

GENETICS AND GENOMICS STUDIES FOR WATER-RELATED STRESSES IN  
RICE (ORYZA SATIVA L.)

A Dissertation

by

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Submitted to the Office of Graduate and Professional Studies of  
Texas A&M University  
in partial fulfillment of the requirements for the degree of

DOCTOR OF PHILOSOPHY

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August 2019

Major Subject: Plant Breeding

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## ABSTRACT

Rice is one of the most important crops that feeds more than half of the world's population. Along with the escalating problems with climate change, drought and submergence events have increased in recent years and have challenged the sustainability of rice production. This dissertation focused on these two water-related stresses, and studied the tolerance mechanisms underlying.

Reproductive stage is the most water-sensitive period for rice cultivation, therefore the study was conducted to investigate the molecular and physiological responses of two rice genotypes, 'Rondo' and '4610', to drought stress during reproductive stage under field conditions. Leaf samples were collected for RNA-Seq. Additionally, 10 agronomic traits and chlorophyll fluorescence were measured. The results showed that 4610 had better performance than Rondo under moderate drought stress conditions. The results indicated that 4610 had more stress responsive GO terms and several known genes families related to drought stress were also identified in 4610 up-regulated DEGs, including the LEA proteins, HSPs, APXs, and GSTs.

The second goal was to characterize the region of *qSub8.1*, a new submergence tolerance QTL during vegetative stage, which will enable us to develop suitable DNA markers and identify the gene(s) underlying *qSub8.1* for further functional characterization. Three rice varieties, Ciherang-Sub1, Ciherang, and IR64-Sub1, were sequenced with 150 bp pair-end WGS. The results showed that Ciherang-Sub1 genome is composed of 59% Ciherang, 24% of IR64-Sub1, and 17% of unknown sources; and

the *qSub8* region is mainly from Ciherang with a few introgressed segments from IR64-Sub1 and unknown sources.

There are challenges in conducting plant transformation and regeneration required to introduce the CRISPR reagents into the plant cell for gene-editing. Here, we used mature seeds as explants and reported a high-efficiency transformation and regeneration protocol for a recalcitrant *indica* rice cultivar Ciherang-Sub1 using particle bombardment to deliver CRISPR/Cas9 gene-editing vector. Our protocol successfully gives an optimal condition for shoot regeneration with 95% of regeneration rate and by using this protocol, CRISPR gene-edited plants can be generated and validated within approximately 12 weeks. Using this protocol, CRISPR gene-edited plants can be generated and validated within 12 weeks.

## DEDICATION

For my mother.

## ACKNOWLEDGEMENTS

I am grateful for everyone who has helped me in my struggle to achieve my dream of earning a Ph.D. degree. First, I would first like to thank my committee chair, Dr. Endang M. Septiningsih for her continual support and guidance of my graduate studies with endless patience. My sincere thanks to my committee members, Dr. Alan Dabney, Dr. Lee Tarpley, Dr. Michael Thomson, and Dr. Shichen Wang, who have given much time, effort and knowledge to aid in the completion of this dissertation.

Many others have been instrumental in this process. I would like to acknowledge their role in the completion of my work. I appreciate the generous assistance of Dr. Rodante Tabien for supporting the research in Beaumont Center; Chersty Harper, Patrick Carre, and Kyle Jones for managing the field and harvesting plant materials; Dr. Abdul Mohammed for teaching me all the physiological measurement. I would also like to thank Dr. John Cason and Michael Baring for teaching me everything about peanut breeding although I did not include peanut research in this dissertation.

The faculty, staff, and students in the Soil and Crop Sciences Department and the Crop Genome Editing Lab also deserve recognition: LeAnn Hague, Taylor L. Atkinson, and Amada Ray for helping me deal with document processing and unexpected situations as an international student. Dr. Ana Barrientos Velazquez and Dr. Sakiko Okumoto for expanding my knowledge in soil science and plant physiology. Dr. Backki Kim for teaching me everything about CRISPR and for being a great example as an excellent breeding scientist. Oneida Ibarra, Dr. Nithya Subramanian, Sudip Biswas,

Sruja Iyer, Ranjita Thapa, Benjamin Rogers, Stephon Warren, Dr. Nancy Wahl, Mark Brooks, Cooper Svajda, Wardah K. Mustahsan, Sejuti Mondal, and A.S.M. Faridul Islam for the sharing of their knowledge and expertise, camaraderie and rapport. I would also like to thank the Soil and Crop Sciences Department for all the support not only for my graduate studies but also for many student activities such as travel funding, SOGO, and the Plant Breeding Symposium.

Many thanks go to my fellow students and friends, Yu-Ming Lin, Yi-Pin Lai, Szu-Ting Kuo, Yu-Lyu Yeh, Wei-Ju Chen, Naining Chi, Ruei-Ping Chang, Hsin-Yi Li, Shu-Hui Chuang, Shen-Yu Hu, Long Chen, Ang Xu, Yuanyuan Luan, Ted Chang, Jean Hsu, Yong-Yu Jhan, Yi-Hua Lee, Morries Cheng, Justine Chu, Saul Perez, Shirley Arbizu, Tabby Liu, Jorge Valenzuela Antelo, Diana Zapata, Steve Anderson, Drutdaman Bhangu, Cynthia Sias, Blake Young, Martin Carlos Costa, Heather Baldi, Ammani Kyanam, and all the members in Herman Heepers softball team, Average Jose's soccer team, TSA basketball team and TSA badminton team, who have provided friendship and support, and with whom I have shared laughter, frustration, and companionship.

Thanks also go to Guosong Wang, Dr. Fu-Jin Wei, Hung-Yu Dai, Wei-Ting Chen, Peter Wu, James Chen, Chi Kao, Jen-Hau Yeh, Sheng-Kai Hsu, Candice Chu, and Nathália Penna Cruzato who shared their knowledge with me without hesitation.

Finally, I cannot begin to express my gratitude to my family for all of the love and support they have sent my way along this journey. To my parents, your unconditional love and support have meant the world to me, I hope that I have made you proud. To my little brother, thanks for always being by my side.

## CONTRIBUTORS AND FUNDING SOURCES

### **Contributors**

This work was supervised by a dissertation committee consisting of Professors Endang M. Septiningsih, Lee Tarpley, and Michael Thomson of the Department of Soil and Crop Sciences, Professor Alan Dabney of the Department of Statistics, and special appointment committee Dr. Shichen Wang of Texas A&M Genomics and Bioinformatics Service.

The field management and sample harvesting for Chapter 2 were assisted by Dr. Rodante Tabien, Chersty Harper, Patrick Carre, and Kyle Jones; and the chlorophyll fluorescence measurement was collected by Dr. Lee Tarpley and Dr. Abdul Mohammed of Texas A&M AgriLife Research Center at Beaumont station. The genomic data analyzed for Chapter 3 was guided by Dr. Shichen Wang. The construction of CRISPR/Cas9 vector in Chapter 4 was guided by Dr. Backki Kim.

All other work conducted for the dissertation was completed by the student independently.

### **Funding Sources**

Graduate study was supported by a graduate research assistantship from Texas A&M University and a dissertation research project from Texas A&M AgriLife Research.

This work was also made possible in part by USDA NIFA under Grant Number # 2017-67013-26194. Its contents are solely the responsibility of the authors and do not necessarily represent the official views of the USDA NIFA.



## NOMENCLATURE

ABA	Abscisic Acid
APXs	Ascorbate Peroxidases
BP	Biological Process
bZIP	basic leucine Zipper motif
Cas9	CRISPR associated protein 9
CAT	Catalase
CC	Cellular Component
CDPK	Calcium-Dependent Protein Kinase
CIM	Callus Induction Medium
CRISPR	Clustered Regularly Interspaced Short Palindromic Repeats
CTAB	Cetyl Trimethylammonium Bromide
DEGs	Differentially Expressed Genes
DREB	Drought Responsive Element Binding proteins
EDTA	Ethylenediaminetetraacetic Acid
ERF	Ethylene-Response Factor
EtOH	Ethanol
FDR	False Discovery Rate
gRNA	Guide RNA
GO	Gene Ontology
GR	Glutathione Reductase

GSTs	Glutathione S-transferases
HR	Homologous Recombination
HSPs	Heat Shock Proteins
K <sup>+</sup>	Potassium
KEGG	Kyoto Encyclopedia of Genes and Genomes
LEA	Late Embryogenesis Abundant
LRT	Likelihood Ratio Test
MF	Molecular Function
MH63	Minghui 63
MSM	Selection Medium
NAA	1-Naphthaleneacetic Acid
NAC	NAM, ATAF, and CUC
NGS	Next-Generation Sequencing
NHEJ	Non-Homologous End-Joining
OSM	high-Osmotic Medium
PR	Pathogenesis-related
qPCR	Quantitative Polymerase Chain Reaction
QTL	Quantitative Trait Locus
RCBD	Randomized Complete Block Design
RNA-Seq	RNA Sequencing
ROS	Reactive Oxygen Species
R1	Shooting Medium (Regeneration 1)

R2	Rooting Medium (Regeneration 2)
SNPs	Single-Nucleotide Polymorphisms
SOD	Superoxide Dismutase
SSR	Simple Sequence Repeat
Tris	Tris(hydroxymethyl)aminomethane
WGS	Whole Genome Shotgun Sequencing
2,4-D	2,4-dichlorophenoxyacetic Acid
6BA	6-Benzylaminopurine Solution

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## CHAPTER I

### INTRODUCTION

Rice (*Oryza sativa* L.) is the third largest crop produced in 2018, with 495.87 million tons of total production worldwide (<https://www.statista.com/statistics/263977/world-grain-production-by-type/>). Rice is also one of the most important staple food that feeds 3.5 billion, more than half of the world's population (<http://ricepedia.org/rice-as-food/the-global-staple-rice-consumers>). Along with the increase of global population which is expected to reach to 9.1 billion by 2050 ([http://www.fao.org/fileadmin/templates/wsfs/docs/expert\\_paper/How\\_to\\_Feed\\_the\\_World\\_in\\_2050.pdf](http://www.fao.org/fileadmin/templates/wsfs/docs/expert_paper/How_to_Feed_the_World_in_2050.pdf)); the demand of increased rice production is also pressing. Hence, in order to meet this increasing demand, different strategies must be applied to increase rice production, including the development of improved high-yielding rice cultivars that are more resilience under climate change scenarios.

More than 70% of rice production are in Asian countries, including China, India, Indonesia, Bangladesh, Vietnam, Philippines, Thailand, Burma, and Japan (<https://www.statista.com/statistics/255971/top-countries-based-on-rice-consumption-2012-2013/>). Brazil and the United States are the 10<sup>th</sup> and 13<sup>th</sup> largest rice produced countries, which account for 1.6% and 0.9% of total rice production in 2018, respectively. (<https://www.statista.com/statistics/255971/top-countries-based-on-rice-consumption-2012-2013/>). The United States, however, is the fifth largest rice exporter, which account for more than 6% of global exports

(<https://www.ers.usda.gov/topics/crops/rice/rice-sector-at-a-glance/>). All rice in the United States is grown in the irrigated fields in four main rice production regions, Arkansas Grand Prairie, Mississippi Delta (parts of Arkansas, Mississippi, Missouri, and Louisiana), Gulf Coast (Texas and Southwest Louisiana), and California (Sacramento Valley). Arkansas is the major rice-producing state, which account for 48% of rice production in the United States, followed by California (19%), Louisiana (14%), Missouri (8%), Texas (7%), and Mississippi (4%). More than 70% of rice production in the US is long-grain, followed by 26% of medium-grain, and 1% of short-grain. All the states are mainly producing long-grain types, except for California, with 92% of medium-grain and 7% of short-grain

([https://www.nass.usda.gov/Publications/Todays\\_Reports/reports/cropan19.pdf](https://www.nass.usda.gov/Publications/Todays_Reports/reports/cropan19.pdf)). The rice planting season in the Gulf Coast region begins at the end of March or early April, followed by the Delta regions in April, and California in May. Some of the fields in Gulf Coast region are able to be ratooned for the second harvest before winter comes.

Among major abiotic stresses that affect rice production are cold, heat, salinity, flooding, and drought. Cold stress decreases seed germination, plant growth and also affects yield (Cruz, Milach, & Federizzi, 2006; Farrell, Fox, Williams, Fukai, & Lewin, 2006). Heat stress, especially high nighttime temperature, has negative impacts on membrane stability, pollen viability, spikelet fertility, and ultimately yield (Mohammed & Tarpley, 2009; Peng et al., 2004). Salinity is a major problem for rice growing particularly in coastal regions such as Bangladesh which can damage plants and cause low yield and poor grain quality (Haque, 2006). Among the abiotic stresses, drought

stress is the most problematic in rice production; about 50% of rice production worldwide is affected by this stress alone (Bouman, Peng, Castañeda, & Visperas, 2005). However, drought is not the only water-related stress for rice production. The submergence due to rapid heavy rain and severe floods are also destructive to the plant growth and yield (Ismail, 2018; Septiningsih & Mackill, 2018). Along with the escalating problems from climate change, the extreme weather events have also increased globally in recent years causing more severe drought and flooding.

Rice is a diploid crop ( $2n = 2x = 24$ ) with a genome size of 379-392 Mb (Sakai et al., 2013; Zhang et al., 2016). The International Rice Genome Sequencing Project (IRGSP), started to decode Nipponbare, a japonica rice variety, in 1999 (Sasaki & Burr, 2000). Thereafter, as the first completely sequenced crop, rice genetic and genomic researches are blooming in the past two decades. There are more than a thousand accessions of *Oryza* species genomic sequences now available in the public database (<https://www.ncbi.nlm.nih.gov/genome/?term=Oryza>). The *Oryza* database provides powerful resources for further genetic and genomic researches in rice and the grasses family. Therefore, we are able to perform more genetics and genomic studies efficiently such as performing whole-genome RNA-Sequencing analysis with gene annotation, conducting referenced-guided genome assembly, and search cloned gene sequences for gene-editing.

The aims of this dissertation were to dissect the genetics and genomics profiles of two water-related stresses in rice, drought and submergence, and to investigate the tolerance mechanism underlying these stresses. In chapter 2, RNA-Seq analysis was

performed to obtain the genome-wide expression profile. Along with the measurement of phenotypic traits, investigated the drought tolerance molecular mechanism of two rice genotypes. In chapter 3, a whole genome shotgun sequencing and a reference-guided *de novo* genome assembly were performed in order to fully understand the genome profile and genome-wide nucleotide information of a submergence tolerance cultivar, Ciherang-Sub1. In chapter 4, a transformation and regeneration protocol was optimized for Ciherang-Sub1 using mature seeds as explants and using a biolistic delivery of CRISPR/Cas9 construct.

CHAPTER II  
TRANSCRIPTOMIC ANALYSIS OF TWO RICE GENOTYPES UNDER DROUGHT  
CONDITIONS DURING REPRODUCTIVE STAGE

**Introduction**

Rice (*Oryza sativa* L.) is one of the most important staple foods that feeds 3.5 billion, more than a half of the world's population (Ricepedia, <http://ricepedia.org/rice-as-food/the-global-staple-rice-consumers>). Global population is projected to reach 9.1 billion by 2050 ([http://www.fao.org/fileadmin/templates/wsfs/docs/expert\\_paper/How\\_to\\_Feed\\_the\\_World\\_in\\_2050.pdf](http://www.fao.org/fileadmin/templates/wsfs/docs/expert_paper/How_to_Feed_the_World_in_2050.pdf)); therefore, the increased of rice production is a necessity to keep pace with the rising global demand for food. However, rice production is challenged by various factors, including abiotic and biotic stresses. Drought stress is one of the main obstacles for crop production, especially for rice; 50% of the rice production is affected worldwide (Bouman et al., 2005). The damages caused by drought stress includes limiting nutrients uptake, cell dehydration, and the production of excessive metabolic compounds of reactive oxygen species (ROS) (Choudhury, Rivero, Blumwald, & Mittler, 2017; Price, Atherton, & Hendry, 1989). A simple cell dehydration may damage cells, including membrane dysfunction, unfolded enzyme, and cytoskeletal damage. Likewise, ROS may cause protein and membrane damages, and damage at the DNA level as well (Mittler, 2002; Tenhaken, 2014).

The drought tolerance mechanisms are complex and this abiotic stress can occur in different developing stages of rice plant growth (Tripathy, Zhang, Robin, Nguyen, & Nguyen, 2000), with the reproductive stage being the most susceptible (Garrity & O'Toole, 1994). Drought stress during reproductive stage can reduce yield dramatically. Drought tolerance mechanism mainly can be divided into two categories, i.e. preventing water loss and preventing damage caused by dehydration (Farooq, Wahid, Kobayashi, Fujita, & Basra, 2009; McDowell et al., 2008). For water loss prevention, ABA regulation (Munemasa et al., 2015), K<sup>+</sup> concentration and membrane potential (Corratge-Faillie et al., 2017) can regulate stomatal conductance to reduce water loss (Chaves, Pinheiro, & Flexas, 2008). Previous studies also revealed that over-expression of drought-induced genes such as calcium-dependent protein kinase (CDPK), NAM, ATAF, and CUC (NAC) transcription factor, and drought responsive element binding proteins (DREBs) transcription factor contribute to drought tolerance in rice (Chen, Meng, Zhang, Xia, & Wang, 2008; Hu et al., 2006; Saijo, Hata, Kyojuka, Shimamoto, & Izui, 2000). Hence, to understand the molecular mechanisms to drought during reproductive stage in rice is important to ensure good survival during this stress period and good harvest.

The aims of this study were to evaluate agronomic traits under drought stress and to investigate the drought tolerance molecular mechanism during rice reproductive stage. To reach these goals, agronomic traits measurement and RNA-Seq analysis were performed. RNA-seq is a next-generation sequencing (NGS) based technique, providing genome-wide expression profile, which allow us to dissect the whole genome picture of

how plants respond to drought. Two rice genotypes, Rondo, a susceptible variety, and 4610, a moderately drought tolerant breeding line, were selected for the study. My results showed that a total of 1040 genes were differentially expressed in 4610, with 555 genes up-regulated and 485 genes down-regulated, and 856 genes were differentially expressed in Rondo, with 460 genes up-regulated and 396 genes down-regulated. The differentially expressed genes (DEGs) including late embryogenesis abundant (LEA) proteins, heat shock proteins (HSP), and some known-stress related genes, which are involved in several stress response Gene Ontology (GO) categories.

## **Materials and Methods**

### *Plant Materials and Drought Treatment*

Two rice genotypes with different performance under drought stress, ‘Rondo’ and ‘4610’, were selected for this study. Rondo is an elite indica rice cultivar, regularly evaluated in Texas and has high yield and resistance to various diseases (Yan & McClung, 2010), but it is susceptible to drought stress. On the other hand, 4610 is a breeding line, from Texas A&M AgriLife Beaumont Research Center (Beaumont station), that was previously reported as less affected by drought (Tabien, Harper, Carre, & Jones, 2015). A field experiment was performed in Beaumont station in 2016 and 2017. The two genotypes were directly sowed at the rice experimental field in Beaumont, Texas, using randomized complete block design (RCBD) with three replications in both drought and irrigated (control) conditions. All replicates were



planted in three-row blocks, each block has 6 m length and 18 cm between rows.

Drought treatment was applied after more than 50% plants flowering by draining the field completely.

#### *Measurement of Chlorophyll Fluorescence and the Agronomic Characters*

The plants for sampling were randomly selected from each plot and the third leaf from the top on the main stem was collected to measure the chlorophyll fluorescence. The capability of reaction center ( $F_v/F_m$ ), and quantum yield (Y), which reflects the efficiency of PSII, were assessed by measuring fluorescence with a pulse-modulated fluorometer (OS5P; Opti-Sciences, Hudson, NH, USA). For  $F_v/F_m$  measurements, the leaves were dark adapted for 30 min (Mohammed, Cothren, Chen, & Tarpley, 2015). The chlorophyll fluorescence was measured 14 days after field being drained.

A total of 10 agronomic traits were measured in the current study. They were filled grain number per panicle, unfilled grain number per panicle, spikelet fertility, filled grain weight per plot, unfilled grain weight per plot, total grain weight per plot, plant dry weight, hundred-seed weight, panicle length, and yield. Yield was calculated in kilogram per hectare, spikelet fertility was calculated in percentage (%) and the rest of the units were measured in gram (g) or centimeter (cm).

