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3 **Running Title**

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10 **Target Gene Identification and sgRNA Design for Waterlogging Tolerance in**
11 **Foxtail Millet via CRISPR-based Transcriptional Activation**

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25

26 **Abstract**

27

28 **Background:**

29 CRISPR activation (CRISPRa) uses non-functional Cas9 endonuclease (dCas9) but retains the genome
30 targeting ability through its single guide RNAs (sgRNAs). CRISPRa is widely utilised as a gene
31 activation system exploiting its ability in recruiting various transcriptional activation domains (TADs)
32 for enhancing expression of the target gene(s). Drought tolerant and resource efficient crops like
33 millets have potential for mitigating effects of climate change and for enhancing food security.

34

35 **Objective:**

36 This study aimed to use the *Setaria italica* (foxtail millet) genome sequence in the identification of a
37 target gene and the subsequent generation of sgRNAs for use in CRISPRa for conferring water logging
38 tolerance that will benefit future expansion of its cultivation area.

39

40 **Methods and Results:**

41 Leveraging on existing RNA-seq data and information on functional studies in model plants and from
42 other cereal species, maize and barley, have enabled identification of candidate *ERFVII* from the
43 foxtail millet genome sequence in the attempt to engineer waterlogging tolerance. The study provides
44 a step-by-step example for using publicly accessible databases and bioinformatics tools from NCBI
45 and Phytozome for the identification and characterization of the ortholog from *Setaria italica*.
46 Softberry was used for promoter annotation to obtain the transcription start site (TSS). Subsequently,
47 CRISP-P 2.0 design tools were employed to generate and select a few efficient sgRNAs for CRISPRa
48 that minimize potentially deleterious off-target binding.

49

50 **Conclusion:**

51 The study is a useful example on how to advance in genomics research including the revolutionizing
52 CRISPR technology in *Setaria italica*, which can be adopted in other plant species, through utilization
53 of the available genome sequence.

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55 **Keywords:** CRISPR/dCas9, CRISPRa, sgRNA, *Setaria italica*, water logging tolerance, ERFVII

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60 **1. Introduction**

61 The applications of clustered regularly interspaced short palindromic repeat (CRISPR) in
62 genomic research have expanded in recent years and developing this technology would enhance the
63 research capability of many existing laboratories. Nuclease-deficient Cas9 (dCas9) is an inactive
64 mutant of Cas9 deficient in endonuclease activity. The CRISPR/dCas9 system has potential to be
65 applied for 1) genome-wide screening for understanding the gene regulatory network affected by the
66 activation of a selected gene; 2) testing the phenotypic effect as the result of changing the expression
67 of a targeted gene; and 3) precise temporal and spatial regulation of a gene (1). Similar to application
68 with CRISPR/Cas9, in CRISPR/dCas9, the synthetic sgRNA is designed to contain two major regions
69 of importance for the CRISPR system, which is the CRISPR RNA (crRNA) spacer and scaffold
70 (tracrRNA) regions. The nucleotides in the spacer region are complimentary to the sequence of the
71 target gene located adjacent to a protospacer adjacent motif (PAM). Any genes and genomic DNA
72 with a sequence complimentary to the spacer region can become possible targets, providing great
73 flexibility to the CRISPR system (2). The scaffold region has the critical role in forming a complex
74 with dCas9 recruited to the targeted genomic site.

75

76 In order to modulate the gene expression at the level of transcription via CRISPR activation
77 (CRISPRa) and CRISPR interference (CRISPRi), the dCas9 fused to the transcriptional effectors is
78 directed to the promoter of a target gene. Transcriptional effectors which include transcriptional
79 activators or repressors are protein domains that assist in the recruitment of RNA polymerase and key
80 cofactors for manipulating the transcription of the target gene(s) (3). However, for regulation via dCas9,
81 the target window is not quite as broad as for gene knockout via Cas9 cutting. For CRISPRa, it is most
82 efficacious to target -200 bp to +1 (TSS) in the upstream region, inclusive of the transcription start site
83 (TSS) while for CRISPRi, it is optimal to target +50 bp ~ +100 bp downstream of the TSS (4). Thus,
84 about a dozen sgRNAs are generated for a given gene targeting the optimal location. It is important to
85 determine the exact location of the TSS. Different databases annotate the TSS in different ways.
86 PlantProm DB (ppdb) (<http://ppdb.agr.gifu-u.ac.jp/ppdb/cgi-bin/index.cgi>) is a plant promoter
87 database that provides promoter annotation of the model plants, *Arabidopsis* and rice. It was also
88 recently shown that the TSSP database, in www.softberry.com which relies on ppdb can help in
89 bioinformatic analysis and in locating the TSS of genes from other plant species (5).

90

91 Foftail (*Setaria italica*) is the most important millet species of Eastern Asia and the second-
92 most widely grown species worldwide after pearl millet. It possesses several desirable features for
93 cultivation as a cash crop such as fast ripening, high photosynthetic efficiency and resistant to pests
94 and diseases. Furthermore, it is nutritious (6) with notable medicinal benefits including for controlling
95 diabetes (7) and hyperlipidemia (8). It is highly attractive as a model plant for scientists due to the
96 possession of several distinct characteristics which include short stature and life cycle, good production
97 of seeds, self-compatibility, a true diploid nature ($2n = 18$), small genome size and its C4 features
98 which can serve as a model for other C4 crops (9). A high-quality genome sequence of foftail millet
99 was completed in 2012. More recently, resequencing of 184 foftail millet recombinant inbred lines
100 and construction of the high-resolution map was carried out to aid essential research on foftail millet
101 improvement (10).

