

Profiling of circular RNA N⁶-methyladenosine in moso bamboo (*Phyllostachys edulis*) using nanopore-based direct RNA sequencing

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Abstract N⁶-methyladenosine (m⁶A) is a prevalent modification in messenger RNAs and circular RNAs that play important roles in regulating various aspects of RNA metabolism. However, the occurrence of the m⁶A modification in plant circular RNAs has not been reported. A widely used method to identify m⁶A modifications relies on m⁶A-specific antibodies followed by next-generation sequencing of precipitated RNAs (MeRIP-Seq). However, one limitation of MeRIP-Seq is that it does not provide the precise location of m⁶A at single-nucleotide resolution. Although more recent sequencing techniques such as Nanopore-based direct RNA sequencing (DRS) can overcome such limitations, the technology does not allow sequencing of circular RNAs, as these molecules lack a poly(A) tail. Here, we developed a novel method to detect the precise location of m⁶A modifications in circular RNAs using Nanopore

DRS. We first enriched our samples for circular RNAs, which we then fragmented and sequenced on the Nanopore platform with a customized protocol. Using this method, we identified 470 unique circular RNAs from DRS reads based on the back-spliced junction region. Among exonic circular RNAs, about 10% contained m⁶A sites, which mainly occurred around acceptor and donor splice sites. This study demonstrates the utility of our antibody-independent method in identifying total and methylated circular RNAs using Nanopore DRS. This method has the additional advantage of providing the exact location of m⁶A sites at single-base resolution in circular RNAs or linear transcripts from non-coding RNA without poly(A) tails.

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INTRODUCTION

Although circular RNAs (circRNA) were discovered over 40 years ago, for much of this time they were mainly considered to be aberrant by-products of the splicing reaction (Nigro et al. 1991; Cocquerelle et al. 1992; Capel et al. 1993; Cocquerelle et al. 1993; Pasman et al. 1996). With the development of circRNA-enriched RNA sequencing techniques and circRNA-specific bioinformatics tools, it became clear that circRNAs can be generated from coding genes by

back-splicing in diverse eukaryotes, including fungi, protists, plants, worms, fish, insects, and mammals (Jeck et al. 2013; Salzman et al. 2013; Westholm et al. 2014; Wang et al. 2014a; Ivanov et al. 2015). Recently, circRNAs were shown to regulate various biological processes in plants and animals such as binding to miRNAs, interaction with RNA-binding proteins, and the regulation of transcription, splicing of parental genes, and translation. Stable circRNAs function as miRNA sponges that compete with miRNA binding sites (Ebert et al. 2007; Franco-Zorrilla et al. 2007;

Poliseno et al. 2010). A striking example in the mammalian brain is a highly conserved circRNA (*Cerebellar Degeneration-Related protein 1 antisense*, or CDR1as), which contains over 60 binding sites for the microRNA miR-7 (Hansen et al. 2011, 2013; Memczak et al. 2013). Nuclear-retained circRNAs modulate the transcription of their precursor transcripts (Zhang et al. 2013; Li et al. 2015; Conn et al. 2017a)

In addition to their role as regulators of transcription, circRNAs also regulate the alternative splicing of their parental transcripts. For example, CircSEP3 derived from the *Arabidopsis* (*Arabidopsis thaliana*) *SEPALLATA3* (*SEP3*) locus, enhances exon skipping in *SEP3* pre-mRNA (Conn et al. 2017b). Exonic circRNAs also interact with RNA-binding proteins and influence their function. For instance, circANRIL (circular antisense non-coding RNA in the *INK4* locus) can bind to the essential 60S-preribosomal assembly factor peccadillo homolog 1 (PES1) to inhibit ribosome biogenesis in vascular smooth muscle cells and macrophages (Burd et al. 2010; Holdt et al. 2016). Currently, RNase R enrichment of circRNAs followed by high-throughput sequencing to generate short reads is the gold standard to detect circRNAs (Li et al. 2016b; Zhang et al. 2019a). However, identification of circRNAs using single-molecule long-read methods such as Nanopore direct RNA sequencing (DRS), which offer several advantages in detecting RNA modifications, has never been reported (Parker et al. 2020).

In addition to the emerging functions of circRNA in epigenetics, RNA modifications are attracting widespread attention as another type of epigenetic regulation. Among all known RNA modifications, N⁶-methyladenosine (m⁶A) is the best-characterized and the most abundant in eukaryotes (Wei et al. 1975; Li and Mason 2014). This modification occurs on RNA co-transcriptionally by a writer complex consisting of METHYLTRANSFERASE-LIKE 3 (METTL3), METTL14, and Wilms tumor 1-associating protein (WTAP) (Wei et al. 1975; Bokar et al. 1997; Liu et al. 2014; Ping et al. 2014; Wang et al. 2014b), and is removed by the m⁶A erasers fat mass and obesity-associated protein (FTO) or alkylated DNA repair protein AlkB homolog 5 (ALKBH5) (Jia et al. 2011; Zheng et al. 2013). m⁶A-containing RNAs are recognized by reader proteins using different mechanisms that involve YTH-domain-containing proteins (YTHDF1-3, YTHDC1-2) (Wang et al. 2015; Shi et al. 2017),

heterogeneous Nuclear Ribonucleoproteins (HNRNPC/G, HNRNPA2B1) (Alarcon et al. 2015; Liu et al. 2015, 2017; Wu et al. 2018), insulin-like growth factor two mRNA-binding proteins 1-3 (IGF2BP1-3) (Huang et al. 2018), and fragile X mental retardation 1 (FMR1) (Edupuganti et al. 2017; Zhang et al. 2018a).

Recent studies have revealed that m⁶A RNA methylation affects multiple aspects of mRNA metabolism, including mRNA localization, stability, polyadenylation, and translation (Meyer and Jaffrey 2014; Yue et al. 2015). The m⁶A eraser ALKBH5 and the m⁶A reader YTHDC1 participate in m⁶A regulation, affecting the export of mRNAs from the nucleus to the cytoplasm (Zheng et al. 2013; Roundtree et al. 2017). The upregulation of m⁶A levels in pre-mRNAs leads to more alternative polyadenylation (APA) in cultured cells (Ke et al. 2015; Molinie et al. 2016). Furthermore, the m⁶A reader YTHDC2 enhances the cap-independent translation efficiency of target mRNAs (Hsu et al. 2017; Wojtas et al. 2017; Jain et al. 2018) through the YTHDF2 protection mechanism, whereas the cytosolic proteins YTHDF3 and YTHDF1 interact with ribosomal proteins to promote mRNA translation (Bailey et al. 2017; Li et al. 2017; Shi et al. 2017). Interestingly, m⁶A modifications are prevalent in circRNAs and play a key role in splicing and translational regulation (Yang et al. 2017; Tang et al. 2020). It is worth noting that the fruit fly (*Drosophila melanogaster*) circMbl (a circRNA from the *Muscleblind* (*Mbl*) locus) and the human (*Homo sapiens*) circZNF609 (a circRNA from Zinc Finger Protein 609) can be translated in a cap-independent manner because they contain internal ribosome entry sites (IRES) and use the same start codon as their parental mRNAs (Legnini et al. 2017; Pamudurti et al. 2017). The translation of circular RNAs may be regulated by m⁶A modifications (Legnini et al. 2017; Pamudurti et al. 2017; Yang et al. 2017).