Agronomic data were collected from the same plants as for the chlorophyll fluorescence measurement. The ten best panicles from each plot were used to count the grain number including filled and unfilled grain number respectively. Spikelet fertility was calculated from filled and unfilled grain number on each of the selected panicle. All

panicles in each plot were manually threshed and manually separated into the filled and unfilled grain. Filled and unfilled grain data was used to calculate filled grain weight, unfilled grain weight, and total grain weight per plot. Plant dry weight was measured for the above ground part of the plant after air-drying for 7 days according to Beaumont Center Rice Breeding Lab protocol. Filled grain number, unfilled grain number, and spikelet fertility were the averages of 10 panicles from each plot. Hundred-seed weight was the average of three times measurement of 100 randomly selected filled grains. Panicle length was measured as average from 20 panicles in each plot. Yield was multiplied from total grain weight per plot. In order to test the differences, panicle length, filled grain number, unfilled grain number, and spikelet fertility were examined by t-test with  $\alpha = 0.05$ .

### *RNA Extraction and Sequencing*

The second leaves, counted from the top, on the main stem were collected from the same plant as for the chlorophyll fluorescence measurement at the 14 days after field was drained. Leaf samples were wrapped in aluminum foil, plunged into liquid nitrogen immediately and stored in  $-80^{\circ}\text{C}$  freezer before extraction. RNA was extracted by using TRIzol reagent followed by QIAgen RNeasy Plant Mini Kit. RNA quality was determined by 28S to 18S ribosomal RNA ratio by using Agilent 2100 Bioanalyzer. Samples with ratio within range of 1.8-2.2 were used for the library preparation. TruSeq Stranded RNA-Seq libraries were prepped at Texas A&M AgriLife Genomics and Bioinformatics Service (TxGen) as per Standard Operating Protocol (Illumina). Libraries

was run on multiple lanes of an Illumina HiSeq 4000 to provide at least 25 million reads (75 nt pair-end) per sample.

### *Data Processing and Statistical Analysis*

In total, twelve cDNA libraries were made for sequencing including three biological replicates for each treatment. Trimmomatic version 0.36 (Bolger, Lohse, & Usadel, 2014) PE -Phred 33 command was used for quality control using the following steps: (1) raw sequencing reads were trimmed to remove adaptors; (2) low quality bases with quality score less than 20 on the ends and tails of reads were removed; (3) scan the read with a 5 bp sliding window, and remove them when the average quality per bp drops below 20; (4) reads below the 25 bases long were dropped; (5) reads without correspondence read pairs were dropped.

*O. sativa* spp. japonica genome (IRGSP-1.0), Nipponbare, was used as a reference in this study. The reference genome sequence FASTA file and gene annotation GFF file was downloaded from EnsemblPlants (<http://plants.ensembl.org>). HISAT2 version 2.1.0 (Kim, Langmead, & Salzberg, 2015) was used to align the reads to the reference genome sequence. Thereafter, StringTie v1.3.4d (Pertea et al., 2015) was used to assemble the transcripts within the regions and to obtain the gene counts. Differential expression analysis was performed in R software package DESeq2 v1.20 (Love, Huber, & Anders, 2014) with reads normalizing and variance stabilizing transformation to account for library size and sequencing depth differences. In order to determine: (1) whether the genes express differently under drought condition, and (2) whether gene

expression under drought condition was different between the two genotypes; experimental data was tested in Wald test and likelihood ratio test (LRT), respectively. Internally, P-values was adjusted for multiple testing using the Benjamini-Hochberg method in DESeq2 package. Genes with false discovery rate (FDR) adjusted p-value ( $p_{adj}$ )  $< 0.05$  were identified as DEGs.

#### *GO Enrichment and KEGG Pathway Analysis*

GO enrichment was performed online using PANTHER v14.1 (Mi et al., 2019) and KEGG pathway analysis was performed using *clusterProfiler* package in R (Yu, Wang, Han, & He, 2012). In PANTHER v14.1, Fisher's test was used for main statistical analysis and KEGG enrichment was calculated based on hypergeometric distribution. Both analyses were performed with FDR adjusted by Benjamini-Hochberg method internally. GO terms with both P-value  $< 0.05$  and FDR  $< 0.05$  was identified as significant. KEGG pathway with both P-value  $< 0.05$  and FDR  $< 0.1$  was identified as significant.

## **Results**

#### *Agronomic Characters and Chlorophyll Florescence of Two Rice Genotypes*

Agronomic characters were collected from a total of 12 plots, covering 3 replications for each genotype under each condition. Under irrigated condition, the panicle length of Rondo was longer than 4610. 4610 had higher hundred-seed weight than Rondo (Table 1). Under drought treatment, most of agronomic characters were

reduced in both 4610 and Rondo with the exceptions of hundred-seed weight of Rondo and panicle length of 4610 which were the same in two conditions (Table 2). Filled grain number and unfilled grain number of 4610 were increased 1.9% and 47.2% under drought treatment. Filled grain number, spikelet fertility, and hundred-seed weight were significantly different between 4610 and Rondo under drought treatment. Under irrigated condition, Rondo had higher filled grain number than 4610. However, under drought treatment, 4610 turned out to be having higher filled grain number than Rondo. Under drought treatment, 4610 had significantly higher spikelet fertility than Rondo whereas there was no significant difference between the two genotypes under irrigated condition.

Chlorophyll fluorescence was measured with two parameters  $F_v/F_m$  and quantum yield.  $F_v/F_m$  represents the maximum photochemical capacity of Photo-System II photochemistry and quantum yield indicates the number of fluorescent events for each photon absorbed. The ratio of  $F_v/F_m$  can be used to estimate the maximum quantum yield. Under irrigated condition, 4610 had 0.73 of  $F_v/F_m$  and quantum yield of 0.37, and Rondo had 0.75 of  $F_v/F_m$  and quantum yield of 0.22. Under drought treatment, 4610 had 0.71 of  $F_v/F_m$  and quantum yield of 0.26, and Rondo had 0.71 of  $F_v/F_m$  and quantum yield of 0.26 (Table 3). Both 4610 and Rondo had reduced values of  $F_v/F_m$  under drought treatment. However, the quantum yield was increased in Rondo under drought treatment.

**Table 1. Effect of variety on yield-related traits under drought treatment.**

	Cultivar	
	4610	Rondo
(1) Filled grain number/ panicle*	69.5	58.9
(2) Unfilled grain number/ panicle	31.2	30.5
(3) Spikelet fertility (%)*	69.5	65.9
(4) Filled grain weight (g)/ plot	55.3	43.7
(5) Unfilled grain weight (g)/ plot	4.1	4.6
(6) Total grain weight (g)/ plot	59.5	48.3
(7) Plant dry weight (g)	126.6	117.3
(8) Hundred-seed weight (g)**	2.9	2.6
(9) Panicle length (cm)	19.5	19.5
(10) Yield (kg/ha)	9850.04	9035.18

<sup>a)</sup> Traits with “\*” and “\*\*” indicates that the difference between the two cultivars is significant by  $p < 0.05$  and  $p < 0.001$ , respectively.

**Table 2. Effect of variety on yield-related traits under irrigated treatment.**

	Cultivar	
	4610	Rondo
(1) Filled grain number/ panicle*	68.2	80.1
(2) Unfilled grain number/ panicle*	21.2	27.5
(3) Spikelet fertility (%)	76.9	74.3
(4) Filled grain weight (g)/ plot	77.3	63.8
(5) Unfilled grain weight (g)/ plot	5.7	6.9
(6) Total grain weight (g)/ plot	83.0	70.7
(7) Plant dry weight (g)	200.76	163.9
(8) Hundred-seed weight (g)**	2.9	2.7
(9) Panicle length (cm)**	19.5	21.6
(10) Yield (kg/ha)	10666	10351

<sup>a)</sup> Traits with “\*” and “\*\*” indicates that the difference between the two cultivars is significant by  $p < 0.05$  and  $p < 0.001$ , respectively.

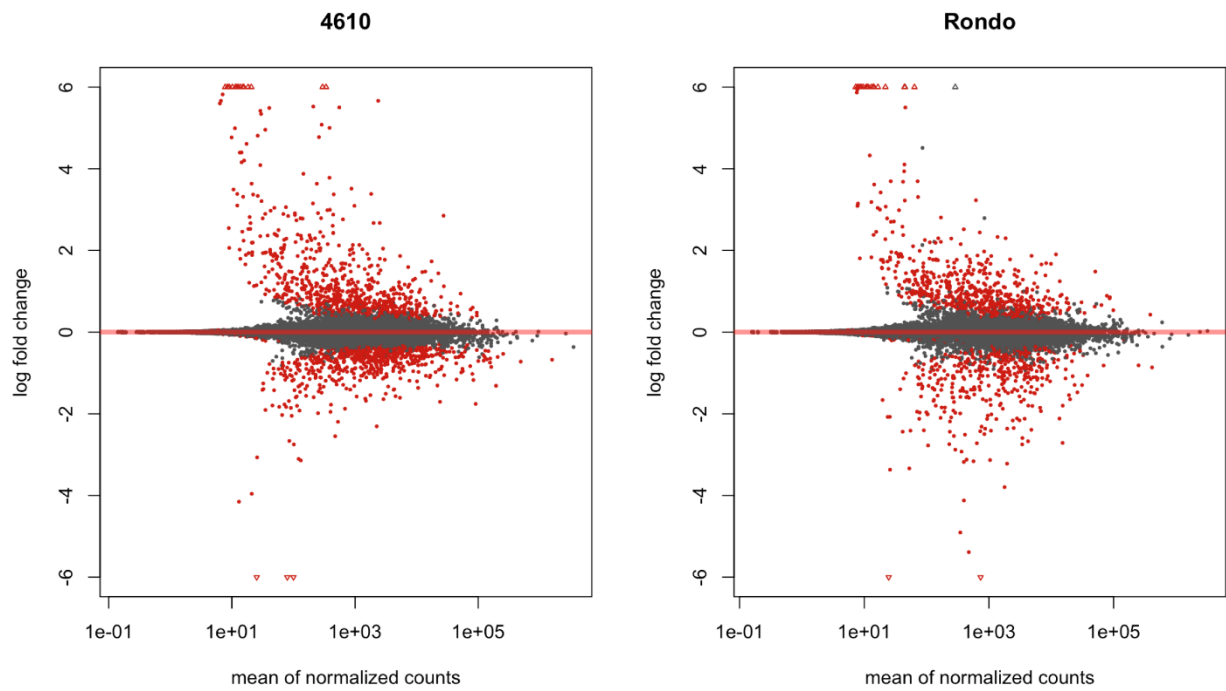
**Table 3. Chlorophyll fluorescence under irrigated and drought conditions.**

Genotype	Condition	Chlorophyll fluorescence	
		$F_v/F_m$	Quantum yield (Y)
Rondo	Irrigated	0.75	0.22
Rondo	Drought	0.71	0.26
4610	Irrigated	0.73	0.37
4610	Drought	0.71	0.26

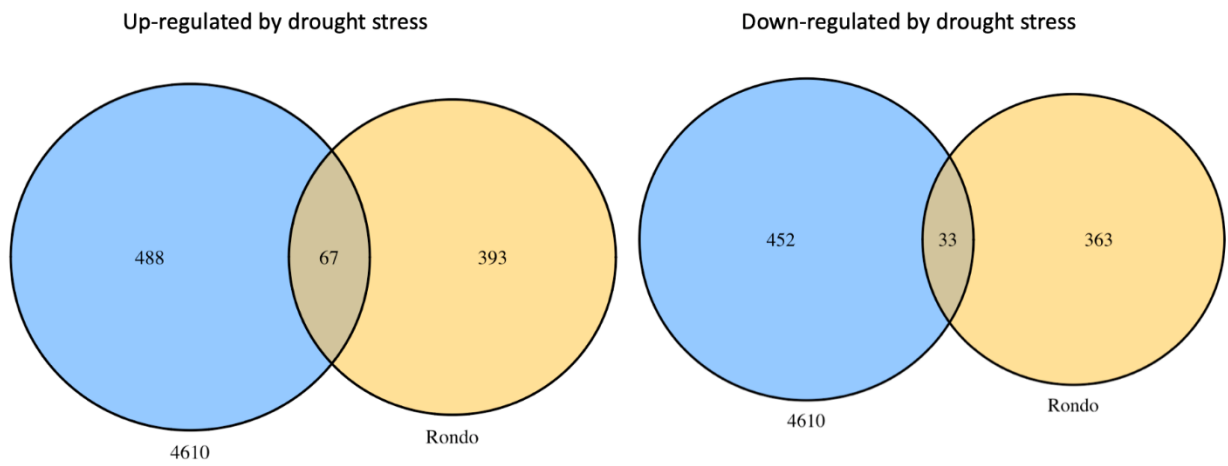


### *Characterization of Drought Stress Responsive DEGs*

The expression levels of 46046 annotated rice genes were subjected to differential expression test in DESeq2 package in R. By comparing irrigated control and drought treatment of the two genotypes, 1040 and 856 genes were identified to be differentially expressed under drought stress for 4610 and Rondo with FDR less than 0.05, respectively (Fig. 1). Among all DEGs, 4610 and Rondo had 555 and 460 up-regulated genes, and 485 and 396 down-regulated genes, respectively (Fig. 2). While for the two genotypes, there were 67 up-regulated and 33 down-regulated DEGs in common. The commonly up-regulated genes including many known drought responsive genes including bZIP transcription factor (OS01G0658900), LEA proteins (OS01G0705200, OS11G0454200), HSPs (OS02G0232000, OS03G0277300), ROS scavenger ascorbate peroxidase (OS04G0434800), and other drought tolerance proteins such as the rare cold-inducible 2 family protein (RCI2, OS03G0286900) and the drought and salt stresses responses 1 (OsDSSR1, OS09G0109600). On the other hand, the commonly down-regulated genes included the regulation of grain size (*GS5*, OS05G0158500), branching, photosynthesis, and grain weight (*MIR8*, OS01G0322700), cytokinin-activating (*LOG1*, OS01G0588900), and cytokinin signaling (*CKT1*, OS02G0738400).



**Figure 1. Differentially expressed genes (DEGs) in two genotypes. Genes with false discovery rate (FDR) adjusted p-value ( $p_{adj}$ ) < 0.05 were identified as DEGs.**



**Figure 2. Overlapping among DEGs regulated by stress between moderate-tolerant genotype 4610 and susceptible genotype Rondo.**

### *GO Enrichment Analysis*

To explore the common and specific responses to drought, GO enrichment analyses of all the DEGs were performed, and a total of 127 gene categories were significantly enriched. 4610 had 36 up-regulated categories including 25 Biological Process (BP) and 11 Molecular Function (MF), and Rondo had 37 up-regulated categories including 11 BP, 21 MF, and 5 Cellular Component (CC). For down-regulated categories, 4610 had a total of 24 categories with 7 BP, 12 MF, and 5 CC; whereas Rondo had 10 BP, 18 MF, and 2 CC. The enrichment analysis was not significant for both up-regulated and down-regulated common DEGs. Notably, 4610 had many DEGs categorized as biological processes, including response to stress, response to oxidative stress, response to stimulus, response to ROS, glutathione metabolic process (Table 4). On the contrary, Rondo had no significant enrichment for these stress responsive categories. Among the enriched biological process categories of Rondo were signal transduction, regulation of biological quality, and ion homeostasis. DEGs involved in the stress responsive GO terms in Table 3A including APXs, Dehydrin family proteins, heat stress transcription factors, and HSPs.

Down-regulated DEGs also enriched in distinct categories between 4610 and Rondo (Table 5). 4610 had DEGs involved in photosynthesis, cellular component assembly and metabolic process; whereas Rondo had DEGs enriched in different stress responses and a hormone-mediated signaling pathway. Among the photosynthesis genes of 4610, one was Oxygen-evolving enhancer protein (OS07G0544800); while the Chlorophyll a-b binding protein (OS02G0764500) appeared in both 4610 and Rondo. The DEGs of Rondo enriched in the hormone-mediated signaling pathway, including the ABA receptor (OS05G0213500) and four pathogenesis-related (PR) genes. The same five DEGs in hormone-mediated signaling pathway were also enriched in response to abscisic acid of Rondo (Table 3B).

**Table 4. Gene ontology (GO) of biological process classification of up-regulated DEGs between 4610 and Rondo.**

Biological process	GO ID	4610	FDR	Rondo	FDR
Response to stress	GO:0006950	24	8.27E-08	6	ns
Response to oxidative stress	GO:0006979	10	9.86E-07	1	ns
Response to osmotic stress	GO:0006970	7	1.03E-04	1	ns
Response to stimulus	GO:0050896	29	2.23E-05	14	ns
Response to reactive oxygen species	GO:0000302	10	1.70E-09	1	ns
Response to cold	GO:0009409	4	7.28E-03	2	ns
Response to drug	GO:0042493	7	1.72E-05	0	ns
Response to heat	GO:0009408	14	2.83E-08	3	ns
Response to toxic substance	GO:0009636	11	7.22E-04	2	ns
Fatty acid catabolic process	GO:0009062	4	1.59E-02	0	ns
Protein folding	GO:0006457	17	4.96E-07	3	ns
Glutathione metabolic process	GO:0006749	6	2.00E-02	0	ns
Organic substance catabolic process	GO:1901575	11	1.38E-03	4	ns

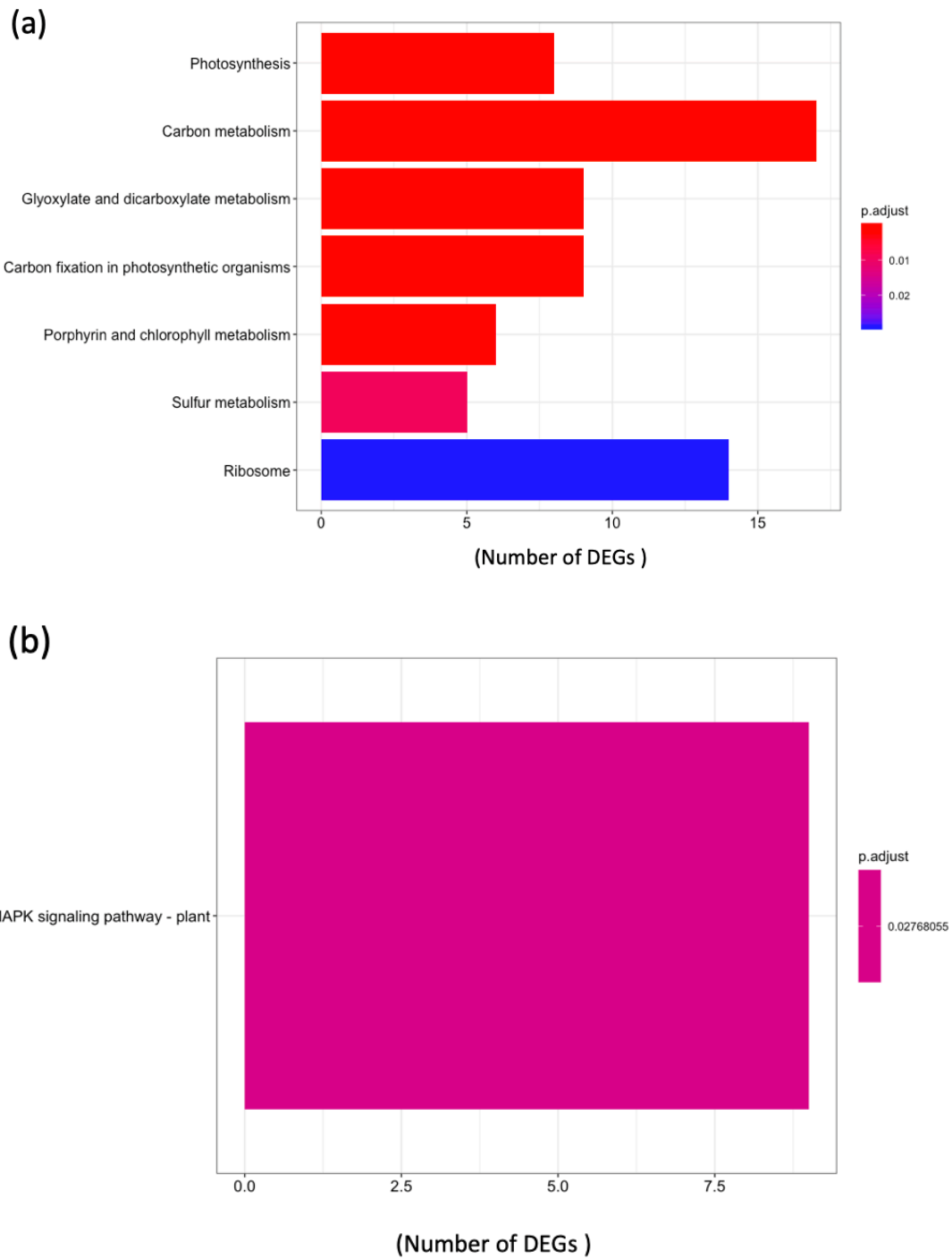
**Table 5. Gene ontology (GO) of biological process classification of down-regulated DEGs between 4610 and Rondo.**