102
103 Waterlogging is used to describe the persistent flooding of the plant root system. Many parts
104 of South East Asia including Malaysia experience such situations due to the heavy rainfall at certain
105 periods of the year. One of the effects of climate fluctuation is increases duration of high precipitation
106 which can worsen water logging occurrences (11). Even though millets perform well under drought,
107 the ability to withstand water logging conditions is considered an important trait to have for
108 domestication in the South East Asian countries including Malaysia. Seeds of four different millet
109 species, *Panicum miliaceum* (proso millet), *Panicum sumatrense* (little millet), *Setaria glauca* (yellow
110 foftail millet), and *Setaria italica* (foftail millet) were tested for waterlogging tolerance and the effect
111 of pre- and post-heading waterlogging on growth and grain yield. *P. sumatrense* exhibited
112 waterlogging tolerance through enhancement of root growth and the presence of a high proportion of
113 lysigenous aerenchyma in the crown root (12). Prolonged effects of water logging leads to severe
114 hypoxia due to poor oxygen availability in cells which adversely impacts plant physiological processes
115 and metabolism (13). Aerenchyma possesses enlarged gas spaces through the programme death of
116 cells in the root that facilitates the diffusion of gases, notably, oxygen from shoots to roots, and CO₂
117 and ethylene from roots to shoots (14).

118
119 Plants respond to waterlogging through transcriptional reprogramming that leads to
120 modification of protein and metabolite composition in the root system to overcome hypoxia (15, 16).
121 Previously, flooding tolerance was extensively investigated at the molecular level in tolerant species,
122 such as *Oryza sativa* L. In rice, several proteins involved in tolerance to hypoxia or avoidance of
123 hypoxia belong to the ethylene response factor (ERF) VII family of transcription factors (17). ERFVII
124 is well recognized for having activity directly linked to oxygen availability. Analysis of the RNA-seq

125 data of water logging response in the roots of a tolerant maize inbred line, HKI1105, showed that
126 ethylene plays a fundamental role in tolerance mechanisms. Furthermore, some members of ERFVII
127 transcription factor in maize were up-regulated in roots, an observation similar to that reported in
128 Arabidopsis under hypoxia (18). Water logging stress resulted in induced expression of barley
129 *HvERF2.11* possessing the CMVII-1 motif characteristic of ERFVII in the waterlogging tolerance
130 lineage and introduction of this gene into Arabidopsis significantly enhanced waterlogging tolerance
131 (19).

132 Millet, like maize and barley is highly sensitive to water logging. In order to produce
133 waterlogging tolerant millet through CRISPRa, it is critical to look for a target gene whose
134 transcriptional activation will enhance water logging response mechanisms that protect the plant. This
135 project aims to perform bioinformatics analysis for designing sgRNA sequence targeting the promoter
136 of the most highly homologous gene to the maize *ERFVII* in foxtail millet for future research to
137 enhance its transcriptional activity through the application of CRISPR/dCas9 technology for increasing
138 tolerance to waterlogging.

139

140 **Materials and methods**

141 **1.1 Identification of potential CRISPR targets**

142 Information about the nucleotide and amino acid sequences of the maize gene
143 (GRMZM2G018398) encoding an ERFVII that was highly up-regulated under waterlogging was
144 obtained from the RNA-seq data in NCBI. The steps involved in identifying the foxtail millet
145 ortholog and the design of sgRNAs targeting it using CRISPR-P 2.0 program through to the
146 production of PCR primers to generate DNA template for *in vitro* transcription are given in Figure
147 1 and the details of all the steps are provided below.

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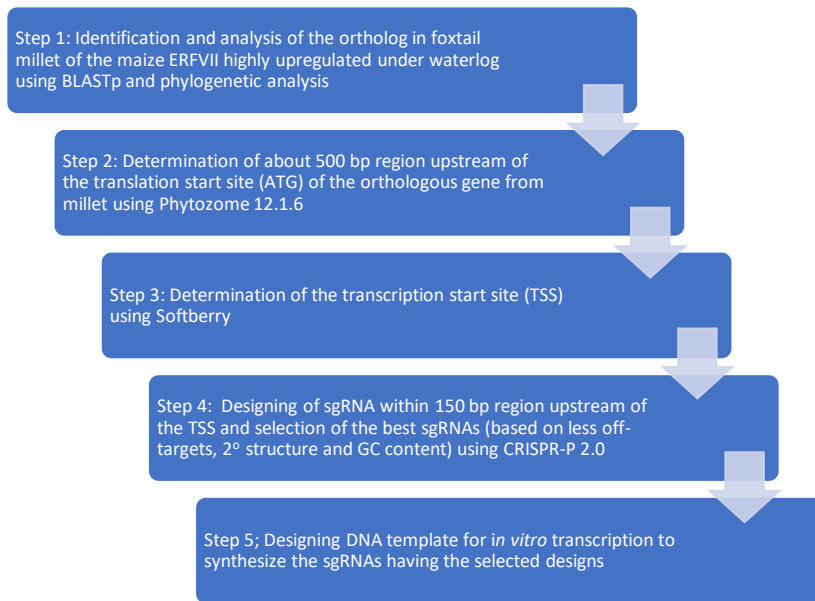


Figure 1. Steps involved in sgRNA design targeting foxtail millet gene orthologous to maize *ERFVII*