The m⁶A modification preferentially occurs in the consensus RNA motif RRACH (R = G or A; H = A, C or U) based on high-throughput sequencing data (Csepány et al. 1990; Harper et al. 1990). Currently, m⁶A modifications in linear transcripts are detected mainly by antibody-based immunoprecipitation methods (Dominissini et al. 2012, 2016; Meyer et al. 2012; Arango et al. 2018) and digestion of mRNAs by the m⁶A-sensitive bacterial RNase MazF (MAZTER-seq) (García-Campos et al. 2019; Zhang et al. 2019b). The recent emergence of

DRS techniques based on Oxford Nanopore Technologies (ONT) provides a new way to detect the underlying modifications in linear transcripts at single-nucleotide resolution (Liu et al. 2019). Unlike linear RNA, circular RNAs have a covalent closed-loop structure without a 3' poly(A) tail (Lasda and Parker 2014; Chen 2016; Wilusz 2018), which is required for DRS on the ONT platform. Thus, the current strategy for ONT-type library preparation and the associated computational pipeline cannot currently be used to identify m⁶A-marked circRNAs. CircRNAs in animals are m⁶A-modified and have the potential to initiate cap-independent translation (Yang et al. 2017). Thus, there is a crucial need to detect m⁶A-marked circular RNAs at single-base resolution using direct RNA sequencing so as to explore their translatability.

Moso bamboo (*Phyllostachys edulis*), for which a chromosome-level reference genome is available, is a large woody bamboo with high ecological, economic, and cultural value in China (Zhao et al. 2018a). In addition, moso bamboo presents striking characteristics, such as late flowering (Ge et al. 2017) and fast growth rate (Li et al. 2016a), which contributes to its economic value in delivering plant biomass in a short period. Phytohormone-mediated signaling largely contributes to growth regulation in bamboo culms (Peng et al. 2013); in particular, gibberellic acid (GA) participates in moso bamboo stem elongation (Zhang et al. 2018b; Shou et al. 2020). We have previously shown that circular RNAs are involved in the rapid growth exhibited by moso bamboo and that they modulate the levels of linear transcripts derived from their parental genes (Wang et al. 2019). However, whether such circRNAs might be modified by m⁶A in response to GA treatment has not been reported in moso bamboo or other plants.

Here, we developed a novel method to detect m⁶A-marked circular RNAs in moso bamboo through direct RNA sequencing using ONT at single-nucleotide resolution. This method involves enriching for circRNAs using a three-step protocol. The circRNAs are then fragmented and used for direct RNA sequencing with a customized reverse transcription adapter. To analyze the RNA reads and identify circRNAs and m⁶A modifications, we developed a new computational pipeline. Our analysis identified 470 circRNAs in moso bamboo, of which about 10% of exonic circRNAs contained m⁶A modifications. In

summary, we developed a new method to identify total and methylated circRNAs using direct RNA sequencing by ONT. This study expands the diversity of methods available for detecting circRNAs, pinpoints the precise location of m⁶A modifications, and paves the way for a thorough investigation of the dynamics and cellular functions of m⁶A methylated circRNAs.

RESULTS

Library preparation for direct sequencing of circRNAs

To enrich highly pure circular RNAs in total RNA, we developed a novel procedure for DRS of circular transcripts (Figure 1A). We extracted total RNA from 4-week-old bamboo seedlings treated with GA₃ and visualized the RNA by agarose gel electrophoresis (Figure 1B). Considering the small fraction of circular RNAs and the high amount of input RNA required for Nanopore DRS, we digested 100 μg of total RNA with RNase R, an almost 25-fold excess compared to the amount used in the RPAD method (Panda et al. 2017). Circular RNAs, such as PH02Gene34473 (which we used as a marker), were enriched after RNase R digestion (Figure 1C). However, linear transcripts for ACTIN were not completely depleted, suggesting that a simple RNase R treatment would not completely digest linear RNAs for highly expressed housekeeping genes, in agreement with previous reports (Panda et al. 2017).

To further remove non-circular RNAs, we artificially ligated poly(A) tails to residual contaminating linear RNAs with and without secondary structures, and then depleted them from our samples using oligo (dT)₂₅ beads. After this purification step, RT-PCR analysis demonstrated that linear RNAs (such as PH02Gene34082) were eliminated, whereas circular RNAs (such as PH02Gene34473) were strongly enriched (Figure 1D). After removing residual rRNAs with ribodepletion probes, we obtained highly pure circRNAs. We then fragmented and dephosphorylated circular RNAs, followed by purification (Figure 1A). Next, we synthesized the first complementary DNA (cDNA) strand from our purified linear RNA fragments by attaching a customized RT adapter including ten degenerate primers 'N' (N = A/C/G/T) to replace the usual oligo(dT)₁₀ used for Nanopore DRS. Finally, we ligated a sequencing adapter to the generated cDNAs

