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# Genome-wide identification and characterization of long non-coding RNAs responsive to *Dickeya zeae* in rice†

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Plant long non-coding RNA (lncRNA) is a type of newly emerging epigenetic regulator playing a critical role in plant growth, development, and biotic stress responses. However, it is unknown whether lncRNAs are involved in resistance responses between rice and *Dickeya zeae*, a bacterial agent causing rice foot rot disease. In this study, RNA-seq was performed to uncover the co-expression regulating networks mediated by *D. zeae* responsive lncRNAs and their candidate target genes. Of the 4709 lncRNAs identified, 2518 and 2191 were up- and down-regulated in response to *D. zeae* infection, respectively. Expression changes of 17 selected lncRNAs and their predicted targets with a potential role in defense response were investigated by qPCR. The expression levels of five lncRNAs were up-regulated while their cognate candidate target genes were down-regulated upon *D. zeae* infection. In addition, several lncRNAs were predicted to be target mimics of osa-miR396 and osa-miR156. These results suggest that lncRNAs might play a role in response to *D. zeae* infection by regulating the transcript levels of their targets and miRNAs in rice.

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## Introduction

Rice (*Oryza sativa* L.) is one of the most important grain crops globally. Rice production is limited by pathogens such as fungi, bacteria and viruses. Rice foot rot disease caused by the pathogenic bacteria *D. zeae* (formerly known as *Erwinia chrysanthemi* pv. *zeae*), is a destructive bacterial disease threatening rice yield and quality.<sup>1</sup> Several outbreaks and epidemics in China resulting in significant yield losses were observed after the first occurrence of rice foot rot disease in Japan in the 70s of the 20th century.<sup>1,2</sup> Multiple resurgences in contemporary rice fields in China were largely due to adoption of new cultivation methods and different climate conditions in China.<sup>1</sup> Studies on the pathogenic mechanism of *D. zeae* suggest that bacterial toxin zeamine and a two-component regulatory system have played

an important role in its pathogenicity.<sup>3</sup> Cultivating and planting resistant rice varieties against *D. zeae* is one of the most economical and effective methods for controlling this bacterial disease. However, the underlying genetic mechanism resistant to *D. zeae* is unknown in rice.

Similar to other plant species, rice has evolved a sophisticated defense mechanism to protect itself from constant invasions of pathogenic microbes.<sup>4</sup> Currently, increasingly studies discovered that lncRNAs play a role in resistance of a diverse of fungal and bacterial diseases in rice.<sup>5,6</sup> Based on the genome location, lncRNA are divided into three categories: (1) long intergenic non-coding RNAs (lincRNAs), (2) natural antisense transcripts (NATs) and (3) intronic lncRNAs.<sup>7</sup>

Coupled with the fast development of genome-wide transcriptome sequencing technology, a large amount of lncRNAs responsive to biotic and abiotic stresses have been identified in plants.<sup>8,9</sup> Recently, a great number of differentially expressed lncRNAs were detected in rice and *Arabidopsis* after infection with the fungal pathogens, *Magnaporthe oryzae* and *Fusarium oxysporum*, respectively.<sup>10,11</sup> Moreover, deep sequencing profiling uncovered a large number of lncRNAs in rice.<sup>12,13</sup> The biological functions of most lncRNAs are still unknown although a few lncRNAs were shown to play a role in plant growth and development. For example, the expression level of a male-fertility-associated RNA (lncRNA LDMAR) was inhibited under long day conditions. Reduction of LDMAR transcript resulted in programmed cell death leading to male sterility due to failed anther development.<sup>14</sup> Another rice lncRNA

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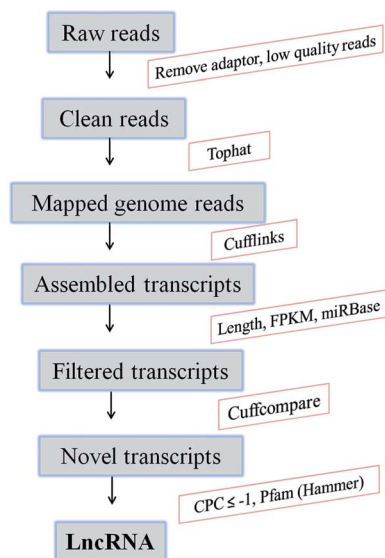


Fig. 1 The computational pipeline for identification of lncRNAs from RNA-seq data in resistant rice. CPC, Coding Potential Calculator.

XLOC\_057324 has been shown to play a role in panicle development and sexual reproduction.<sup>15</sup>

Competing endogenous RNAs (ceRNAs) of miRNAs or miRNA target mimics have been shown to function in many biological processes through repression of miRNAs.<sup>16,17</sup> Plant ceRNAs can act as 'sponges' to sequester miRNAs complementary to ceRNAs resulting in unleashing miRNA targets mimics.<sup>18,19</sup> For instance, rice lncRNA XLOC\_057324 is able to release more transcripts of the targets of miR160 and miR164 by decoying these two miRNAs.<sup>15</sup> A ceRNA network was constructed for rice root and shoot tissues under phosphate starvation conditions.<sup>20</sup> However, it is unclear whether lncRNA-miRNAs-target interaction networks are involved in immune response to pathogenic bacteria *D. zeae* in rice.

Studies on the role of lncRNAs in resistance responses can benefit to understand the rice immune mechanism. The objectives of the present study were to (1) identify and

characterize lncRNAs in response to inoculation of *D. zeae* in a resistant rice variety, and (2) explore the crosstalk network among lncRNAs, miRNAs and their targets.

## Materials and methods

### Plant materials and growth conditions

All rice plants including Nanjing 40, Nanjing 45, Kasalath and Nipponbare were planted in experimental field under natural normal growth conditions, greenhouse and illumination incubator for bacterial pathogen *D. zeae* inoculation and RNA extraction in Jiangsu Academy of Agricultural Sciences, Nanjing, Jiangsu Province, China.