BLASTp (<https://blast.ncbi.nlm.nih.gov/Blast.cgi?PAGE=ProteinsBLASTp>) using the encoded amino acid sequence was used to search for the gene ortholog from foxtail millet. The most strongly homologous gene (here after referred to as *SiERF1.1*) was identified. Comparison of the protein functional domains between the maize *ERFVII* and the foxtail millet *SiERF1.1* was performed to determine the presence of the expected ERFVII signature domains. The identified *SiERF1.1* (XP_012698581.1) sequence was blasted in NCBI (<https://blast.ncbi.nlm.nih.gov/Blast.cgi>) using non-redundant protein sequence database within *Setaria italica* (taxid:4555) organism by blastp (protein-protein BLAST). All ERF that produced significant alignments were selected and downloaded in FASTA (complete sequence) format. ERF1 genes possessing the amino acid sequences of the highly conserved 6-bp MCGGAI/L (signature for ERFVII) and the 60-70 bp AP2 domains were selected. The obtained sequences were aligned by MEGA X (20) using Clustal alignment and then the phylogenetic tree of the ERF genes was constructed and estimated using the neighbor-joining method (with 1000 replicates) based on deduced amino acid sequences. The reliability of a phylogenetic tree was also estimated by the bootstrap method.

174

175 The promoter sequence of the *SiEREF1.1* was retrieved in the *Setaria italica* v2.2 genome.
176 BLAST using the nucleotide sequence of *SiEREF1.1* obtained from NCBI as input was used to search
177 the reference *Setaria italica* genome (*Setaria italica* v2.2 genome) in Phytozome 12.1.6
178 (<https://phytozome.jgi.doe.gov/pz/portal.html#>) for the nucleotide sequence 500 bp upstream of the
179 start codon (ATG) was performed. The transcript sequence and sequence information found upstream
180 was obtained by specifying the size of sequence information that is required for walking 5' from the
181 5'-UTR. For obtaining the expected locations of the TSS and TATA box, the 500bp upstream sequence
182 information including the ATG was then used as an input in the promoter prediction program for plant
183 genes (TSSP) in Softberry (www.softberry.com).
184

184

185 1.2 Design of optimized single guide RNAs

186 The CRISPR-P program version 2.0 (<http://crispr.hzau.edu.cn/CRISPR2/>) was employed to
187 design sgRNAs with *Setaria italica* v2.2 as the target genome. After selecting the target genome in
188 CRISPR-P 2.0, a gene locus, chromosome position or sequence of the targeted DNA region for search
189 could also be selected. In our design, the promoter region of *SiERF1.1* 150 bp upstream of the TSS
190 including the TATA box was targeted for gene activation using dCas9-activators, and used as the input
191 sequence in CRISPR-P 2.0.
192

192

193 The target sequence of *SiERF1.1* promoter was mapped to its genome, and all possible sgRNAs
194 were screened and shown in a graphical genome model. On-target scores to assess the on-target
195 efficiency of sgRNAs were also obtained from CRISPR-P 2.0. Potential sgRNAs were then identified,
196 their efficiencies were calculated and the predicted results were listed and scored. The sgRNAs DNA
197 template sequences were designed after identifying the target sequence in the promoter region of
198 *SiERF1.1* upstream of the TSS. The template sequence was composed of the T7 promoter sequence,
199 the sequence of the target-specific sgRNAs, and the fixed sequence of the tracrRNA. In Figure 2, the
200 T7 Promoter sequence is shown in blue. Transcription begins at and includes the bold G from the T7
201 promoter sequence. The non-variable tracrRNA of 80 nucleotides in length is shown in green (Figure
202 2).
203

203

5'TAATACGACTCACTATAGNNNNNNNNNNNNNNNNNNNNGTTTTAGAGCTAGAAATAGCAAGTTAAATAAGGCTAGTCCG
TTATCAACTTGAAAAAGTGGCACCGAGTCGGTGCTTTT-3'

Figure 2. The sgRNA DNA template sequence.

204 1.3 Design of forward and reverse oligonucleotides for PCR assembly

205 After identifying the final target sequences, the forward and reverse oligonucleotides were designed to
206 be PCR assembled with the Tracr Fragment + T7 Primer Mix to generate the sgRNAs DNA template.
207 The Tracr Fragment + T7 Primer Mix contains the universal forward and reverse amplification primers
208 and the 80-nt tracrRNA region. Two 34- to 38-bp oligonucleotides were required to assemble the
209 synthetic sgRNA template: a Target F1 forward primer harboring the T7 promoter sequence and a
210 Target R1 reverse primer that harbours the 5' end of the tracrRNA constant sequence as shown in
211 Figure 3A which will be used for assembly of sgRNA DNA template as shown in Figure 3B.
212 Shortening of the oligonucleotide lengths (≤ 40 bases) is favoured for the target primers to prevent
213 synthesis mistakes, which occur at higher probability with long oligonucleotides. Forward and reverse
214 target primer sequences that are 34-nt long are produced by the GeneArt™ CRISPR Search and Design
215 tool by default.