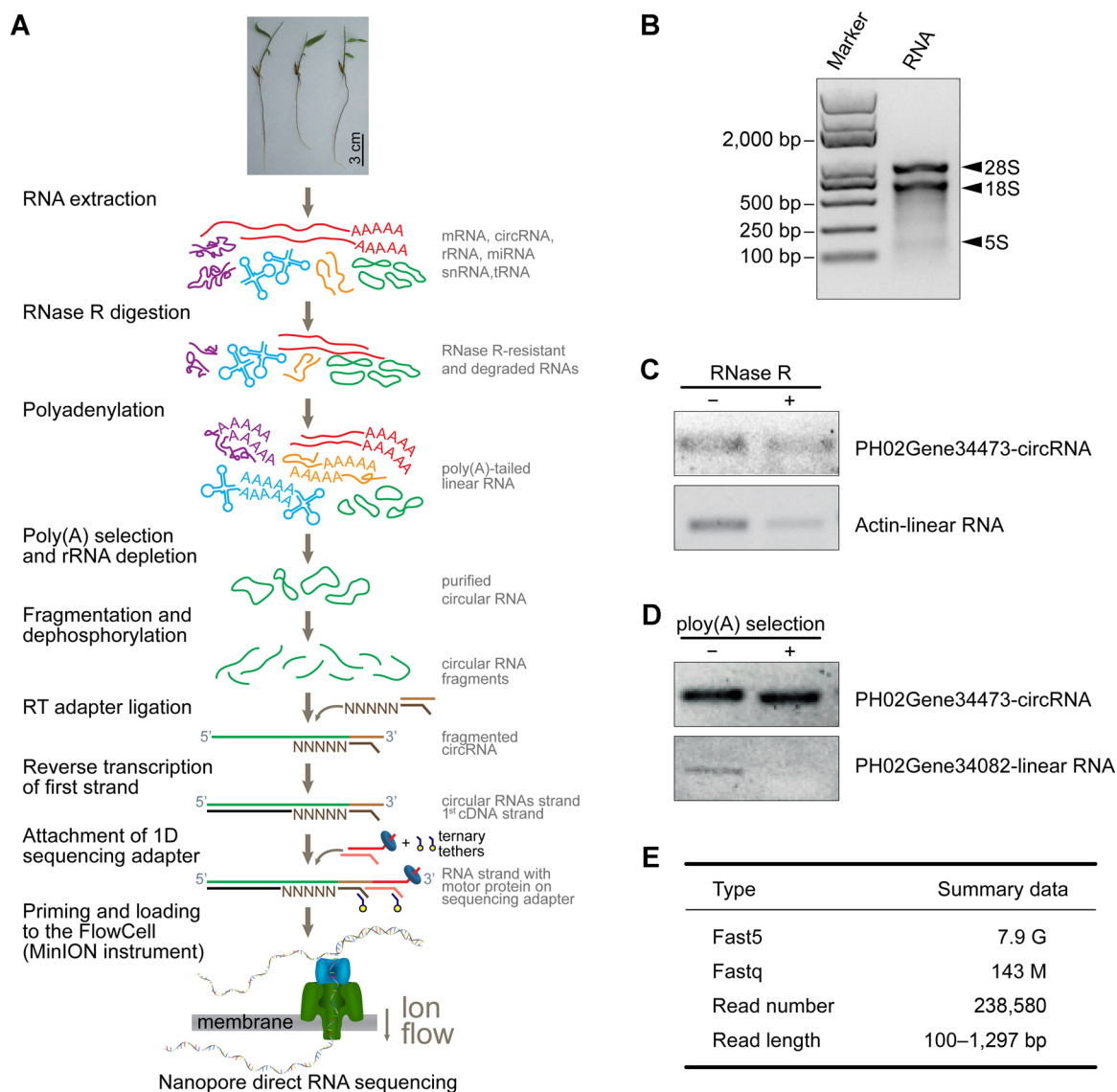


Figure 1. Circular RNA library preparation and experimental validation of circular RNAs enrichment

(A) Schematic diagram of circular RNA library preparation for Nanopore direct RNA sequencing. Total RNA was extracted from bamboo seedlings treated with GA. Circular RNAs were then enriched by RNase R digestion, polyadenylation, poly(A) selection and rRNA depletion. Subsequently, circular RNAs were fragmented, dephosphorylated, ligated to a modified RT adapter, reverse transcribed. Finally, a sequencing adapter (red lines) was added and the final products were sequenced on the MinION platform. (B) Agarose gel electrophoresis of total RNA. (C) Validation of RNase R digestion using a known circRNA (PH02Gene34473-circRNA) and linear RNA (actin-linear RNA) as negative and positive controls, respectively. (D) Validation of removal of poly(A)-tailed RNAs using circRNA (PH02Gene34473-circRNA) and linear RNA (PH02Gene34082-linear RNA) as positive and negative controls, respectively. (E) Summary of generated Nanopore DRS reads (fast5 and fastq).

and subjected them to direct RNA sequencing on a MinION Nanopore sequencer (Figure 1A).

It should be noted that the motor protein was linked to the RNA strand, so that the RNA was sequenced to detect RNA modification, and not the first-strand cDNA, which was merely present to reduce or eliminate RNA

secondary structures to ensure efficient RNA strand translocation through the Nanopore (Soneson et al. 2019). Overall, we obtained raw fast5 file (7.9 Gbite in size), corresponding to 143 million reads (fastq file) after base calling, including 238,580 reads (Figure 1E) with a sequence length ranging from 100 to 1,297 nt.

Identification of circular RNAs generated from Nanopore DRS data

There is currently no available computational pipeline to identify circular RNAs produced from DRS reads. To map single-molecule sequencing reads, including back-splicing junction sites, we developed a *de novo* computational pipeline for identifying circRNAs from DRS reads, which is based on back-splicing across splice junctions (i.e., covalent joining between a downstream splice donor site and an upstream acceptor splice site), a special characteristic of circRNAs (Zhang et al. 2014). Briefly, we joined all exons or introns from gene annotations by simulating back-splicing to construct a virtual library of circRNA sequences (Figure 2A), and then aligned all reads generated from DRS to this virtual library using the minimap2 algorithm (Li 2016). We selected reads spanning back-splicing junctions as potential circRNAs. In total, this *de novo* strategy allowed us to identify 428 exonic circular RNAs (circRNAs) and 42 intronic circular RNAs (ciRNAs), respectively (Figure 2B, Table S1). To further confirm these circular RNAs from Nanopore DRS, we selected four candidates to validate their circularity by RNase R digestion, followed by RT-PCR. All candidates showed a PCR product of the expected size even after RNase R treatment, in contrast to the linear RNA control (Figure 2C).

Most detected exonic circular RNAs appeared to be processed from multiple exons, most commonly two or three, although circRNAs with only one circularized exon accounted for 5.9% of the circularized exons (Figure 2D, left panel). Overall, the length of back-spliced junction reads was much longer than that of all reads, which included both reads with back-splicing junction and fragmented reads without back-splicing junction from Nanopore sequencing (Figure 2D, right panel). The length of single circularized exons was much longer than that of multiple circularized exons (Figure 2E, right panel), which is consistent with a previous report indicating that biogenesis of circularized exons may prefer a given minimal length to maximize exon(s) circularization (Zhang et al. 2014). We next asked whether these identified circRNAs were associated with specific processes or functions. We performed a Gene Ontology overrepresentation test using the parental genes of these circRNAs. As shown in Figure 2F, our results suggest that parental genes are involved in specific processes, including chromosome organization and

chromosome segregation. For example, we detected a circ-RFC1 originating from the gene PH02Gene11283, which encodes Replication Factor C subunit 1 (RFC1) and is required during meiosis for DNA double-strand break repair during meiotic homologous recombination (Liu et al. 2013).