Biological process	GO ID	4610	FDR	Rondo	FDR
Photosynthesis	GO:0015979	5	2.14E-02	2	ns
Organic substance biosynthetic process	GO:1901576	16	4.74E-02	2	ns
Plastid organization	GO:0009657	5	4.19E-02	0	ns
Cellular component assembly	GO:0022607	7	2.64E-04	0	ns
Metabolic process	GO:0008152	76	2.17E-02	51	ns
Response to stimulus	GO:0050896	7	ns	21	3.03E-03
Response to chemical	GO:0042221	4	ns	12	1.95E-02
Response to abscisic acid	GO:0009737	0	ns	5	7.62E-03
Hormone-mediated signaling pathway	GO:0009755	0	ns	5	1.78E-02

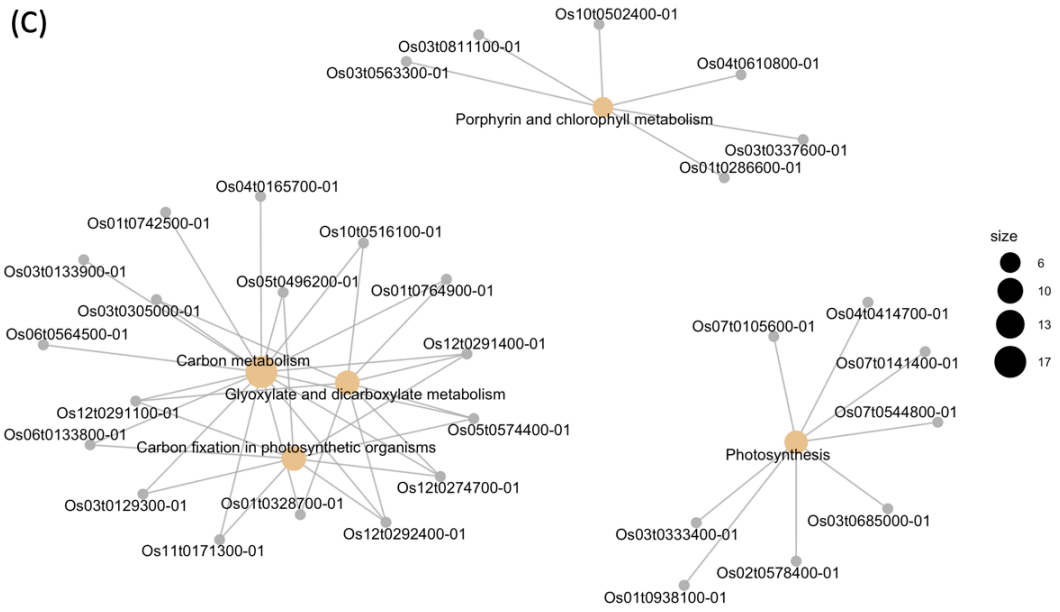
### *Pathway Enrichment Analysis*

Among the four categories of DEGs: 4610 up-regulated, 4610 down-regulated, Rondo up-regulated, and Rondo down-regulated, only 4610 down-regulated DEGs and Rondo down-regulated DEGs had the enriched pathways (Fig. 3). The 4610 down-regulated DEGs had 7 enriched pathways including photosynthesis, carbon metabolism, glyoxylate and dicarboxylate metabolism, carbon fixation in photosynthesis organisms, porphyrin and chlorophyll metabolism, sulfur metabolism, and ribosome (Fig. 3A). Rondo down-regulated DEGs had only MAPK signaling pathway enriched (Fig. 3B). Among the seven enriched pathways of 4610 down-regulated DEGs, there were three pathways, carbon metabolism, glyoxylate and dicarboxylate metabolism, and carbon fixation in photosynthesis organisms that interacted with each other (Fig. 3C). However, another 3 photosynthesis-related pathways, photosynthesis, carbon fixation in photosynthesis organisms, and porphyrin and chlorophyll metabolism that did not share any common genes between pathways.





**Figure 3. KEGG enrichment analysis of down-regulated DEGs. (a) Pathway of down-regulated DEGs in 4610. (b) Pathway of down-regulated DEGs in Rondo. (c) Interaction between enriched pathways in 4610.**



**Figure 3. Continued.**

## Discussion

### *Agronomic and Physiological Performance and Gene Regulation under Drought Stress*

Previous researches indicated that water stress reduces plant biomass, grain size, panicle development, and fertility (Garrity & O'Toole, 1994; van der Weijde et al., 2017; Zhang et al., 2018). The results also showed that panicle number, filled grain number, spikelet fertility, grain weight, plant dry weight, panicle length, and yield were decreased under drought stress. After further evaluation of the DEGs and enrichment analysis, I found that genes involved in the regulations of branching, grain weight, grain size, and photosynthesis were significantly decreased in both genotypes. According to Rice Annotation Project Database (RAP-DB, <https://rapdb.dna.affrc.go.jp>), *MIR408* (OS01G0322700) is involved in regulation of panicle branching, grain weight, grain yield and photosynthesis. *GW5* (OS05G0158500) is a serine carboxypeptidase, which acts as a positive regulator of grain size. The expression of *MIR408* was decreased 2 and 4 times in Rondo and 4610, respectively. Comparing to the panicle numbers, Rondo had 10% reduction of panicle numbers; whereas that of 4610 was 35% (Appendix Table1). Although the panicle number is determined before the drought stress was imposed, the drought stress may still affect the initiation of the secondary panicles. *GW5* had decreased expression level with 2 times in both genotypes under drought stress. Therefore, our study suggests that the down-regulated of *MIR408* and *GW5* may partially contribute on the reduction of panicle numbers and hundred-seed weight under drought stress condition.

### *Diagnosis of DEG analysis*

The MA plot and the p-value distribution histogram are two classic diagnostic plots for DEG analysis that can be used to diagnosis whether the results and the methods are appropriate. The MA plots were symmetrical with the horizontal line log<sub>2</sub> fold-change equal to 0 (Fig. 1). This indicated that the read counts of all samples had been normalized as expected. The MA plot also showed that genes expressed with no significant differences (black dot) were clustered around log<sub>2</sub> fold-change equal to 0, indicating the relationship between fold-change and p-value was held. The p-value distribution histogram showed the proportion of p-value, which can be used to diagnosis whether the multiple testing approach is reliable. The results showed that the raw p-value of genotype-by-treatment effect and treatment effect in Rondo, were U-shaped, with p-values dense near 0 and 1, and spread uniformly in between (Appendix Fig. 1 and 3). The p-value distribution of treatment effect in 4610 was most dense near 0 and became less dense as the p-values increase (Appendix Fig. 2). Both two shapes indicated the results of multiple testing were reliable. The green histogram showed that the proportion of padj less than 0.05 were very few in three DEG analysis, which indicated that the DEGs analysis with FDR control was appropriate and stricter (Appendix Fig. 1-3).

### *Expression Patterns of Drought Responsive Gene Families*

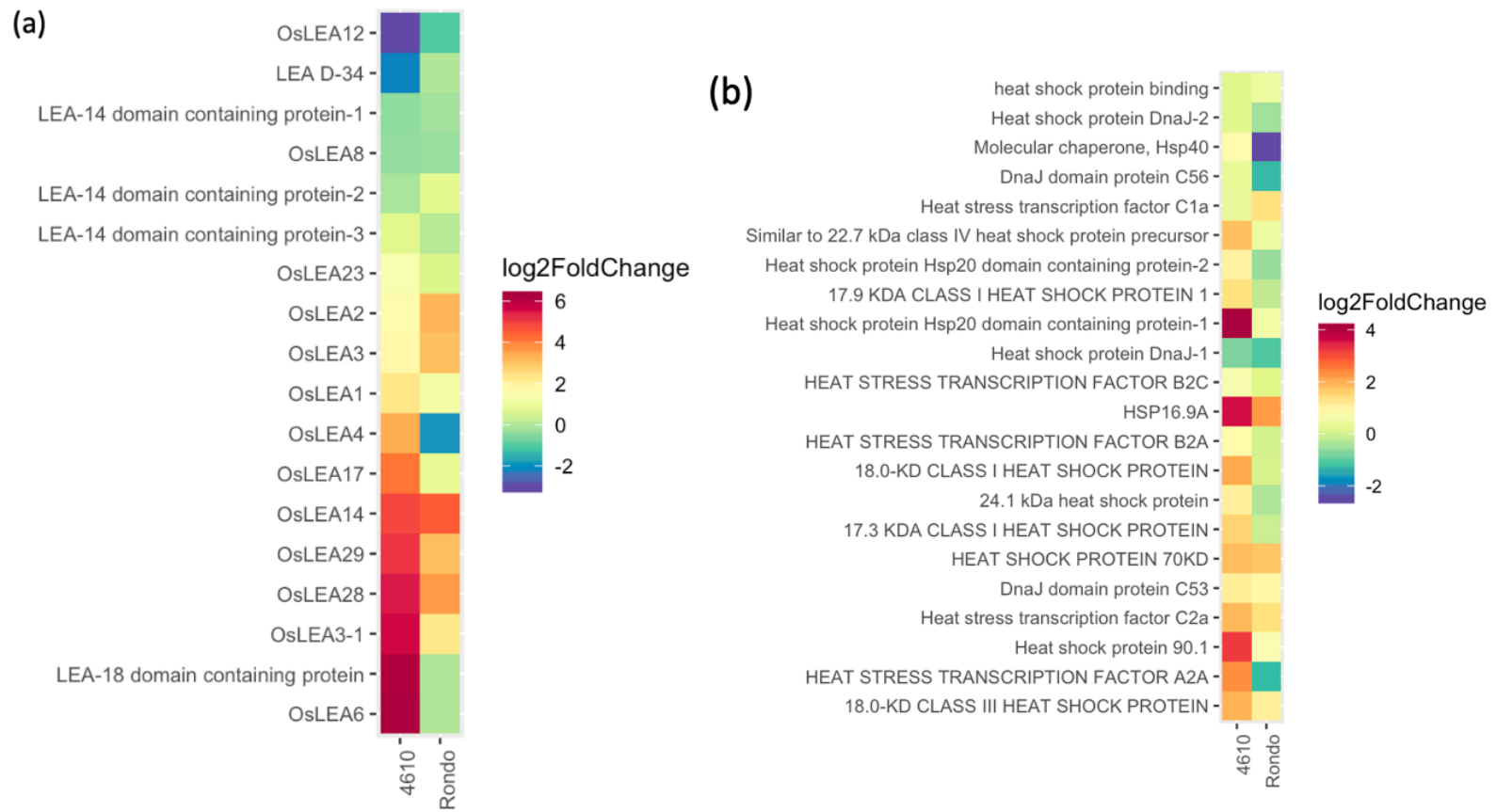
The DEGs profile showed that bZIP transcription factors, LEA proteins, HSPs, and other drought tolerance proteins were up-regulated in both 4610 and Rondo. GO

enrichment results also showed that 4610 had many more DEGs involved in the stress responsive categories. To further study the expression pattern between the two genotypes, I developed gene lists based on drought-related categories and compared the log<sub>2</sub> fold-change of expression level between 4610 and Rondo. The log<sub>2</sub> fold-change was obtained from the differential gene expression analysis which indicated the gene expression difference between the drought and control conditions.

LEA protein is an unfolded aqueous solution acting as the substitute of water, that can prevent protein aggregation in a cell during water stress, which allows the cell to maintain its function (Goyal, Walton, & Tunnacliffe, 2005). Therefore, LEA proteins were annotated as drought and cold tolerance protein and have been overexpressed in many different plants, including brassica and rice, to improve their tolerance to such stresses (Dalal, Tayal, Chinnusamy, & Bansal, 2009; Xiao, Huang, Tang, & Xiong, 2007). The results showed that under drought condition, many LEA family proteins had higher expression level in 4610 than Rondo (Fig. 4A). *OsLEA23*, *OsLEA14*, *OsLEA29*, *OsLEA28*, and *OsLEA3-1* were differentially expressed under drought, and clearly show that *OsLEA29*, *OsLEA28*, and *OsLEA3-1* were expressed 2 to 8 times higher in 4610 than Rondo. Other than LEA proteins, HSPs also play a role in helping with the protein folding and damage prevention under the stress (Lee et al., 2005). The results showed that a number of HSPs also expressed higher level in 4610, especially *Hsp20*, *HSP16.9A*, *Hsp 90.1* and transcription factor *A2A*. Notably, a chaperone protein *Hsp40* was significantly decreased in Rondo (Fig. 4B). Some of bZIP transcription factors have also been known to enhance the gene regulation under stress in rice (Liu et al., 2014). The

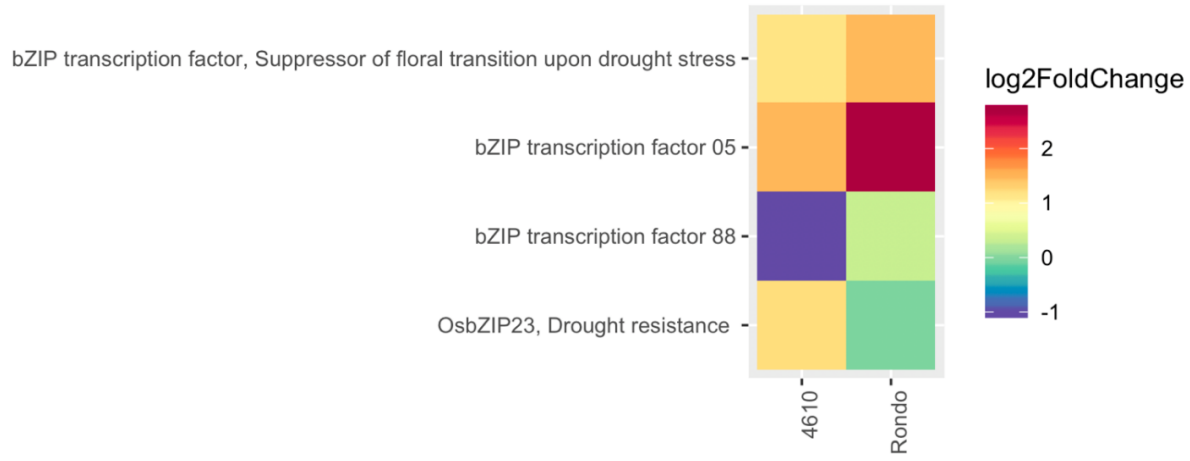
results showed that a few members of the bZIP transcription factors were up-regulated in both 4610 and Rondo (Fig. 4C). *OsbZIP23* (OS02G0766700), was known to be involved in drought resistance was more upregulated in 4610. Notably, two *bZIP* transcription factors related to the ABA signaling were more up-regulated, and a flowering promotion gene (OS05G0518000) was down-regulated in 4610, indicating that 4610 might delay the subsequent flowering to escape drought stress. This strategy has been demonstrated in orange (Juan Carlos, Jill, Albrigo, & James, 2010) and rice (Zhang et al., 2016). Notably, bZIP transcription factor *05* was actually expressed with higher level in Rondo.

Aside from gene families above, DREB genes also annotated as drought and cold tolerance gene by regulating drought and cold stress response gene in the ABA-independent pathway (Lata & Prasad, 2011; Shinozaki & Yamaguchi-Shinozaki, 2000). However, in the current transcription profile among a total of 19 annotated DREB family genes in rice, none of them was significant differentially expressed.



**Figure 4. The expression differences between 4610 and Rondo. (a) Late embryogenesis abundant (LEA) proteins. (b) Heat shock proteins (HSPs). (c) bZIP transcription factors.**

(c)

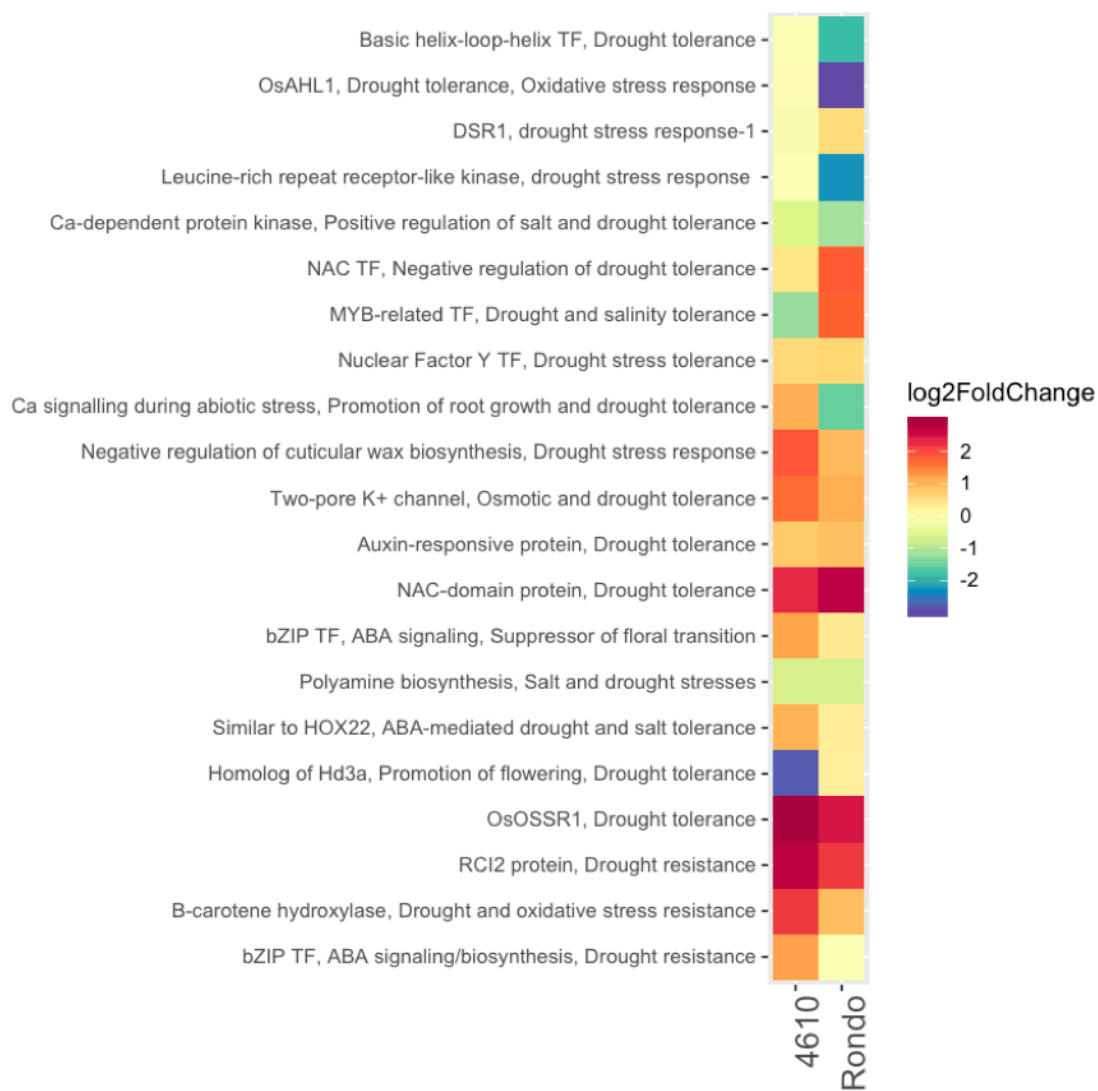


**Figure 4. Continued.**



### *Expression Patterns of Other Drought Tolerance Genes*

Some of the genes related to drought tolerance or drought resistance were included NAC transcription factors (Zheng, Chen, Lu, & Han, 2009), Calcium-dependent protein kinase (Zou et al., 2010), Calcium signaling (Cheong et al., 2003), potassium channel (Mian, Ahmad, & Maathuis, 2016), ABA signaling (Kizis & Pagès, 2002), RCI2 protein (Li et al., 2014), and beta-carotene hydrolase (Du et al., 2010). To better understand the differences of gene expressions between 4610 and Rondo under drought stress, those related-tolerance genes were obtained from RAP-DB and were investigated. The log<sub>2</sub> fold-change results showed that the basic helix-loop-helix transcription factor (OS03G0741100), *OsAHL1* (OS03G0741100), and *Leucine-rice receptor like kinase* (OS02G0154000) were significantly down-regulated in Rondo while there were no differences in expressions in 4610 under drought stress (Fig. 5). For other genes, such as the two-pore K<sup>+</sup> channel (OS07G0108800), *OsDSSRI*, *RIC2*, and *beta-carotene hydrolase*, were up-regulation in both genotypes with higher expression level in 4610 was observed. Thereby, the drought tolerance of 4610 might be significantly enhanced. Further, a negative regulator of the drought tolerance transcription factor, *NACTF* (OS08G0200600) was significantly up-regulated in Rondo (Fig. 5). The down-regulated MAPK pathway, which transmits the signals to activate tolerance response (Mizoguchi, Ichimura, & Shinozaki, 1997), was also enriched in Rondo (Fig. 3B). Interestingly, a negative regulator of the cuticular wax biosynthesis gene (OS02G0682300), which reduces drought tolerance, was also significantly up-regulated in 4610.

