNAC2* were transcriptionally induced by drought, cold or salt, respectively, and over-expression of these two genes improved rice tolerance to the corresponding abiotic stress(es)^{17, 18}. Seven membrane-bound *ZmNTL* genes were identified in maize (*Zea mays*) that were up-regulated upon hydrogen peroxide or abscisic acid treatment suggesting their involvement in abiotic stress tolerance¹⁹. These previous results from model plants together with featured functional domains (or subdomains) among the *NAC* family genes provide valuable insights into translational research on target gene identification and functional prediction in bioenergy as well as other agronomic crops.

Switchgrass (*Panicum virgatum*), a perennial C_4 tall grass, is considered as an ideal biomass energy resource due to its high and sustainable biomass production^{20, 21}. In order not to compete with grain crops, switchgrass is and will be primarily planted on marginal lands that were often threatened by serious abiotic stresses that will inevitably impose heavy influence on the growth and biomass yield of switchgrass. For examples, switchgrass yield and plant height are severely affected by drought and salt stresses²². Transcription factors are key signaling components in the regulation of plant endogenous defense system against abiotic stresses^{23, 24}. Therefore, identification of key TFs that enable switchgrass to overcome severe abiotic stresses is an important topic of molecular genetic studies on switchgrass. Yet, due to the self-incompatibility and complex allotetraploid background, it is difficult to pinpoint these key genes in switchgrass using forward genetic approaches. Translational genomics provide an important alternative route for gene identification in switchgrass^{25, 26}.

A previous study reported that switchgrass had 107 potential NACs based on unique transcript data²⁷. In this study, the much improved switchgrass genome dataset made it possible to identify a better picture of PvNAC family members. Therefore, we conducted a comprehensive genome-wide identification of NAC domain TFs in switchgrass and exploited expanded NAC family with totally 251 family genes. The basic characteristics including sequence phylogeny, gene structure, genome organization, membrane-bound TFs (MTFs), and conserved motif analysis for NAC family of switchgrass were analyzed. We also took advantage of publicly available transcriptomic datasets to systematically analyze *NAC* gene family to identify abiotic stress-related and tissue-specific candidate genes. This study would provide an insight of a large number of candidate *NAC* genes for future genetic studies on switchgrass.

Results

Identification and nomenclature of switchgrass NACs. The recently released genome database of *"Panicum virgatum* v1.1, DOE-JGI" and the Hidden Markov Model (HMM) file PF02365 for the NAC domain were used for the identification of PvNACs in this study. A total of 251 switchgrass NAC proteins were identified and designated as PvNAC1 to PvNAC251 (Additional file 1) according to their orders in the chromosomes (The PvNACs started naming from chromosome 1a to 09b), and the rest PvNACs not designated onto its chromosomes were named according to the order of their IDs from the smallest to the largest. The inferred full length of PvNAC proteins ranged from 143 aa to 759 aa, among which 24 proteins were more than 500 aa in length, and 166 proteins were under 300 aa, with molecular weights ranging from 15701.89 to 84903.08 Da, and the isoelectric points from 4.48 to 11.14 (Additional file 1).

Phylogenetic and structural analyses. A neighbor-joining (N-J) phylogenetic tree was built to show the evolutionary relationship between PvNACs. The PvNAC proteins can be further classified into 19 distinct subgroups (see Supplementary Fig. S1a). The subgroup XIX had the maximum number of PvNACs (29), followed by subgroup IX (23) and XVI (22), while subgroup VII had the least number of PvNACs (4). The structural diversity of *PvNAC* genes was also illustrated with the exon/intron organization (see Supplementary Fig. S1b). And most closely related members in the same subgroups shared highly similar exon/intron structures with comparable intron numbers and exon lengths (see Supplementary Fig. S1b), supporting the subgroup classification of the phylogenetic tree. In addition, a more stringent maximum likelihood approach was also conducted with these 251 PvNACs to confirm the reliability of N-J phylogenetic tree (see Supplementary Fig. S2), and similar results were obtained using both approaches.

Another phylogenetic tree was built from alignments of the full-length PvNACs together with NACs in *Arabidopsis* and rice (see Supplementary Fig. S1c). Accordingly to Ooka *et al.*⁸, most *Arabidopsis* and rice NACs were classified into 18 subgroups, yet a high percentage of switchgrass PvNACs (100; 39.84%) were outside of these subgroups, reflecting the divergence and expansion of specific groups of NACs in switchgrass. For example, eight PvNACs (PvNAC86, -74, -31, -39, -230, -87, and -135) were not grouped with any *Arabidopsis* or rice NAC protein (see Supplementary Fig. S1c), indicating their potential roles in shaping the growth and development or environmental adaptation of switchgrass. Nevertheless, according to the constructed phylogenetic tree and literature review, we were able to pinpoint functional-annotated NACs with their PvNAC homologs (Supplementary Table S1) that are defined as orthologous genes shared similar sequences in a monophyletic group. Accordingly, the potential functions of 27 PvNACs were predicted. These PvNACs can be further clustered into six groups (a–f) (Fig. 1) that were predicted to involve in the regulation of senescence and abiotic stress tolerance.