### Pathogen inoculation

The resistance of rice plants to rice foot rot disease pathogen *D. zeae* was measured by the basal stem and root inoculation method. The resistance rate was classed as five groups by measuring the percentage of diseased area at 10 days after inoculation. No obvious disease symptom in the stem and foot indicates immunity. The disease index less than or equal to 5 indicates highly resistance. A disease index from 5.1 to 12.4 indicates moderately resistance. A disease index from 12.5 to 19.9 indicates moderately susceptibility. A disease index equals to or greater than 20 indicating highly susceptibility.<sup>21</sup>

### Library construction and sequencing

The resistant japonica rice variety Nanjing 40 was selected for lncRNA library construction and RNA sequencing. Trizol kit (TaKaRa, Dalian, China) was used to extract root total RNAs from two samples, K1 (0 hour post inoculation, hpi) and K2, a mixed sample of 6, 12 and 48 hpi based on three time biological replicates.<sup>22</sup> The high-throughput RNA sequencing was performed at the LC-Bio Co., Ltd (Hangzhou, China) following the vendor's recommended protocol. The RNA quality was examined with an absorbance at 260/280 nm by using an Agilent 2100 Bioanalyzer. Approximately 5 µg of total RNA was used to

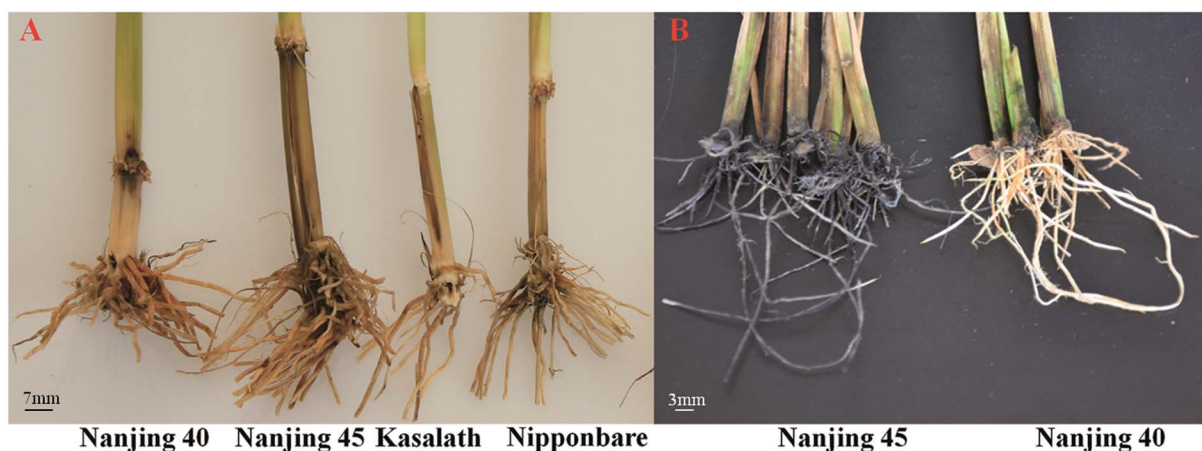


Fig. 2 Resistant and susceptible phenotypes in response to *D. zeae* infection. (A) and (B) phenotypes observed based on the method of basal stem and root inoculation, respectively.



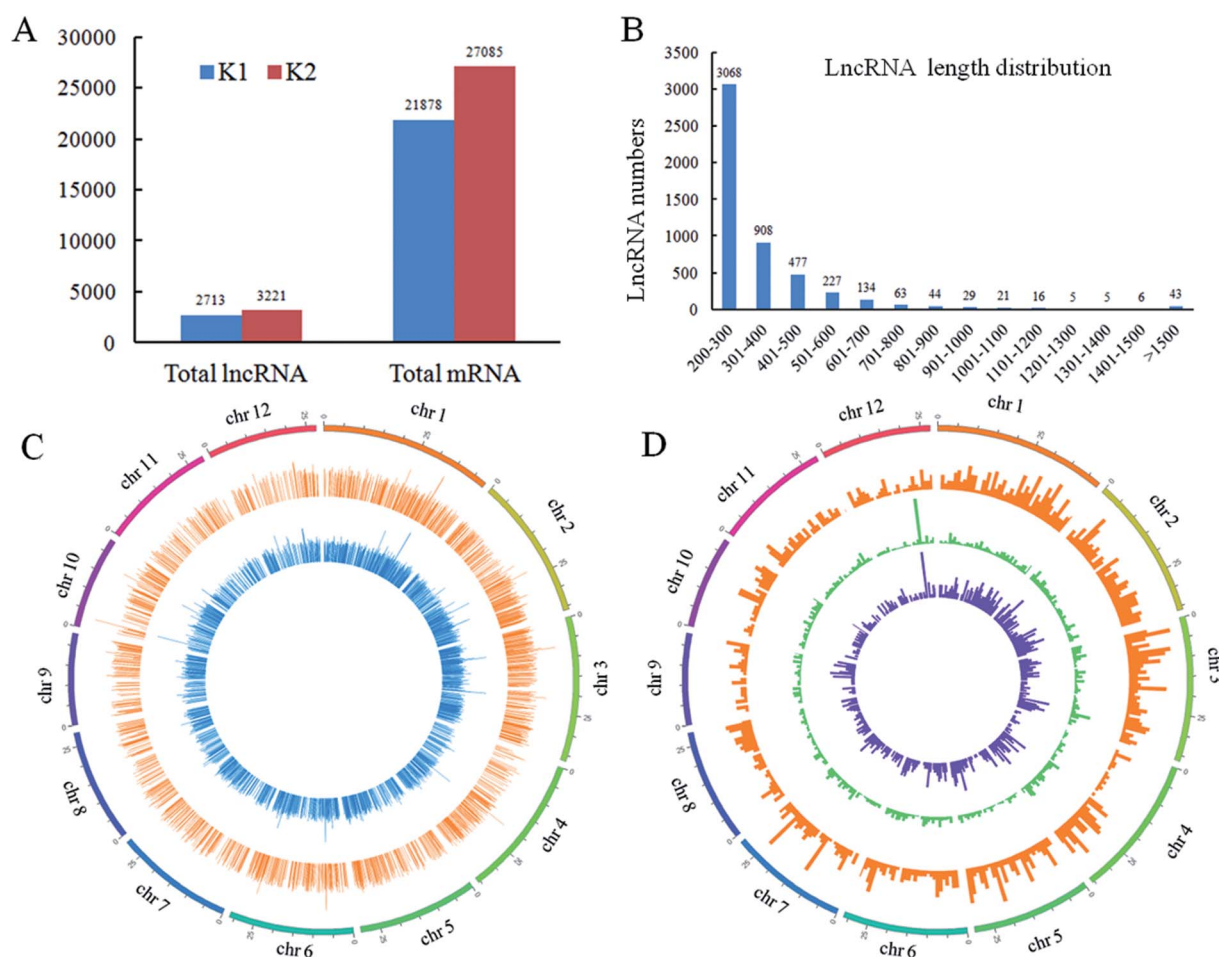
deplete ribosomal RNA according to the manuscript of the RiboZero™ rRNA Removal Kit, including four steps, prepare microspheres, treat sample with rRNA removal solution, remove rRNA and purify rRNA-depleted sample (Illumina, San Diego, USA). After removing ribosomal RNAs, the left RNAs were fragmented into small pieces using divalent cations under high temperature. Then the cleaved RNA fragments were reverse-transcribed to create the cDNA. Single- or dual-index adapters are ligated to the fragments, and size (200–600 bp) selection was performed with agarose gel electrophoresis and the ligated products are amplified by PCR. At last, we performed the 100 bp paired-end sequencing on an Illumina Hiseq 2500 following the recommended protocol.

