



Article Starch Morphology and Metabolomic Analyses Reveal That the Effect of High Temperature on Cooked Rice Elongation and Expansion Varied in *Indica* and *Japonica* Rice Cultivars

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Abstract: Rice (*Oryza sativa* L.) is mainly grouped into *indica* and *japonica* varieties. The aim of this study was to investigate the effect of temperature on cooked rice elongation, cooked rice expansion, and rice fragrance. This study was conducted in three growth temperature chambers with *indica* cultivar Basmati 385 (B385) and *japonica* cultivar Yunjingyou (YJY). Grains of B385 grown in low-temperature regimes had the highest cooked rice elongation and expansion, whereas the grains of YJY grown in high-temperature regimes had the highest cooked rice elongation and expansion. Starch granules of B385 grown in low-temperature regimes were more compact and bigger, compared to grains grown in medium- and high-temperature regimes. Conversely, the starch granules of YJY grown in high-temperature regimes were more compact and bigger, compared to those grown in medium- and low-temperature regimes. Metabolomic analyses showed that temperature affected the rice metabolome and revealed that cyclohexanol could be responsible for the differences observed in cooked rice elongation and expansion percentage. However, in both B385 and YJY, grains from low-temperature regimes had the highest 2-AP content and the lowest expression levels of the *badh2* gene. The findings of this study will be useful to rice breeders and producers.

Keywords: rice; temperature; cooked rice elongation; cooked rice expansion; rice fragrance; 2-acetyl-1-pyrroline; *badh2*

1. Introduction

Rice (*Oryza sativa* L.) is mainly grouped into *indica* and *japonica* ecotypes or races. *Indica* and *japonica* rice have marked differences in plant architecture, as well as agronomic and physiological features [1–3].

Amylose content percentage is an important trait used in the determination of rice grain quality [4,5]. High-amylose rice cultivars cook dry with firm and separate grains, while low-amylose rice cultivars are tender, glossy, and cohesive after cooking [6–8]. *Indica* rice cultivars have been reported to have higher amylose content percentage compared to *japonica* rice cultivars [9]. Champagne et al. [10] reported a negative correlation between apparent amylose content and slickness in rice and a weak negative correlation between springiness and amylose content in rice.



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Copyright: © 2021 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). Umemoto et al. [11] reported differences amylopectin structure between *indica* and *japonica* rice cultivars and also noted that the starch from *japonica* rice had lower gelatinization temperature, compared to the starch from *indica* rice. Similarly, Kang et al. [12] noted that the viscogram values of cooked *indica* rice cultivars were higher than those of cooked *japonica* rice cultivars. Other differences noted by the authors included higher hardness exhibited by *indica* cultivars compared to *japonica* cultivars, as well as less compact and smaller starch granules in *indica* cultivars compared to compact and larger starch granules in *japonica* cultivars.

Indica rice cultivars have been reported to have lower nitrogen utilization efficiency for biomass accumulation and higher nitrogen utilization efficiency for grain yield, compared to *japonica* rice cultivars [13]. Ntanos et al. [14] reported differences in dry matter and nitrogen translocation in *indica* and *japonica* rice cultivars.

Chen et al. [15] cloned the S5 gene, a major locus for *indicia–japonica* hybrid sterility and wide compatibility, and discovered that the *indica* S5-i allele and *japonica* S5-j allele differed by two nucleotides. Mano et al. [16] reported differences in the chemical compositions of glyceroglycolipids and cerebroside in *indica* and *japonica* rice cultivars.

Metabolomics and proteomics studies have also shown differences in *indica* and *japonica* rice cultivars. Hu et al. [1] noted that *indica* and *japonica* rice cultivars have significant variation in the relative abundance of metabolites. Yang et al. [17] reported differences in the protein composition of *indica* and *japonica* rice varieties.

However, the improvement of rice grain quality is one of the major challenges facing both *indica* and *japonica* rice breeders and producers. In other to improve rice grain quality, it is important to grasp the factors that influence the traits used in determining rice grain quality. Cooked rice elongation, cooked rice expansion [18], and rice fragrance [19] are some the major traits used in determining rice grain quality.