In our study, a total of 11 PvNAC membrane-bound transcription factors (MTFs) were identified by using the TMHMM server 2.0 (Table 1). Each MTF includes an α -helical TM in the C terminal that has a function to anchor onto either endoplasmic reticulum or plasma membranes. Furthermore, four PvNAC MTFs (PvNAC88, -76, -102, and -99) putatively involved in plant stress responses were identified as orthologous ones to the stress-related NAC MTFs of *Arabidopsis* (Fig. 2). While it would be interesting to test whether these four PvNAC



Figure 1. Phylogenetic relationships show the PvNACs that are orthologous to annotated AB- or stressresponsive NAC genes in rice and *Arabidopsis*. (a) PvNAC249 and PvNAC216 were orthologous to Os11g03310.1. (b) PvNAC41 was orthologous to Os08g339910.1. (c) PvNAC208 and PvNAC185 were orthologous to Os11g03300.1 and Os12g03040.1. (d) PvNAC219 was orthologous to Os07g48450.1. (e) PvNAC141 was orthologous to Os03g60080.1. (f) PvNAC239 and PvNAC174 were orthologous to ANAC002, ANAC032, Os05g34830.1, and Os01g66120.1.

Names	Gene model	Length (a.a)	Transmembrane sequences
PvNAC95	Pavir.Fa00048.1	660	629-651
PvNAC165	Pavir.J00978.1	236	188-210
PvNAC99	Pavir.Fa01901.1	674	651-673
PvNAC102	Pavir.Fb00405.1	682	659-681
PvNAC1	Pavir.Aa00085.1	643	619-641
PvNAC21	Pavir.Ab03009.1	636	612-634
PvNAC88	Pavir.Eb01057.1	527	501-520
PvNAC27	Pavir.Ba01681.1	713	681-703
PvNAC179	Pavir.J04800.1	715	683-705
PvNAC76	Pavir.Ea01166.1	531	502-524
PvNAC172	Pavir.J03378.1	632	600-622

Table 1. Putative membrane-bound switchgrass PvNACs.

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MTFs have conserved functions in plant stress tolerance, it was also notable that there was less number of NACs in this clade in grass (switchgrass and rice) than that in *Arabidopsis*.

Chromosomal locations and duplications in homeologous chromosomes. Allotetraploid switchgrass possesses two subgenomes (A, and B)²⁸. The segmental duplication and tandem amplification of chromosomal regions are common phenomena that contributing to gene expansion, evolution and diversification of plants²⁹. In this study, a total of 163 *PvNACs* were designated onto 18 chromosomes of switchgrass (Fig. 3), with the rest 88 *PvNACs* not located on chromosome yet. *PvNACs* distributed unevenly on chromosomes, with the most on Chr02b and Chr09b (13 *PvNACs* on each chromosome), and the least on Chr03a, Chr04b, and Chr08b (6 *PvNACs*). According to the phylogenetic tree, 48 paralogous pairs of *PvNAC* genes were linked with red line (bootstrap value >95 in the phylogenetic tree) as shown in Fig. 3. Majority of these 48 pairs were homeologous chromosomes with only two exceptions (*PvNAC36/71; PvNAC59/133*). Tandem gene duplication was stated that genes in the same chromosome linked in tandem with less than five gene loci. In this study, only four tandem duplications including *PvNAC24/PvNAC25* on Chr02a, *PvNAC43/PvNAC44* on Chr02b, *PvNAC54/PvNAC55* on



Figure 2. Phylogenetic relationship of NAC MTFs from switchgrass, rice, and *Arabidopsis*. Multiple sequences alignment of NAC MTFs was conducted using ClustalX, and MEGA5.0 was used to construct phylogenetic tree by using Neighbor-joining method with 1000 bootstrap replicates and p-distance method, and bootstrap values are shown next to the branch.

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Chr03b, and *PvNAC105/PvNAC106* on Chr06b were discovered (Fig. 3). Together, this result showed that most *PvNACs* was derived from segmental duplication other than tandem amplification.

Beneficial mutations contribute to species divergence and evolutionary innovation (diversifying selection), and removal of pernicious mutations keeps the natural fitness of species (purifying selection). To understand the evolution trend of these *PvNAC* paralogous genes, we selected 52 pairs of *PvNAC* homologous genes, among which 46 pairs were homeologous, for the calculation of nonsynonymous and synonymous substitution rates (Supplementary Table S2). The result showed that 71.15% (37 out of 52) *PvNAC* pairs were under diversifying selection, and only 15 *PvNAC* pairs (28.85%) under purifying selection.

Expression profiles of switchgrass NAC genes with public datasets. NACs play important roles in stress tolerance and plant development. Here, we pooled out expression profiles of *PvNACs* from datasets: a switchgrass Affymetrix array³⁰ and a switchgrass gene expression database, PviGEA, and PviUT database³¹.

Using the Affymetrix array data³⁰, we re-analyzed the heat-responsive *PvNACs*. From the total of 199 *PvNACs* probed on the switchgrass GeneChip (Additional file 2), 24 of them were transcriptionally responsive to heat treatment that three *PvNACs* were up-regulated, and 21 were down-regulated (see Supplementary Fig. S3).

Tissue-specific gene expression data is useful to identify target genes involved in developmental processes³². Taking advantage of the PviGEA and PviUT database³¹, we pooled out and analyzed the expression patterns of 251 *PvNACs* in 21 differential tissues, organs, and developmental stages (see Supplementary Fig. S4). According to the analysis, genes with specific expression patterns related to lignification, leaf development, flowering, and seed maturation were analyzed.