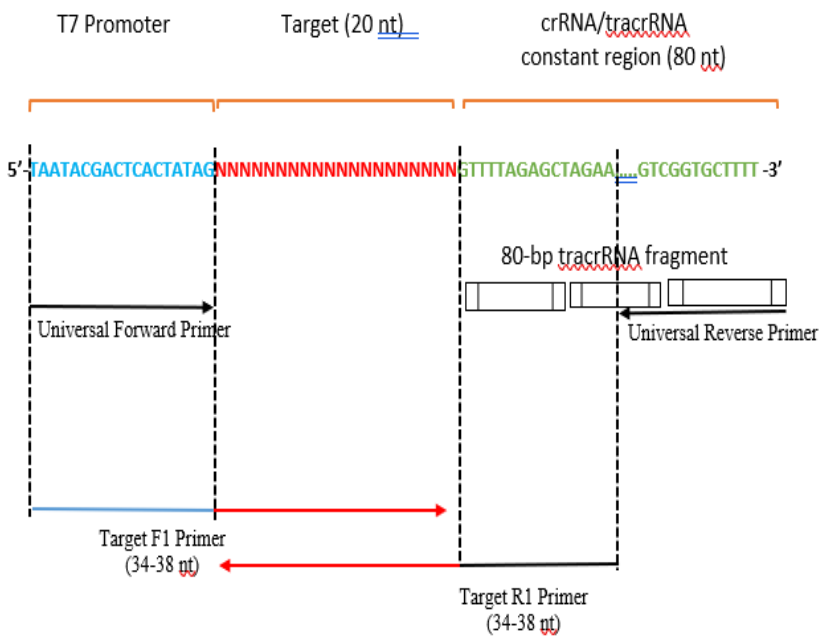
216

217

A.

Target F1: TAATACGACTCACTATAG+first 16–20 nt of the target sequence.
Target R1: TTCTAGCTCTAAAAC+first 19–20 nt of the target sequence reverse complement

B.



218

Figure 3. PCR assembly of sgRNA DNA template. A) Sequences of the Target F1 forward and Target R1 reverse oligonucleotides required for synthetic sgRNA template assembly. B) Schematic diagram demonstrating the amplified region using the Target F1 forward and Target R1 reverse oligonucleotides to produce the DNA template for *in vitro* transcription to produce the sgRNA.

219 2.

220 **Results and discussion**

221 **2.1 Identification of a target gene in foxtail millet and sgRNA design**

222

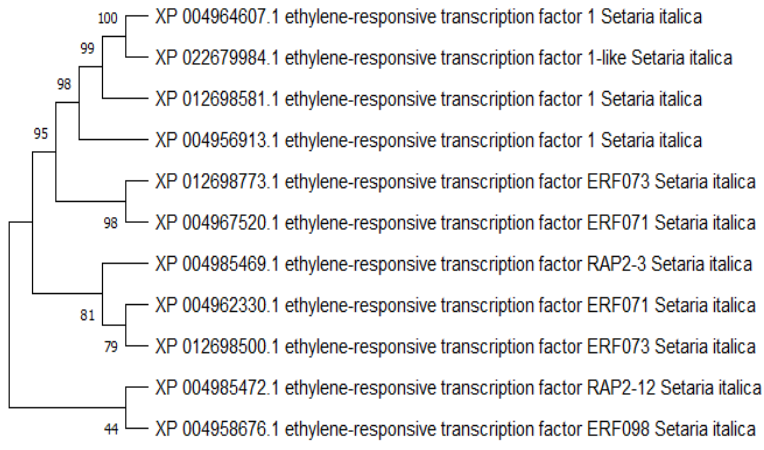
223 BLASTp search showed that the foxtail millet ERF1 (XP_012698581.1) here referred to *SiERF1.1* has
224 the highest homology to one of the most highly upregulated *ERFVII* under hypoxia in maize (21) hence
225 this millet gene was chosen as the target gene for the CRISPR/dCas9 transcriptional activation in our
226 study. Comparing the protein structures of the maize *ERFVII*, barley *HvERF2.11* and foxtail millet
227 *SiERF1.1* showed the presence of a conserved N terminal sequence motif MCGGAIL and the AP2
228 domain of 60 to 70 amino acids. The presence of one AP2 domain is a common feature that
229 characterised all ERF transcription factor from the AP2 superfamily (22). The N-terminal MCGGAIL
230 designated as the CMVII-1 motif is the signature motif for ERFVII (23) hence the *SiERF1.1* may be
231 categorised as an ERFVII. Our BLASTp search using the MCGGAIL domain motif discovered at
232 least ten other *ERFVII* in foxtail millet besides *SiERF1.1*. The multiple sequence alignment and
233 phylogenetic analysis of the different foxtail millet ERFVII are shown in Figure 4. The phylogenetic
234 tree shows that the foxtail millet ERFVII can be separated into three separate groups based on their
235 protein sequences. XP_004956913.1, which we refer to as *SiERF1.2*, has the highest amino acid
236 sequence homology with barley *HvERF2.11* (19) and is the most closely related member to the foxtail
237 millet *SiERF1.1* used as our target gene and they both belong to the same group in the phylogenetic
238 tree, thus increasing the confidence in choosing *SiERF1.1* as the target gene for CRISPRa. The effects
239 of targeting both *SiERF1.1* and *SiERF1.2* through CRISPRa may also be explored in the future through
240 a multiplexing approach (1).