The genetic basis of cooked rice elongation and cooked rice expansion has not been fully elucidated. However, Arikit et al. [20] reported that the QTLs associated with cooked rice elongation were found near the locations of starch-biosynthesizing genes on chromosome 4 and chromosome 6. Ge et al. [21] found that the QTL on chromosome 6 located near the *waxy* gene region was associated with cooked rice elongation and cooked rice expansion. Qiu et al. [22] reported slight genetic overlap between rice grain appearance quality and cooked rice elongation, and they stated that, among 60 appearance/quality QTLs and 14 cooked rice elongation QTLs, only two regions located on chromosome 5 and chromosome 6 showed pleiotropic effects on both appearance quality and cooked rice elongation. Ahn et al. [23] noted that a segment of rice chromosome 8, introgressed from rice cultivar Basmati 370, contains a gene or genes affecting grain elongation.

Rice fragrance is another important trait used in determining rice grain quality. Over 100 compounds have been associated with fragrance in rice [24,25], but the roles, genetics, and biosynthesis of these compounds are not yet well understood. Buttery et al. [26] reported that all fragrant rice varieties contain 2-acetyl-1-pyrroline (2-AP). Reports by Hinge et al. [27], Hashemi et al. [28], Bourgis et al. [29], Huang et al. [30], and Lorieux et al. [31] have also shown that 2-AP is responsible for fragrance in rice.

A single recessive gene, *fgr*, found on chromosome 8 of rice is associated with rice fragrance [29,32,33] and determines the quantity of 2-AP in rice [28,32]. Fine mapping of the *fgr* locus on chromosome 8 of rice and extensive sequence analysis have identified two isozymes, BADH1 and BADH2, encoding BADH [34]. According to Bradbury et al. [35], BADH1 and BADH2 found in rice are encoded on chromosome 4 and chromosome 8, respectively; however, only BADH2 is responsible for fragrance in rice. *Badh2* is a dominant allele that encodes the BADH2 gene, while its nonfunctional recessive allele *badh2* is responsible for fragrance in rice [34–36]. It has been shown that *badh2* expression was negatively associated with 2-AP accumulation in fragrant rice [27].

Rice is the world's most important food crop [37] and the staple food of over half of the world's population [1]. The importance of rice is not limited to its nutritional value and economic importance. For researchers, rice is a valuable model system for cereal plant genetics, due to its sequenced and annotated genome [38] and its capacity for transformation, as well asits similarity to other major cereal crop species [39].

Therefore, it is very important that we understand the effects of temperature on rice grain quality. Perkins et al. [40] reported increases in warm spells and heat wave frequency at a global scale from 1950 to 2011. Russo et al. [41] predicted more heat waves in the coming years.

The high temperature associated with heat waves will have an impact on rice production. Yin et al. [42] reported that, when diurnal temperature delayed flowering in rice, it also increased the number of leaves. Exposure to high temperature above 50 °C for over 12 h has been shown to cause color degradation in freshly harvested rice grains [43]. Temperature can affect germination, growth, tiller number, heading time, and yield [44]. High temperature has also been reported to induce high disease incidence in rice compared to low temperature [45]. Temperature in rice has also been shown to affect the total plant biomass [46,47]. The aim of this study was to determine the effect of temperature on the cooked rice elongation, cooked rice expansion, and rice fragrance in *indica* and *japonica* rice cultivars.

2. Materials and Methods

2.1. Rice Materials

Plant materials were identified and provided by Professor Xiangru Tang. We did not deposit a voucher specimen of the rice cultivars in any public herbarium, but they can be provided upon request.