For the *PvNACs* potentially involved in development of root system, four genes including *PvNAC170*, -26, -16, and -8 possess higher expression in root than other tissues (Fig. 4a).

For those potentially involved in the regulation of lignin biosynthesis, we identified eight PvNACs had relatively high expression levels in highly lignified tissues (crown, root, node, internode, and inflorescence branches) (Fig. 4b); and five of these PvNACs (PvNAC85, -89, -190, -213, and -215) were also previously pinpointed



Figure 3. Chromosomal locations of 163 *PvNACs*. Duplications generated by allotetraploidy were connected by full lines, while tandem duplications were connected by thick red lines. The numbers listed along each chromosome were locations of *PvNACs*, and the smaller/larger number indicated the *PvNACs* were closer to start/end point of chromosome. The number below each chromosome was the whole length.

through an orthologous gene identification study²⁷. Notably, the rest three *PvNACs* (*PvNAC70*, -125, and -189) that showed lignification-related expression patterns were not previously reported and could be novel genes involved in the strengthening of grass cell wall (Supplementary Table S3).



Figure 4. The special expression profiles for several tissues of *PvNACs*. (**a**–**e**) Special expression patterns of *PvNACs* in root, lignified, leave, flower, and seed tissues. AP13_Seed0d, AP13_Seed5d, AP13_Seed10d, AP13_Seed15d, AP13_Seed20d, AP13_Seed25d, AP13_Seed20d, represent whole flowers at anthesis stage, whole seeds 5 days post fertilization, whole seeds with visible caryopsis, whole seeds at the milk stage, whole seeds at the soft dough stage, whole seeds at the hard dough stage, whole seeds at the physiological maturity stage, respectively. Inflo-meristem: Inflorescence meristem (0.5–3.0 mm). Inflo-floret: Floret of inflorescence when glumes are 10–20 mm. Inflo-REL: Rachis and branch elongation of inflorescence (50–150 mm). Inflo-PEM: Panicle emergence of inflorescence (>200 mm). E4-LFB: Pooled leaf blade from plant. E4-LSH: Pooled leaf sheath. E4i3m: Middle 1/5 fragment of the 3rd internode. E4i4b: Bottom 1/5 fragment of the 4th internode. E4i4t: Top 1/5 fragment of the 4th internode. E4i4t: Top 1/5 fragment of the 4th internode. E4i4ternode: E4i4m: Middle 1/5 fragment of the 4th internode 4. E4-root: Whole root system. E4-crown: Whole crown. E4-node: Pooled nodes. The genes with red frames were chosen for qRT-PCR in further step.



Figure 5. The expression analysis of nine selected *PvNACs* relating to ABA and drought, salt, and cold stresses via qRT-PCR. Relative expression of these *PvNACs* were normalized in relation to reference gene *UCE2* in different stresses. The bars represent error bar. The black * represents the expression for treatment group is more than twice as control group (0 d), while red * represents treatment group is below half of the control group (0 d).

For those potentially involved in cellular metabolism of the green leaves, three PvNACs (PvNAC100, -130, and -137) were identified that had relatively high expression levels in leaves blade and leaf sheath (Fig. 4c).

For those potentially involved in flowering, nine PvNACs were identified (PvNAC48, -64, -96, -97, -107, -108, -161, -165, and -175) that had relative higher expression levels in inflorescence meristem and floret. On the other side, five PvNACs (PvNAC30, -35, -40, -45, and -220) had obviously lower expression levels in these organs/tissues (Fig. 4d).

PvNACs that might associate with seed development and maturation were also identified: PvNAC149, -195, -239 and -240 had relatively high expression in seed relative to the other tissues. Additionally, PvNAC31, -39, -87, -128, and -136 showed relatively high expression levels from milk stage to physiological maturity stage, but low expression levels from the anthesis stage to five days post fertilization (Fig. 4e), suggesting these genes might involve in the process of seed maturation.

The interaction network of PvNAC proteins. To further explore the relationship between PvNAC proteins in switchgrass, an interaction network of PvNAC proteins was constructed based on the orthologous rice proteins (see Supplementary Fig. S5; Supplementary Table S4), which identified 15 high confidence interactive proteins involved in the NAC family networks in switchgrass. Through combining with previous analysis as shown in Table S1, seven PvNAC proteins with predicted functions were built in the network (see Supplementary Fig. S5). Specially, PvNAC80, -92, and -141 were all related to drought and/or cell death, indicating that these three NACs coordinately regulate plant drought and/or cell death processes. The pairs between PvNAC147 and -46, and between PvNAC239 and -31 shared similar functions in ABA and drought stresses. PvNAC213 was predicted to interact with PvNAC175 and -89 that these three proteins might regulate secondary cell wall strengthening together. It is notable that this predicted interaction network was based on corresponding rice orthologs. Considering the specificity of different plant species (even though both are in the Poaceae family) and genes' functional diversification, the reliability of this network shall be further checked through experimental approaches.

qRT-PCR analysis of selected abiotic stress-responsive and tissue/organ-specific *PvNACs.* The expression patterns of potential stress-related *PvNACs* were further analyzed using qRT-PCR in response to drought, ABA, salt, and cold treatments (Fig. 5). We selected nine *PvNACs* (e.g. *PvNAC41*, -141, -174, -185, -208, -216, -219, -239, and -249) that were orthologous to functional-annotated *NAC* genes involved in plant stress tolerance (Fig. 1) and classified in different subgroups in the phylogenetic tree for gene expression analysis with the gene-specific amplification confirmed by single peak melting curves of the qRT-PCR products



Figure 6. The expression analysis of three selected *PvNACs* based on array data relating to ABA and drought, salt, cold, and heat stresses through qRT-PCR. Relative expression of these *PvNACs* were normalized in relation to reference gene *UCE2* in different stresses. The bars represent error bar. The black * represents the expression for treatment group is more than twice as control group (0 d), while red * represents treatment group is below half of the control group (0 d).

