SCIENTIFIC DATA

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OPEN Data Descriptor: Transcriptomic profiling for prolonged drought in Dendrobium catenatum

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Orchid epiphytes, a group containing at least 18,000 species, thrive in habitats that often undergo periodic drought stress. However, few global gene expression profiling datasets have been published for studies addressing the drought-resistant mechanism of this special population. In this study, an experiment involving the effect of continuous drought treatments on an epiphytic orchid, Dendrobium catenatum, was designed to generate 39 mature-leaf-tissue RNA-seq sequencing datasets with over two billion reads. These datasets were validated by a series of quality assessments including RNA sample quality, RNA-seq read quality, and global gene expression profiling. We believe that these comprehensive transcriptomic resources will allow a better understanding of the drought-resistant mechanisms of orchid epiphytes.

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Figure 1. Overview of the experimental design and analysis pipeline. The raw data were filtered using the package Fastq_clean, and clean data were assessed using FastQC and MultiQC. The clean reads were mapped to the D. catenatum genome (GenBank Assembely ID ASM160598v2) using Hisat2. The package ReSQC was used to calculate RNA-seq reads coverage over the gene body. Gene abundance was quantified using DESeq2.

Background & Summary

In response to prolonged water deficit stress, plants have evolved coping mechanisms to increase their drought tolerance [thro](#page-7-0)ugh physical adaptations, molecular regulations, and environmentally suitable metabolic pathways¹⁻³. Most studies concerning drought stress mechanisms have been performed in Arabidopsis thaliana and other drought-intolerant C_3 plants^{[2](#page-7-0)}. Studying a highly resistant plant that has been shaped by natural selection is the most direct and effective way to extract crucial genes and determine the main metabolic pathways of the drought stress procedure.

In the wild, most epiphytic orchids, a prosperous group containing over 18,000 species, take root on the surface of tree bark or rocks^{[4](#page-7-0),[5](#page-7-0)}. Due to the poor moisture supply in these habitats^{[6](#page-7-0)}, these plants usually suffer periodic water shortage^{[7](#page-7-0)}. While adapting to harsh habitats, some orchid species have evolved succulent storage-organs, such as pseudobulbs^{8,9}, thick leaves¹⁰, and crassulacean acid metabolism $(CAM)^{11}$ $(CAM)^{11}$ $(CAM)^{11}$, a photosynthetic pathway with high water-use efficiency¹². Morphological and anatomical studies show that orchid plants possess desirable qualities for mitigating drought stress^{[10,13,14](#page-7-0)} . By measuring physiological indexes and secondary metabolites of *Dendrobium moniliforme*¹⁵, Wu *et al.* found that increasing antioxidant enzyme activities and osmolytes play an important role in protecting plants under drought stress. Although several physiological traits might provide clues for the mechanism of drought resistance, there is no large data set that allows holistic understanding. Unfortunately, few comprehensive transcriptomic profiling studies that address drought resistance have been published.

Comparing the two published genomes from epiphytic orchid species^{[16,17](#page-7-0)}, Phalaenopsis equestris and Dendrobium catenatum, the latter possesses more Heat-shock protein 70 family members and R genes^{[17](#page-7-0)}, which suggests that *D. catenatum* can tolerate a much wider variety of environments and has superior qualities for adverse resistance. A previous study demonstrates that *D. catenatum* uses the facultative CAM pathway as a drought-enduring process^{[11](#page-7-0)}. Hence, this species can be considered as droughtresistant material useful for elucidating mechanisms of mitigating drought stress in epiphytic orchids. Previous studies show that the cir[cadia](#page-7-0)n clock modifies responsiveness to environmental input and stress according to the time of day^{18-21} . With regard to the correlation between CAM and circadian rhythm[22.](#page-7-0) the conventional sampling tactics that focus on a single time point per day should be abandoned as, if the daylight sampling time is fixed, some important clues to key resistance genes could be missed.

In the current study, D. catenatum plants were subjected to continuous drought treatments by simulating their natural environment under controlled conditions. Sampling time points were set for both day and night during the drought procedure. A dataset containing 39 RNA-seq with over 41 million sequence reads per sample was generated using the Illumina HiSeq 2500 platform. We assessed RNA sample quality, RNA-seq read quality, and the global gene profile (Fig. 1) to ensure the dependability of

Table 1. Statistics of Dendrobium catenatum transcriptomes in this study. Clean data rate =Clean read number/Raw read number ^{*} 100%. Mapping rates were assessed from the Hisat2 mapping procedure.

our dataset. We believe that these transcriptomic profiles will contribute to a comprehensive understanding of the mechanism of drought resistance in D. catenatum.