### Identification of lncRNAs and analysis of sequencing data

For identification of candidate lncRNAs, a computational pipeline was developed (Fig. 1). The raw data obtained from the two libraries were analyzed to remove adaptor, low-quality and rRNA reads. The remaining clean reads were aligned to the rice

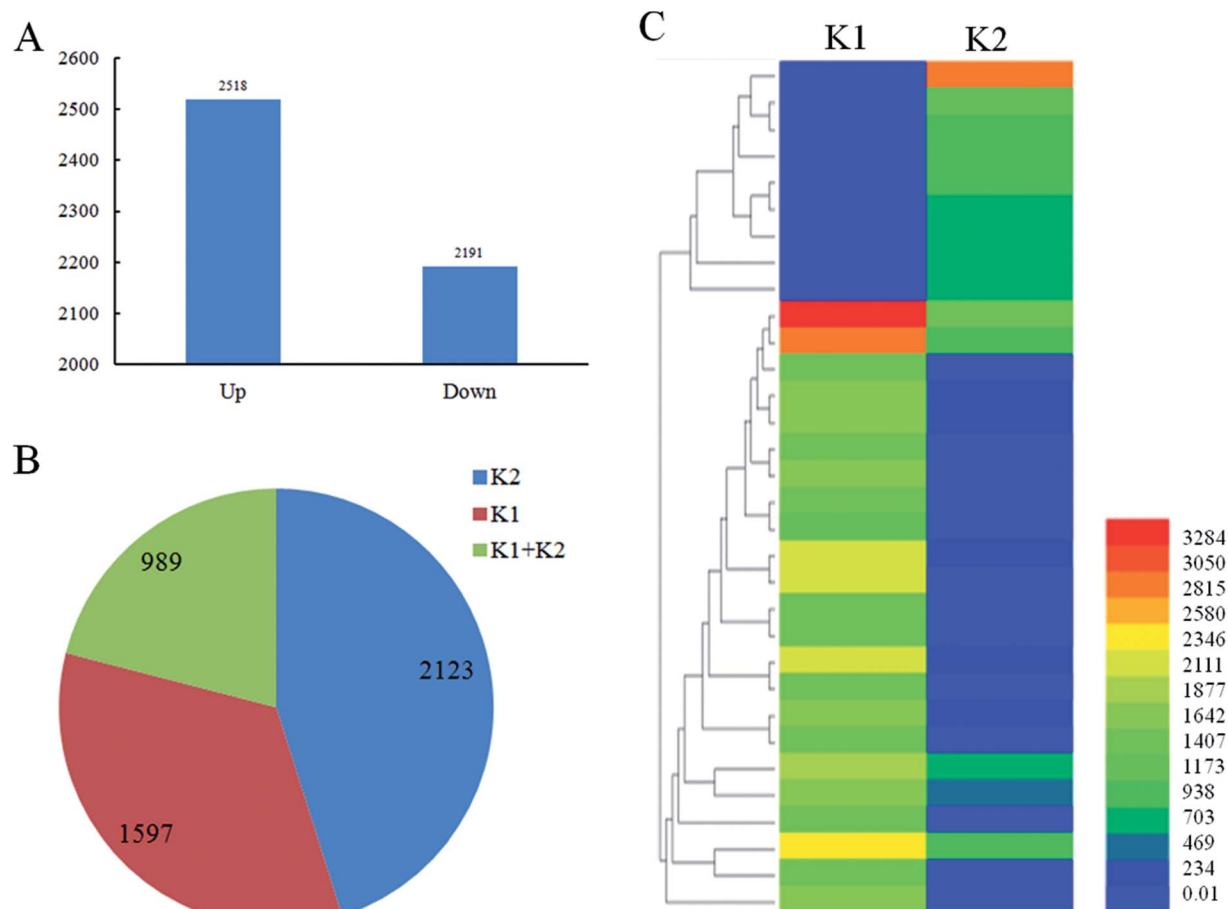
genome (<https://plants.ensembl.org/info/website/ftp/index.html>) using the TopHat2.<sup>23</sup> Then, the mapped reads were utilized in transcript assembly by Cufflinks. According to the annotated rice transcripts (Automated Annotation of the Rice Genome), the known protein-encoding transcripts were removed, and unknown transcripts (>200 and <1500 nucleotides) were defined as candidate lncRNA by using Cuffcompare.<sup>23</sup> The remaining transcripts were aligned to miRBase to exclude miRNA precursors. Finally, novel lncRNAs were identified based on their non-protein coding potential (score  $\leq -1$ , means that the transcript has no potential probability for coding proteins) calculated by the Coding Potential Calculator (CPC; <http://cpc.cbi.pku.edu.cn>), and searching against the Pfam database using the software Hmmer to remove known non-coding RNAs.<sup>24,25</sup>

To measure the expression levels of lncRNAs and their targets, Cufflinks 2.0.0 was used to normalize counts of reads based on their lengths. Fragments Per Kilobase of exon model per Million mapped reads (FPKM) represented the normalized



**Fig. 3** Results of lncRNA identification. (A) The number of detected lncRNAs and mRNAs. (B) Length distribution of lncRNAs. (C) Genomic distribution of lncRNAs from two libraries. The outside concentric ring represents lncRNAs from K1, the inside concentric ring represents lncRNAs from K2. (D) Distribution of three kinds of lncRNAs. The numbers of intronic lncRNAs (outer orange circle), lincRNAs (middle green circle) and anti-sense lncRNAs (inner blue circle) in physical bins of 500 kb (kilobase) for each chromosome. Intronic lncRNAs are generated from the intron region of protein-coding gene. lincRNAs (long intergenic noncoding RNAs) are transcribed from intergenic regions of the rice genome. Anti-sense lncRNAs are transcribed from the antisense strand and overlap in part with one or more exons of a protein-coding gene.