(see Supplementary Fig. S6). Setting the cut-off value at 2-fold change, the expression levels of eight *PvNACs* were significantly up- or down-regulated by three types of treatments, and that of *PvNAC208* were up-regulated by all of the four treatments. Specifically, these nine genes were all significantly up-regulated in switchgrass under severely drought condition (drought for 28 days). The expression of these *PvNACs* showed different patterns in response to ABA treatment from those to drought treatment that, *PvNAC208* was the only gene transcriptionally up-regulated by ABA treatment after 8 d (2-fold change), while *PvNAC41*, *-216*, and *-239* were significantly down-regulated. When exposed to salt treatment, three genes including *PvNAC185*, *-208*, and *-219* were up-regulated after 14 d and 28 d of treatment, and only *PvNAC249* was significantly down-regulated. Cold treatment significantly induced expression of these genes except *PvNAC41*. In particular, the transcript level of *PvNAC219* and *PvNAC185* increased over 50-fold after 28 d of cold treatment.

For those 24 PvNACs that showed differential expression upon heat stress as revealed by the Affymetrix data (see Supplementary Fig. S3), we picked three genes (PvNAC65, -103, and -224) to tested their responses to heat, cold, salt, ABA and drought treatments using qRT-PCR (Fig. 6). The results showed that all three genes transcriptionally responded to heat stress at different time points after heat treatment that PvNAC65 and -224transcripts increased to 2-fold after 28 d or 14 d of treatment, yet PvNAC103 was significantly repressed by heat. Furthermore, these three genes responded to the other abiotic stress treatments as well. For example, the transcript levels of PvNAC224 and PvNAC65 increased to 18-fold and 6-fold, respectively, after 28 d of drought treatment. PvNAC224 was also transcriptionally repressed after prolonged ABA, salt and cold treatments. PvNAC103 was transcriptionally induced by ABA after 8 d of treatment, but was suppressed by 16 d of treatment, and this gene was also significantly suppressed by drought, salt, and cold after different period of treatment time. To validate the data from the PviGEA and PviUTs database that revealed about 38 PvNACs had tissue/organ-specific express patterns (Fig. 7), we selected six of them with different expression patterns (PvNAC64, -85, -87, -190, -239, and -100) for qRT-PCR analysis. As shown in Fig. 7, the expression levels of tested genes were consistent with the data from PviUT (see Supplementary Fig. S4) in general. For examples, PvNAC85 and PvNAC190 had relatively higher expression levels in lignified tissues, such as stem, spikelet and root (Fig. 7). PvNAC87 had relatively high expression levels in seed, the expression of PvNAC239 and PvNAC100 were specifically detected in roots and leaves, respectively. PvNAC64 displayed significantly lower expression level in flower and seed than the other tissues/organs.

Correlation between conserved motif analysis and functional predication. NAC proteins share relatively conserved motifs in their N-terminal regions and diversified C-terminals. Therefore, we tried to analyze the conserved motifs among the PvNACs and the correlation between these motifs and their predicted functions.

As shown in Fig. 8, nearly all PvNACs in Group A had the entire NAC domain (subdomains A-E), while most PvNACs in Group B had incomplete NAC domains that were in lack of one or two subdomains. Among the PvNACs in Group B, only subdomains A was tightly conserved, while subdomains B, C, and E were more divergent, indicating that subdomains A might have the most conserved and indispensable functions for NACs. In particular, PvNACs in the subgroup XV were composed of the least conserved NAC domain that had no subdomain C at all. And it is interesting to note that more than half of PvNACs in subgroup XVI possessed the unique motif 10, and these PvNACs were homologous to ANA010 and ANA073 involved in secondary cell wall thickening in lignified cells³³ (see Supplementary Fig. S7), indicating that the motif 10 could be an important region in defining the function of these NACs in the process of cell wall biogenesis and lignification.

In the C-terminal of NACs locate TARs (or TRRs) with highly divergent sequences. In this study, a total of 12 motifs (a-l) were identified in the TARs in 10 out of the 13 PvNAC subgroups (see Supplementary Fig. S8), and these motifs in TARS were conserved in parallel with NAC domain structures in the N-terminus. Although the exact roles of these conserved motifs in the TARs of NACs were not well understood, but consistent presence of certain motifs in the C- and N- terminals among certain subgroups in the phylogenetic tree could suggest that these motifs are key components for proper functions of these PvNACs, that hypothesis could be further check using experimental approaches (e.g. domain swap).



Figure 7. The expression analysis of selected six tissue specific *PvNACs* via qRT-PCR. Relative expression of these *PvNACs* were normalized in relation to reference gene *UCE2* in different tissues (Root, stem, leaf, flower, spikelet, seed). The bars represent error bar.