Methods

Plant material and experimental design

Clones of D. catenatum were planted in transparent plastic pots (5.0 cm in diameter) with sphagnum moss as the matrix. Eight-month-old plants were transferred into a phytotron chamber (12/12 h light/ dark, light intensity ~100 µmol m⁻²s⁻¹; 28/22 °C day/night; and relative humidity 60/70% day/night) and adapted to the controlled conditions for 10 days before being used for the follow-up experiment. The

Figure 2. Topological overlap matrix plot. Seventeen color-coded modules were detected and Branches in the hierarchical clustering dendrograms correspond to modules (clusters).

experiments were conducted on initially healthy individuals (~12 cm height). Plants were irrigated on the first day and then water was withheld to mimic drought stress. We collected leaf samples when the volumetric water content of the base material declined to \sim 30–35%, \sim 10–15, and \sim 0%, respectively, at both 09:00 h and 21:00 h ([Fig. 1\)](#page-1-0). The fourth and fifth leaves (mature leaf) from the apex of each plant were harvested and mixed to create one sample. These samples were immediately frozen in liquid N_2 and stored at -80 °C.

RNA isolation and sequencing

Total RNA was extracted from the samples mentioned above ([Table 1\)](#page-2-0) using the RNAprep Pure Plant Kit (No. DP441; Polysaccharides & Polyphenolics-rich; Tiangen Co. Ltd, Beijing, China; [http://www.tiangen.](http://www.tiangen.com/) [com/\)](http://www.tiangen.com/) according to the manufacturer's protocols. RNA purity was estimated using a NanoPhotometer spectrophotometer (Implen, CA, USA). RNA quality was assessed using an RNA Nano 6000 Assay Kit of the Bioanalyzer 2100 system (Agilent Technologies, CA, USA). RNA samples of acceptable quality were used to construct non-strand-specific sequencing libraries with the TruSeq RNA Sample Prep Kit (Illumina, CA, USA). These libraries were sequenced using the PE150 mode on an Illumina HiSeq2500 platform at Novogene Corporation (Beijing, China;<http://www.novogene.com/>).

Data filtering and assessment

The raw data (raw reads; Data Citation [1\)](#page-7-0) were filtered using Fastq_clean v2.0²³. Sequencing adapters, low-quality bases, viral sequences, and rRNA sequences were cleaned. The criteria for this filtering procedure were set as follows: (1) RNA 5' and 3' adapters were set as [5'-AATGATACGGCGAC CACCGAGATCTACACTCTTTCCCTACACGACGCTCTTCCGATCT-3'] and [5'-GATCGGAAGAG CACACGTCTGAACTCCAGTCAC (index) ATCTCGTATGCCGTCTTCTGCTTG-3'] (the indexes are listed in [Table 1\)](#page-2-0), respectively; (2) bases with a phred quality score below 20 were clipped from both ends of reads; (3) after low-quality bases were trimmed, reads containing over two "N" were discarded; (4) reads with a length shorter than 75 nt were discarded; and (5) the parameters for BWA v0.5.7²⁴ were set as recommended according to Fastq_clean instructions. The statistics of clean reads are listed in [Table 1](#page-2-0). The quality of the clean data was evaluated using the package FastQC v0.11.7 [\(http://www.bioinformatics.](http://www.bioinformatics.babraham.ac.uk/projects/fastqc/) [babraham.ac.uk/projects/fastqc/\)](http://www.bioinformatics.babraham.ac.uk/projects/fastqc/) and then summarized using MultiQC v1.3²⁵.

Gene quantification and detection of read coverage skewness

The clean reads were mapped to the *D. catenatum* genome^{[17](#page-7-0)} (GenBank Assembly ID ASM160598v2) using Hisat2^{[26](#page-7-0)} with default parameters. Salmon v0.9.1²⁷ was used to estimate gene abundance as read counts in the alignment-based mode. The raw read counts were imported into the R package $DESeq2^{28}$ $DESeq2^{28}$ $DESeq2^{28}$ for normalization. We used the package ReSQC^{29} ReSQC^{29} ReSQC^{29} to assess RNA-seq read coverage skewness over the gene body based on the above mapping results.

Table 2. RNA sample quality for each sample.

Figure 3. Quality assessment metrics for RNA-seq data. (a) Per base sequence quality. (b) Per sequence quality scores. (c) Per sequence GC content.

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Figure 4. Read distribution on the reference genes. Read distributions are shown for a relative length of 100 reads that were transformed from all reference genes.