Characterization of circular RNAs containing m⁶A modification

To test for the existence of RNA modifications such as m⁶A modification in circRNAs, we first statistically determined whether our list of candidate circRNAs contained the m⁶A-modified consensus RRACH site. As indicated in Figure 3A and Table S2, approximately 99.2% of all identified circRNAs included potential RRACH motifs, a prerequisite for m⁶A-modification. We then applied the EpiNano tool (Liu et al. 2019) to identify real m⁶A-marked circRNAs from DRS reads. Overall, we identified m⁶A modifications in 10.7% of our circRNAs.

Most m⁶A modifications appeared to occur near donor or acceptor splice sites (Figure 3B), an observation that is consistent with a recent report (Tang et al. 2020) and indicates that m⁶A modifications may regulate the back-splicing step. We further evaluated the features of circRNAs with or without m⁶A modifications. Compared with non-m⁶A circRNAs, m⁶A circRNAs more commonly originated from three exons (Figure 3C), although exon length in m⁶A circRNAs was comparable to that of non-m⁶A circRNAs (Figure 3D). However, exons from linear transcripts with m⁶A modifications showed a longer length than linear transcripts without m⁶A modifications ($P = 2.2 \times 10^{-16}$), based on a typical Nanopore DRS library generated without the RNase R digestion step (Figure 3D). Furthermore, we noticed that the flanking introns of circRNAs containing m⁶A modifications were much longer than those of circRNAs lacking m⁶A modifications (Figure 3E). However, this difference in length could not be attributed to the presence of transposable elements within these long flanking introns.

A Gene Ontology (GO) enrichment analysis of the parental genes generating m⁶A-marked circRNAs (Figure 3F–H) revealed a number of highly enriched biological processes, such as amyloplast organization and glutamine biosynthetic process. We also observed enrichment for the cellular components chloroplasts

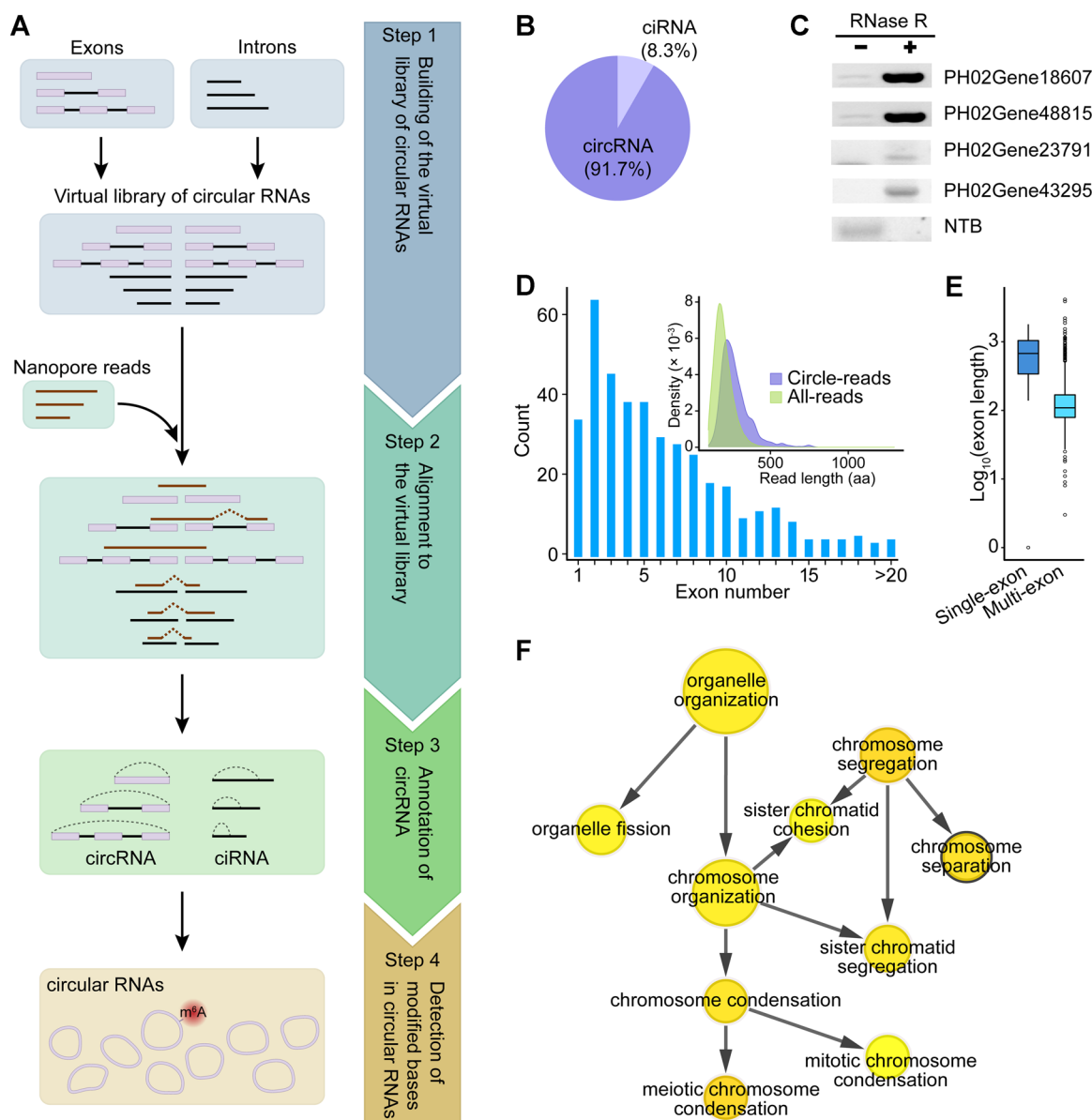


Figure 2. Identification and characterization of circular RNAs from Nanopore DRS

(A) Schematic diagram of the accurate detection and annotation of full-length circRNAs from Nanopore data. All annotated exons and introns were first used to construct a simulated library of back-splicing junctions (Step 1). Then, Nanopore reads (brown lines) were mapped to simulated back-splicing junctions using minimap2; the reads spanning back-splicing junctions were retained as circRNA candidates for downstream analysis (Step 2). These candidates were compared to the predicted circRNAs with a customized algorithm using known gene annotations (Step 3). The m⁶A modifications in circRNAs were detected using EpiNano software (Step 4). The m⁶A modifications in circRNAs were detected using EpiNano software (Step 4). ciRNAs: intronic circular RNAs. (B) The number of all circRNAs. (C) RT-PCR validation of circular RNAs with divergent primers resistance to RNase R treatment. Total RNA from seedlings with (+) or without (-) RNase R treatment. Linear RNAs NTB was control. (D) Number of circularized exons (left panel) and length distribution (right panel) of back-spliced reads for all circRNAs. (E) Length of circularized exons. (F) GO enrichment analysis for circRNA parental genes.