241

242

D D - A M C G G A I L A N L T K Q P G P
 cgc cgg ctc acg gag cgg gac ctc tgg cag gag aag aag aag ccc aag agg ggc ggc ggc
 R R L T E R R D L W Q E K K K P K R G G G G
 ggc ggg agc cgc tgg ttc ctg ggc gag gag gat gag gac ttc gag gcc gac ttc gag gac
 G G S R W F L A E E D E D F E A D F E D
 ttc cag gcc gaa tcc gag gag tcc gat ttg gag ctc ggg gag ggg aag gac gac gac gtt
 F Q G E S T E E S D L E L G E G K D D D V
 gtc gat ctc aag ccc ttc gcc acc tcc aaa gat gcc tta agc acc atg act act gct
 V E I K P F A A T S K D G L S T M T T A
 ggt tat gat gcc cct gca agc tca gcc aaa agg aag aga aag aat caa tac agg ggc
 G Y D G P A A R S A K R K R K N Q Y R G
 atc cgc cag cgc cct tgg ggt aag tgg gct gct gag atc aga gat cct cag aag ggt gtt
 I R Q R P W G K W A A E I R D P Q K G V
 cgt gtc tgg ctt ggt act ttc aat agt cct gag gaa gct gca aga gcc tat gat gct gaa
 R V W L G T C F N S P E E A R A Y D A E
 gca cgc agy atc cgt gcc aag aag gcc aag gtt aac ttt cct gat gca cag aca gtt gct
 A R R I R G K K A K V N F P D A P T V A
 cag aag cgc cga tct gcc cca cct gct gct aaa gca ccc aag tca agt gtg gaa cag aag
 Q K R R S G P P A A K A P K S S V E Q K
 cct gct gtc aaa cca gat agc ctt gcc aac aca aat aca tac ttc tac cca cct
 P A V K P A A V N S L A N T N T Y F Y P
 gct gac tac acc ttg agc aag cca ttt gtt cag cat gag aat atg cca ttc cct cca gca
 A D Y T L S K P E U Q H E N M P F P A
 atg aac tct gct agt cct att gag gac cct att atg aat ctg cac tct gac cag gga agt
 M N S A S P I E D P I M N L H S D Q G S
 aac tcc ttt gcc tgc tca gac ttg agc tgg gaa aat gat acc aag act tca gac ata tca
 N S F G C S D L S W E N D T K T S D I S
 cct att gct ccc act agc atc atc gct gaa ggt gat gag tgt gca ttc gtc aac agc aat
 S I A P I N T I A E G D E C A F V N S N
 tca aac aac cca ctg gct cct tct atg gag acc aat cct gtt gat ctc act gag ggg
 S N N S L V P S V M E T N P V D L T E G
 ctg aca gat tta gaa ccc tac agy ttt ctt ctg gat gat ggt gcg agt gaa tca att
 L T D L E P Y M R F L L D G A S E S I
 gat agc cct ctg aat ggt ggt tct cag gat gtt gty agc aac atg gat ctc tgg agi
 D S L L N V D G S Q D V V S N M D L W S
 ttt gat gac atg ccc atg gtt gcc gat atc tat tga gga att cga agc cct gta ata gga
 F D D M P M V G D I Y - C I R S P V I G

A



B





C

Figure 4. Sequence alignment and phylogenetic analysis of foxtail millet *ERF1.1* (XP_012698581.1) with other ERF members from foxtail millet having the MCGGAI/L signature motif identified through BLASTp in NCBI. **A)** Nucleotide and predicted amino acid sequence of *SiERF1.1*. **B)** The sequences of *Setaria italica* ERF with accession numbers XP 004956913.1, XP 004958676.1, XP 004962330.1, XP 004964607.1, XP 004967520.1, XP 004985469.1, XP 004985472.1, XP 012698500.1, XP 012698581.1, XP 012698773.1, XP 0126279984.1 used for constructing the phylogenetic tree using the neighbourhood joining method. The numbers on the nodes indicate bootstrap values from 1000 replicates. **C)** Multiple sequence alignment of *SiERF1.1* and other ERF family members having the N-terminal MCGGAI/L. The same sequences were used in developing the phylogenetic tree.

In the CRISPRa mechanism for transcriptional activation, the transcriptional activation domain (TAD) recruited by the dCas9 needs to be positioned in the promoter region within 200 bp upstream of TSS (4). In order to identify the region upstream of the promoter, it was essential to determine the position of the TSS. Figure 5 shows the nucleotide 500 bp upstream of the ATG of the *SiERF1.1* with the A at position 389 as the TSS and the TATA box at 352 as determined by Softberry. This also indicates that the *SiERF1.1* belongs to the TATA-containing genes. TATA-box is an important core promoter element involved in transcription initiation of eukaryotic genes (24).

>Seita.1G342700 | scaffold_1:39868092..39871080 reverse

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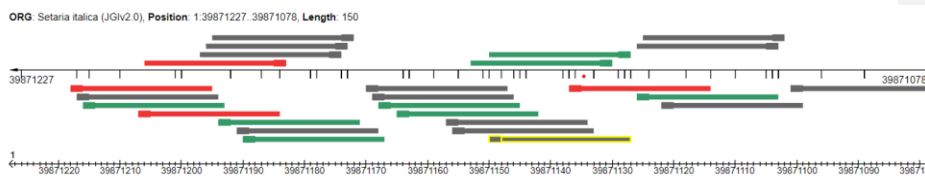
TTGAAGATACAATTTGAAAAGCAAATAATTGTTAAAGTGAGGATGGCGCGCTG
AGTGAGTTTTTCAGCGTGTGATGATCTTTGTAGGAGAATGAAACATGCCCTCTAAACC
TCGGAATCTTGCACTTCTGCCTTACTGTTTGAGGGATATGTTTCATCAAATTATATATT
CACAAAGGGGCGACATGTGCAAATTTGGCCTCTACAGCCTACTAGCACCATCTACTA
CACCTTCTCCGTTTCTCTTACTACCCGTCGTTCCGCTTCACGTTTCCGCCCCGTTCCG
CTGACGTGGGGACCCACCCAGCGCTCCCGAGCCTGCACACTGCTCCGAGCGGCGGC
CAGCCAATA TATATATATATAGGGCCACCCAGTCCGTGCTCTCCA ACATTTCGCC
AGGTAAACTCGTTTACCATTTTCGCTCTCGCGACTCGCGATTTTTTTTCTACTGTGCT
CGTTCCGGCGCGGGCGGGAGCTCCCGACGACTGAGCC ATG

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Figure 5. Genomic sequence of *SiERF1.1* 500 bp upstream of the start codon. Red boxes show the start codon (ATG), the transcription start site (TSS) and the TATA box of the promoter region that was used to design the sgRNAs. Softberry (www.softberry.com) was used in determining the positions of the TSS and TATA box.