Basmati 385 (B385), a fragrant *indica* rice cultivar, and Yunjingyou (YJY), a fragrant *japonica* rice cultivar, were used for this study. Both cultivars were obtained from the College of Agriculture, South China Agricultural University, Guangzhou, China. They were sown in the early planting season. Seeds were soaked in water, before sowing them under greenhouse conditions following randomized blocks. A total of 36 plastic pots (18 pots for each cultivar)—28 cm in height and 30 cm in diameter—already containing soil and 3 g of fragrant fertilizer (15% N, 4% P₂O₅, 7% K₂O, 25% organic matter, and 2% $ZnCl_2$), were used for this experiment. Five seedlings were transplanted to each plastic pot, and, for each cultivar, six pots were used per treatment. Then, 21 days after transplanting, another 2 g of fragrant rice fertilizer was added to each pot. At the onset of heading, the pots were transferred to three Conviron temperature-controlled chambers (manufactured by Controlled Environments Limited). The chambers were designated growth temperature one (GT1), growth temperature two (GT2), and growth temperature three (GT3). GT1 had its temperature set at 32 °C from 6:00 a.m. to 5:59 p.m. and 26 °C from 6:00 p.m. to 5:59 a.m., relative humidity was set at 80% RH, fluorescence was set at 450 µmol from 6:00 a.m. to 10:59 a.m., 700 µmol from 11:00 a.m. to 2:59 p.m., 450 µmol from 3:00 p.m. to 5:59 p.m., and 0 μ mol from 6:00 p.m. to 5:59 a.m., and CO₂ was set to 340 ppm. GT2 had its temperature set at 27 °C from 6:00 a.m. to 5:59 p.m. and 21 °C from 6:00 p.m. to 5:59 a.m. Relative humidity, fluorescence, and CO₂ were the same as GT1. GT3 had its temperature set at 22 °C from 6:00 a.m. to 5:59 p.m. and 16 °C from 6:00 p.m. to 5:59 a.m. Relative humidity, fluorescence, and CO_2 were also the same as in GT1. All pots were uniformly watered during plant growth and development.

2.2. Sample Collection

At maturity, grain samples were collected and transferred to labeled plastic bags, where they were immediately frozen in liquid nitrogen, before transferring them to the laboratory for storage at -80 °C pending further analysis. However, grains for cooked rice elongation and cooked rice expansion were dried at room temperature, as well as stored at room temperature, pending experiments.

2.3. Cooked Rice Elongation and Cooked Rice Expansion Percentage

Cooked rice elongation was here represented as the difference between the length of grains measured before and after cooking. In this kind of investigation, precision is very crucial; therefore, a Microtek ScanMaker i800 plus scanner was used to conduct all length measurements. One the other hand, cooked rice expansion was here represented as the difference between the perimeter of grains measured before and after cooking. After 6 months of storage, rice grains were used for the determination of cooked rice elongation and cooked rice expansion. The grains were milled with a JNMJ6 milling machine manufactured by Taizhou Grain Instrument Factory.

For each replicate, 10 milled rice grains were measured, using a Microtek ScanMaker i800 plus scanner. Each grain was then transferred to a PCR tube containing 150 μ L of distilled water. The PCR plate containing the rice grains was then placed in a PCR thermocycler, and the rice grains were individually cooked for 30 min at 99 °C block temperature. The cooked rice grains were then removed from the PCR plate and placed on a filter paper. After drying for 5 min at room temperature, they were remeasured. As with the raw grains, 10 cooked grains were remeasured simultaneously; this helped to control the variability of water content that could have resulted from unequal resting times between measurements. These experiments were conducted with 10 grains per treatment and each treatment had three replicates.

In other to determine the elongation percentage of cooked rice for each treatment, the following formula was used [15]:

$$\% E = (ACML - BCML)/BCML \times 100,$$

where %E is the elongation percentage, ACML is the mean length after cooking, and BCML is the mean length before cooking.

In other to determine the expansion percentage of cooked rice for each treatment, the following formula was used:

$$\%$$
 Exp = (ACMP - BCMP)/BCMP \times 100,

where %Exp is the elongation percentage, ACMP is the mean perimeter after cooking, and BCMP is the mean perimeter before cooking.

2.4. Scanning Electron Microscopy

Scanning electron microscopy was conducted using a Zeiss Scan Electron Microscope (EVOMA15). Rice grains sputter-coated with platinum were cut with a scalpel and examined at a magnification of $5000 \times$ at 5.00 kV.

In other to see the arrangement of the starch granules and the air spaces, starch granules were compared in their natural forms.