and thylakoids, and phosphatase inhibitor activity and glycogen debranching enzyme activity were among enriched molecular functions associated with circRNA parental genes. For instance, five m⁶A modifications

were detected in circ-At1-2 generated from gene PH02Gene48815 encoding a homolog to ARABIDOPSIS PROTEIN PHOSPHATASE INHIBITOR-2 (At1-2), which may promote the interaction of TYPE ONE PROTEIN

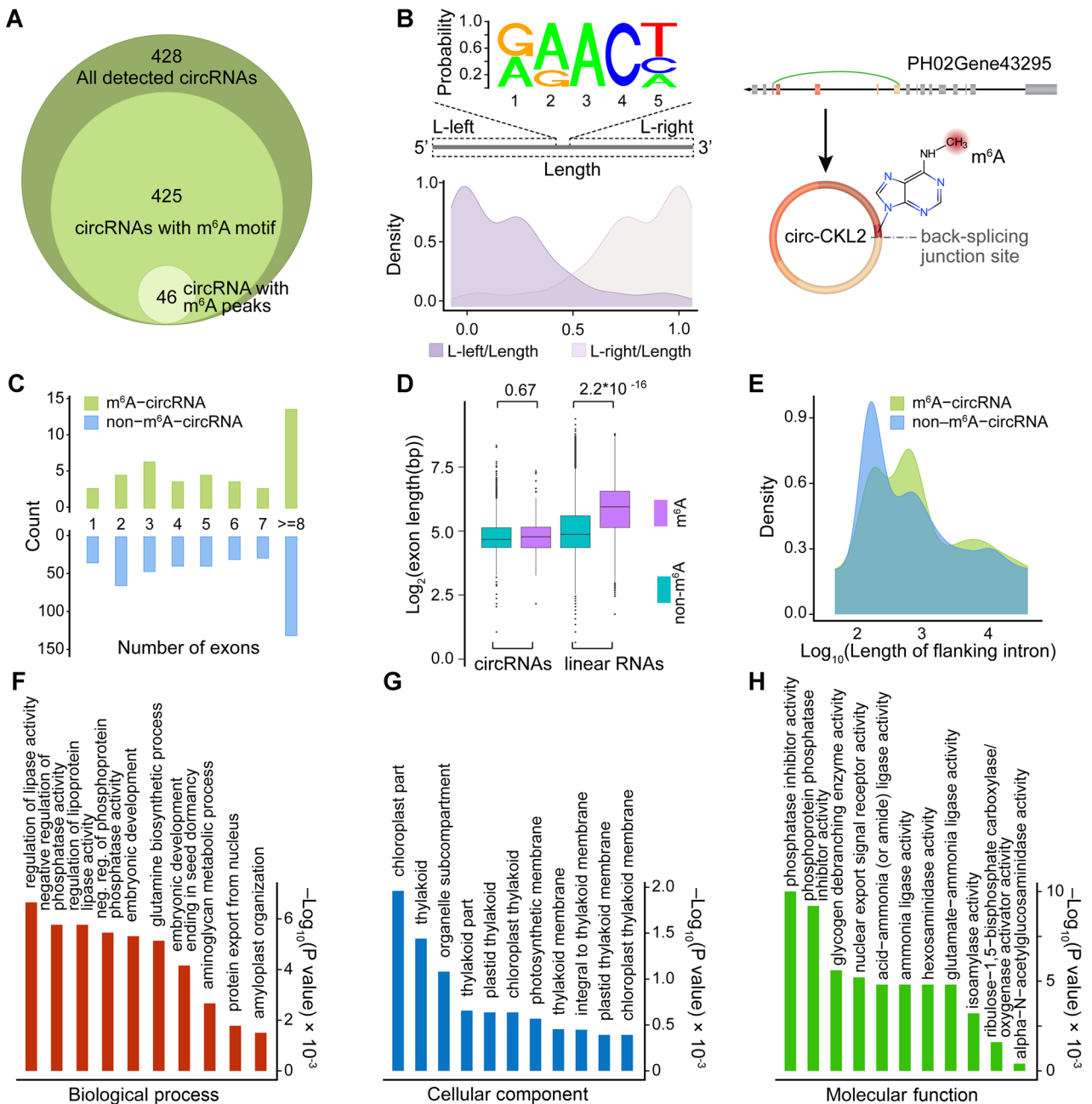


Figure 3. Characterization of circular RNAs containing the m⁶A modification

(A) The number of circRNAs containing the m⁶A modification. Outer circles indicate total detected circRNAs (428), the middle circle represents circRNAs with potential RRACH motifs (425) and the inner circle indicates circRNAs containing m⁶A modification, supported by a signal in Nanopore DRS read (46). (B) Consensus m⁶A motifs (RRACH) are enriched around back-splicing junction sites (left panel, Top). Density indicates the distance between RRACH motifs to 5' back-splicing junction sites or 3' back-splicing junction sites, respectively (left panel, Bottom). One example from PH02Gene43295 presents an m⁶A site, which is close to the back-splicing junction (right panel). (C) Number and length distribution of circularized exon circRNAs with or without m⁶A modifications. Most circRNAs with m⁶A modification contain multiple back-spliced exons. (D) Box plots of the distribution of exon length (y axis) in circRNAs with or without m⁶A modifications and linear transcripts as control. (E) Density plot showing that flanking introns of circRNAs with m⁶A modifications are longer than those of circRNAs without m⁶A modifications. (F–H) Gene Ontology (GO) functional enrichment analysis was performed for the parental genes of circRNAs with m⁶A modifications.

PHOSPHATASE 1 (TOPP1) and the abscisic acid receptor PYRABACTIN-RESISTANCE1 (PYR1)-LIKE 11 (PYL11) (Templeton et al. 2011).