282 Since sgRNA-dCas9 complex could still bind target DNA that is not a perfect match, the off-
 283 target effect of CRISPR/dCas9 system is a great concern among researchers. The on-target efficiency
 284 scores only supported those sgRNAs containing 5'-NGG-3' PAM in *Streptococcus pyogenes*, thus the
 285 binding specificity/capability depends on the PAM-proximal sequence (25). Targeting the promoter
 286 region in CRISPRa through CRISPR/dCas9 may produce fewer occurrences of off-targets binding
 287 compared to targeting the coding region which may be affected by homologous regions found in gene
 288 family members (26). Nevertheless, it is still very important to use a platform for designing the sgRNA
 289 which is equipped with the ability to evaluate the characteristics of the sgRNA especially the binding
 290 position in the genome as well as its GC content and secondary structure, criteria that influence the
 291 functional properties of the sgRNA. CRISPR-P 2.0 (<http://crispr.hzau.edu.cn/CRISPR2/>) is suitable
 292 for designing highly efficient sgRNA with minimal off-target effects. CRISPR-P 2.0 uses a scoring
 293 system for rating the off-targeting potential and on-targeting efficiency of sgRNAs for *Streptococcus*
 294 *pyogenes* Cas9, the most commonly used CRISPR-Cas9 system (27). The scoring system is based on
 295 the latest knowledge about *Streptococcus pyogenes* Cas9 genome editing. Detailed information of the
 296 guide sequence is generated, consisting of: GC content, restriction endonuclease site, microhomology
 297 sequence flanking the targeting site (microhomology score), and the secondary structure of sgRNA.
 298 Figure 6 provides a graphic genome model of mapping *SiERF1.1* target sequence (150 sequence
 299 upstream of the *ERF1.1* promoter inclusive of the TSS) to the *Setaria italica* v2.2 genome through
 300 CRISPR-P 2.0 design tool.

Commented [SM1]: Does it directly use the genome sequence and look for matches throughout?



306
307
308 **A**

	Sequence	Region	%GC
guide1	TATATTGGCTGGCCGCCGCTCGG	Intergenic	60
guide2	GCTTCACGTTTCCGCCGTTTCGG	Intergenic	60

guide3	GAACGGGCGGAAACGTGAACGG	Intergenic	60
guide4	AACGTGAAGCGGAAGCGACGGGG	Intergenic	60
guide6	GGGTCCCCACGTCAGCCGAACGG	Intergenic	70
guide7	CCCCACGTCAGCCGAACGGGCGG	Intergenic	75

B

Figure 6 Mapping of *SiERF1.1* target sequence to the *Setaria italica* v2.2 genome through CRISPR-P 2.0 design tool using 150 sequence upstream of the *SiERF1.1* promoter inclusive of the TSS as an input. **A)** Distribution of sgRNA targets in *Setaria italica* genome. The presumably best target sequences in red (score > 0.50) and the intermediates in green (0.20 < score < 0.50). **B)** DNA target sequences for six selected sgRNA, their region in the genome and %GC.

2.2 Advanced selection of sgRNAs

The CRISPR-P 2.0 design tool employs a scoring module to evaluate the sgRNAs based on sequence features of sgRNAs, which leads to improvement of on-target efficiency and the construct a predictive model to design critically active sgRNAs (27, 28). The choice of the targeting site is the most critical step in CRISPR/dCas9 technology. Genome-wide specificity analysis included in CRISPR-P 2.0 helps overcome or reduce off-target effects (30). In this study, about 26 sgRNAs were generated when mapped to the genome of foxtail millet targeting *SiERF1.1* promoter region. The results showed that off-target potential among these 26 sgRNAs varies from 0.051 to 0.9. In general, optimum sgRNA should have high on-target scores and less off-target score sites (31). It is important to optimise the on-target location (intergenic for *SiERF1.1*) of the sgRNA through analysing on-target and off-target scores. Six sgRNAs with higher on-target of above 0.4 were selected. All six sgRNA have higher score for on-target compared to off-target. GC content (%) of sgRNAs is also important for the efficiency of CRISPR/dCas9 systems (30). Our results showed that GC content among the six selected gRNAs was high ranging between 50% to 70% and is within the expected range of 30% to 80% for plant sgRNAs (28) as those sgRNAs having exceptionally high or low GC content may be less active (27). Table 1 shows the results for the on-targets, the microhomology score and features of the secondary structure that aid in choosing efficient sgRNAs.