Discussion

Switchgrass has a large number of unique NAC genes under diversifying selection. In this study, we took advantage of the recently released genome database of "*Panicum virgatum* v1.1, DOE-JGI" and identified a total of 251 switchgrass NAC genes. The number of PvNACs is the highest among the reported ones, including those in rice $(151 NACs)^{34}$, *Arabidopsis thaliana* $(105 NACs)^8$, soybean (*Glycine max*) $(152 NACs)^{35}$, *Populus trichocarpa* $(163 NACs)^{32}$, maize $(148 NACs)^{36}$, and watermelon (*Citrullus lanatus*) (80 NACs)^{37}. This large number of NACs in switchgrass could be due to the recent allotetraploidization event at ~1 million years ago (Mya) between two closely related diploid progenitors of switchgrass^{38, 39}, and this narrow time frame after the polyploidization event might not be sufficient for large number of NAC genes in switchgrass. On the other hand, according to the phylogenetic tree built with NACs of switchgrass, *Arabidopsis* and rice (see Supplementary Fig. S1c), a high percentage of PvNACs (100; 39.84%) were outside of the subgroups assigned for rice and *Arabidopsis* NACs, reflecting the divergence and expansion of specific groups of NAC genes in switchgrass. Furthermore, while for 37 pairs of PvNACs under diversifying selection, half of them (51.35%) had dissimilar expression patterns in different organs/developmental stages (see Supplementary Fig. S9).

The tetraploid switchgrass is disomic inheritance with two subgenomes likely originated from a polyploidization event between closely-related diploids⁴⁰. This disomic inheritance displays more opportunities than polysomic inheritance to promote the duplicated genes to undergo divergence and development of new functions^{28, 39}. Therefore, the high proportion of *PvNAC* pairs under diversifying selection (71.15%) (Supplementary Table S2) indicated that some *PvNACs* might have evolved to gain novel or unique functions for the fitness and successful natural adaption of switchgrass.

Functional predication of PvNACs. Phylogenetic analysis with the whole gene family members is an effective method to predict their potential functions^{35, 39}. For example, ZmNAC1 was isolated as the maize otholog to OsNAC6 of rice with 80% of sequence similarity. ZmNAC1 has confirmed to play an important role in stress tolerance against cold, NaCl, drought, and ABA⁴¹ (Liu *et al.*, 2008). Meanwhile, Rabbani *et al.* (2003) suggested that OsNAC6 with a high similarity to ZmNAC1 could also be induced by ABA, cold, salt, and drought stresses⁴². Moreover, NACs were reported to involve in the regulation of biotic and abiotic stress tolerances, plant



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Figure 8. Schematic representation of the conserved motifs in N-terminal regions of PvNACs for displayed by MEME analysis. (a) Motifs in N-terminal regions. The colored boxes represent each types of motif, and black lines indicate the non-conserved sequences. (b) The logo of motifs 1–10 in N-terminal regions.

development, and senescence progress. For examples, OsNAC52 (Os05g34830.1), ONAC045 (Os11g03370.1), SNAC2 (Os01g66120.1), OsNAC10 (Os11g03300.1), ONAC063 (Os08g33910.1) in rice and ATAF1 (ANAC002) in *Arabidopsis* were all positive regulators in plant abiotic stress resistance^{18, 43-47}. OsNAC5 (Os11g08210.1) was involved in senescence and its expression was up-regulated with the progression of natural- (aging) and stress-induced senescence (e.g. dark, ABA application, high salinity and cold)⁴⁸. ONAC131 (Os12g03040) was reported to involve in biotic stress response that silencing of ONAC131 yielded rice to be more susceptible to *Magnaporthe grisea* infection (the causal agent of rice blast)⁴⁹. The identification of these conserved switchgrass orthologs to these functional-annotated NACs provide a basis for translating the available knowledge from rice and *Arabidopsis* to switchgrass. In addition, three cell death and stress- related proteins (PvNAC80, -92, and -141) in Table S1 were closely located in protein-protein network (see Supplementary Fig. S5), indicating their mutual effect in functional regulation.

MTFs stored in dormant forms is one regulatory mechanism to quickly respond to environmental stimuli that can be quickly activated upon stimulus signals through degrading the cytoplasmic anchors to enter into the nucleus where they are able to trans-activate or -suppress their target genes^{50, 51}. Comprehensive analysis of NAC family predicted 18 and 5 MTFs in *Arabidopsis* and rice, respectively⁵². To date, four *Arabidopsis* NAC MTFs (At3g49530/ANAC062, At2g27300/ANAC040, At4g35580/NTL9 and At4g01540/ANAC068) were activated and

liberated from the TM domain by membrane-associated proteases in the endoplasmic reticulum to function in stress responses^{51, 53-55}. The PvNAC MTFs possess a single TM that is similar to the NACs in *Arabidopsis*, rice⁵², and it would be interesting to further verify their functions using experimental approaches.