Translation of circRNAs

To determine the coding potential of circular transcripts identified by Nanopore DRS, we processed all single exon circRNAs and multiple exon circRNAs (excluding intron sequences) for coding potential through the classification tools Coding-Non-Coding Index (CNCI) and Coding Potential Calculator (CPC), as well as the Swiss-Port database. CNCI, CPC and Swiss-Port identified 331 circRNAs with translation potential, or 77.3% of all circRNAs (Figure 4A).

To determine if their translation might be promoted by internal ribosome entry sites (IRES), we screened circRNAs for the presence of IRES cis-regulatory elements using framed k-mer features with the IRESfinder tool. Of our initial set of 331 circRNAs with translation potential, 143 circRNAs had one IRES, accounting for 33.4% of all detected circRNAs (Figure 4B). In addition, circRNAs contained slightly more IRES cis-elements than the flanking exonic regions from the same host genes (Figure 4B). These results strongly indicate that circularized transcripts possess a similar coding potential as linear transcripts and that the translation potential of circRNAs may also rely on the presence of IRES cis-elements. Interestingly, circRNAs also originate from the m⁶A effector loci *METTL14* (PH02Gene11019) and *YTHDF1-3* (PH02Gene28571), as noted in our previous study (Wang et al. 2019). At least in the case of *METTL14*, an IRES cis-element is present (PH02Gene11019) in the circRNA. However, more experimental evidence will be needed to determine whether circRNA derived from *METTL14* can be translated into a protein with biological function (Figure 4C).

We next undertook a systematic identification of all open reading frames (ORFs) encoded by our list of circRNAs. To this end, we multiplied the sequences of single exon circRNAs and multiple exons circRNAs (excluding intron sequences) four times to detect ORFs, only keeping non-redundant predicted ORFs for downstream analysis (Figure 4D). We obtained 237 ORFs from 150 circRNAs with predicted ORF lengths ranging from 200 to 1,000 aa (Figure 4E). The percentage of ORFs spanning the back-splicing junctions of circRNAs accounted for approximately 50% of all

predicted ORFs (Figure 4E). Using this set of circRNA-encoded proteins, we performed BLAST homology searches to identify orthologues in other species. Of these 237 ORFs, we identified 135 ORFs, or 56.9%, with clear homologs with known functions (Figure 4F; Table S3). For example, peptides translated from the circRNA circ-KEL1, generated from the PH02Gene10106 locus, showed homology to the yeast (*Saccharomyces cerevisiae*) protein KEL1, a kelch-repeat-containing protein that is involved in cell morphogenesis and cell fusion by antagonizing the Protein Kinase C (PKC1) pathway (Figure 4G) (Ghaemmaghami et al. 2003). These observations imply that peptides generated from circRNAs may function as proteins and may therefore regulate biological pathways composed of proteins that are translated from linear molecules.

Translation of circRNAs lacking a 5' cap or a poly (A) tail can still occur through IRES, or be driven by m⁶A RNA modification, such as the circRNAs circ-ZNF609, circ-Mbl, and circ-FBXW7 (F-box/WD repeat-containing protein 7) (Legnini et al. 2017; Liang et al. 2017; Yang et al. 2018). Moreover, we identified 46 circRNAs containing m⁶A modification, of which 11 can potentially be translated into long, continuous ORFs (Figure 4H). For example, circ-GAMYB (GA MYB domain protein) generated from PH02Gene34674 contained a m⁶A modification in upstream 160 bp of the start codon of its predicted ORF. Taken together, this study suggests that translation of circularized transcripts might be driven by IRES or m⁶A modifications.

DISCUSSION

Circular RNAs (circRNAs), formed by back-splicing known as non-canonical 3' to 5' end-joining event, are widely present and conserved across eukaryotic organisms (Zhang et al. 2014). Previous studies have shown that circRNAs may function as miRNA sponges or modulate gene expression at both the transcriptional and splicing levels (Zhang et al. 2013; Li et al. 2015; Chuang et al. 2018). More recently, several studies pointed out that m⁶A can promote the translation of circRNAs and that m⁶A modification of circRNAs is written and read by the same machinery (METTL3/14 and YTH521-B Homology (YTH) proteins) used for mRNAs, although often at different locations (Yang et al. 2017). Current technologies for detecting RNA modifications