**Fig. 4** Identification of lncRNAs responded to the infection of *D. zeae* in a resistant rice variety. (A) The number of differentially expressed lncRNAs in a resistant rice variety after *D. zeae* inoculation. (B) The lncRNAs responded specifically to the infection by *D. zeae* in a resistant rice variety. K2 and K1 were the numbers of lncRNAs only detected in a resistant rice variety with and without inoculation. K1 + K2, the number of lncRNAs detected in both libraries. (C) Differentially expressed lncRNAs in two libraries by hierarchical clustering. More than 2 fold change was the cutoff point of the lncRNAs.

**Table 1** The top ten up- and down-regulated targets in response to *D. zeae* infection based on RNA-seq

| Target       | Gene annotation                      | K1     | K2     | Regulation | lncRNA         |
|--------------|--------------------------------------|--------|--------|------------|----------------|
| OS03G0339400 | Plant peroxidase                     | 0      | 60.79  | Up         | TCONS_00054645 |
| OS04G0470100 | Rab GTPase family 2 (Rab2)           | 0.12   | 30.88  | Up         | TCONS_00064813 |
| OS02G0318100 | Alternative oxidase                  | 1.04   | 197.93 | Up         | TCONS_00043825 |
| OS08G0480000 | MATE family                          | 4.85   | 39.36  | Up         | TCONS_00096879 |
| OS03G0764600 | MYB transcription factor             | 8.01   | 297.03 | Up         | TCONS_00055598 |
| OS08G0536300 | B-box-type zinc finger protein       | 9.76   | 63.87  | Up         | TCONS_00096627 |
| OS03G0576200 | K <sup>+</sup> potassium transporter | 10.08  | 72.83  | Up         | TCONS_00054751 |
| OS02G0811800 | Flavonoid reductase                  | 11.94  | 720.39 | Up         | TCONS_00043541 |
| OS12G0207500 | ATP synthase                         | 32.99  | 143.67 | Up         | TCONS_00032691 |
| OS01G0369700 | Glutathione S-transferase            | 33.09  | 506.35 | Up         | TCONS_00011946 |
| OS08G0113000 | Peroxidase 47                        | 272.01 | 41.767 | Down       |                |
| OS03G0235000 | Peroxidase A2                        | 250.03 | 43.23  | Down       | TCONS_00054545 |
| OS03G0741100 | Transcription factor BHLH148         | 223.55 | 37.54  | Down       | TCONS_00053343 |
| OS05G0110000 | E3 ubiquitin-protein ligase          | 193.24 | 30.53  | Down       |                |
| OS04G0637000 | Basic leucine zipper protein         | 184.53 | 20.63  | Down       | TCONS_00064963 |
| OS02G0101700 | E3 ubiquitin-protein ligase          | 101.94 | 21.5   | Down       |                |
| OS02G0669500 | DUF241                               | 174.27 | 26.7   | Down       | TCONS_00044026 |
| OS01G0585600 | DUF632                               | 93.26  | 38.75  | Down       | TCONS_00012775 |
| OS06G0683400 | Calcium-binding protein              | 124.57 | 7.53   | Down       | TCONS_00080557 |
| OS02G0787800 | Kinase 7                             | 113.66 | 26.8   | Down       | TCONS_00037675 |





expression level of lncRNAs and target genes, and the significance of the expressional difference was tested by using *t* test. The fold change was measured by the DEGseq package with *p* values < 0.05 and FDR (False Discovery Rate) < 0.05, fold change > 2 or < -2. The heatmap was developed according to the expression abundance of lncRNAs by using the software HemI (Heatmap Illustrator, version 1.0).

To analyze the *cis* regulation of lncRNAs, the Integrative Genomics Viewer was used to show the genomic loci containing lncRNAs and their adjacent genes. About 100 kb upstream or downstream sequences of lncRNAs were retrieved to search their candidate mRNA targets. Co-expressed lncRNA and target pairs were defined if both were expressed and spaced by less than 100 kb. Furthermore, differentially expressed lncRNAs and mRNAs in response to *D. zae* were identified.

### Validation of differentially expressed lncRNAs and targets

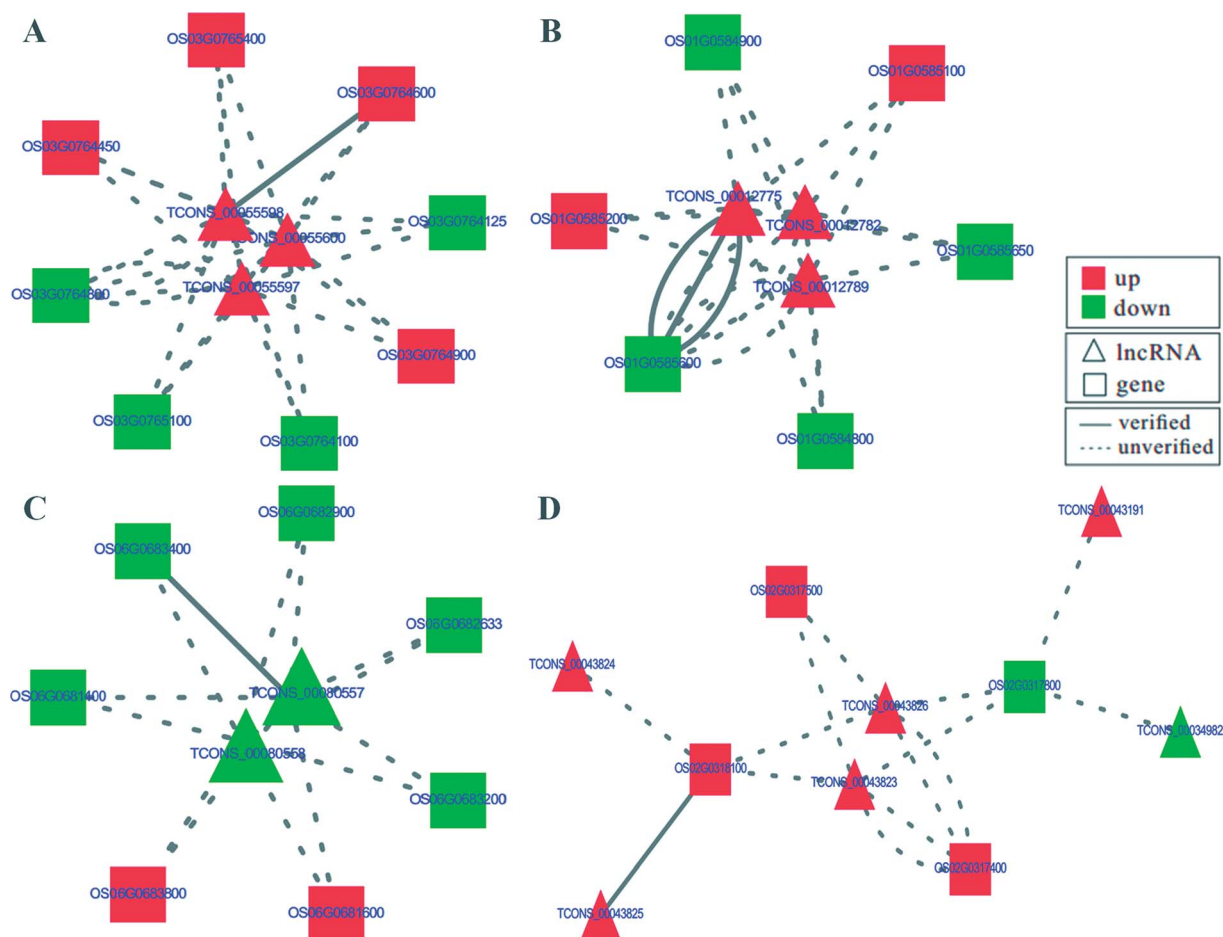
To test the expression level of lncRNAs and their predicted targets, rice roots after inoculation were collected for extraction of total RNA from two samples, K1 (0 hpi) and K2, a mixed sample of 6, 12 and 48 hpi using the Trizol reagent (TaKaRa,