Assessment of sample composition

A heatmap for cluster relationships among samples representing Poisson distance were generated with raw read counts. The R package PoiClaClu^{[30](#page-7-0)} was used for the calculation of Poisson distance, and the R package Pheatmap ([https://cran.r-project.org/web/packages/pheatmap/index.html\)](https://cran.r-project.org/web/packages/pheatmap/index.html) for visualization. A principal component analysis (PCA) was also employed to assess sample relationships based on rlogtransformed values of raw read counts.

Gene hierarchical clustering and Gene Ontology (GO) analysis

To determine the highly correlated genes in this prolonged drought experiment, weighted gene co-expression network analysis (WGCNA)^{[31](#page-7-0)} was used to detected gene clusters (modules) on normalized read counts (Data Citation [2](#page-7-0)) using the WGCNA v1.63 32,33 32,33 32,33 32,33 32,33 package in R. This analysis generated a topological overlap matrix plot ([Fig. 2\)](#page-3-0) that illustrated the relationships among gene clusters. To give an

Figure 5. Summary of sample clustering. (a) Heatmap displaying similarities among samples based on Poisson distances. (b) Principal component analysis performed on the 39 samples based on gene expression profiles.

insight into the functions of both genes and gene clusters, we performed GO enrichment analysis using Gogsea, a web tool from Omicshare ([http://www.omicshare.com/tools/Home/Soft/gogsea\)](http://www.omicshare.com/tools/Home/Soft/gogsea). The edge information of each gene cluster and the results of both GO annotation and GO enrichment are stored in the Figshare repository (Data Citation [3\)](#page-7-0).

Code availability

The R scripts for reads count filtration and normalization, heatmap illustration, PCA and WGCNA are available in Figshare (Data Citation [4\)](#page-7-0).

Data Records

The RNA-seq raw data of 39 samples are deposited at the NCBI Sequence Read Archive (Data Citation [1\)](#page-7-0).

Supplementary materials are available on the Figshare data management platform (Data Citations 2–4). Data Citation [2](#page-7-0) provides expression profiles of raw read counts and normalized read counts; Data Citation [3](#page-7-0) contains WGCNA results, GO annotation for all genes, and GO enrichment for gene clusters. Data Citation [4](#page-7-0) is dedicated to the R scripts in this study.

Technical Validation

RNA quality control

The quality of total RNA is a critical parameter for the construction of sequencing libraries and the follow-up quantitative analyses. In particular, RNA integrity (RIN) is positively correlated on uniquely mapped reads in $RNA-Seq^{34}$, which means low RIN would lead to a bias in gene expression profiles. In this study, RNA samples with a RIN value >6.5 were employed for RNA-seq library construction, which meant that high-quality reads were obtained for subsequent studies. The quality values for RNA samples, including RIN, are listed in [Table 2](#page-4-0).

Quality validation

The high clean data rate ([Table 1\)](#page-2-0), ranging from 98.73% to 99.56%, indicated that both RNA-seq libraries and raw RNA-seq data obtained in this study were of high quality. Results of clean reads assessment by FastOC are illustrated in [Fig. 3](#page-4-0). The per base quality scores were >30, and most per sequence quality scores were >20, suggesting a high sequence quality. The per sequence GC contents had pattern curves similar to a normal distribution indicating the sequencing data were free of contamination. In addition, we examined read-mapping qualities of the 39 samples, including mapping rates and read distribution on reference genes. The mapping rates to the reference genome were superior, with a range from 83.36% to 88.02% [\(Table 1](#page-2-0)). The distribution of reads based on the detection of read coverage skewness showed good fragmentation randomness ([Fig. 4](#page-5-0)), which reflected that each part of the gene was sequenced evenly.

Both the heatmap (Fig. 5a) and PCA (Fig. 5b) of gene profiles from all 39 samples revealed the clustering of samples according to time and drought level. The samples from daytime and nighttime clustered into two separate groups. The extreme drought groups during both day and night were

distinctly separate from the groups with water content of 10–15% and 25–30%. However, the clustering of samples with 10–15% and 25–30% water content overlapped. The explanation for this is that, for a CAM plant, moderate drought would not result in a significant change in gene expression because of its strong ability to adapt to drought.

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Data Citations

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Author Contributions

X.W. designed the experiments, collected samples, extracted RNA, processed the data, and wrote the original draft. L.-H.Z. designed the experiments, collected samples, extracted RNA, processed the data, and wrote the original draft. B.-Q.Z. collected samples, extracted RNA, and reviewed the manuscript. Y.-Q.T. supplied the original clones of Dendrobium catenatum, and reviewed the manuscript. Y.W. designed the experiments, reviewed the manuscript and supervised the study.

Additional Information

Competing interests: The authors declare no competing interests.

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