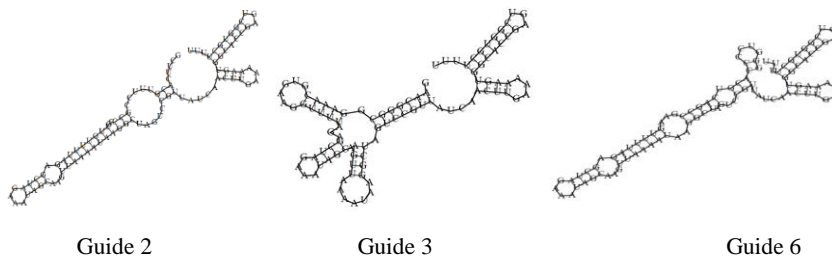
Table 1. Results of sgRNAs designed to target *SiERF1.1* promoter region generated by CRISPR- P 2.0.

Guide	On-score	Micro-Score	Secondary structure	Structure features
guide 1	0.6774	77.64	<p>UUAUUGGCGGCGCCGCCU GUUUUGAGAGCUAGAAUAGCAAGUUAAAUAAGGCUAGUCC</p> <p>GUUUAUCAACUUGAAAAGUGGCACCGAGUCGGUGCUUUU</p> <p>.(((.(((((((C...(((((((C...)))))))))...))))))...))</p> <p>))...(((C...))) ((((((C...))))))... (-30..50)</p>	<p>3 TSL; 0</p> <p>GSL; 9</p> <p>CBP; 13</p> <p>TBP; 0 IBP</p>

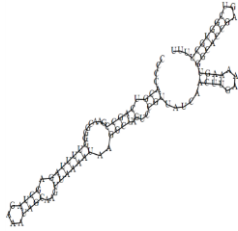
guide 2	0.607 0	67.62	<p>GCUUCACGUUCCGCCCGUGUUUUAGAGCUAGAAAUAGCAAGUUAAAUAAGGCUAGUCC GUUAUCAACUUGAAAAAGUGGCACCGAGUCGGUGCUUUU (((.....(((.....(((.....(((.....)))))))))).....))).....(((.....)))(((.....)))... (-24.70)</p>	3 TSL;0 GSL;3 CBP;8 TBP;0 IBP
guide 3	0.601 1	0.00	<p>GAAACGGCCGAAACGUGAAGGUUUUAGAGCUAGAAAUAGCAAGUUAAAUAAGGCUAGUCC GUUAUCAACUUGAAAAAGUGGCACCGAGUCGGUGCUUUU .(((.....(((.....)))...(((.....)))...(((.....)))...))))).....(((.....)))(((.....)))... (-27.80)</p>	5 TSL;0 GSL;7 CBP;12 TBP;0 IBP
guide 4	0.553 9	0.00	<p>AACGUGAAGCCGAAACGACGGUUUUAGAGCUAGAAAUAGCAAGUUAAAUAAGGCUAGUCC GUUAUCAACUUGAAAAAGUGGCACCGAGUCGGUGCUUUU (((.....(((.....)))...(((.....)))...)))...)))))...))(((.....)))(((.....)))... (-30.40)</p>	3 TSL;0 GSL;12 CBP;12 TBP;0 IBP
guide 6	0.446 9	69.43	<p>GGGUCGCCACGUCAGCCGAGUUUUAGAGCUAGAAAUAGCAAGUUAAAUAAGGCUAGUCC GUUAUCAACUUGAAAAAGUGGCACCGAGUCGGUGCUUUU (((.....))(((.....)))...(((.....)))...)))...))))).....(((.....)))(((.....)))... (-26.20)</p>	4 TSL;1 GSL;5 CBP;10 TBP;2 IBP
guide 7	0.438 5	73.22	<p>CCCCACGUCAGCCGAAACGGCGUUUUAGAGCUAGAAAUAGCAAGUUAAAUAAGGCUAGUCC GUUAUCAACUUGAAAAAGUGGCACCGAGUCGGUGCUUUU (((.....)))...(((.....)))...)))...))))).....(((.....)))(((.....)))... (-23.20)</p>	3 TSL;0 GSL;5 CBP;8 TBP;0 IBP

336 The on-target efficiency scores only support gRNAs with 5'-NGG-3' PAM for utilization with
337 *Streptococcus pyogenes* dCas9. Consequently, PAM sequences were considered in our advanced
338 selection of sgRNAs, which profiles secondary structure. The function of the sgRNA relies on the
339 interaction of its secondary structure with the Cas9 protein *in vivo*. For CRISPR/Cas9 system, the
340 secondary structure of sgRNA can interfere with the editing efficiency as a link between secondary
341 structure and editing efficiency of sgRNAs has been suggested (28, 29). Further selection of
342 sgRNAs was done based on the recommended criteria for selection of efficient sgRNAs as follows:
343 The total base pairs between guide sequence and the other sequence (TBP) should not be higher
344 than 12, consecutive base pairs (CBP) not higher than 7, while internal base pairs in the guide
345 sequence (IBP) should not be greater than 6. Four out of the six guide sgRNA that met the criteria
346 were selected for generation of the secondary structures as shown in Figure 7.

347
348



349
350



Guide 7

Figure 7. Schematic representation of the *SiERF1.1* sgRNAs secondary structures. The secondary structure of sgRNA 2, 3, 6 and 7 to target promoter region of *SiERF1.1*.

The secondary structure of sgRNAs showed that two of the designed sgRNAs, Guide 2 and Guide 7 have intact secondary structures including stem loop RAR, stem-loop one, stem-loop two and stem-loop three. The repeat and anti-repeat region (stem loop RAR) could trigger precursor CRISPR RNA (pre-crRNA) processing by the enzyme RNase III and subsequently activates crRNA-guided DNA cleavage (binding for dCas9). The stem-loop one is essential for the function of dCas9-sgRNA-DNA complex. The stem-loop two and three meanwhile, promote formation of a stable complex. Clearly, all three stem-loop structures are required for successful application of CRISPR (30).