Dalian, China). Quantitative PCR (qPCR) analysis was done using Applied Biosystem 7500 Real Time PCR System and SYBR Premix Ex Taq™ (TaKaRa, Dalian, China) according to the manufacturer's instructions. The first-strand cDNA was synthesized by the First-strand cDNA Synthesis Kit (TaKaRa, Dalian, China) using random hexamer primer (lncRNAs) or oligo dT RTprimer (mRNAs). The *EF1-α* gene was used as the reference control gene to standardize the RNA sample for evaluating relative expression levels, and all primers used in this study were listed in Table S1.† For qPCR assays, three independent biological samples were carried out, accompanied by three technical replicates.

## Results

### Response of a resistant japonica rice to *D. zae* infection

Hypersensitive response inhibiting the infection and invasion of *D. zae* in a resistant rice variety Nanjing 40 was observed whereas three susceptible rice varieties, Nanjing 45, Kasalath and Nipponbare showed typical disease symptoms nearby the site of injection at 10 dpi (Fig. 2A). Moreover, according to the



**Fig. 5** The predicted interaction networks of four lncRNAs–target pairs. (A)–(D) show the interaction networks of different lncRNA–target pairs. The triangular and rectangular nodes represent lncRNAs and relevant targets, respectively. Red and green represent the up-regulated and down-regulated nodes, respectively. Lines show the interaction of the lncRNAs–target pairs. The solid line and break line represent verified and unverified lncRNA–target pairs, respectively in Table 1.



Table 2 Expression profile of lncRNAs acting as ceRNAs in response to *D. zea*e infection in resistant rice

| miR_name   | ceRNA          | Predicted target | Gene annotation           | ceRNA |     |
|------------|----------------|------------------|---------------------------|-------|-----|
|            |                |                  |                           | K1    | K2  |
| osa-miR156 | TCONS_00012844 | OS01G0633100     | Glucose pyrophosphorylase | 0     | 60  |
| osa-miR156 | TCONS_00043299 | OS02G0557300     | RING-H2 finger protein    | 0     | 81  |
| osa-miR156 | TCONS_00102384 | OS09G0376800     | Glycosyltransferase       | 1980  | 778 |
| osa-miR156 | TCONS_00102574 | OS09G0252800     | Ubiquitin-protein ligase  | 267   | 163 |
| osa-miR156 | TCONS_00072934 | OS05G0363100     | Esterase protein          | 460   | 20  |
| osa-miR156 | TCONS_00013133 | OS01G0944100     | Vacuolar-sorting receptor | 0     | 28  |
| osa-miR396 | TCONS_00042166 | OS02G0742100     | DNA binding protein       | 1096  | 481 |
| osa-miR396 | TCONS_00064123 | OS04G0112200     | Transcription factor E2FB | 0     | 134 |
| osa-miR396 | TCONS_00081640 | OS06G0503400     | Reticulon-like protein B2 | 0     | 193 |

root inoculation experiment, Nanjing 40 was also more resistant to *D. zea*e than Nanjing 45, which showed withered leaves, black rot symptom and foul smell (Fig. 2B). The results from both two inoculation experiments demonstrated that Nanjing 40 was highly resistance against *D. zea*e and was thus chosen to analyze resistance mechanism mediated by lncRNA against *D. zea*e using the high-through sequencing technology.

### Overview of RNA-seq in an incompatible interaction of rice with *D. zea*e

In order to understand the molecular mechanisms of rice lncRNAs responsive to *D. zea*e in resistant rice, the raw reads from RNA-seq data were analyzed respectively, and the raw reads were submitted to NCBI (SRA: SRP149059). 4841 lncRNAs in Nanjing 40 were identified. Among them, 3221 and 2713 transcripts were identified in the infected (K2) and control (K1) sample, respectively (Fig. 3A and Table S2†). The lengths of the detected lncRNAs were in the range from 200 to more than 1500 bp, and 200–300 bp lncRNAs accounted for 60.8% (Fig. 3B). These lncRNAs were evenly distributed on 12 rice chromosomes (Fig. 3C). According to their locations in the genome, 1581, 2138 and 1122 were classified as intronic lncRNAs, lincRNAs (also termed long intergenic noncoding RNAs or intergenic lncRNAs)

and antisense lncRNAs. Their distribution on the 12 chromosomes are shown by different concentric rings from outside to inside in Fig. 3D (Fig. S1†).

### Identification of *D. zea*e responsive lncRNAs

A total of 4709 lncRNAs in response to the infection of *D. zea*e were identified ( $P$ -value < 0.05) in roots of K1 sample compared with K2 sample, including 2518 up-regulated lncRNAs and 2191 down-regulated lncRNAs (Fig. 4A, S2 and Table S3†). Additionally, 2123 lncRNAs were uniquely detected in Nanjing 40 after *D. zea*e inoculation, 1597 lncRNAs were unique to the control, and 989 lncRNAs were detected in both libraries (Fig. 4B and Table S3†). The heatmap in Fig. 4C showed the selected 33 lncRNAs differentially expressed in an incompatible interaction (Fig. 4C and Table S4†). Differential expression of lncRNAs at certain time points after *D. zea*e infection suggests a role of these lncRNAs in response to *D. zea*e infection.