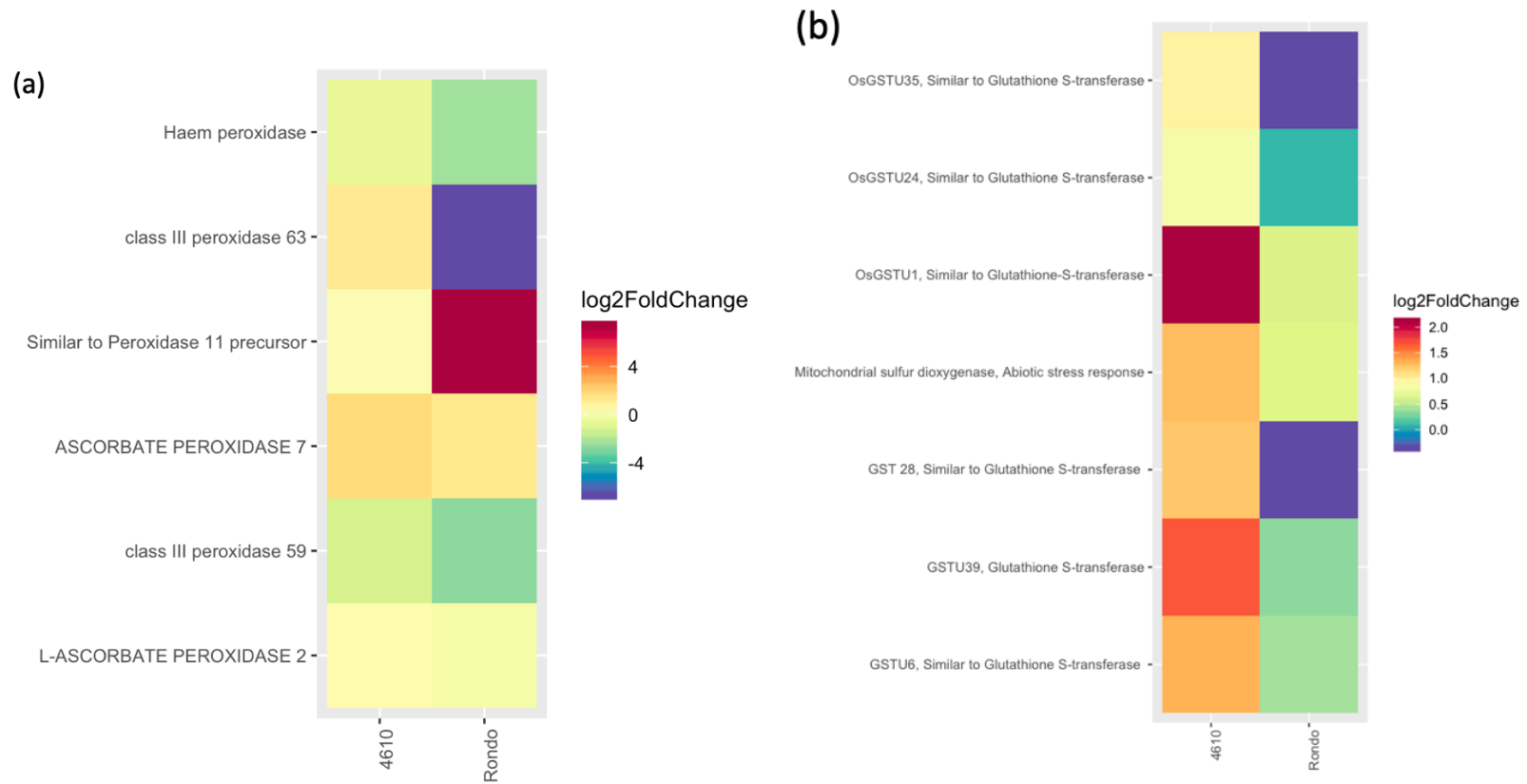


**Figure 5. The expression difference of annotated drought tolerance genes in 4610 and Rondo.**

### *ROS Scavengers Enhanced Drought Tolerance*

ROS scavengers play an important role in stress tolerance mechanisms in plants (Das & Roychoudhury, 2014). Under drought stress, the increased ROS accumulation (Mittler, 2002) cause oxidative stress and damage at different levels such as proteins, lipids, DNA and RNA (Chool Boo & Jung, 1999; Moran et al., 1994; Sgherri, Pinzino, & Navari-Izzo, 1993). There are ROS scavenging mechanisms in plants that are able to protect the cells under drought stress, such as the scavenging enzymes and non-enzyme antioxidants. There are two main enzymes that act in the ascorbate/glutathione scavenging pathway, the APXs and the glutathione reductases (GR), which can convert toxic  $O_2^-$  to  $H_2O$  (Foyer & Noctor, 2011). Other than APXs and GRs, other ROS scavenging enzymes including superoxide dismutase (SOD), catalase (CAT), and glutathione S-transferases (GSTs) (Cruz de Carvalho, 2008; Kumar & Trivedi, 2018). Therefore, we subtracted the log<sub>2</sub> fold-change of ROS scavenging enzymes from significant DEGs to further evaluate their expression levels. The results showed that *APX7* (OS04G0434800) was up-regulated in both genotype with higher expression level in 4610 (Fig. 6A). Interestingly, *peroxidase 11 precursor* (OS06G0274800) was expressed higher in Rondo. For GSTs, *GSTU1* (OS03G0785900), *GST28* (OS03G0785900), *GST39* (OS03G0785900), *GST6* (OS01G0692000), and *mitochondrial sulfur dioxygenase* (OS01G0667200) were expressed higher in 4610 (Fig. 6B).

Although *GST* is not directly involved in ascorbate/glutathione scavenging pathway, previous study has revealed that GST can protect cell from oxidative damage by quenching reactive molecules with the addition of glutathione (Kumar & Trivedi, 2018), and GSTs also have been proved to enhance chilling and drought tolerance in rice (Guo, Ou, Lu, & Zhong, 2006). For SOD and CAT, the results did not show any significant DEGs belonging to these two categories. Therefore, this study suggests that ROS scavengers APXs and GSTs play an important role in enhancing drought tolerance in 4610.



**Figure 6. The expression difference of ROS scavenging genes in 4610 and Rondo. (a) Peroxidases. (b) Glutathione S-transferases (GSTs).**

## **Conclusion**

The study showed that filled grain number, spikelet fertility, grain weight, plant dry weight, and yield were decreased for both genotypes under drought stress. Based on the relative agronomic performances of the two rice genotypes under control and drought conditions, 4610 had better performance than Rondo under drought stress condition. The results from the transcriptomic study also indicated that 4610 had more stress responsive genes that were differentially expressed than its counterpart. Furthermore, several known genes families related to drought stress or stress-related conditions were also identified in 4610 up-regulated genes, including the LEA proteins and HSPs. The ROS scavengers, especially APXs and GSTs, also had higher expression in 4610, which may enhance the tolerance of 4610. Further validation of drought-related DEGs can be validated by qPCR.

## CHAPTER III

### REFERENCE-GUIDED DE NOVO GENOME ASSEMBLY TO DISSECT A QTL REGION FOR SUBMERGENCE TOLERANCE IN CIHERANG-SUB1

#### **Introduction**

Rice (*Oryza sativa* L.) is a staple food that feeds more than half of the world population (Ricepedia, <http://ricepedia.org/rice-as-food/the-global-staple-rice-consumers>). Submergence induces hypoxia stress for plants which inhibits photosynthesis, leads to anaerobic metabolism, and may reduce crop productivity dramatically (Fukao & Bailey-Serres, 2004). In the U.S., for example, the recent hurricane Harvey brought heavy rain and rapid flood and caused \$7.5 million in losses for rice and soybean in Texas in 2017 (Fannin, 2017). Due to the climate change, extreme weather events have increased the frequency of severe flooding which significantly affect agriculture, including rice production both in the US and internationally. A strong submergence tolerance gene, *Submergence 1 (SUB1)* from a landrace FR13A had been cloned and introgressed into a few popular rice varieties (Septiningsih et al., 2009; Xu et al., 2006). *Sub1A* is an ethylene-response factor (ERF) which is activated by ethylene accumulation caused by water jacket effect during hypoxia circumstances (Glinski, 2018). Recently, a novel submergence tolerance QTL, *qSub8.1* was identified and mapped on chromosome 8 from a SUB1-tolerant allele fixed RIL mapping population, derived from Cihorang-Sub1 and IR10F365 (Gonzaga et al.,

2017). Ciherang-sub1 was developed from a cross of Ciherang, a popular variety from Indonesia, and IR64-Sub1. IR10F365 is an advanced breeding line having the *SUB1* gene. It was hypothesized that this QTL may have a complimentary effect with the *SUB1A* gene in the events of submergence during vegetative stage. A variety with prolonged submergence tolerant would be beneficial to maintain rice production when we face the increasing effects of climate change.

The goals of this study were to characterize the region of *qSub8.1*, and obtain sequence information of the three cultivars to facilitate candidate gene identification and validation, and DNA marker development for recombinant identification and molecular breeding. In order to fully understand the genome profile and genome-wide nucleotide information, a whole genome shotgun sequencing and a reference-guided *de novo* genome assembly were performed in the current study. WGS is a NGS method that cuts the whole genome into small pieces and sequences each of them in a particular way. DNA was isolated from leaf samples of Ciherang-Sub1 and its parental cultivars, Ciherang and IR64-Sub1. The high quality DNA samples were then sent for 150 bp pair-end WGS. Reads were first *de novo* assembly to construct scaffolds; thereafter the scaffolds were aligned to a reference genome to obtain the relative orders to build the genome. Based on the alignment to the reference sequence Nipponbare, Ciherang-Sub1, Ciherang and IR64-Sub1 have genome sizes of 345.4 Mb, 343.7 Mb, and 344.7 Mb, respectively. On the other hand, based on the alignment to the *indica* reference, Minghui 63 (MH63) (Zhang et al., 2016), Ciherang-Sub1, Ciherang and IR64-Sub1 have genome sizes of 354.9 Mb, 353.9 Mb, and 353.9 Mb, respectively.



## Materials and Methods

### *Plant Materials*

Ciherang-Sub1, which carries the novel submergence tolerance QTL *qSub8.1* (Gonzaga et al., 2017), was derived from a cross of the submergence susceptible parent Ciherang, a popular variety from Indonesia, and the submergence resistant parent IR64-Sub1 (Septiningsih et al., 2014). In order to characterize *qSub8.1*, Ciherang-Sub1, Ciherang, and IR64-Sub1 were selected for the whole genome sequencing and assembly. The seeds of Ciherang-Sub1, Ciherang, and IR64-Sub1 were imported from the International Rice Research Institute (IRRI), Philippines for the experiment and were planted in a quarantined greenhouse in Texas A&M AgriLife Research Center in Beaumont, Texas in 2017 for seed productions.

### *Whole Genome Sequencing and Assembly*

DNA was collected from healthy leaves from the three cultivars and stored in -80°C freezer before extraction. A modified CTAB method was used to obtain high quality of DNA (Doyle, 1987), with 2% CTAB, 100 mM Tris (Tris(hydroxymethyl)aminomethane), 700 mM NaCl, 20 mM EDTA, 0.9% sodium bisulfate, 4% polyvinylpyrrolidone (PVP-40) and 0.5%  $\beta$ -mercapto-ethanol. DNA quality was assessed using Agilent 2100 Bioanalyzer and libraries were prepared at the Texas A&M AgriLife Genomics and Bioinformatics Service (TxGen). Whole-genome shotgun sequencing of the three rice genomes was performed on Illumina HiSeq4000

platform to provide at least 80-100 million reads per sample, with 150 bp pair-end. The quality control of raw reads was performed using Trimmomatic version 0.36 (Bolger et al., 2014) with PE -Phred 33 command. The quality control was determined using the following steps: (1) raw sequencing reads were trimmed to remove adaptors; (2) low quality bases with quality score less than 20 on the ends and tails of reads were removed; (3) reads were scanned with a 5 bp sliding window, and an average quality of sequences per bp drops below 20 were removed ; (4) reads less than the 25 bases long were dropped; and (5) reads without correspondence read pairs were dropped. SOAPdenovo2 version r240 (Luo et al., 2012) was used to perform the *de novo* assembly. In SOAPdenovo2, both *-63mer* and *-127mer* were used. MUMmer version 3.23 (Kurtz et al., 2004) was used for aligning *de novo* scaffolds and contigs to (1) *O. sativa* L. spp. japonica reference genome (IRGSP-1.0); and (2) *O. sativa* L. spp. indica reference genome to decide the order of all scaffolds and contigs. Reference genome of indica rice cultivar MH63 version 2 (MH63RS2) was downloaded from the Rice Information GateWay (RIGW, <http://rice.hzau.edu.cn/rice/>). Following this, three genomes were constructed by re-orienting and connecting all the scaffolds and contigs according to their order.

### *Variants Calling*

The *O. sativa* L. spp. japonica reference genome (IRGSP-1.0) was used as a reference genome in the assembly. Reads were sorted by individual sample and aligned to the reference genome using the Bowtie2 v2.2.9 (Langmead & Salzberg, 2012) with

default parameters for end-to-end mode. The likelihood of each genotype was computed and summarized using *samtools mpileup* function in SAMtools v0.1.19 (H. Li et al., 2009), and the actual variant calling was performed using *bcftools -bvcg* function. SNPs were identified when there were polymorphisms between the three cultivars.

To make the genome structure graph, SNPs of Ciherang-Sub1 were compiled with two different window sizes, 50k and 100k. That is, the physical distance 50k and 100k were used as a block, calculated total SNP types (Ciherang-alike or IR64-Sub1-alike) within the block and decided the dominant SNP to represent each block.

## Results

### *Genome Assembly and Validation*

The Illumina sequencing results showed that there were more than 100 million raw reads in each cultivar and more than 93% of the raw read-pairs were good quality that can be used in *de novo* assembly (Table 6). A total of 102,213,313 reads of Ciherang-Sub1 genome, corresponding to 15,331,996,950 bp were generated, and represented 38-fold sequencing depth and covered 91% of the Nipponbare reference genome or 90.5% of the MH63 reference genome (Table 7). Reference-guided *de novo* assembly of three cultivars was combined *de novo* assembler SOAPdenovo2 with reference genome alignment (Fig. 7). In the first step, reads were *de novo* assembly with two different functions, *63mer* and *127mer*, separately. The results showed that all three cultivars had better average scaffold length, length of longest scaffold, and N50, which

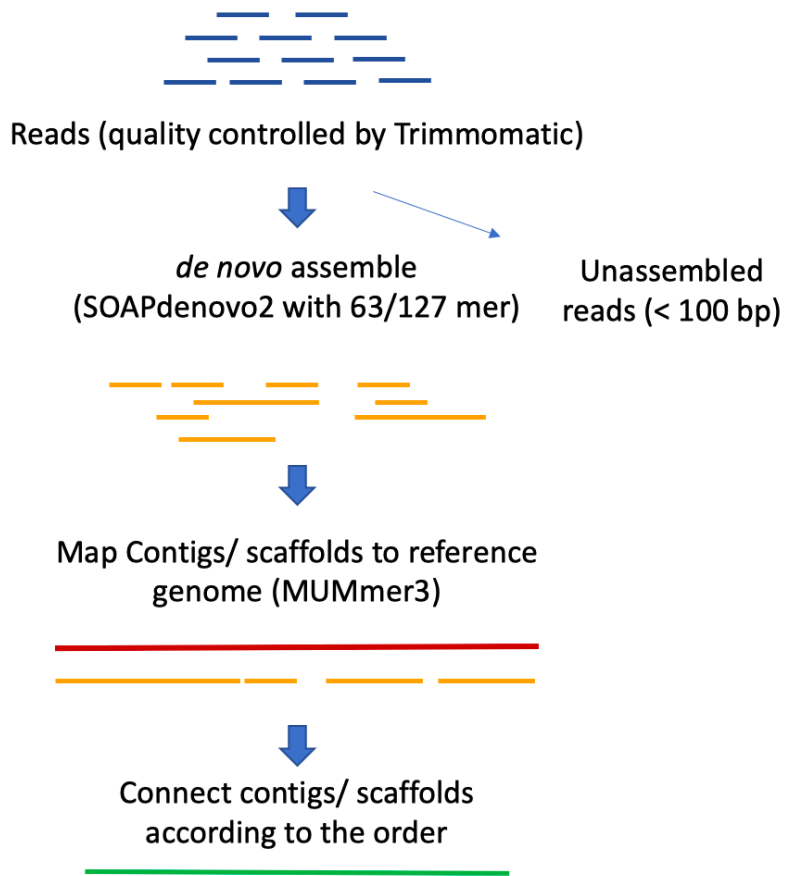
demonstrate the length of the 50<sup>th</sup> percentile of scaffolds in determining the assembly quality were also assessed, with *63mer* (Table 8). The average scaffold length (bp) of Ciherang-Sub1, Ciherang and IR64-Sub1 were 6907, 7456, and 7521 with *127mer*; whereas, 7819, 8115, and 8321 with *63mer*, respectively. The longest scaffold (bp) of Ciherang-Sub1, Ciherang and IR64-Sub1 were 80935, 101859, and 120411 with *127mer*; and 212257, 210201, 210221 with *63mer*, respectively. The N50 of Ciherang-Sub1, Ciherang and IR64-Sub1 were 11298, 12635, and 12524 with *127mer*; and it was more than twice as long in *63mer* with 25138, 25390, and 26139 in the three cultivars, respectively. Therefore, the scaffolds assembled with *63mer* were used in the next step. All scaffolds were aligned to the Nipponbare reference genome and the MH63 reference genome separately with *nucmer* function. The scaffolds were then connected based on their orders to become a complete genome. The results showed that Ciherang-Sub1, Ciherang, and IR64-Sub1 had genome size of 345.4 Mb, 343.7 Mb, and 344.7 Mb with 91%, 90.6%, and 90.8% coverage based on the Nipponbare reference genome (Table 7). For alignment based on MH63 reference genome, Ciherang-Sub1, Ciherang, and IR64-Sub1 had genome size of 354.9 Mb, 353.9 Mb, and 353.9 Mb with 90.5%, 90.2%, and 90.2% coverage, respectively.