2.5. RNA Extraction

RNA extraction was carried out using a HiPure Plant RNA Mini Kit with the samples that were stored at -80 °C. The protocol used for RNA extraction was based on the kit's manual.

2.6. cDNA Synthesis and Quantitative Real-Time PCR (qRT-PCR)

cDNA synthesis was performed according to the protocol stipulated Vazyme kit for HiScript II Q RT SuperMix for qPCR (+gDNA wiper). Analysis was performed with Biometra Tone 96 G. cDNA, when not used immediately, wasstored at -80 °C.

qRT-PCR was carried out with SYBR qPCR Master Mix with Vazyme code Q311-02 5 mL 500 rxn.A BIO-RAD CFx96 Thermal Cycler was used for analysis. For each cultivar, qRT-PCR was performed with threereplicates of cDNA, and, according to Bao et al. [48], gene-specific primers (forward: 5'–GGTTGGTCTTCCTTCAGGTGTGC–3', reverse: 5'–CATCAACATCATCA TCAAACACCACTAT–3') were used.

2.7. GC–MS Analysis

GC–MS analysis was carried out using a GCMS-QP2010 with samples that were stored at -80 °C immediately after collection from the temperature chambers. Every sample used in this study had three replicates. Each replicate was prepared with 1 g of grain sample that waspulverized to fine powder using alaboratory mortar and pestle.

The ground sample was transferred to a 20 mL bottle, followed by the addition of 10 mL of dichloromethane (CH₂CL₂). Samples were then transferred to ultrasonic cleanser (KQ-800ES), set at 0 °C for 4 h. Afterward, samples were allowed to cool for 60 s and then transferred to a 10 mL conical flask before the addition of 4 g of anhydrous sodium sulfite (Na₂SO₂). After 30 s, 1 mL of the supernatant was transferred to a vial using asealed micropipette. This was followed by the addition of 2 μ L of 2,3,6-trimethylpyridine (1000× dilution with CH₂Cl₂) as an internal standard. Vials were closed and transferred to the GC–MS machine for analysis.

2.8. Matured Rice Grain Length and Perimeter

In other to determine the length and perimeter of rice grains, mature rice grains were scanned using a Microtek ScanMaker i800 plus scanner. This experiment was carried in threereplicates for each treatment. For each replicate, 20 grains of dehusked rice were scanned, and the average length and perimeter weredetermined. The rice grains used in this experiment were not milled to avoid differences that could occur during milling.

2.9. Statistical Analysis

Standardized metabolic data were used to perform principal component analysis (PCA). PCA was performed using SIMCA 14.1. The graphics of the heatmap was performed with TBtools software (version no 1.09852), and data values are presented on a log scale. To assess statistical differences among GT1, GT2, and GT3 regimes, Student's *t*-tests (performed using SPSS software) were conducted, with p < 0.05 used as the criterion of significance. Different lowercase letters (in the figures) indicate significant differences among the mean values.

3. Results

3.1. Cooked Rice Elongation and Cooked Rice Expansion Percentage

The results of the cooked rice elongation and cooked rice expansion percentage show that, in *indica* and *japonica* cultivars, temperature affected both cultivars differently.

In B385, the cooked rice elongation percentage was 24%, 34%, and 45% for the GT1, GT2, and GT3 regimes, respectively (Figure 1a). The cooked rice expansion percentage of B385 was 26%, 48%, and 58% for the GT1, GT2, and GT3 regimes, respectively (Figure 1c). This result shows that GT3 (low-temperature regime) recorded the highest percentage of cooked rice elongation and expansion percentage in B385. The results of Student's *t*-tests showed significant differences ($p \le 0.05$) in the cooked rice elongation and cooked rice expansion percentages among the three growth temperature regimes.

In YJY, the cooked rice elongation percentage was 65%, 52%, and 46% for the GT1, GT2, and GT3 regimes, respectively (Figure 1b). The cooked rice expansion percentage of YJY was 65%, 56%, and 46% for the GT1, GT2, and GT3 regimes, respectively (Figure 1d). According to the results, in YJY, GT1 (high-temperature regime) recorded the highest cooked rice elongation and cooked rice expansion percentage. The results of Student's *t*-tests showed significant differences ($p \le 0.05$) in the cooked rice elongation and cooked rice expansion percentages among the three growth temperature regimes.