The feedstock quality of switchgrass biomass for bioenergy or forage usage is negatively impacted by the lignin content^{56–58}; therefore, identification of genes correlating to the lignin plays an essential part in increasing the conversion efficiency by genetic modification. In this study, we found eight genes with high expression levels in lignified tissues (crown, root, node, internode, and inflorescence branches), but low expression in less lignified tissues (leaf, leaf sheath, florets and seeds) (Fig. 4b), indicating that these eight genes might involve in the process of lignin biosynthesis and/or secondary cell wall strengthening. A previous study also explored switchgrass ten *NAC* genes (corresponding to *PvNAC032*, -033, -046, -055, -061, -062, -066, -068, -101, and -102 in this study) that are potential targets for modifying cell wall recalcitrance²⁷. In this study, five of them (*PvNAC85*, -89, -190, -213, and -215) were also found with higher expression levels in lignified tissues (Fig. 4b), yet the remaining ones did not have that featured expression pattern (*PvNAC16*, -152, -183).

In order to clearly portrait the *PvNAC* gene expression pattern, the special expression profiles for several tissues were separately analyzed (Fig. 4). The longer and stronger root system plays a significant role in absorbing subsoil surface nutrients and moisture to help plant adapt to drought stress and withhold soil⁵⁹. For *Arabidopsis*, the *AtNAC2* and *NAC1* genes are preferentially overexpressed in roots, and promote lateral root development, which confirm that *AtNAC2* and *NAC1* regulate the lateral root development^{60, 61}. Over-expression of the cotton (*Gossypium*) *GhNAC2* under the *CaMV35S* promoter could increase root growth in both *Arabidopsis* and cotton under unstressed conditions⁶². Obviously, in this study, four *PvNAC* genes including *PvNAC170*, -26, -16, and -8 possess higher expression in root than the other tissues, indicating that these four genes probably are involved in root development (Fig. 4a).

Leaf photosynthesis, respiration, and senescence are fundamental metabolic processes for plant growth^{63–65}. Identification of genes specifically expressed in leaves will be helpful for learning mechanisms in leaf development. For instance, inducible overexpression of *AtNAP*, a gene encoding a NAC family transcription factor in *Arabidopsis*, readily causes precocious leaf senescence⁶⁶. Meanwhile, during drought-induced leaf senescence, a drought-responsive NAC transcription factor NTL4 has been proved to promote ROS production through directly binding to the promoters of genes encoding ROS biosynthetic enzymes in *Arabidopsis*⁶⁷. Here, leaf special gene expression pattern displayed three genes including *PvNAC100*, -130, and -137 expressed higher in leaf (leaf blade and leaf sheath) than the other tissues (Fig. 4c).

After plants begin to flower, the accumulation of aboveground biomass will decrease⁶⁸. Thus, the delayed flowering time will enable the plants to extend vegetative growth and yield more biomass. In this study, fourteen genes were found to be likely involved in flower development that nine of them had particular higher expression levels in inflorescent floret and five genes had obviously lower expression levels (Fig. 4d).

The low germination rate of switchgrass is another issue hindering its commercialization of seed packages and successful and quick field establishment⁶⁹. Nine genes that may associate with seed development were identified that *PvNAC239*, -149, -195, and -240 might involve in seed dormancy or seed maturation at the very late stage, while *PvNAC31*, -87, -39, -128, and -136 might relate to seed maturation according to their gene expression patterns.

In addition, the current qRT-PCR result supported the previous *in silico* data and provided clues for the functional predication of these *PvNACs*. Yet, these qRT-PCR analyses had its limitations, e.g. insufficient physiological or phenotype data associated with their relative expression levels and lack of perfect control to normalize the developmental stages across different stress treatments. Further analyses are to be made to confirm functional predications for target genes.

New insights into motif and structure arrangements. All NAC proteins have relatively conserved NAC domains in the N-terminus with five (A-E) subdomains among which DBDs were contained in subdomains D & E, while subdomains B, C, and E corresponded to the proteins' diverse functional roles for cooperated DNA-binding specificity of NACs^{6, 60, 70}. A previous study showed that subdomains A & E were necessary for stable NAC homo- or hetero-dimer formation, while subdomains D & E indispensable for DNA-binding⁷¹. The universal presence of subdomain A suggested that the formation of NAC dimers could be essential for the accurate function of NACs. It would be interesting to test the NAC-NAC interaction network to better understand the functional specificity vs functional redundancy among NACs with a special attention to the diversified regions in the future.

In this study, we showed that subdomains B, C, and E were more divergent that might contribute to the functional divergence and specification in certain biological processes. In particular, PvNACs in the subgroup XV were composed of the least conserved NAC domain that had no subdomain C at all. And it is interesting to note that more than half of PvNACs in subgroup XVI possessed the unique motif 10, and these PvNACs were homologous to ANA010 and ANA073 involved in secondary cell wall thickening in lignified cells³³ (see Supplementary Fig. S6), indicating that the motif 10 could be an important region in defining the function of these NACs in the process of cell wall biogenesis and lignification. Moreover, NACs could also interact with other transcription factors which may be responsible for these differences in the conserved parts of PvNACs (Fig. 8)⁷². The C-terminal of NACs were highly divergent, but short conserved motifs in TARs were also identified that were proposed as core regions for protein interactions and functional specification⁸. In this study, a total of 12 motifs (a-1) were identified in the TARs in 13 out of the 19 PvNAC subgroups (see Supplementary Fig. S8), and these motifs in TARS were conserved in parallel with NAC domain structures in the N-terminus. The exact roles of these conserved motifs in the TARs of NACs were not well understood. If the hypothesis that these motifs function as core regions for protein interactions was valid, then it would be meaningful to further pool out their interacting proteins using these regions as bait by using the Yeast two hybrid system or the other protein interactome technologies.