### Co-expression analysis between lncRNAs and their targets in defense pathways

To identify potential mRNA targets of lncRNAs, differential expression was analyzed for the mRNAs within the 100 kb flanking regions of differentially expressed lncRNAs.<sup>26</sup> The transcriptome data from RNA-seq identified top ten up-regulated targets involved in multiple signal pathways related to defense responses, such as plant peroxidase, Rab GTPase family 2 (Rab2), alternative oxidase, MATE family protein, MYB family transcription factor, K<sup>+</sup> potassium transporter, flavonoid reductase and glutathione S-transferase *etc.* (Table 1). The top ten down-regulated targets included peroxidase 47, peroxidase A2, two E3 ubiquitin-protein ligases, two DUFs (Table 1). Most of these targets, including peroxidase and E3 ubiquitin-protein ligases, are involved in defense response signal pathways.<sup>27</sup> Co-expression analysis of lncRNAs and their flanking mRNAs uncovered that 17 lncRNAs regulated the expression of 17 of 20 targets, except for OS08G0113000, OS05G0110000 and OS02G0101700 (Table 1). Moreover, the interactive networks of 17 lncRNA–target pairs were constructed by the Cytoscape software. Seven of them had networks with more than four nodes, and the remaining ten had networks with three or less nodes (Fig. 5 and S3†). The interactive networks shown in Fig. 5A contained eight target genes, including MYB

Table 3 The 17 differentially expressed lncRNAs based on the normalized data and randomly chosen from RNA-seq data

| lncRNA         | K1      | K2     | Regulation |
|----------------|---------|--------|------------|
| TCONS_00043825 | 120.87  | 980.18 | Up         |
| TCONS_00032691 | 0       | 168.89 | Up         |
| TCONS_00064597 | 0       | 139.36 | Up         |
| TCONS_00054751 | 0       | 845.71 | Up         |
| TCONS_00096627 | 0       | 104.63 | Up         |
| TCONS_00054645 | 0       | 138.92 | Up         |
| TCONS_00054417 | 0       | 97.72  | Up         |
| TCONS_00096879 | 0       | 142.38 | Up         |
| TCONS_00081726 | 0       | 147.87 | Up         |
| TCONS_00064813 | 0       | 99.03  | Up         |
| TCONS_00064963 | 0       | 83.99  | Up         |
| TCONS_00044026 | 0       | 63.73  | Up         |
| TCONS_00012775 | 0       | 77.49  | Up         |
| TCONS_00054545 | 1621.13 | 195.11 | Down       |
| TCONS_00053343 | 1020.79 | 17.03  | Down       |
| TCONS_00037675 | 274.84  | 0      | Down       |
| TCONS_00080557 | 620.79  | 0      | Down       |



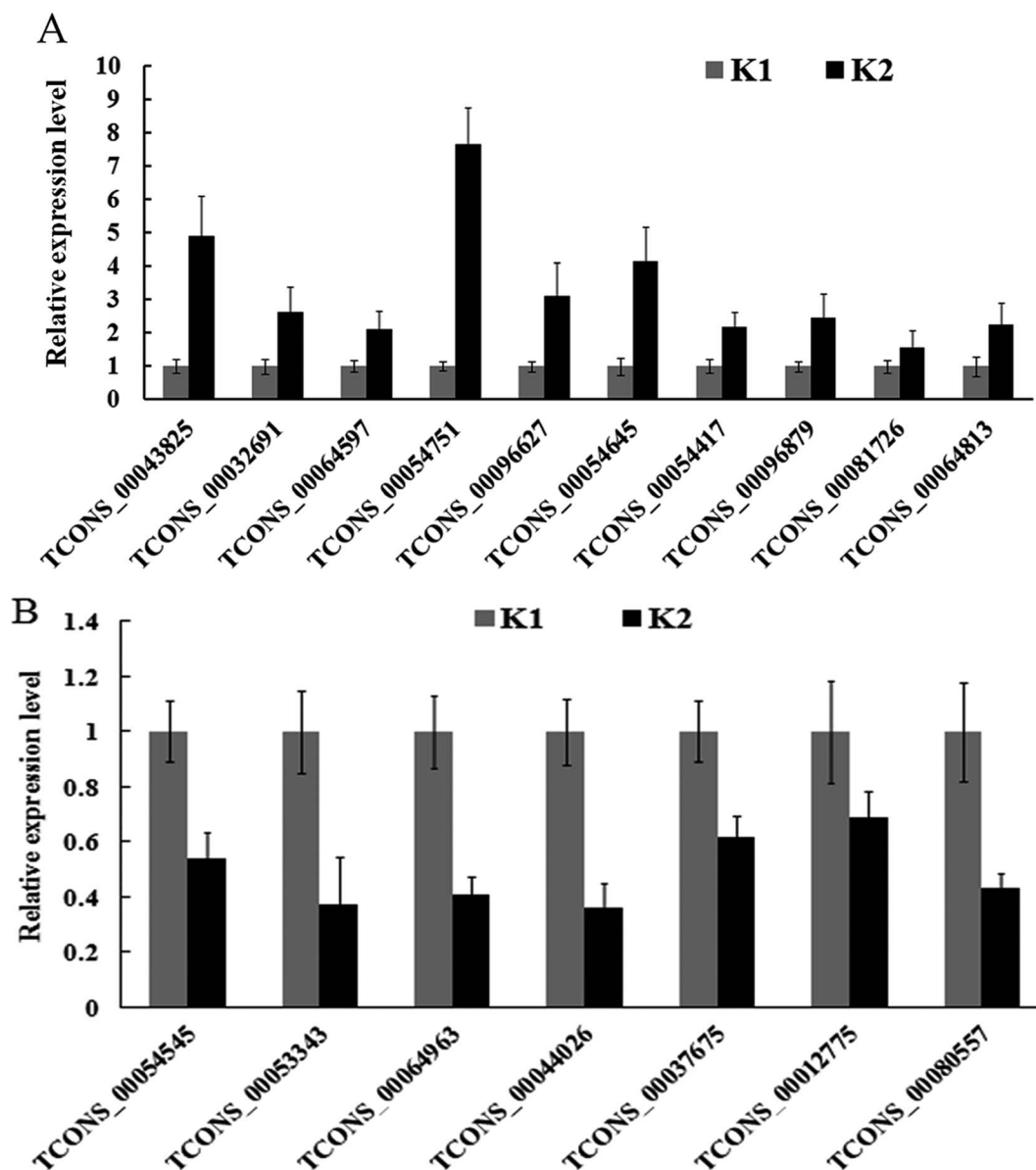


Fig. 6 lncRNAs from RNA-seq verified by qPCR. (A) and (B) the expression level of ten up-regulated and seven down-regulated lncRNAs were validated by qPCR, respectively. Data represent means of three replicates  $\pm$  standard deviation for each target in the two libraries.