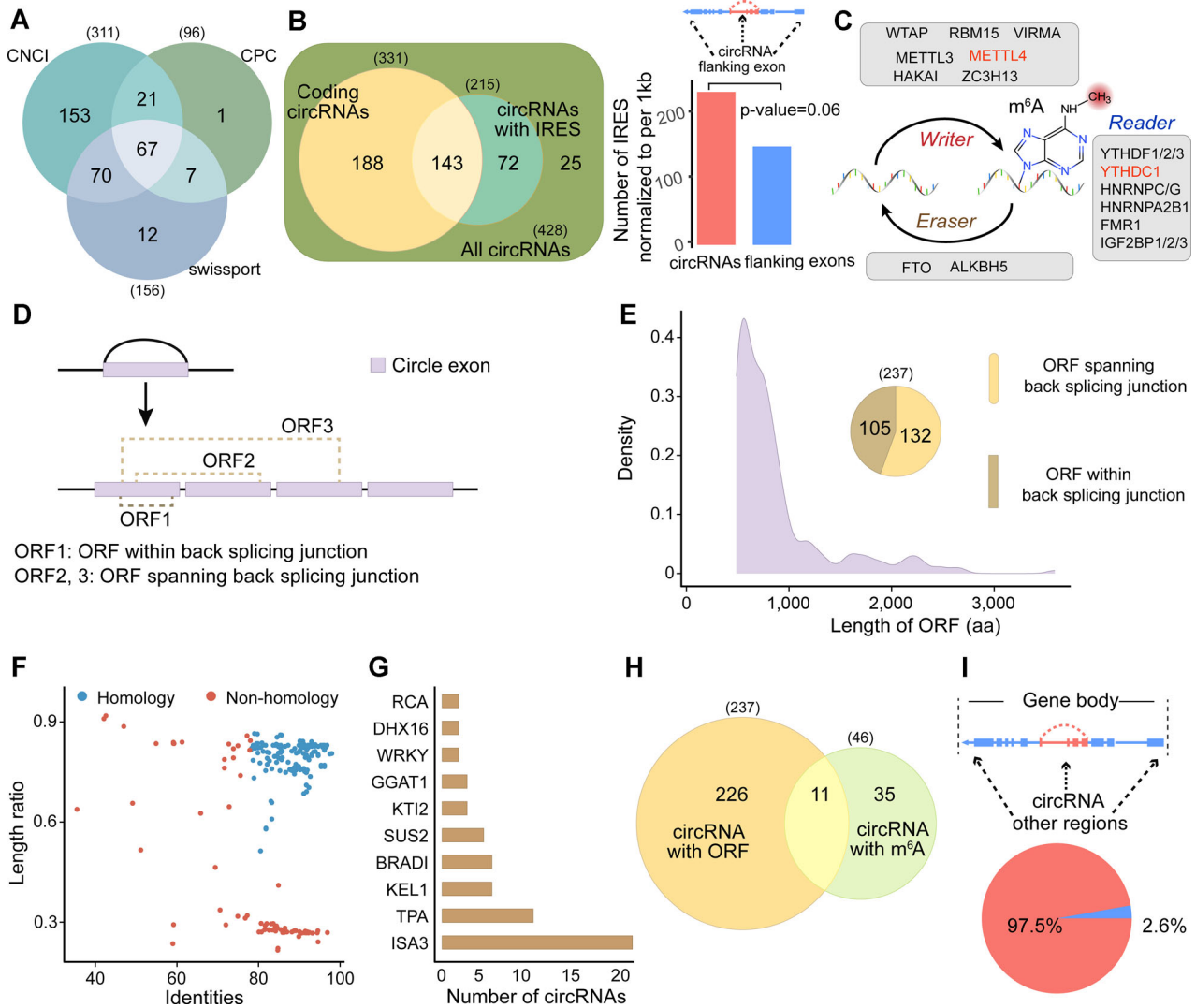


Figure 4. Translation of circRNAs

(A) The number of potential protein-coding circRNAs supported by Coding-Non-Coding Index (CNCI), Coding Potential Calculator (CPC), and Swiss-Port. (B) Left panel presented the number of circRNAs containing internal ribosome entry sites (IRESs). Right panel presented the number of IRES (Normalized to 1 kb) in circRNA regions and flanking exons regions in their host gene. (C) Summary of the m⁶A modification machinery, including writers, erasers and readers that may regulate methylation of circular RNAs. Red indicates the m⁶A methyltransferase complex that might generate methylated circRNAs. (D) Schematic diagram for identifying ORFs in circRNAs. Each circRNA sequence, excluding intron sequences, were joined four times for ORFs prediction. (E) Density plot indicates the length of predicted ORFs. Pie chart shows that approximately 50% of predicted ORFs spanned circRNA junctions. (F) Homology-based annotation for predicted ORFs. 135 ORFs originating from 65 circRNAs shared significant homology with known proteins. (G) Bar plot indicates the top 10 known proteins that showed homology to the above-mentioned ORFs. (H) Venn diagram showing the overlap between ORF-containing circRNAs and circRNAs with m⁶A modifications. (I) Distribution of reads generated from DRS in the body of an annotated gene. Red and blue indicate the percentage of reads in the circRNA regions, or flanking regions of host gene, respectively.

that use antibody immunoprecipitation (Dominissini et al. 2012, 2016; Meyer et al. 2012; Carlile et al. 2014; Schwartz et al. 2014; Arango et al. 2018) cannot identify the underlying modified sites in circRNAs at

single-nucleotide resolution. Although Nanopore-based DRS techniques can detect modifications from linear RNAs (Garalde et al. 2018; Liu et al. 2019), they are limited to linear transcripts with poly(A) tails. Furthermore,

the lack of an adequate computational pipeline has restricted the identification of RNA modifications in circRNAs from DRS data.

To overcome these limitations, we improved on the library construction approach of ONT DRS to identify any transcript, with or without a poly(A) tail. In parallel, we developed a *de novo* computational pipeline to detect circular transcripts and RNA modifications in native circRNA sequences that do not contain a poly(A) tail. Using the method described here, we identified 428 circRNAs (exonic circular RNAs) and 42 ciRNAs (intronic circular RNAs). The intrinsic features of circRNAs characterized in this study, such as distribution of exon numbers and length, were consistent with previous reports (Zhang et al. 2014), which validated the reliability of our approach from DRS. This study also demonstrates that ONT DRS can efficiently detect native circular transcripts and identify RNA modifications within circRNAs, which had not been reported for circRNAs in either plants or animals with this technology. However, Nanopore-based DRS using a MinION device produced a lower depth of coverage than next-generation sequencing on an Illumina platform, a clear limitation for the application of Nanopore DRS to the quantification of native circular transcripts and their m⁶A modifications. With improvements in sequencing depth for ONT using the GridION and PromethION systems, the method described in this study may become applicable to obtaining quantitative information on circRNAs and RNA modifications.

In this study, we modified the RPAD method (Panda et al. 2017) to enrich for circular RNA (Figure 1A). Our method significantly enriched reads from circRNA regions (97.5%) relative to other regions of the host genes (2.6%) (Figure 4I), suggesting that the RPAD method almost completely removed all linear mRNA fragments from the same parental genes, greatly decreasing background noise during downstream analysis. However, circRNAs expressed at low levels might be under-represented by this method due to the multiple filtering during library construction.

The advantage of the ONT platform is that it allows the identification of RNA modifications in individual native circular RNA sequences at single-nucleotide resolution. In this study, we detected 99 m⁶A modified sites in only GA-treated seedlings. While our method allowed the identification of individual

circRNA molecules and the detection of m⁶A modification on individual circRNAs, it cannot currently provide an accurate quantification of m⁶A modifications at a transcript-based level, which would open up the quantitative profiling of m⁶A abundance using Nanopore DRS between any two conditions or genotypes. We hope to reveal differential m⁶A-modified circRNAs sites in response to phytohormone treatment in moso bamboo, when the methods for quantifying m⁶A sites become available for Nanopore DRS. In addition to m⁶A modifications, other RNA modifications such as m¹A and m⁵C from individual circRNA molecules might also become accessible to detection. However, a corresponding computer algorithm would have to be developed to accommodate multiple RNA modifications. Currently, only computational pipeline for the detection of the m⁶A identification has been reported.

The coding potential of the circular transcripts identified in our study by the ONT platform is strongly supported by multiple lines of evidence. For example, 33.4% of all detected circRNAs possessed IRES cis-elements. In addition, 56.9% of all ORFs generated from circRNAs may have similar functions to proteins they show strong homology for in other organisms. Here, due to the low depth of MinION sequencing, we did not provide the distribution of m⁶A modifications near the start/stop codons, which might be associated with protein-coding potential. Thus, further research is essential to uncover how these m⁶A modifications affect the translation of circular molecules using GridION or PromethION systems, which can provide higher depth of coverage to quantify circular RNAs and RNA modifications.