Methods

Database research and sequence retrieval. The switchgrass protein sequences were downloaded from the Phytozome database (http://phytozome.jgi.doe.gov)⁷³, and the protein data was built by using HMMER (v 2.3.2). Hidden Markov Model (HMM) profile of NAC domain (PF02365) downloaded from Protein family (Pfam; http://pfam.sanger.ac.uk/)⁷⁴ to be exploited for the identification of the *NAC* genes from local switch-grass database (E-value < 0.001) using HMMER (v 2.3.2). All hits were confirmed by Pfam (PF02365)⁷⁴ and NCBI Conserved Domain Search (http://www.ncbi.nlm.nih.gov/Structure/cdd/wrpsb.cgi)⁷⁵. The confirmed NAC proteins were aligned using Clustal X (v 2.0)⁷⁶ to remove the redundant sequences. Two NAC switchgrass proteins with alternative splicing sites were picked out only with the longest translated protein and the duplicated result was removed in phylogenetic tree analysis. The NAC protein sequences of *Arabidopsis* were downloaded from the *Arabidopsis* genome TAIR 9.0 (http://www.Arabidopsis.org/)⁷⁷ and those of rice retrieved from the Rice Genome Annotation Project website (http://rice.plantbiology.msu.edu/, release 5.0)⁷⁸. Prediction of membrane-bound PvNAC proteins was conducted by using the TMHMM server v.2.0 (http://www.cbs.dtu.dk/ services/TMHMM/)⁷⁹.

Phylogenetic analysis. A total of 251 NAC protein sequences from switchgrass were aligned by Clustal X (v 2.0). MEGA 5.0⁸⁰ was used to construct the unrooted neighbor-joining (N-J) phylogenetic tree (bootstrap 1,000 replicates) based on pairwise gap deletion mode, which was used to certify more different C-terminal domains and could be able to contribute to the topology of the NJ tree. To validate the results from N-J phylogenetic tree, a maximum likelihood method was used to construct the phylogenetic tree based on partial deletion mode. Another phylogenetic tree using the N-J method was built using the same methods for the illustration of relationship between NACs of switchgrass, rice and *Arabidopsis*.

Genomic structure and motif analysis. The exon-intron display was constructed according to gene structure display server (GSDS) program⁸¹ according to the available CDS and genomic information of the PvNACs. The conserved motifs among subgroups of PvNACs were identified using the program MEME (Multiple Expectation Maximization for Motif Elicitation; version 4.11.1) (http://meme-suite.org/tools/meme)⁸² with default parameters, and the maximum number of motifs to find was set to 10 for the prediction of A-E sub-domains, and 30 for the prediction of TARs⁸³.

Construction of chromosome location images. The chromosomes of switchgrass were ordered to match syntenic fortail millet (*Setaria italica*) chromosome order (http://phytozome.jgi.doe.gov). The chromosome location of PvNACs was generated from MapInspect software according to the available information from the Phytozome database (http://phytozome.jgi.doe.gov). Tandem gene duplication in switchgrass was defined as two paralogs separated by no more than five genes in a range of 100 kb distance on the same chromosome according to the same criteria described in rice (TIGR), and segmental duplications were those placed on replicated chromosomal blocks from the same genome lineage⁸⁴. Moreover, duplications in two sets of homeologous chromosomes can be explained by interspecific genome duplication (allotetraploidy). The selected pairs of homologous genes were used to calculate the ratio between nonsynonymous and synonymous nucleotide substitutions (Ka/Ks) using DNAsp5 software (http://www.ub.edu/dnasp/)⁸⁵.

Gene expression analysis for transcripts levels in switchgrass tissues and developmental stages. The Unitranscript IDs of the *PvNACs* were identified in the PviUTs database (http://switchgrassgenomics.noble.org/)³¹. The integrated expression database were obtained by searching against the Switchgrass Gene Expression Atlas (PviGEAs) (http://switchgrassgenomics.noble.org/)³¹. The results were graphically presented in a heatmap format with log fold change after value normalization via the R Project software (http://miyoviqo.tha.im/)⁸⁶. The previously reported cell wall-related NAC genes were used to find homologs among the PvNACs using BLAST.

Switchgrass affymetrix microarray data analysis under heat stress. For the heat-responsive transcription analysis of the *PvNACs*, data from the ArrayExpress repository under the accession number E-MTAB-1897³⁰ were retrieved. A total of 199 *PvNACs* retrieved from the array data were presented in a heatmap with \log_2 fold change after value normalization by the R Project software (http://miyoviqo.tha.im/)⁸⁶.

Prediction of PvNACs protein-protein interaction network. We constructed an interaction network of PvNAC proteins to explore genome-wide regulation network by using STRING 10 (http://string.embl.de/)⁸⁷ with a default value >0.400, which identified 15 high confidence interactive proteins in rice. The homologs of these interactive proteins in switchgrass were then identified by BLAST analysis.