**Table 6. Results of raw reads cleaning.**

Variety	Number of raw read pairs	Number of read pairs after trimming
Ciherang-Sub1	107,957,981	102,213,313 (94.68%)
Ciherang	122,304,187	115,172,273 (94.17%)
IR64-Sub1	122,140,197	114,085,140 (93.41%)

**Table 7. General sequencing statistics and summary of assembly.**

Variety	Number of reads	Total read length (bp)	Sequencing depth (X)	Genome size (bp)	
				Nipponbare reference	MH63 reference
Ciherang-Sub1	102,213,313	15,331,996,950	38	345,442,284 (91.0%)	354,934,762 (90.5%)
Ciherang	115,172,273	17,275,840,950	43	343,737,849 (90.6%)	353,859,778 (90.2%)
IR64-Sub1	114,085,140	17,112,771,000	43	344,678,967 (90.8%)	353,859,751 (90.2%)



**Figure 7. Reference-guided *de novo* assembly pipeline.**

**Table 8. Summary of *de novo* assembled scaffold.**

	127mer			63mer		
	Ciherang-Sub1	Ciherang	IR64-Sub1	Ciherang-Sub1	Ciherang	IR64-Sub1
Number of scaffold	43595	40208	39881	40341	38595	37731
Average length (bp)	6907	7456	7521	7819	8115	8321
Length of longest scaffold						
(bp)	80935	101859	120411	212257	210201	210221
N50 (bp)	11298	12635	12524	25138	25390	26139
N90 (bp)	1372	1515	1595	514	354	468



The three genome assemblies were validated by the position of known genes, *GW5*, *SDI*, *SubIA*, and *SubIB*. Results showed that the positions of *SDI* and *GW5* were correct in all three cultivars and aligned well to both Nipponbare (Table 9) and MH63 (Table 10). *SDI* is located at 38,382,385 to 38,385,469 on chromosome 1 in the Nipponbare genome. For the three cultivars, *SDI* is located on chromosome 1 at 42,999,152 to 42,501,761 in Ciherang-Sub1, 43,076,841 to 43,079,530 in Ciherang, and 42,596,482 to 42,597,334 in IR64-Sub1. *GW5* is positioned on chromosome 5 at the physical position of 4,832,476 to 4,834,024 in Ciherang-Sub1, 4,873,155 to 4,874,734 in Ciherang, and 5,262,475 to 5,264,054 in IR64-Sub1. For *SubIB*, Ciherang-Sub1 and IR64-Sub1 had similar position with Nipponbare reference, both located on chromosome 9 and at the position of 5,266,747 to 5,267,932 of Ciherang-Sub1, and 4,932,683 to 4,933,868 of IR64-Sub1. However, for Ciherang, *SubIB* is located at 4,258,518 to 4,259,713 on chromosome 1. Interestingly, *SubIA* is located at 3,892,209 to 3,896,051 on chromosome 11 of Ciherang-Sub1, 4,281,291 to 4,284,501 on chromosome 10 of Ciherang, and 8,519,270 to 8,523,113 on chromosome 8 of IR64-Sub1.

Table 10 shows the position of four genes in the three genomes based on the MH63 reference. *SDI* is located on chromosome 1 for three cultivars, at the position of 42,731,953 to 42,734,562 of Ciherang-Sub1, 42,731,953 to 42,734,562 of Ciherang, and 42,731,953 to 42,734,562 of IR64-Sub1. *GW5* is also on chromosome 5 for three cultivars, at the position of 5,278,241 to 5,279,789 of Ciherang-Sub1, 5,178,118 to 5,179,697 of Ciherang, and 4,864,637 to 4,866,216 of IR64-Sub1. For *SubIB*, Ciherang-Sub1 and IR64-Sub1 had similar position with MH63 reference, both located on

chromosome 9 and at the position of 4,262,753 to 4,263,938 of Ciherang-Sub1, and 5,209,441 to 5,210,626 of IR64-Sub1. For Ciherang, *Sub1B* is located at 7,911,678 to 7,912,873 on chromosome 12. *Sub1A* is on chromosome 11 of three cultivars, at the position of 17,912,307 to 17,916,149 of Ciherang-Sub1, 8,533,735 to 8,556,945 of Ciherang, and 18,314,723 to 18,318,566 of IR64-Sub1.

**Table 9. Summary of position of known gene in the three genomes based on the Nipponbare reference genome.**

	Ref. genome	Ciherang-Sub1	Ciherang	IR64-Sub1
SD1	chr01:38,382,385	chr01:42,499,152	chr01:43,076,841	chr01:42,596,482
(Os01g0883800)	..38,385,469	..42,501,761	..43,079,530	..42,597,334
GW5	chr05:5,365,122	chr05:4,832,476	chr05:4,873,155	chr05:5,262,475
(Os05g0187500)	..5,366,701	..4,834,024	..4,874,734	..5,264,054
Sub1A	chr08:6,319,062	chr11:3,892,209	chr10:4,281,291	chr08:8,519,270
	..6,321,934	..3,896,051	..4,284,501	..8,523,113
Sub1B	chr09:6,388,205	chr09:5,266,747	chr1:4,258,518	chr09:4,932,683
(Os09g0287000)	..6,389,719	..5,267,932	..4,259,713	..4,933,868

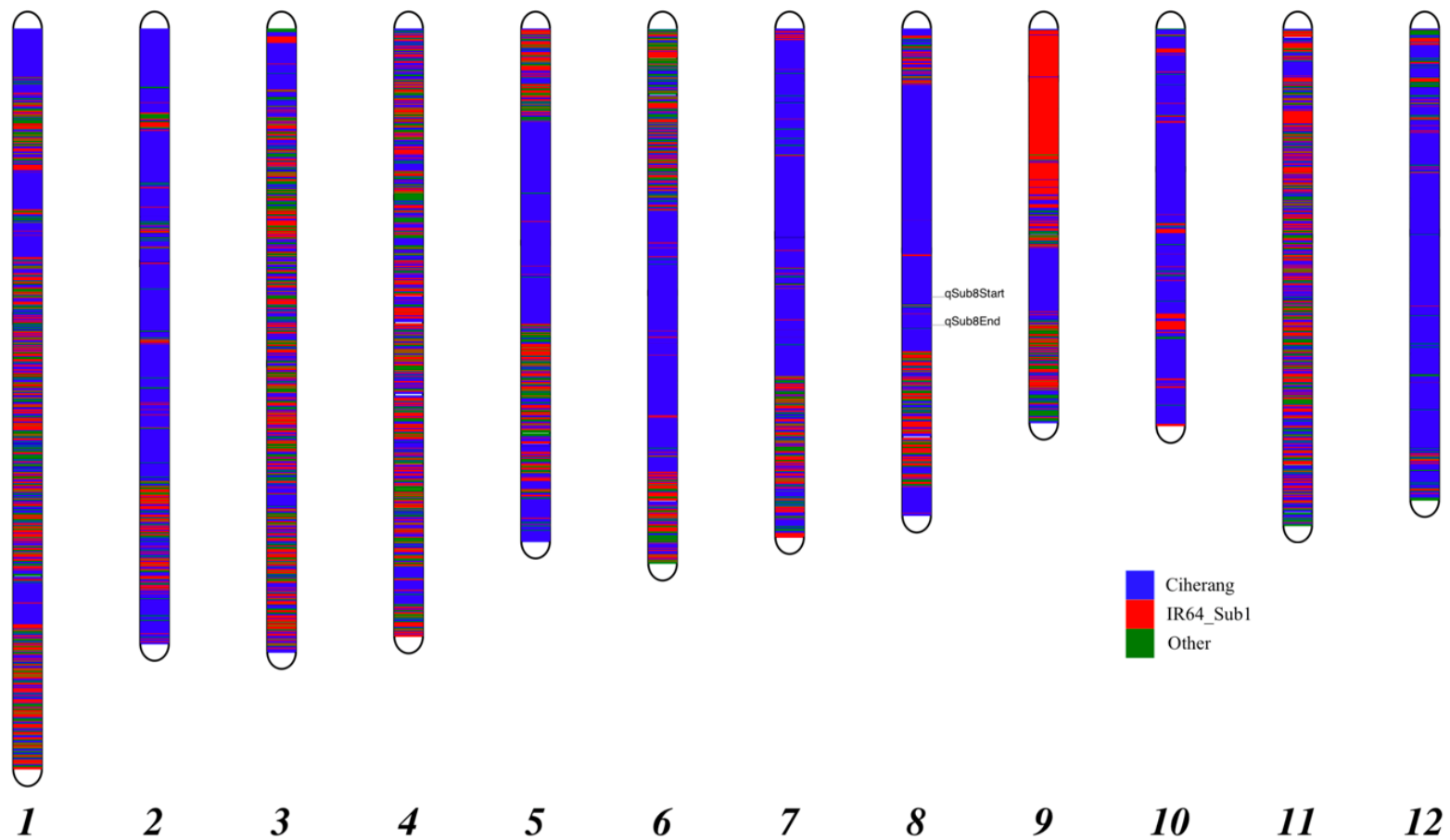
**Table 10. Summary of position of known gene in the three genomes based on the MH63 reference genome.**

	Ref. genome	Ciherang-Sub1	Ciherang	IR64-Sub1
SD1	chr01:39,643,093	chr01:42,731,953	chr01:42,731,953	chr01:42,731,953
(OsMH_01G0636900)	..39,644,426	..42,734,562	..42,734,562	..42,734,562
GW5	chr05:5,428,533	chr05:5,278,241	chr05:5,178,118	chr05:4,864,637
(OsMH_05G0081900)	..5,430,112	..5,279,789	..5,179,697	..4,866,216
Sub1A	chr06:22,422,489	chr11:17,912,307	chr11:8,553,735	chr11:18,314,723
	..22,419,199	..17,916,149	..8,556,945	..18,318,566
Sub1B	chr09: 7,179,132	chr09: 4,262,753	chr12: 7,911,678	chr09: 5,209,441
(OsMH_09G0114700)	..7,180,335	..4,263,938	..7,912,873	.. 5,210,626

### *Genome Structure of Ciherang-Sub1*

The genome structure of Ciherang-Sub1 was examined by the characteristics of the genome-wide SNPs. A total of 636,243 SNPs were detected between Ciherang-Sub1, Ciherang, and IR64-Sub1. There were 83,555 SNPs on chromosome 8, and 5,665 SNPs were located within the *qSub8.1* region. Based on the assessment of SNPs with the 50k window size, a total of 7,453 SNPs was identified with 4,406 SNPs Ciherang-alike, and 1,791 SNPs IR64-Sub1 alike. Notably, there were 1,256 SNPs neither Ciherang nor IR64-Sub1. In summary, Ciherang-Sub1 has 59% of genetic background from Ciherang, 24% from IR64-Sub1, and 17% came from unknown sources. To better visualize the genome structure of Ciherang-Sub1, 7,453 SNPs were plotted according to their physical position with different colors representing their sources (Fig. 8). The genome structure graph illustrated that the majority fragments of chromosome 2, 5, 6, 7, 8, 10 and 12 of Ciherang-Sub1 were from Ciherang; whereas chromosome 1, 3, 4, and 11 were mixtures between Ciherang and IR64-Sub1. Notably, a clear region on the proximal end of chromosome 9 was from IR64-Sub1.

With the scope zoomed-in to *qSub8* region, we found that *qSub8* region of Ciherang-Sub1 was mainly from Ciherang background (Fig. 9). With 50 kb window size, there were two segments from IR64-Sub1, and two segments from other sources within *qSub8* region, and one segment from other sources slightly outside of *qSub8* region (Fig. 9A). However, with 100k window size, there was only one segment from other sources within *qSub8* region (Fig. 9B).



**Figure 8. Genome structure of Ciherang-Sub1 with the window size of 50k.**



**Figure 9.** *qSub8* region using different SNP block window sizes. (A) *qSub8* region with 50 kb window size. (B) *qSub8* region with 100 kb window size.

## Discussion

### *Gene in Unexpected Position*

The results showed that some genes have different positions in the assembled genome than we expected such as *Sub1A* and *Sub1B* (Table 9 and 10). *Sub1A* has been cloned and revealed that it is near the centromere of chromosome 9 (Xu et al., 2006). However, in the three genomes, either based on Nipponbare or MH63 references, the position of *Sub1A* was not on chromosome 9. For genomes aligned with Nipponbare reference, *Sub1A* was on chromosome 11 for Ciherang-Sub1, chromosome 10 for Ciherang, and chromosome 8 for IR64-Sub1 (Table 9). This might be due to the fact that the *Sub1A* gene was actually not present in Japonica rice, including Nipponbare. Previous research indicated that *Sub1A* gene is absent in japonica rice and some other *Oryza* species such as *O. rhizomatis* and *O. eichingeri* (Niroula et al., 2012; Xu et al., 2006), therefore the scaffold contains *Sub1A* would be assigned to another location with higher sequence similarity. For the alignments with the *indica* MH63 reference, *Sub1A* was on chromosome 11 for the three cultivars (Table 10). However, it seems that *Sub1A* gene was not readily annotated in the MH63 genome (Zhang et al., 2016). Therefore, I searched the position with *Sub1A* complete sequence to further deliberate if MH63 has *Sub1A* locus. The results showed that *Sub1A* is corresponding to the distal end of chromosome 6. Previous research indicated that some *indica* varieties may also lack *Sub1A* locus such as IR24, Swarna, IR50, and Habiganj aman (Xu et al., 2006). Therefore, the unexpected location of *Sub1A* in MH63 genome could be due to its



genetic background or assembling error. Hence, we used Nipponbare as a reference genome in variant calling process even though all of the three cultivars belong to the *indica* rice subgroup.

*Sub1B* is on the upper region of chromosome 9 in Ciherang-Sub1, IR64-Sub1 in both reference genomes, whereas Ciherang has *Sub1B* position on a different chromosome (Table 9 and 10). This result revealed that Ciherang-Sub1 and IR64-Sub1 has high similarity in *Sub1B* locus. In fact, Ciherang-Sub1 was derived from Ciherang and IR64-Sub1, and IR64-Sub1 was Sub1 donor. When Sub1 was introgressed into Ciherang, it actually included Sub1A, Sub1B, and Sub1C. Therefore, Ciherang-Sub1 not only has Sub1A from IR64-Sub1 background but also Sub1B and Sub1C (Septiningsih et al., 2014). Sub1B position in Ciherang, however, the top match was at different chromosome. This might be due to the scaffold size that was a bit too short compared to those of Ciherang-Sub1 and IR64-Sub1.

### *Genome Structure*

The statistics indicated that Ciherang-Sub1 genome is composed of 59% Ciherang, 24% IR64-Sub1, and 17% unknown sources. I can also easily define that the majority of Ciherang-Sub1 genome was from Ciherang (Fig. 8). Notably, almost the entire proximal end of chromosome 9 is composed of IR64-Sub1 background. This result was clearly corresponding to the breeding process of Ciherang-Sub1. Ciherang-Sub1 was derived from marker-assisted breeding with two Sub1 flanking SSR markers ART5 and RM8300 (Septiningsih et al., 2014). Therefore, only this region was IR64-

Sub1 background and the rest of the part was mainly from Ciherang or a mixture with both parents. Ciherang-Sub1 was released as a cultivar at BC<sub>1</sub>F<sub>2</sub> generation, and it has been cultivated in the paddy fields in IRRI and farmers' fields for a few years. This might explain the less purity of the seeds of this cultivar as well.

#### *Source of qSub8.1 QTL*

*qSub8* region is delimited to a physical position of 15,666,434 to 17,319,167 on chromosome 8 in the Nipponbare genome. According to the genome structure of Ciherang-Sub1, *qSub8* region was mainly from Ciherang background with possible segment from IR64-Sub1 (Fig. 9A) or unknown sources (Fig. 9B). The structures profiled with 50 kb window size and 100 kb window size were slightly different. The one with 50 kb window size has another two segments from IR64-Sub1, and the other one with 100 kb window size has only one segment from unknown sources. Obviously, enlarged windows can reduce the noise from sequencing errors or ambiguous variant callings. However, some useful information could also be lost in this scenario. The ideal window size largely depends on the size of the linkage block within the region of interest. The sizes of linkage block vary from 75 kb to 500 kb in rice, and the linkage block is about 75 kb in the *indica* subgroup (Mather et al., 2007). Therefore, based on my analysis, the source of submergence tolerance QTL *qSub8.1* can be gene(s) from unknown sources or IR64-Sub1, or as a result of an epistatic interaction between gene(s) that are normally susceptible in Ciherang background, but then contribute to tolerance

with the Ciherang-Sub1 background. Hence, further studies are needed to elucidate this QTL.

### **Conclusion**

The Trimmomatic-SOAPdenovo2-MUMmer3 pipeline for genome assembly resulted in approximate genome sizes of 354.4 Mb, 343.7 Mb, and 344.7 Mb, with N50 values of 25.1 kb, 25.4 kb and 26.1 kb, respectively. The results showed that Ciherang-Sub1 genome is composed of 59% Ciherang, 24% of IR64-Sub1, and 17% of unknown sources. The genome profile showed that *qSub8* region is mainly from Ciherang with few introgressed segments from IR64-Sub1 and unknown sources. For the results with 50 kb window size, there were two introgressed segments from IR64-Sub1 and two introgressed segments from unknown sources; however, with the 100 kb window size only one introgressed segment from unknown sources was present. The SNPs obtained from variant calling can be used to develop *qSub8.1* NILs. To further narrow down and clone *qSub8.1*, a longer sequencing technology, such as PacBio sequencing, needs to be used.

CHAPTER IV  
OPTIMIZATION OF PROTOCOL FOR EFFICIENT TRANSGENIC PLANT  
DEVELOPMENT OF AN ELITE INDICA RICE CULTIVAR, CIHERANG-SUB1  
USING A BIOLISTIC DELIVERY OF CRISPR/CAS9 CONSTRUCT

**Introduction**

In recent years, the clustered regularly interspaced short palindromic repeats/Cas9 nuclease (CRISPR/ Cas9) technique has been considered as the most powerful tool for crop improvement with its precise gene editing ability. CRISPR technique has been applied to many crops to develop the gene edited plants, including wheat (Wang et al., 2014), soybean (Cai et al., 2015), and rice (Li et al., 2016; Miao et al., 2013). The CRISPR/Cas9 gene editing vector assembly of gRNA promotor, gRNA, and a Cas9 expression vector in one final destination vector (Lowder et al., 2015). Therefore, once the destination vector is delivered in the host plant, gRNA-Cas9 complex will be expressed, Cas9 will cut the host genome at the specific targeted site, and can cause the mutation through non-homologous end-joining (NHEJ) or homologous recombination (HR) (Paul & Qi, 2016). Agrobacterium-mediated transformation with T-DNA insertion is the most common and stable method to deliver the vector into the host plants (Gelvin, 2003). However, there are still some challenges remain for gene editing in plants, including the technically demanding and time-consuming aspect of tissue culture; and the low regeneration efficiency, especially for recalcitrant species or genotypes (Khanna

& Raina, 1998; Mao, Botella, Liu, & Zhu, 2019). In addition, in order to completely avoid the USDA GMO regulation, the delivery systems that bypass the bacterium delivery system also need to be established

([https://www.aphis.usda.gov/aphis/ourfocus/biotechnology/brs-news-and-information/2018\\_brs\\_news/pbi-details](https://www.aphis.usda.gov/aphis/ourfocus/biotechnology/brs-news-and-information/2018_brs_news/pbi-details)).

In rice (*Oryza sativa* L.), the standard tissue and transformation protocol of japonica cultivars has been established using mature seeds as explants (Hiei, Ohta, Komari, & Kumashiro, 1994); on the contrary, *indica* cultivars are more recalcitrant for such a method with poor callus induction and regeneration and a low transformation efficiency (Aldemita & Hodges, 1996; Hiei & Komari, 2008). Previous study revealed that using immature embryos as explants can provide higher efficiency in *indica* cultivar (Hiei & Komari, 2008). However, there are some disadvantages of using immature embryos as explants, for example, inconvenience for dissecting the materials and also it is time consuming. Several studies have reported the development of an efficiency *indica* rice transformation protocol using mature seeds (Kumar, Maruthasalam, Loganathan, Sudhakar, & Balasubramanian, 2005; Lin & Zhang, 2005; Sahoo, Tripathi, Pareek, Sopory, & Singla-Pareek, 2011). However, *indica* cultivars are more genetically diverse than *japonica* cultivars, many high-efficiency protocols are genotype-specific, and the transformation efficiency may decrease due to different genotypes (Hiei & Komari, 2006; Zaidi et al., 2006).

Hence, the aim of the current study was to optimize the protocol for transformation and regeneration of the *indica* rice cultivar Ciherang-Sub1 using mature

seeds as explants and the biolistic bombardment as a delivery method for the CRISPR/Cas9 gene-editing construct. In this study, CRISPR/Cas9 gene editing vector was constructed following a published rice gene editing toolbox (Lowder et al., 2015) and the Biolistic® PDS-1000/He particle delivery system was used. Different carbon sources, auxin/cytokinin ratio, and callus age were also evaluated in this study. Results suggest that this protocol can accelerate the tissue culture process to 80 days with a high regeneration efficiency of 95%.