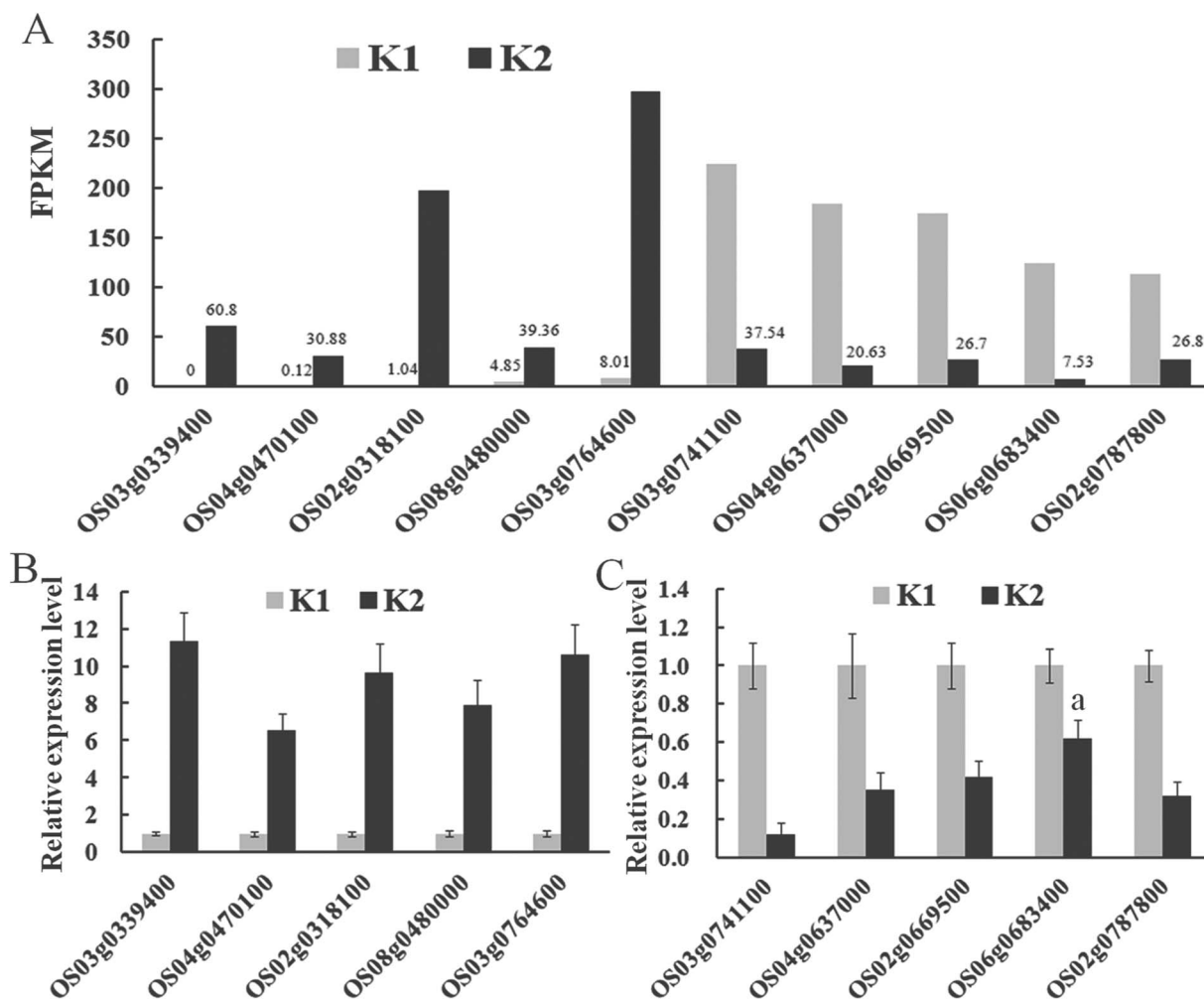
transcription factor, zinc finger and serine/threonine-protein kinase, which were regulated by three lncRNAs (TCONS\_00055600, TCONS\_00055598 and TCONS\_00055597) in the resistant rice cultivar in response to *D. zae* infection. The interactive network shown in Fig. 5B represented three lncRNAs (TCONS\_00012775, TCONS\_00012782 and TCONS\_00012789) regulating six targets, including gene encoding component of the small subunit processome, protein with domains of unknown function (DUFs) and WRKY transcription factor. The targets of TCONS\_00080557 and TCONS\_00080558 were calcium binding motif-containing protein, phospho-3-sulfolactate synthase, 50S ribosomal protein L24 and peroxidase (Fig. 5C). Moreover, a more complex interactive network was found between six lncRNAs and four targets (Fig. 5D). These four targets were composed of uncharacterized protein (OS02G0317800), alternative oxidase (OS02G0318100), F-box-

like protein with seven leucine-rich repeats (LRR; OS02G0317500) and clathrin adaptor (OS02G0317400), which OS02G0318100 and OS02G0317500 may respond to the infection of *D. zae* in rice. The remaining 13 interactive networks of lncRNAs–target pairs were shown in Fig. S3.† Targets involved in these networks included plant peroxidase, alternative oxidase, peroxidase, transcription factor, E3 ubiquitin-protein ligase and so on. These lncRNAs–target pairs may have a regulatory role in defense against *D. zae* infection.