Plant material, growth condition and stress treatments. Switchgrass cv. Alamo seeds were sown in pots (0.2 meter diameter × 0.3 m tall) containing 1,000 g soil (pH 5.56, 1.35% organic qualitative content, 100.33 mg/kg N, 4.93 mg/kg P, and 332.25 mg/kg K). The plants were grown in a growth chamber (Wenjiang, Sichuan, China) at 28°/20 °C (day/night) with a photoperiod of 16 h/8 h (day/night). Switchgrass seedlings were thinned to four plants *per* pot after germination. Fifty days after sowing, the potted of switchgrass seedlings were exposed to various stresses including drought, ABA, salt, and cold conditions as follows. For drought treatment, the potted seedlings were maintained without watering for 28 days, and the soil water content of drought-stressed plants was measured to be 10% at the end of drought treatment. And the leaf samples were harvested after 0, 14, 28 days of drought treatment. For ABA treatment, the seedlings were sprayed with 100 mmol ABA for 16 days, and leaves were sampled after 0, 8, 16 days of treatment. For salinity treatment, the seedlings were watered with 250 mmol/l NaCl for 28 days, and leaves were sampled after 0, 14, 28 days of treatment. For cold treatment, the

seedlings were subjected to cold stress for 6 °C for 28 days, and leaves were collected after 0, 14, 28 days of treatment. For heat treatment, the plants were exposed to high temperature for 38 °C/30 °C for 28 days and leaves were collected at 0, 14, 28 days. For the tissue/organ-level gene expression profiling, roots, stems, leaves, florets, spikelets, and seeds were collected from field-grown switchgrass, separately. All materials harvested from each treatment were immediately frozen in liquid nitrogen and stored at -80 °C before for RNA isolation. All experiments were conducted three times with three biological replicates for qRT-PCR analysis.

RNA Isolation, cDNA Synthesis, and Real-time qRT-PCR. Total RNA was extracted using the Total RNA kit II (Qiagen, USA). RNA concentration measurement, DNaseI treatment and cDNA synthesis were conducted as previously described⁸⁸.

Seventeen gene-specific primer pairs (for 12 genes expression analysis under abiotic stresses, and for 6 genes' in different tissues) were designed by using Primer 5 software⁸⁹ (Supplementary Table S5). We also confirmed the primer specificity by blasting each primer sequence to the switchgrass genome (https://phytozome.jgi.doe.gov/ pz/portal.html#linfo?alias=Org_Pvirgatum_er; Panicum virgatum v1.1). The subsequent analysis of visualization for amplicon fragments and melting curves were performed to confirm whether the 17 primer pairs exhibited an electrophoresis pattern of a single amplicon with accurate length and the corresponding melting curves formed a single sharp peak. In addition, the Ubiquitin-conjugating enzyme 2 (UCE2) gene was selected as reference gene for the expression of switchgrass genes (Supplementary Table S5), and qRT-PCR reactions and data analysis were conducted according to a previous study⁸⁸. The cut-off value of 2-fold for stress-specific expression were adopted in this study. The expression levels were designed as 'up-regulate', and 'down-regulate' only if the difference conformed to the criteria.

Conclusion

In conclusion, this study has provided a comprehensive identification and characterization of the switchgrass NAC family. We have identified a total number of 251 NAC proteins in switchgrass genome to be divided into two large groups and 19 subgroups with conserved gene structure. According to the constructed phylogenetic tree with switchgrass, rice, and Arabidopsis, a total number of 27 PvNACs were considered to be related to abiotic stresses, and four NAC MTFs were predicted to be orthologous to stress-related MTFs of Arabidopsis. In addition, a number of 40 NAC genes with tissue-specific expression were found with the help of array data of switchgrass. A number of 163 PvNACs were unevenly distributed on 18 chromosomes, and evolution analysis performed that high proportion of PvNAC gene pairs (37/52) were under diversifying selection. The motif analysis showed that all NAC proteins have relatively conserved NAC domains in the N-terminus with five motifs (A-E), while the C-terminal of NACs were highly divergent, but short conserved motifs in TARs were considered as core regions for protein interactions and functional specification. An interaction network of PvNAC proteins was built to predict 15 PvNACs involved in this network, among which seven proteins were potential functional proteins. Next, we designed 17 gene-specific primers for qRT-PCR to confirm 12 PvNACs to be related to various stresses and six PvNACs expressed specifically for different tissues. Even though additional experiments for their under- or overexpression would be helpful for precisely determining the function of these genes, the current results provided useful insights on switchgrass NACs for further genetic engineering studies.

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Acknowledgements

The authors gratefully acknowledge the financial support from the Modern Agro-industry Technology Research System (CARS-35–05), the Sichuan International Cooperation Projects (2017HH0071) and the Sichuan Province Breeding Research grant (2016NYZ0039). We also thank Mr. Jeremy Schmutz at DOE Joint Genome Institute for providing the public-available switchgrass dataset and Samuel Nobel Foundation for the public PviGEA and PviUT transcriptome datasets.

Author Contributions

H.Y. and L.H. designed research studies; H.Y., Y.Y., L.H., J.C., and X.H. conducted experiments, acquired data, and analyzed data; H.Y. and A.Z. wrote the manuscript; H.Y., B.X., L.H. X.Z., C.W., S.Z., Y.P., X.M., and Y.Y. revised the manuscript.

Additional Information

Supplementary information accompanies this paper at doi:10.1038/s41598-017-03435-z

Competing Interests: The authors declare that they have no competing interests.

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