## **Materials and Methods**

### *Plant Materials and Callus Induction*

Mature dry seeds of an indica rice cultivar, Ciherang-Sub1 was used in this study to induce embryogenetic callus. Husks were removed from healthy seeds of Ciherang-Sub1 and the seeds were then sterilized with 1.5% sodium hypochlorite and 1 drop of Tween 20 for 20 min in mini rotator (Grant-bio, PTR-25) at speed of 3. Seeds were rinsed by autoclaved tap water for 7-8 times until all sodium hypochlorite solution had been removed. The seeds were then dried on autoclaved filter paper for 5-10 min to remove the excess liquid. For callus induction, 19-20 seeds were placed onto callus induction medium (CIM) in 15 mm deep petri dishes (90 x 15 mm) and incubated at 28°C in the dark. CIM contains 4.4 g/l Murashige and Skoog Basal Medium (Sigma-Aldrich, M404), 30 g/l maltose, 0.6 g/l proline, 0.3 g/l casein hydrolysate, 3 mg/l 2,4-dichlorophenoxyacetic acid (2,4-D), 0.3 mg/l 6-Benzylaminopurine solution (6BA), and 3 g/l phytigel. The pH was adjusted to 5.8 with 1N NaOH and the whole media then was autoclaved at 121°C for 15 min.

After the first incubation at 29°C in the dark for 14 days, calli were removed from roots and cut into 2-4 pieces depending on the size of the calli. These calli were then sub-cultured onto fresh CIM in 20 mm petri dishes (90 x 20 mm) at 29°C in the dark for another 14-20 days before the bombardment treatment.

### *CRISPR/ Cas9 Vector Construction*

The full sequence of the *SUB1A* of Ciherang-Sub1 will be obtained from the genome assembly results. The second exon of *SUB1A* gene (Fig. 10) was targeted for knock-out through gene editing. Two gRNAs were designed using two online gRNA design tools CRISPRdirect and Cas-OFFinder (Bae, Park, & Kim, 2014; Bono, Hino, Ui-Tei, & Naito, 2014). The sequences of the two gRNAs were gRNA1: 5'-CCGGCGAGGAGGCTGTCCATCAC-3' and gRNA2: 5'-ACGGCCGCTGCCGGATGCCGTGG-3'. The CRISPR/Cas9 vectors assembly procedures of the *SUB1A* knock-out were performed according to a published protocol (Lowder et al., 2015). Two Golden Gate entry vectors, pYPQ131C and pYPQ132C, that contain OsU6 promoter were used to clone the two gRNAs to form gRNA expression cassette. The two gRNA expression cassettes were then assembled into the Golden Gate recipient vector pYPQ142. After that, both pYPQ142 and Cas9 expression vector (pYPQ150) were assembled into a binary vector, pMDC32, through the LR Clonase II recombination reaction. The final destination vector pMDC32 was then transformed into *Escherichia coli* (*E. coli*) competent cell DH5 $\alpha$  through heat shock transformation at 42°C for 30s.



```

Query 1 GGTGTTGAGGTCACCAGGTGAAAATGATGCAGGCCGGGGCGCCGCCACCATGTCCAT 60
      |
Sbjct 675 GGTGTTGAGGTCACCAGGTGAAAATGATGCAGGCCGGGGCGCCGCCACCATGTCCAT 616
Query 61 GCCGCTGGACCCCGTGACCGAGGAGGCCGAGCCGGCGGTGGCTGAGAAGCCTCGCCGGCG 120
      |
Sbjct 615 GCCGCTGGACCCCGTGACCGAGGAGGCCGAGCCGGCGGTGGCTGAGAAGCCTCGCCGGCG 556
Query 121 CCGGCCGAGGCGGAGCTACGAGTACCACGGCATCCGGCAGCGGCCGTGGGGCGGTGGTC 180
      |
Sbjct 555 CCGGCCGAGGCGGAGCTACGAGTACCACGGCATCCGGCAGCGGCCGTGGGGCGGTGGTC 496
Query 181 GTCGGAGATCCCGGACCCCGTCAAGGGCGTCCGCCTCTGGCTCGGCACCTTCGACACCCG 240
      |
Sbjct 495 GTCGGAGATCCCGGACCCCGTCAAGGGCGTCCGCCTCTGGCTCGGCACCTTCGACACCCG 436
Query 241 CGTCGAAGCCGCGCTCGCCTACGACGCCGAGGCCCGCCGCATCCACGGCTGGAAAGCCCG 300
      |
Sbjct 435 CGTCGAAGCCGCGCTCGCCTACGACGCCGAGGCCCGCCGCATCCACGGCTGGAAAGCCCG 376
Query 301 GACAAACTTCCACCCGCGATCTTTCTTCGCCGCCGCCGCGTTCGACGCCGCTCTGCTT 360
      |
Sbjct 375 GACAAACTTCCACCCGCGATCTTTCTTCGCCGCCGCCGCGTTCGACGCCGCTCTGCTT 316
Query 361 CTTGCTCAACGACAACGGCCTCATCACAATCGGAGAAgcgccgaccgacgacgcgcgctc 420
      |
Sbjct 315 CTTGCTCAACGACAACGGCCTCATCACAATCGGAGAAAGCGCCGACCGACGACGCCGCGTC 256
Query 421 gacgtcgacgtcgacgacggaggcgtccggcgacgcgcgcATACAACTGGAGTGCTGCTC 480
      |
Sbjct 255 GACGTCGACGTCGACGACGGAGCGTCCGGCAGCGCGCATACAACTGGAGTGCTGCTC 196
Query 481 GGACGACGTGATGGACAGCCTCCTCGCCGGCTACGACGTGGCCAGCGGCACGACATATG 540
      |
Sbjct 195 GGACGACGTGATGGACAGCCTCCTCGCCGGCTACGACGTGGCCAGCGGCACGACATATG 136
Query 541 GACATGGACATCTGGAGCCTCCTCCACCTCTGTTAACCAAGAGATCAAGACCCCATCGAT 600
      |
Sbjct 135 GACATGGACATCTGGAGCCTCCTCCACCTCTGTTAACCAAGAGATCAAGACCCCATCGAT 76

```

**Figure 10. Sub1A sequence alignment between Ciherang-Sub1 and Sub1A exon2 on NCBI database with the two gRNAs marked as yellow: (1) gRNA1: CCGGCGAGGAGGCTGTCCATCAC; (2) gRNA2: ACGGCCGCTGCCGGATGCCGTGG.**

### *Plasmid Isolation and Biolistic Bombardment*

The transformed *E. coli* competent cell were cultured overnight in 5 ml liquid LB media with 5 ul kanamycin as selecting agent, incubated at 37°C at 125 rpm. Afterwards plasmids were isolated by QIAprep Spin Miniprep Kit which can then be stored in -20°C freezer for up to 2 weeks before using. The biolistic bombardment was performed using the PDS-1000/He particle bombardment system with 1.0 um gold particle at a helium pressure of 1,100 psi with a target distance of 6 cm.

The bombardment procedures followed the Biolistic® PDS-1000/He Particle Delivery System user manual (<http://www.biolistic.com/webroot/web/pdf/lsr/literature/M1652249.pdf>). Before coating gold particles with DNA, 30 mg of 1.0 µm gold particles were sterilized with 70% EtOH and resuspended with 50% glycerol. The gold particles can be store at -20°C for up to 2 weeks. For the DNA coating, all steps need to be done while vortexing continually. For each of 50 µl gold particle, brought 5 µg of DNA to a total volume of 55 µl with 2.5M icy CaCl<sub>2</sub> and added 20 µl 0.1M spermidine. The mix was then vortexed vigorously for 3 minutes to coat DNA onto gold particle. After that, I spun down the gold particles and discarded the solution. Gold particles were again sterilized with absolute (100%) EtOH and resuspended with 48 µl 100% EtOH by tapping. Gold particles need to be vortexed at low speed continuously before using. Macrocarriers were sterilized with 70% EtOH for 1 minute and dried on sterile filter paper. For each shot, 7 µl of gold particles were applied onto sterilized macrocarriers. In this study, two shots were applied to each plate under 1,100 psi.

### *Cultivation Before and After Bombardment*

Callus was transferred onto high-osmotic medium (OSM) (Liang et al., 2018) at least 4 h before bombardment and incubated at 23°C in dark. OSM was prepared using 4.4 g/l Murashige and Skoog Basal Medium, 5 mg/l 2,4-D, 72.87 g/l mannitol, pH adjusted to 5.8 by KOH, and 3.2 g phytigel. The OSM was autoclaved at 121°C for 15 min and poured as 40 ml aliquots into petri dishes (90 x 15 mm). OSM can be stored at 4°C in dark for up to 6 weeks. After bombardment, calli were incubated in OSM overnight in the dark at 23°C. In the next day, calli were transferred onto CIM without any antibiotic at 29°C in dark for 7-10 days recovery.

### *Selection and Regeneration of Transformed Callus*

The selection and regeneration protocol was modified mainly from two previous studies (Hiei & Komari, 2008; Sahoo et al., 2011). After recovery, callus were transferred onto selection medium (MSM), which was prepared using CIM supplied with 50 mg/l hygromycin, and cultured at 27°C in dark for 12 days. MSM can be stored in dark at 4°C for up to 4 weeks. After the first selection, brown or black callus were removed and only yellow or creamish calli were transferred onto fresh MSM for the second selection for 10-12 days. After the second selection, yellow or creamish calli should propagate some small new callus. These calli can be transferred onto regeneration medium in petri dishes. If the callus condition is ambiguous, the third selection can be performed optionally.

Regeneration can be divided into two phases, shooting and rooting. After the selection process, calli were transferred onto shooting medium (R1), which has composition of 4.4 g/l Murashige and Skoog Basal Medium, 30 g/l maltose, 3 mg/l kinetin, 0.1 mg/l 1-Naphthaleneacetic acid (NAA), and 7 g/l agarose. The pH was adjusted to 5.8 with 1N NaOH and autoclaved at 121°C for 15 min. After autoclaving, medium needs to be cooled down to 50°C and 30 mg/l hygromycin was added. The medium was poured as 40 ml aliquots into petri dishes (90 x 15 mm) or 100 ml aliquots into Magenta GA-7 vessels. In the first stage of shooting, calli were transferred onto R1 with petri dishes for 14 days until the green shoots reached the lid. After that, callus with green shoots was transferred into fresh R1 with Magenta GA-7 vessel for 7-10 days until the plants had more than 3 tillers and more than 5 cm height. For regeneration, callus were cultured at 29°C with day/ night period 14/ 10 hr.

For root development, plants were transferred to rooting medium (R2), containing 2.2 g/l Murashige and Skoog Basal Medium, 30 g/l sucrose, 3 g/l phytigel with the pH of 5.8. Thereafter, 30 mg hygromycin was added after autoclaving at 121°C for 15 min. Medium was poured as 100-ml aliquots into Magenta GA-7 vessels and can be stored in dark at room temperature for up to 2 weeks. At the first stage of rooting, plants were cultured in R2 for 7-10 days until the leaves reached the lid. After that, the lid was removed, and replaced by an empty, inverted Magenta GA-7 vessel to allow plant to have more growing space. After 5-7 days, the leaves will reach the ceiling; at this point the plant can be removed from the medium. The roots were cleaned properly with tap water, removed of all the medium residues, and put in a Magenta GA-7 vessel

with fresh tap water to cover all the roots. For the 7-10 days acclimation period, plants were kept under cool (23-25°C), well ventilated condition (no need to cover), and protected from direct sunlight. During the acclimation period, I made sure water was clean and covered all the roots. If fungus growth was noticed, the water was changed right away. After the new roots appeared, the plants were transferred to soil, with Metro Mix 820 potting Mix and Turface Athletics MVP 1:1 ratio mix.

## **Results**

### *CRISPR/ Cas9 Vector Construction*

After cloning gRNAs into two Golden Gate entry vectors, pYPQ131C and pYPQ132C, three single colonies of each vector were cultured in liquid LB with tetracycline and isolated plasmids for Sanger sequencing. The sequencing results of the three vectors were compared with its corresponding vector to confirm that the gRNA was successfully cloned into the vectors. In entry vector, the nucleotides in lower case indicated the insertion region for gRNA. Once gRNA was ligated, the region should be replaced by the gRNA sequence (Fig. 11). The results showed that three gRNA1 vectors, gRNA1-1, 1-2, and 1-3, were ligated into pYPQ131C entry vector (Fig. 11A). For gRNA2, two out of three vectors were ligated into pYPQ132C entry vector, while gRNA2-3 had no gRNA inserted (Fig. 11B).

**(A)**

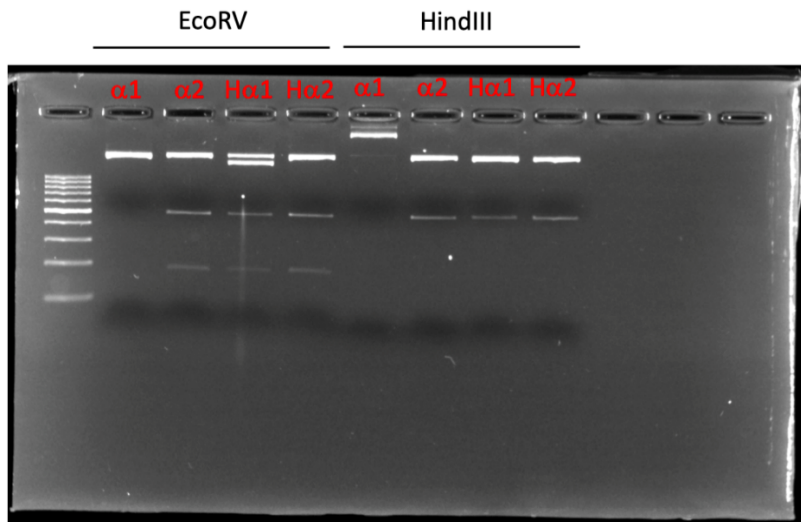
gRNA1-3	AGGCCGGGAGGAACAGTTTAGTACCACATTGCCAGCTAACTCGAACGCGACCAACTTATA	403
gRNA1-2	AGGCCGGGAGGAACAGTTTAGTACCACATTGCCAGCTAACTCGAACGCGACCAACTTATA	402
pYPQ131C	AGGCCGGGAGGAACAGTTTAGTACCACATTGCCAGCTAACTCGAACGCGACCAACTTATA	2040
gRNA1-1	AGGCCGGGAGGAACAGTTTAGTACCACATTGCCAGCTAACTCGAACGCGACCAACTTATA	403
	*****	
gRNA1-3	AAACCCGCGCGCTGTCGCTTGTGTGTGATGGACAG-----CCTCCTCGCGTTT	450
gRNA1-2	AAACCCGCGCGCTGTCGCTTGTGTGTGATGGACAG-----CCTCCTCGCGTTT	449
pYPQ131C	AAACCCGCGCGCTGTCGCTTGTGTGgagaagagatetagtetgagtegaecgtetetGTTT	2100
gRNA1-1	AAACCCGCGCGCTGTCGCTTGTGTGTGATGGACAG-----CCTCCTCGCGTTT	450
	***** ** * * ****	
gRNA1-3	TAGAGCTAGAAATAGCAAGTTAAAATAAAGGCTAGTCCGTTATCAACTTGAAAAAGTGGCA	510
gRNA1-2	TAGAGCTAGAAATAGCAAGTTAAAATAAAGGCTAGTCCGTTATCAACTTGAAAAAGTGGCA	509
pYPQ131C	TAGAGCTAGAAATAGCAAGTTAAAATAAAGGCTAGTCCGTTATCAACTTGAAAAAGTGGCA	2160
gRNA1-1	TAGAGCTAGAAATAGCAAGTTAAAATAAAGGCTAGTCCGTTATCAACTTGAAAAAGTGGCA	510
	*****	

**(B)**

gRNA2-3	GAGGCCGGGAGGAACAGTTTAGTACCACATTGCCAGCTAACTCGAACGCGACCAACTTAT	403
pYPQ132C	GAGGCCGGGAGGAACAGTTTAGTACCACATTGCCAGCTAACTCGAACGCGACCAACTTAT	2039
gRNA2-1	GAGGCCGGGAGGAACAGTTTAGTACCACATTGCCAGCTAACTCGAACGCGACCAACTTAT	402
gRNA2-2	GAGGCCGGGAGGAACAGTTTAGTACCACATTGCCAGCTAACTCGAACGCGACCAACTTAT	402
	*****	
gRNA2-3	AAACCCGCGCGCTGTCGCTTGTG-----	426
pYPQ132C	AAACCCGCGCGCTGTCGCTTGTGTGgagaagagatetagtetgagtegaecgtetetGTT	2099
gRNA2-1	AAACCCGCGCGCTGTCGCTTGTGTGACGGCCGCTG-----CCGGATGCCGTT	450
gRNA2-2	AAACCCGCGCGCTGTCGCTTGTGTGACGGCCGCTG-----CCGGATGCCGTT	450
	*****	
gRNA2-3	TTAGAGCTAGAAATAGCAAGTTAAAATAAAGGCTAGTCCGTTATCAACTTGAAAAAGTGGC	486
pYPQ132C	TTAGAGCTAGAAATAGCAAGTTAAAATAAAGGCTAGTCCGTTATCAACTTGAAAAAGTGGC	2159
gRNA2-1	TTAGAGCTAGAAATAGCAAGTTAAAATAAAGGCTAGTCCGTTATCAACTTGAAAAAGTGGC	510
gRNA2-2	TTAGAGCTAGAAATAGCAAGTTAAAATAAAGGCTAGTCCGTTATCAACTTGAAAAAGTGGC	510
	*****	

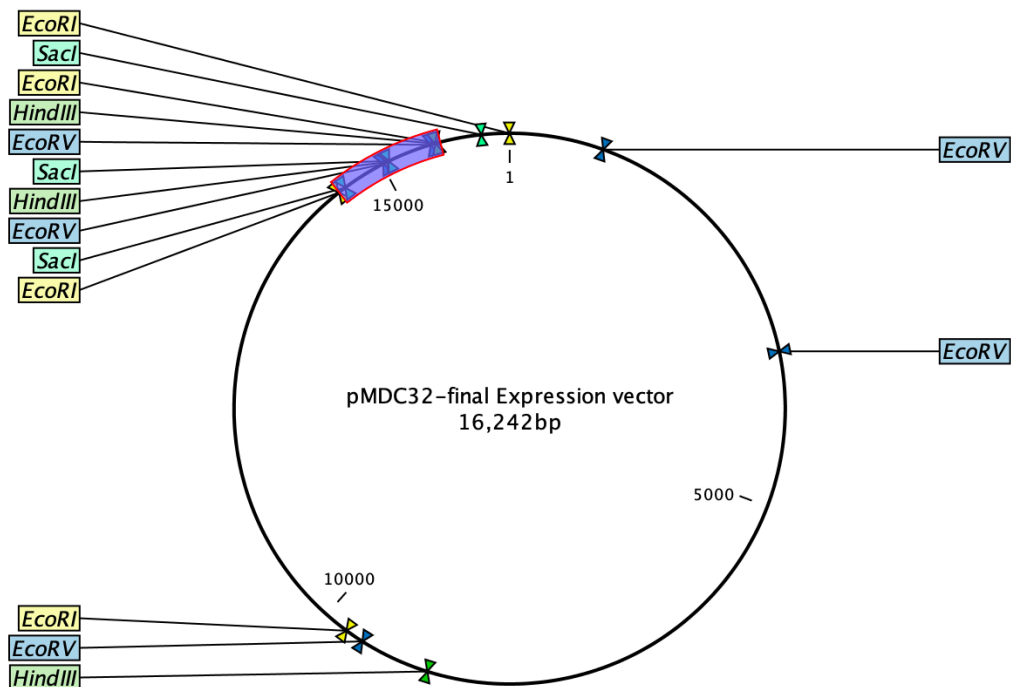
**Figure 11. Sanger sequencing results of the two gRNAs cloning into the entry vectors. Yellow marks indicated the gRNA ligated sequences and the crossed-out regions were the regions replaced by the gRNA insertions. (A) Alignment of three gRNA1 sequences with its entry vector pYPQ131C. (B) Alignment of three gRNA2 sequences with its entry vector pYPQ132C.**

gRNA1-1 and gRNA2-1 were assembled into pYPQ142 recipient vector, selected with blue-white screen, and validated with restriction enzyme digestion. The enzyme digestion results showed that only  $\alpha 2$  and H $\alpha 2$  were assembled successfully (Fig. 12) since  $\alpha 1$  had no digestion occurred and H $\alpha 1$  had non-expected bands appeared. pYPQ142 vector  $\alpha 2$ , Cas9 vector pYPQ150, and binary vector pMDC32 were assembled through LR reaction. The final destination vector was pMDC32 containing gRNA expression cassette and Cas9 expression sequence (Fig. 13). The final expression vector pMDC32 was validated by restriction enzyme digestion. The expected fragments of *EcoRI* and *EcoRV* digestion are 9760 bp, 4756 bp, 1043 bp, and 683; and 6059 bp, 5432 bp, 2624 bp, and 1646 bp. The results showed that only sample1 had the expected fragments in both *EcoRI* and *EcoRV* digestion (Fig. 14). Therefore, only sample1 was successfully assembled and could be used for further processes. Sample1 was stored at -80°C and was used to prepare plasmids for biolistic bombardment.