#### Crosstalk of the lncRNA–miRNA network in an incompatible interaction

Previously, two miRNAs, osa-miR396 and osa-miR156, have been shown to be involved in the rice defense responses respectively.<sup>28,29</sup> The lncRNAs acting as potential ceRNAs





**Fig. 7** Expression levels of the ten targets selected for verification by qPCR. (A) Ten significantly differentially expressed target genes based on the number of normalized reads in an incompatible interaction. FPKM (Fragments Per Kilobase of exon model per Million mapped reads) represents the normalized expression level of target genes. (B) and (C) The expression level of five up- and down-regulated targets analyzed by qPCR, respectively. Data represent means of three replicates  $\pm$  standard deviation for each target in the two libraries in an incompatible interaction. a indicates that a significant difference ( $P < 0.05$ ) was detected between K1 and K2.

mimics of both miR396 and miR156 were predicted and their expressional changes were analyzed using the lncRNA sequencing data (Table 2). Three lncRNAs, TCONS\_00042166, TCONS\_00064123 and TCONS\_00081640, were predicted to be ceRNAs mimics of osa-miR396 (Table 2). Six lncRNAs, TCONS\_00012844, TCONS\_00043299, TCONS\_00102384, TCONS\_00102574, TCONS\_00072934 and TCONS\_00013133, were predicted ceRNAs of osa-miR156 (Table 2). It is noticeable, some mRNA genes were presumably the targets of miRNAs osa-miR156 and osa-miR396 (Table 2), predicted to be as ubiquitin-protein ligase, vacuolar-sorting receptor protein, esterase protein and transcription factors involved in defense responses (Table 2) suggesting that lncRNA may regulate miRNAs in resisting *D. zeae* in an incompatible interaction.

#### Validation of *D. zeae* responsive lncRNAs

A total of 17 differentially expressed lncRNAs were randomly chosen for qPCR analysis. Among the 17 lncRNAs, 13 had their number of normalized reads significantly up-regulated, and

four significantly down-regulated (Table 3). For example, the number of normalized reads of lncRNA TCONS\_00054751 in the infected and control samples were 845.71 and 0, respectively (Table 3), representing the highest induced lncRNA. The qPCR analysis results confirmed the expression changes of 17 lncRNAs, although three lncRNAs (TCONS\_00064963, TCONS\_00044026 and TCONS\_00012775) showed an opposite result (Fig. 6).

Ten targets (five up-regulated and five down-regulated genes in response to *D. zeae* infection) were randomly selected for confirmation of their differential expression pattern using qPCR (Fig. 7). For all ten genes, their expression patterns were confirmed despite the degree of changes varied between RNA-seq (Fig. 7A) and qPCR (Fig. 7B and C).

## Discussion

Rice foot rot disease caused by pathogen *D. zeae* is one of the most destructive bacterial diseases.<sup>1</sup> lncRNAs were involved in





the regulation of target gene expression at epigenetic, transcriptional and post-transcriptional levels in rice.<sup>16</sup> It was predicted that lncRNA plays a role in a wide range of biological processes including growth and development and stress responses in plants.<sup>14,15</sup> In this study RNA-seq was performed to identify the putative rice lncRNAs in response to *D. zea* infection in Nanjing 40.

lncRNAs are thought to be involved in complex interaction with target genes and miRNAs.<sup>19</sup> lncRNAs may function as ceRNA to bind specific miRNAs to prevent degradation of relevant target mRNAs by miRNAs.<sup>18</sup> To a great degree, the biological function of miRNAs partly reflected the biological function of lncRNAs as ceRNAs.<sup>19</sup> The Plant ceRNA database (PceRBase, <http://bis.zju.edu.cn/pcernadb/index.jsp>) contains potential ceRNAs, and ceRNA target-mimic pairs from 26 plant species.<sup>17</sup> lncRNAs potentially acting as ceRNAs of two key miRNAs, osa-miR156 and osa-miR396, were deduced and characterized in this study (Table 2). These two miRNAs regulate not only growth and development but also response to pathogen infection in plants.<sup>29</sup> Particularly, a recent study showed that rice blast infection significantly induced the accumulation of osa-miR156 and osa-miR396.<sup>29</sup> In this study, we identified that ubiquitin-protein ligase and glycosyltransferase are two targets of osa-miR156 (Table 2). Previous study demonstrated that ubiquitin ligase-associated protein SGT1 is required for resistance responses to diverse phytopathogens in *Nicotiana benthamiana*.<sup>30</sup> Recent study showed that E3 ubiquitin ligase EBR1 interacted with target *OsBAG4* in triggering programmed cell death and activating innate immunity and resistance to both blast and *Xoo* in rice.<sup>27</sup> Moreover, glycosyltransferase plays a key role in regulating the composition of plant cell wall resulted in increased diseases resistance.<sup>31,32</sup> Overexpression of miR396a or miR396b in *Arabidopsis* significantly contributed resistance to cyst nematode.<sup>31</sup> We also identified that reticulon-like protein B2 and transcription factor E2FB-like were the predicted two targets of osa-miR396 (Table 2). The reticulon-like protein B2 gene was clearly induced by the fungal pathogen *Fusarium oxysporum* in chickpea.<sup>33</sup> The E2FB transcription factor in *Arabidopsis* may be involved in the bacterial disease resistance by regulating the auxin signal pathway.<sup>33,34</sup> Another predicted target of osa-miR396 was the growth-regulate factor *OsGRF*, which is involved in multiple resistance-related signal pathways such as cell-wall modification, cytokinin biosynthesis and the accumulation of secondary metabolites in *Arabidopsis*.<sup>31,32</sup>

The reactive oxygen species (ROS) burst was a key defense responses signal molecule conferring the broad-spectrum resistance to fungal and bacterial diseases in rice.<sup>35</sup> For example, rapid accumulation of ROS resulting from the inhibition of the expression of peroxidase gene in *bsr-d1* knockout plants conferred a broad-spectrum resistance to rice blast fungus.<sup>35</sup> We showed that the expression levels of the targets of TCONS\_00055598 (OS03G0764600, a MYB transcription factor) and TCONS\_00054545 (OS03G0235000, peroxidase A2), were significantly up- and down-regulated, respectively (Table 1 and Fig. 7). In addition, plant peroxidase (OS03G0339400) and alternative oxidase (OS02G0318100), targets of TCONS\_00054645 and TCONS\_00043825, respectively, were

increased in the incompatible interaction (Table 1 and Fig. 7). During an incompatible interaction, increase of peroxidase suggests that lncRNAs may regulate ROS during defense against *D. zea*. Consistent with the observation that ROS balance mechanism can be used to prevent the damage resulting from massive ROS burst induced by pathogen infection.<sup>36</sup>

In this study, we identified and characterized lncRNAs in response to *D. zea* infection in a resistant rice variety using RNA-seq. A total of 4709 lncRNAs, 2518 up-regulated and 2191 down-regulated, were detected. The RNA-seq based expression levels of selected lncRNAs and their targets were validated by qPCR. Some lncRNAs were predicted to be target mimics of miRNAs. These results in this study provide evidences for better understanding the role of lncRNAs in regulating resistance to the bacterial rice foot rot disease in rice, as well as show a potential approach for cultivating the resistant rice to foot rot disease by generating lncRNA transgenic plants in the future.

## Conflicts of interest

All authors declare that there are no conflicts of interest.

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