MATERIALS AND METHODS

Plant materials and RNA extraction

We collected 4-week-old whole moso bamboo (*Phyllostachys edulis*) seedlings grown on Murashige and Skoog (MS) medium and in long-day conditions (16 h light/8 h dark) after being treated with gibberellic acid (GA₃, 100 μM) for 4 h. The seedlings were immediately frozen in liquid nitrogen and stored at -80°C prior to total RNA extraction. Total RNAs were isolated with the RNeasy Pure Plant Kit (Cat. #DP441, Tiangen). RNA quality was assessed by agarose gel electrophoresis and

measurements on a NanoDrop 2000c UV-Vis Spectrophotometer before downstream MinION library construction and sequencing.

Enrichment of circular RNAs

Circular RNAs were enriched as described in Figure 1A, using the RPAD method (RNase R treatment, polyadenylation, and poly(A)+RNA depletion) with minor modifications (Panda et al. 2017). Briefly, 100 µg total RNA was dispensed into ten 1.5 mL RNase-free tubes, 10 µg of RNA per tube, followed by incubation with 30U RNase R (per tube) at 37°C for 15 min. After purification, the undigested RNA fragments were mixed with 3U poly(A) polymerase I (AM1350, Thermo Fisher Scientific) to add poly(A) tails *in vitro*. A subsequent removal of poly(A)+RNAs with the Dynabeads™ mRNA Purification Kit and removal of rRNAs with the RiboMinus™ Plant Kit for RNA-Seq (A10838-08, Thermo Fisher Scientific) enriched our preparations with pure circular RNAs for downstream library construction. Primers used in this study are listed in Table S4.

Direct sequencing of circular RNAs using MinION

First, circular RNAs were fragmented using RNA Fragmentation Reagents (AM8740, Ambion), since circular RNAs have a covalent closed-loop, and then collected with the RNA Clean & Concentrator-5 kit (Cat.#R1015, Zymo Research). Subsequently, the fragmented RNAs were dephosphorylated at their 3' ends with T4 Polynucleotide Kinase (Cat.#M0201V, NEB) and purified with RNA Clean & Concentrator-5 kit (Cat.#R1015, Zymo Research). The RT adapter supplied in the Direct RNA sequencing kit includes an oligo(dT)₁₀ primer, designed for poly(A)-tailed RNAs, which will not hybridize to fragmented circular RNAs, since they lack a poly(A) tail. Instead, we attached a customized RT adapter with 10 degenerate primers 'N' (N=A/C/G/T) at the 3' end to replace the original (dT)₁₀. Fragmented circular RNAs attached with sequencing adapter were then sequenced on a MinION platform according to manufacturer's instructions for sequence-specific direct RNA sequencing (SQK-RNA002, Nanopore).

Computational pipeline for detecting circular RNAs and modifications from DRS data

To comprehensively map back-spliced junction reads and annotate circular RNAs containing m⁶A modification from DRS with high confidence, all

circularized single intron, exon and multiple exons (including internal introns) were multiplied twice to construct a comprehensive virtual sequencing library that would include all potential circular RNAs containing back-splicing junctions. We then removed duplicates from the reads generated from Nanopore sequencer and aligned remaining reads to the virtual circular RNAs sequences using the minimap2 algorithm with default parameters (Li 2016). Candidate transcripts from RNA direct sequencing spanning back-splicing junction sites were retained to further compare them to existing gene annotations in order to obtain the precise positions of donor or acceptor splice sites for each predicted circular RNA. According to the number of exons, exonic circular RNAs (circRNAs) were grouped into distinct subsets to determine whether circularized exons enriched in a specific subset. The average length of distribution of back-spliced exons was independently calculated for circular RNAs with only one circularized exon or multiple exons, respectively. Back-spliced junction regions included in each unique circular RNAs were quantified by RPM (reads per million mapped reads).

The m⁶A modification of circular RNAs was detected according to direct RNA sequencing reads using EpiNano tool (Liu et al. 2019) with default parameters. To systematically characterize features of circular RNAs containing the m⁶A modification, we performed a number of analyses, which included relative positions between m⁶A modification and splice site, the number and length distribution of circularized exons, as well as flanking introns between all detected circRNAs and circRNAs containing m⁶A modification. We applied BiNGO (Maere et al. 2005) in Cytoscape for GO enrichment analysis of parental genes resulting in circular RNAs or circular RNAs containing m⁶A modification.

Characterization of coding circular RNAs

We used CNCI (<https://github.com/www-bioinfo-org/CNCI>), CPC (<http://cpc.cbi.pku.edu.cn>), and Swiss-Port annotation with default parameters to evaluate the coding potential of circular transcripts. Translational enhancing elements such as IRESs of circular transcripts were predicted with the IRESfinder tool, which identifies core IRES regions using framed k-mer features (Zhao et al. 2018b).

Given the possibility that open reading frames (ORFs) translated from circRNAs may span circular junction several times, we first followed a previous method (Pamudurti et al. 2017) and multiplied four times for circRNA sequences, excluding introns, and then predicted ORFs of at least 200 amino acids in length using Transdecoder (Haas et al. 2013). Subsequently, all non-redundant predicted ORFs were mapped to the nr (Non-Redundant) protein sequence database at the National Center for Biotechnology Information (NCBI) using the Basic Local Alignment Tool for Proteins (BLASTP) to detect their homologous proteins with known function using following parameters: score >80, E-value <0.01.

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AUTHOR CONTRIBUTIONS

L.F.G. and A.R. conceived and designed the study. Y.S.W., H.Y.W., F.F.X., X.M.H., W.T.W., H.X.Z., and Q.Y.Z. performed the experiments. Y.S.W. and H.Y.W. analyzed high-throughput sequencing data. Y.S.W., H.Y.W., Y.S.Z., Q.Z., M.K., A.R., and L.F.G. analyzed the data as a whole and wrote the manuscript. All authors have read and approved of its content.

COMPETING FINANCIAL INTERESTING

The authors declare no competing financial interests.

DATA AVAILABILITY

Raw Nanopore DRS data has been submitted to the NCBI Gene Expression Omnibus under accession no PRJNA613867. All locus identifiers and circRNAs are available in <http://forestry.fafu.edu.cn/pub/circDRS>.

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SUPPORTING INFORMATION

Additional Supporting Information may be found online in the supporting information tab for this article: <http://onlinelibrary.wiley.com/doi/10.1111/jipb.13002/supinfo>

Table S1. List of all circRNAs based on Nanopore direct RNA sequencing

Table S2. List of circRNAs containing m⁶A modification

Table S3. List of circRNAs with continuous ORF

Table S4. Primers used for validation of circular and linear transcripts