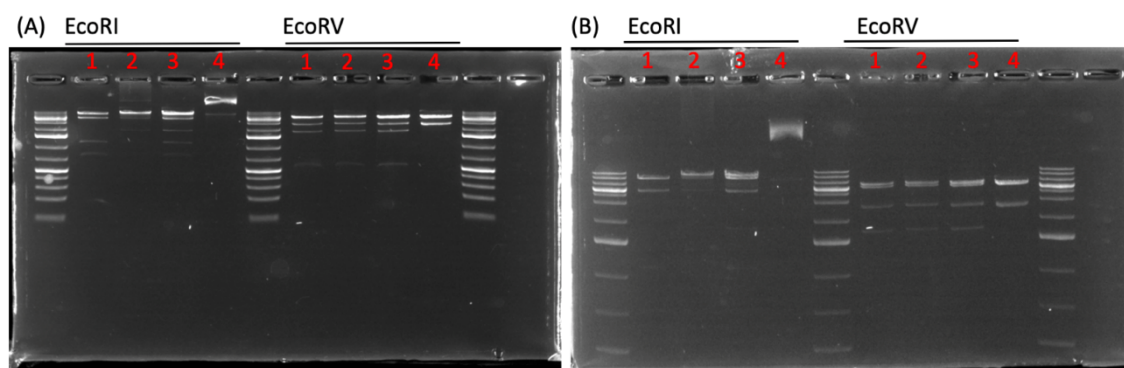


**Figure 12. Validation of *E. coli* recipient vector (pYPQ142) using restriction enzyme. The expected fragments of *EcoRV* digestion were 3186 bp, 481 bp, and 183 bp; while the expected fragments of *HindIII* digestion were 3369 bp and 481 bp.**





**Figure 13. Illustration of restriction enzyme cutting sites and expected sizes. The purple box indicated the gRNA expression cassette (pYPQ142) insertion region. If the gRNA expression cassette inserted successfully, the expected fragments of *EcoRI* digestion were 9760 bp, 4756 bp, 1043 bp, and 683; and 10180 bp and 1909 bp if no LR recombination happened. The expected sizes for *EcoRV* fragments were 6059 bp, 5432 bp, 2624 bp, 1646 bp, and 481 bp; and 6059 bp, 3406 bp, and 2624 bp for non-recombinants. The expected sizes for *HindIII* fragments were 9612 bp, 6149 bp, and 481; and 16242 bp for non-recombinants. For *SacI*, the expected sizes were 480 bp, 906 bp, and 14856 bp; and 16242 bp for non-recombinants.**



**Figure 14. Validation of *E. coli* destination vector (pMDC32) using different restriction enzymes. (A) 1.3% agarose 20 min at 135V. (B) 1.3% agarose 40 min at 135V.**

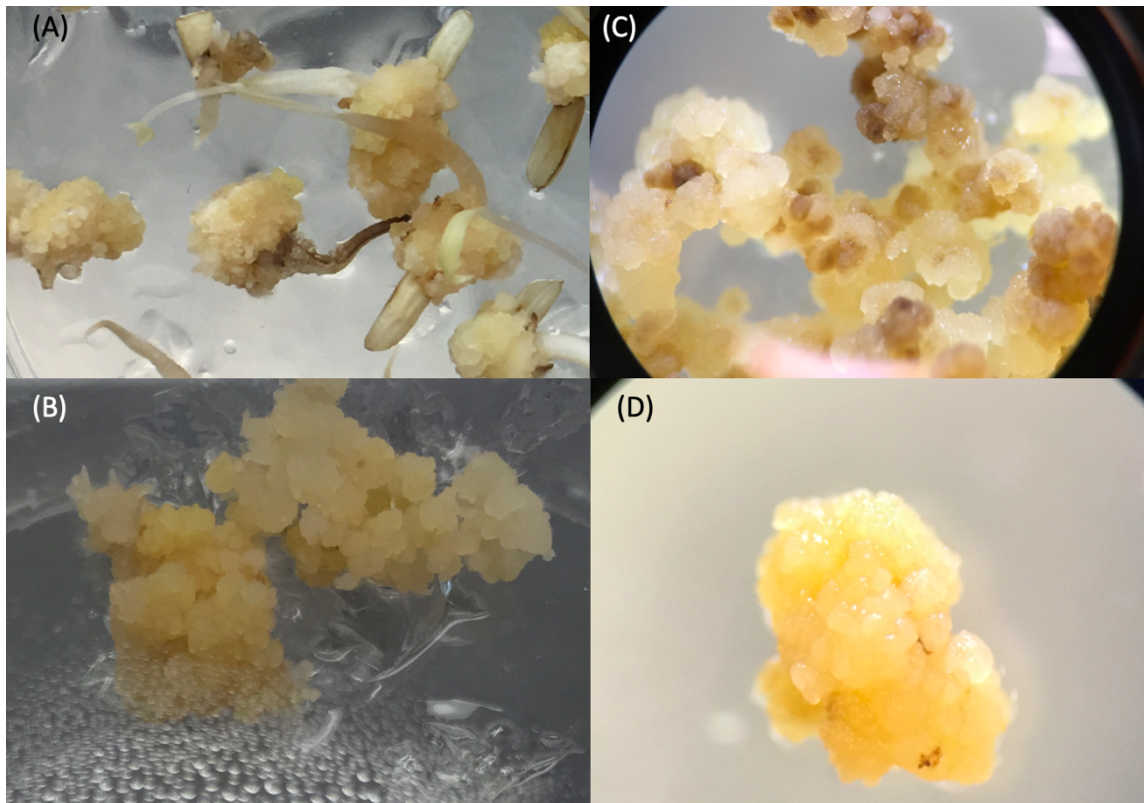
### *Optimization of Callus Induction Medium and Callus Status*

This study compared six different compositions of CIM including (1) with 3 mg 2,4-D and 0.25 mg 6BA (Sahoo et al., 2011), (2) 2.5 mg 2,4-D and 0.15 mg 6BA (Sahoo & Tuteja, 2012), (3) 3 mg 2,4-D and 0.2 mg 6BA, (4) 3 mg 2,4-D and 0.2 mg 6BA with phytagel increased, (5) with 0.75 mg kinetin as cytokinin source instead of 6BA, and (6) 3 mg 2,4-D and 0.3 mg 6BA. Callus induced from 2.5 mg 2,4-D and 0.15 mg 6BA and 3 mg 2,4-D and 0.2 mg 6BA, were smaller (Fig. A4) and slower comparing with the optimal recipe. Some of callus induced from 3 mg 2,4-D and 0.25 mg 6BA were tended to be darker (Fig. A4). Calli induced from 0.75 mg kinetin medium grew faster than other media but it tended to generate more small pieces rather than a bigger calli with pretty shape. As for increasing phytagel from 3 g/l to 4 g/l, the results did not show difference between two groups.

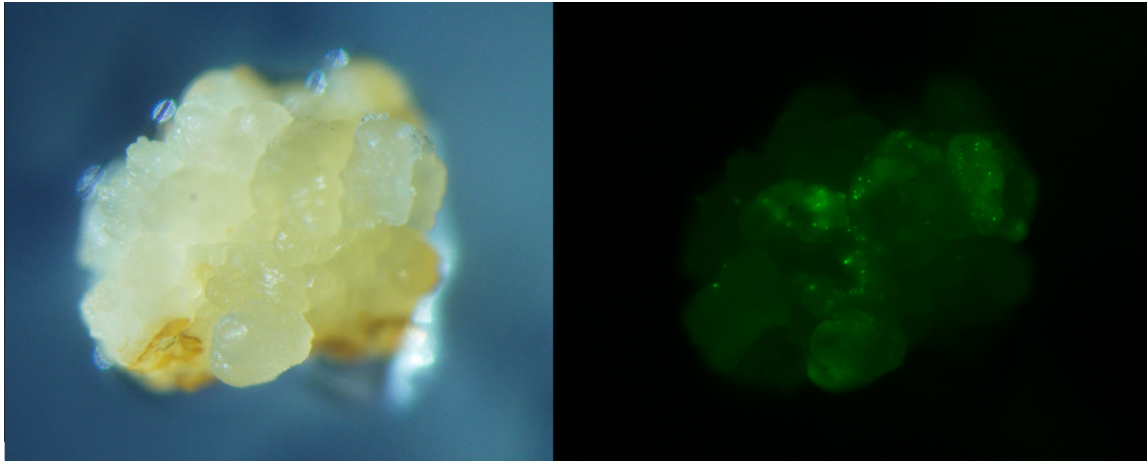
Comparing with 5 other recipes above, this study suggested that medium with 3 mg 2,4-D and 0.3 mg 6BA (see Method section) has the best callus induction rate of Ciherang-Sub1. Callus induced from 2.5 mg 2,4-D and 0.15 mg 6BA were smaller; and callus induced from 3 mg 2,4-D and 0.25 mg 6BA tended to be darker (Fig. A4) and also generated more small pieces rather than a bigger calli with pretty shape. At the first culturing, almost all the seeds can be induced for embryogenic callus (Fig. 15A). This study also suggested that removing roots, sub-culturing and cutting callus into small pieces can facilitate callus propagation. More than 80% of seeds had propagated new callus after 16 days of sub-culturing in CIM (Fig. 15B). However, not all of the calli can be used to perform transformation. There were about 10% of calli turned brown and dry,

which cannot be used (Fig. 15C). The optimal callus for transformation should have creamy or yellow color, with visible differentiated shape on the surface, and cannot be too wet, such as juicy surface or visible water drop on the surface, or too fragile, which can be easily crushed by tweezers (Fig. 15D).

In order to confirm whether the calli were ideal for transformation and validate the biolistic bombardment delivery system, calli were observed and screened under microscope to perform biolistic bombardment. The selected calli were transformed with pPTN-EYFP control vector via biolistic bombardment. The results showed that the green fluorescence can be observed under fluorescence microscope 5 days after biolistic bombardment (Fig. 16). The result indicated that the delivery protocol was ready to use and the callus condition was optimal for transformation.



**Figure 15. Callus induction and the optimal callus for bombardment. (A) Callus induced from mature seeds after 14 days cultured in CIM. (B) Callus after 16 days sub-cultured in CIM. (C) Observation of callus under microscope. (D) The optimal callus shape for biolistic bombardment.**

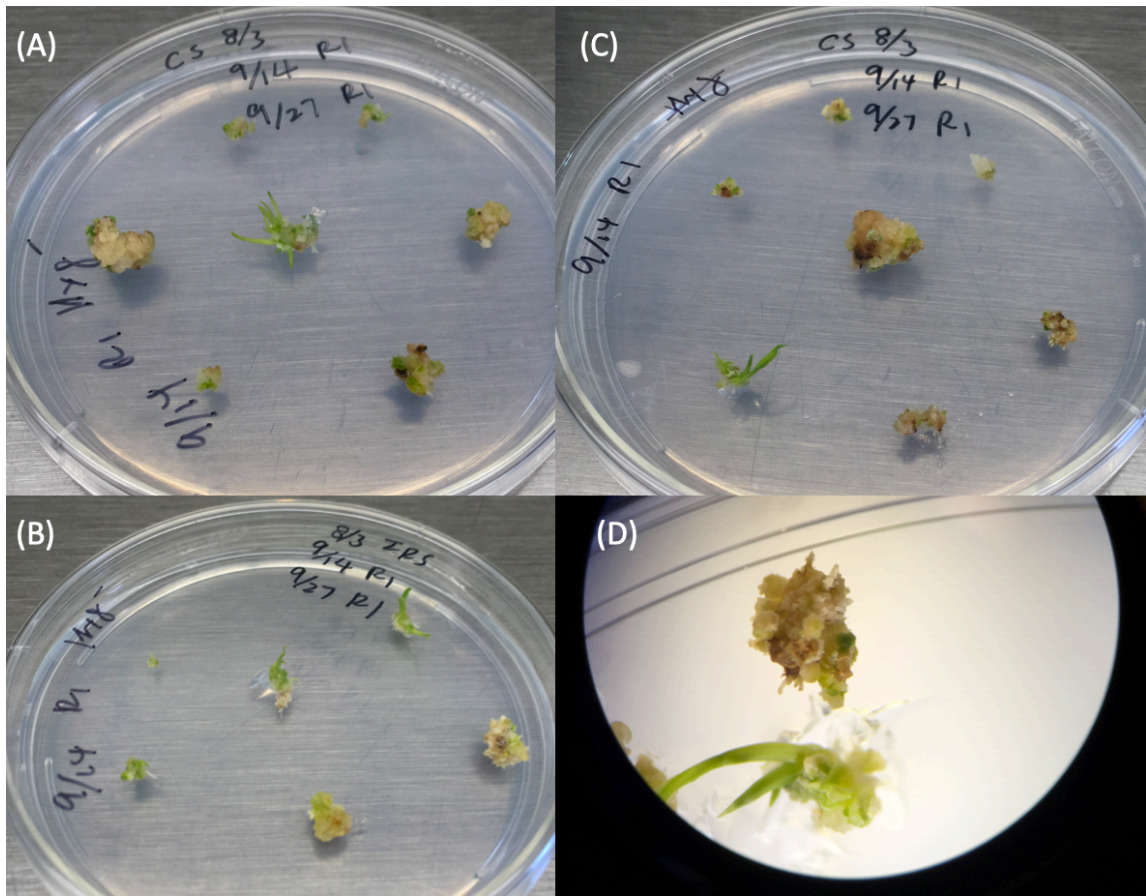


**Figure 16. Bombardment with pPTN-EYFP control vector under the fluorescence microscope.**

### *Optimization of Regeneration Medium*

For testing the regeneration medium, three different formulas were tested including (1) 0.2 mg kinetin and 2 mg NAA, (2) 0.1 mg kinetin and 3 mg NAA, and (3) 0.1 mg kinetin and 3 mg NAA with agarose reduced from 8 g/l to 7 g/l. The optimal calli without transformation were selected under microscope and transferred onto regeneration medium, without any antibiotic added, to calculate the regeneration rate. With 0.2 mg kinetin and 2 mg NAA medium, green tissues were observed as early as 10 days after transferred onto regeneration medium; however, some calli became dry and dark after turning green in this medium. The results suggested that the regeneration medium (R1) with 0.1 mg kinetin and 3 mg NAA with 7 g agarose to solidify had the highest percentage of green callus and had a faster progress were observed.

After being transferred onto R1 medium, the yellow or creamy color callus would partially turn light green from the corner. After that, the green became darker, a part expanded, and the tiny spikes started to appear (Fig. 17). The spikes would elongate and differentiate to leaves. The earliest light green formation can be observed 5-7 days after being transferred onto the R1 medium. We observed 19 out of 20 calli were regenerated after 5-14 days after being transferred onto R1 medium (Fig. 17A-C), indicating that we have a 95% regeneration rate of Ciherang-Sub1. However, not all the calli turned to light green can develop spikes, and not all the spikes can differentiate leaves. We also observed that about 5-10% of green callus turned brown and died eventually. Notably, once the spikes elongate and the leaf formation appears (Fig. 17D), they will not turn brown.

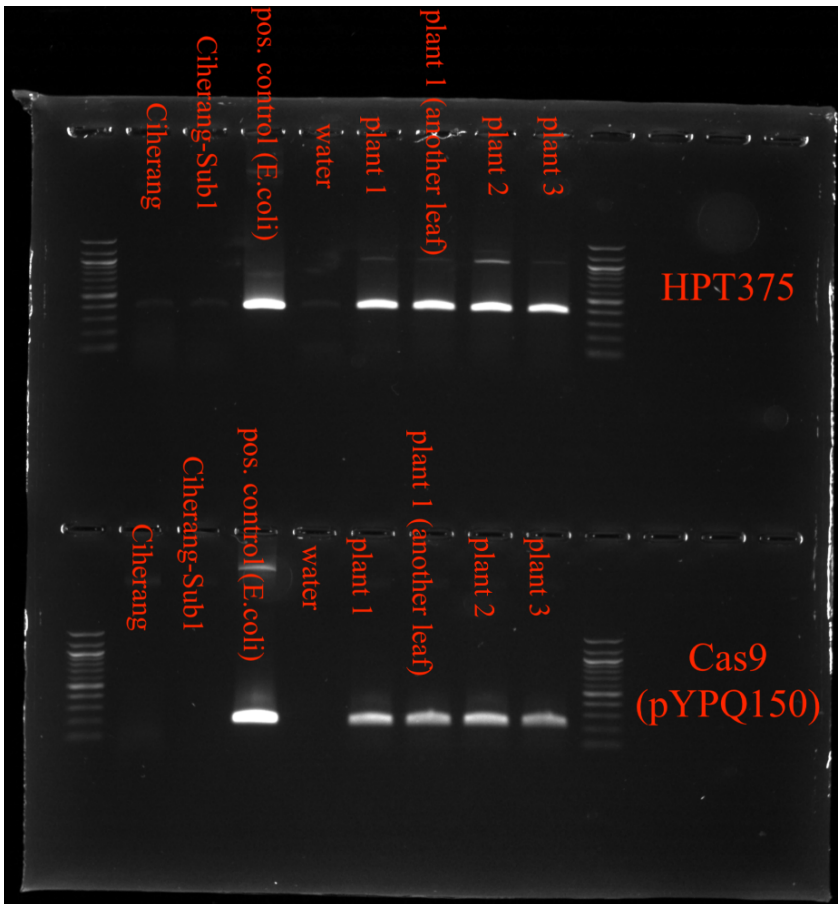


**Figure 17. (A), (B), (C) Ciherang-Sub1 callus in regeneration medium without any antibiotic. (D) Observation of regeneration of callus under microscope.**



### *Confirmation of Transgenic Plants*

After bombardment and recovery, from calli that survived under three times of selection processes and regenerated from R1, R2 regeneration media with hygromycin added, three plants were obtained. After taking out plants from R2 medium, plants were transferred to clean water for acclimation. In the meantime, 2 cm leaf pieces from each plant were cut and used for DNA samples. Two leaf samples were collected from plant1, and DNA was extracted with a modified CTAB method (Liang, Baring, Wang, & Septiningsih, 2017). Two selective markers, hygromycin phosphotransferase (HPT) and Cas9 sequence for pYPQ150 vector, were used to confirm the transformation. The expected product size of marker HPT375 is 375 bp, while the expected product size of Cas9 marker is 218 bp. Ciherang, Ciherang-Sub1 and autoclaved water were used as negative control, whereas an *E. coli* destination vector, which had been validated with restriction enzyme digestion, was used as positive control. DNA of transgenic samples, positive control and negative controls were diluted to 100-150 ng for the PCR reaction with annealing temperature of 55°C. The results showed that all the negative controls had no PCR products amplified, while positive control, plant2, plant3, and both leaf samples of plant1 had amplified PCR products with the expected sizes (Fig. 18).