There are other online tools that can be used for sgRNA design besides CRISPR-P 2.0. For example, CRISPR/Cas9 target online predictor (CCTop) (<https://cctop.cos.uni-heidelberg.de:8043/index.html>) determines empirically the off-target scores for each sequence, while the CRISPRater score is used to predict the efficiency of sgRNAs (32, 33). E-CRISP (<http://www.e-crisp.org/E-CRISP/>) is equipped with its own SAE (Specificity, Annotation, Efficacy) score to evaluate the quality of each sgRNA (34). CRISPOR (<http://crispor.tefor.net/>) provides a versatile platform that can rank the gRNAs according to different scores for evaluating potential off-targets in the specified genome, and for predicting on-target activity (35). A large number of CRISPR/Cas-derived RNA-guided endonucleases (RGENs) have been identified or modified to improve the cutting efficiency and the editing range. Some tools enable the design of gRNAs for RGENs. For example, Cas-Designer (<http://www.rgenome.net/cas-designer/>) allows

378 users to choose 20 PAM types from different RGENs (36), while CRISPOR also offers various
379 PAMs from a defined list. An important criterion to be considered by biologists in exploring these
380 web-based tools is user-friendliness as this can expedite the process of designing efficient sgRNA
381 with minimum occurrence of off-targets as demonstrated by CRISPR-P 2.0.
382

383 2.3 sgRNA DNA template design

384 The sgRNAs DNA template sequences were designed after identifying the target sequences in
385 the promoter region of *SiERF1.1* upstream of the TSS. The NNNNs in Figure 8 were replaced with
386 the target sequences in the selected sgRNAs. The target region represented by the Ns can be up to
387 20 bases in length. It was noted that the use of only 18 bases (deleting the first two bases from the
388 5' end) improves the specificity in binding to the target (29).
389

```
5'TAATACGACTCACTATAGNNNNNNNNNNNNNNNNNNNGTTTTAGAGCTAGAAATAGCAAG  
TTAAAATAAGGCTAGTCCGTTATCAACTTGAAAAAGTGGCACCGAGTCGGTGCTTTT-3'
```

390 Guide 2

```
5'TAATACGACTCACTATAGGCTTACGTTTCGCCCCGTTGTTTTAGAGCTAGAAATAGCA  
AGTTAAAATAAGGCTAGTCCGTTATCAACTTGAAAAAGTGGCACCGAGTCGGTGCTTTT-3'
```

Guide 7

```
5'TAATACGACTCACTATAGCCCCACGTCAGCCGAACGGGGTTTTAGAGCTAGAAATAGC  
AAGTTAAAATAAGGCTAGTCCGTTATCAACTTGAAAAAGTGGCACCGAGTCGGTGCTTTT-3'
```

Figure 8. The sgRNAs-DNA template for *SiERF1.11* sequence. The target sequence is in red.

391 Having at least one G at the start of the transcript improves sgRNA yield from the *in vitro* transcription
392 (IVT) reaction. A 5' G was added to the target sequence at the T7 forward primer in the Tracr Fragment
393 + T7 Primer Mix used for the sgRNA template assembly. Target regions with the added 5' Gs longer
394 than 21 bases can have a significant affect the on-target activity (37). As transcription starts
395 immediately after the TATA of the T7 promoter sequence, we may select a target sequence that adds
396 one to two 5' Gs within the 20 base sequence naturally or use the T7 promoter sequence in order to

397 have a single G at the 5' end of the target sequence because it is found to enhance promoter activation
398 by boosting the transcription initiation of sgRNA (38).

399 **3. Conclusion**

400 Mining the foxtail millet genome sequence using RNA-seq data and information from functional
401 studies in model plants performed earlier and in closely related species, maize and barley, respectively
402 has enabled identification of candidate foxtail millet *ERFVII* to explore engineering waterlogging
403 tolerance. This could provide great benefits not only in terms of research advancement but also major
404 saving in time and financial investment of not having to repeat similar gene discovery research in each
405 species. Subsequent use of the CRISP-P 2.0 design tools produced efficient sgRNAs for the foxtail
406 millet *ERVII*, minimizing potentially deleterious off-target binding. The sgRNAs will be valuable in
407 future functional studies through CRISPRa to understand the gene regulatory network involved in
408 conferring waterlogging tolerance in foxtail millet. This will benefit future expansion in the cultivation
409 of this crop which naturally grows in arid regions through to wetter parts of the world.

410

411 **4. Ethics Approval and Consent to Participate**

412 Not applicable.

413

414 **5. Human and Animal Rights**

415 Not applicable.

416

417 **6. Availability of Data and Materials**

418 The data supporting the findings of the article is available in the NCBI Sequence Read Archives
419 under the project PRJNA377604, reference no [21]

420

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423

424

425 **7. Funding**

426

427 The authors acknowledge the financial support from Universiti Putra Malaysia for Prof. Siti
428 Nor Akmar Abdullah's sabbatical leave and this research is part of the outputs of her study
429 during that period.

430
431 **8. Consent for Publication**

432 Not applicable

433
434 **9. Conflict of Interest.**

435 There is no conflict of interest.

436
437 **10. Acknowledgements**

438 The research plan was based on the discussion between SNAA and SM. SNAA carried out the
439 research and wrote the manuscript with the assistance of MM.

440

441

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