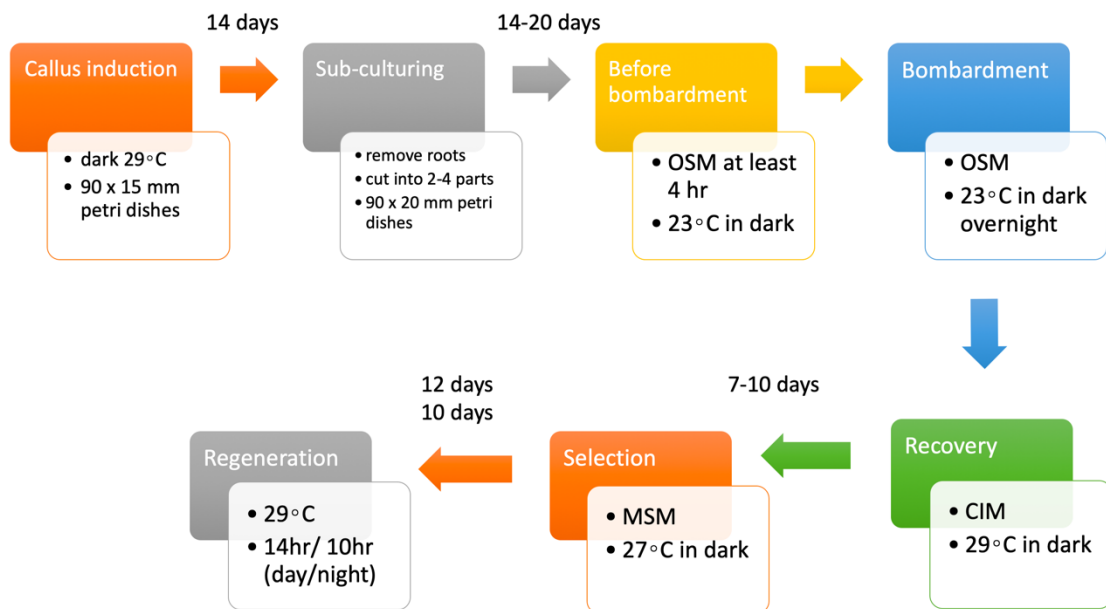


**Figure 18. Transformation validation with selective marker hygromycin phosphotransferase (HPT) and Cas9 sequence.**

## Discussion

### *Optimization of Tissue Culture and Regeneration Protocol of Ciherang-Sub1 Using Mature Seeds*

The optimal protocol of Ciherang-Sub1 is illustrated in Figure 19. It takes 80 days to obtain a transgenic plant from mature seed to transfer to soil. For this improved protocol, several medium components were modified from current japonica and indica rice tissue culture protocols (Hiei & Komari, 2008; Sahoo et al., 2011). In callus induction stage, maltose is the optimal carbon source of Ciherang-Sub1. We observed that callus turned brown, and dry and the shoot grew longer when using sucrose instead of maltose (Fig. 20A-B). Previous studies had revealed not only different plant hormone ratio but also different carbon sources have significant effects on tissue culture due to different reasons (Mendoza & Kaeppeler, 2002), for example, sucrose cause greater osmotic potential than maltose and has different organogenesis rate (de Paiva Neto & Otoni, 2003). Previous studies also showed that replacement of sucrose with maltose can improve callus induction for spring wheat (*Triticum aestivum* L.) and indica rice (Orshinsky, McGregor, Johnson, Hucl, & Kartha, 1990; Sahoo et al., 2011). However, for the callus induction in japonica rice cultivars, sucrose is used as the carbon source (Hiei & Komari, 2008).



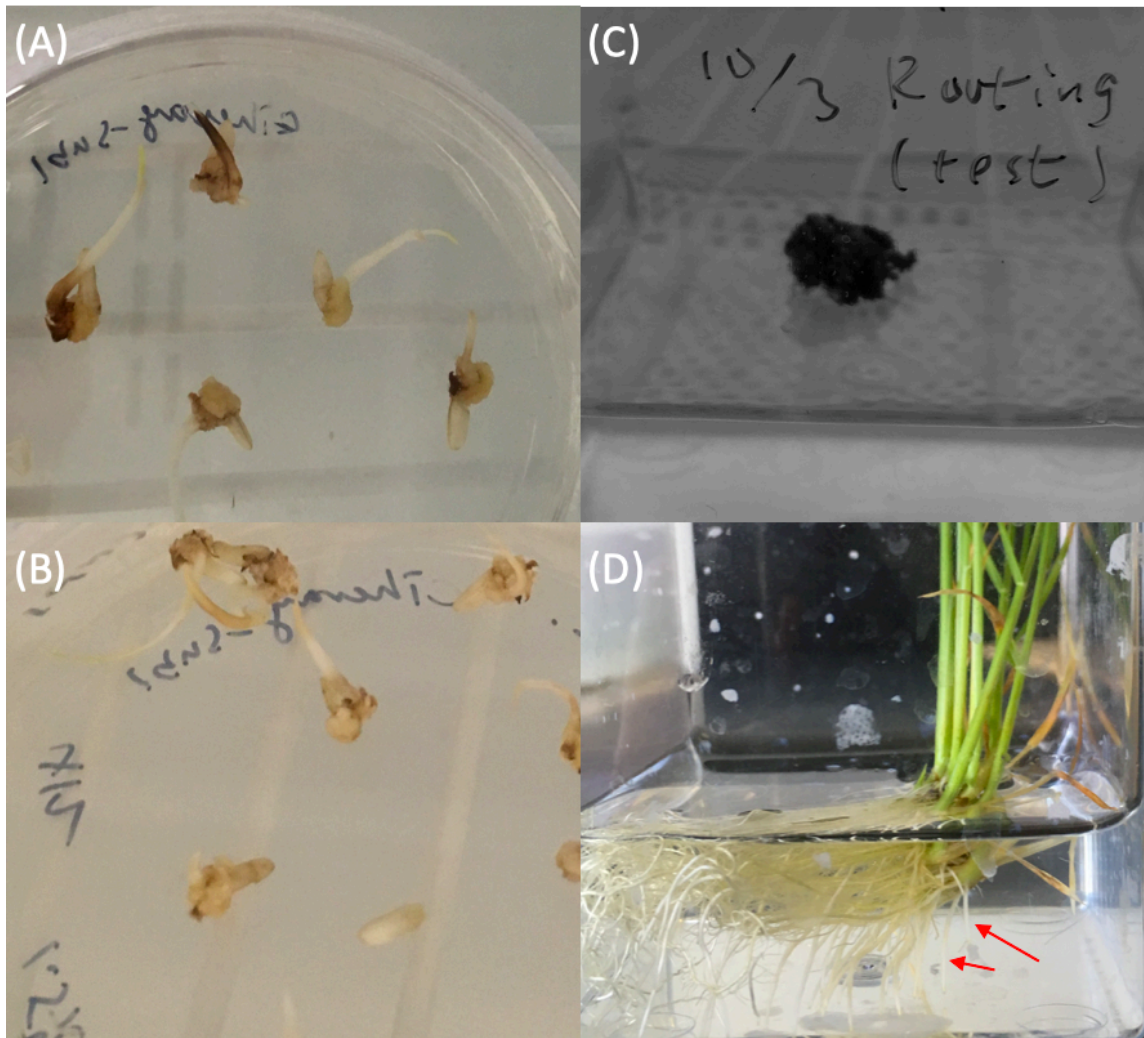
**Figure 19. Workflow of the transformation protocol in Ciherang-Sub1.**

In organogenesis, auxin and cytokinin are the major phytohormones to control the different organogenesis stages, for example, auxin to cytokinin ratio equal to 3:0.2 will induce callus, 0.03:1 can induce shoot regeneration and 3.0:0.02 can induce roots (Skoog & Miller, 1957).

For callus induction, I recommend auxin to cytokinin ratio of 3:0.3 as optimal for Ciherang-Sub1. Compared with other indica cultivars such IR64 and IR64-Sub1, Ciherang-Sub1 has slower callus formation and propagation processes. Therefore, I slightly increased the concentration of 2,4-D, a synthetic auxin, and BAP, a cytokinin source, separately from the Sahoo *et al.* (2011) protocol. With higher 2,4-D supplied, the callus became smaller and there were more lateral roots differentiated from the main root derived from mature seeds. On the other hand, when I slightly increased 6BA concentration from 0.25 mg/l to 0.3 mg/l, the callus formation and propagation were more vigorous. This study also considers that callus with ideal shape developed after 30 days of callus induction is the optimal callus for biolistic bombardment.

Previous studies have revealed that low auxin/cytokinin ratio promotes shoot formation from callus (Gaspar et al., 1996; Skoog & Miller, 1957; Skoog & Tsui, 1948). Therefore, I increased the kinetin concentration and reduced the NAA concentration, a natural auxin, in the regeneration medium (R1). I also noticed that with agarose concentration reduced from 8 g/l to 7 g/l can also improve the callus regeneration of Ciherang-Sub1. During the testing process, we also tested the possibility of inducing root before shoot regeneration. However, the result showed that callus, without shoot regenerated, died after being transferred to rooting medium directly (Fig. 20C).

Previous studies apply fungicide (Benomyl) to root or culture in hydroponic solution after plants are moved out from rooting medium (Deb & Imchen, 2010; Hauptmann, Widholm, & Paxton, 1985; Thielges & Hoitink, 1972). In this study, I observed that fresh tap water is adequate for rice acclimation. The new roots can be observed 5-7 days after culturing in water (Fig. 20D). For transferring to soil, the air temperature and aeration are critical points. Air temperature that is too high or poor aeration will cause plant death.



**Figure 20. Optimization of protocol. (A), (B) Callus induction with sucrose supplied. (C) Calli was transferred onto rooting medium before shoot formation. (D) Plant acclimation in fresh tap water. Red arrows indicate the new grown roots.**

### *Agrobacterium-mediated Transformations Using this Protocol*

I also tried to use the optimal protocol and callus for agrobacterium-mediated transformation with *Agrobacterium tumefaciens* EHA105 strain. However, no callus was propagated under the selection medium. Previous studies show that the callus age has crucial impact on transformation efficiency. In japonica rice and Basmati indica rice, the ideal callus age is 3 weeks (Hiei & Komari, 2008; Rashid, Yokoi, Toriyama, & Hinata, 1996), but is 8 weeks callus for IR64 and IR72 indica rice (Kumar et al., 2005). Therefore, the optimal callus age for agrobacterium-mediated transformation needs further investigation.

### **Conclusion**

This study demonstrated that the auxin/cytokinin ratio of 3:0.3 is the optimal condition for callus induction; while the auxin/cytokinin ratio of 0.1:3 is the optimal condition for shoot regeneration. Leaf samples were collected from the regenerated plants for DNA extraction. The confirmation of transformation was validated by two selection markers, the hygromycin resistance gene, hygromycin phosphotransferase (HPT), and the Cas9. Sanger sequencing to reveal the gene-edited region is currently underway. The results showed that 28-35 day-old calli were ideal for particle bombardment, and the regeneration medium (R1) had a regeneration rate of 95%. Using this protocol, CRISPR gene-edited plants can be generated and validated within 12 weeks.



## CHAPTER V

### CONCLUSIONS

This dissertation provided some insight into the molecular regulation and genomics of drought and submergence stresses in rice. In the drought stress part, the results suggested that under moderate drought condition during reproductive stage, rice genotype 4610 had better performance than Rondo, possessing higher spikelet fertility, hundred-seed weight, and yield. The transcriptomics analysis results revealed that the drought tolerance of 4610 can be partially attributed by the higher expression of drought stress response molecular mechanisms such as the LEA proteins, HSPs and ROS scavengers such as APXs and GSTs. In the second part, to better understand the target QTL for submergence tolerance during vegetative stage, *qSub8.1*, whole genome sequencing of three varieties was performed. Based on the genome assembly of the three varieties, Ciherang-Sub1, Ciherang, and IR64-Sub1, the results inferred that Ciherang-Sub1 genome is composed of 59% of Ciherang, 24% of IR64-Sub1, and 17% of unknown sources. According to the SNPs profiles, the *qSub8.1* QTL region of Ciherang-Sub1 is mainly from Ciherang background with a few introgressed segments from IR64-Sub1 and unknown sources. The SNPs flanking the *qSub8.1* region can be used to design DNA markers for further characterization of the *qSub8.1* region. In addition, in preparation of the gene validation of the candidate genes underlying the *qSUB8.1* QTL, an experiment to optimize transformation and transgenic development using Ciherang-Sub1 was conducted. In summary, a protocol which allows us to generate CRISPR gene-

edited plants within 12 weeks was developed with helium-driven biolistic bombardment delivery system. This is the first transformation and tissue culture protocol reported for Ciherang-Sub1 genetic background using mature seed as explants. This protocol demonstrates that the auxin to cytokinin ratio of 3:0.3 is the optimal condition for callus induction for mature seed; while the auxin to cytokinin ratio of 0.1:3 is the optimal condition for shoot regeneration.

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doi:10.1104/pp.110.157545

APPENDIX A

Table A1. Effect of variety on yield-related traits under drought treatment.

	4610		Rondo	
	Irrigated	Drought	Irrigated	Drought
Panicle number	49.7	36.7	47.7	43.0

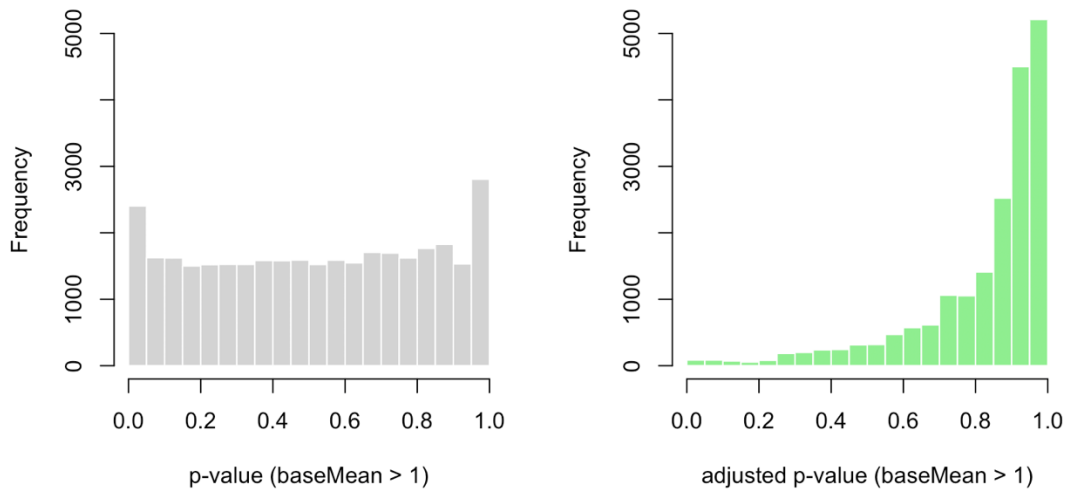


Figure A1. The p-value distribution of likelihood ratio test for genotype-by-treatment effect.

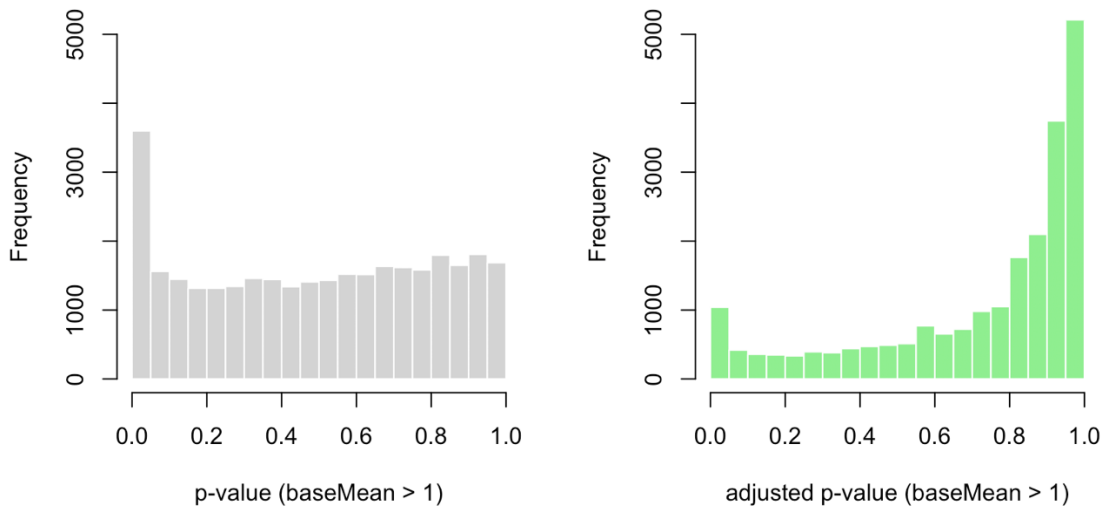


Figure A2. The p-value distribution of Wald test for the treatment effect in 4610.

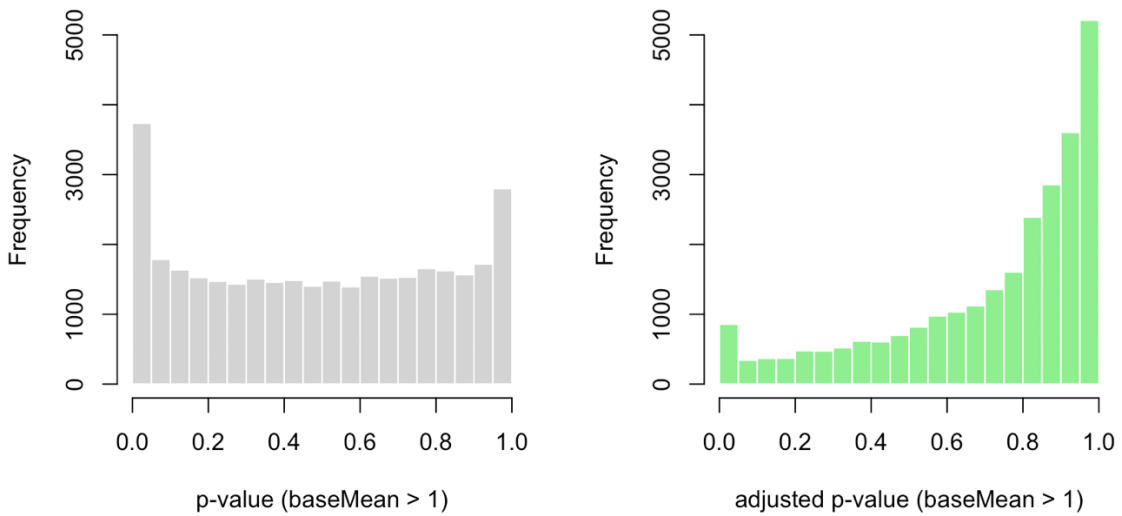


Figure A3. The p-value distribution of Wald test for the treatment effect in Rondo.

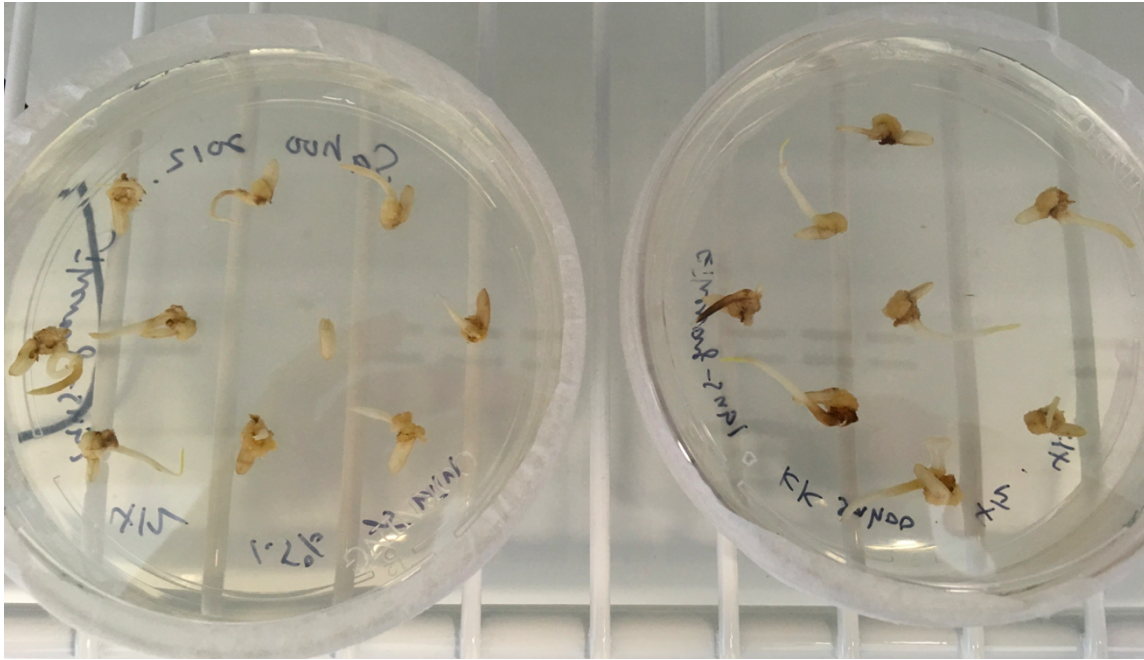


Figure A4. Callus induced from mature seeds after 10 days cultured in CIM with 2.5 mg 2,4-D and 0.15 mg 6BA (left); and with 3 mg 2,4-D and 0.25 mg 6BA (right).