Figure 1. Cooked rice elongation percentage and cooked rice expansion percentage: (a) B385 cooked rice elongation percentage; (b) YJY cooked rice elongation percentage; (c) B385 cooked rice expansion percentage; (d) YJY cooked rice expansion percentage. Different lowercase letters indicate significant differences (p < 0.05) among the mean values.

3.2. Starch Granule Morphology

The images of the starch granule morphology of B385, as revealed in Figure 2a–c, showed compact and bigger starch granules in GT3 (low-temperature regime); however, the starch granules were less compact and smaller in the GT1 and GT2 regimes.



Figure 2. Starch granule morphology: (**a**) starch granule morphology of B385 grown in GT1 regime; (**b**) starch granule morphology of B385 grown in GT2 regime; (**c**) starch granule morphology of B385 grown in GT3 regime; (**d**) starch granule morphology of YJY grown in GT1 regime; (**e**) starch granule morphology of YJY grown in GT2 regime; (**f**) starch granule morphology of YJY grown in GT3 regime.

However, the images of the starch granule morphology of YJY, as revealed in Figure 2d–f, showed compact and bigger starch granules in GT1 (high-temperature regime); however, the starch granules were less compact and smaller in the GT2 and GT3 regimes. Generally, YJY had more compact and bigger starch granules, compared to B385.

3.3. Principal Component Analysis (PCA) and Heatmap

The PCA results showed 95% cumulative variance in the grains of B385 and YJY, with a score plot of PC1 versus PC2 explaining 0.35 and 0.232 variation, respectively (Figure 3).



Figure 3. Principal component analysis of B385 and YJY grown in GT1, GT2, and GT3 regimes.

The heatmap showed that the highest abundance of cyclohexanol in B385 was recorded in GT3 (low-temperature regime); conversely, in YJY, cyclohexanol recorded its highest abundance in GT1 (high-temperature regime). The abundance of cyclohexanol in the grains correlated with cooked rice elongation and cooked rice expansion percentage. The abundance of cyclohexanol in the heat map is highlighted in green (Figure 4a,b). The results of Student's *t*-tests showed significant differences ($p \le 0.05$) in cyclohexanol in B385 among the three growth temperature regimes (Figure 4c), as well as in YJY among the three growth temperature regimes (Figure 4d).



Figure 4. Heatmaps and cyclohexanol abundance: (**a**) heatmap of compounds identified in B385 grown in GT1, GT2, and GT3 regimes; (**b**) heatmap of compounds identified in YJY grown in GT1, GT2, and GT3 regimes; (**c**) cyclohexanol abundance in B385; (**d**) cyclohexanol abundance in YJY. Different lowercase letters indicate significant differences (p < 0.05) among the mean values.

3.4. Unmilled Rice Grain Length and Parameter

Unlike the results of the cooked rice elongation and cooked rice expansion, the results of unmilled grain length and perimeter showed that temperature affected both cultivars in a similar fashion (Figure 5).



Figure 5. Unmilled rice grain length and perimeter: (**a**) grain length of B385; (**b**) grain length of YJY; (**c**) grain perimeter of B385; (**d**) grain perimeter of YJY. Different lowercase letters indicate significant differences (p < 0.05) among the mean values.

The rice grain length of B385 was 6.3 mm, 6.5 mm, and 6.6 mm for the GT1, GT2, and GT3 regimes, respectively. The grain perimeter of B385 was 15.2 mm, 15.3 mm, and 15.4 mm for the GT1, GT2, and GT3 regimes, respectively.

In YJY, the grain length was 4.7 mm, 4.8 mm, and 4.9 mm for the GT1, GT2, and GT3 regimes, respectively. The grain perimeter of YJY was 12.4 mm, 12.7 mm, and 12.9 mm for the GT1, GT2, and GT3 regimes, respectively.

The results of Student's *t*-tests showed significant differences ($p \le 0.05$) in the grain length and perimeter of YJY; however, in B385, only the length in GT1 was significantly different, whereas the perimeter results did not show a significant difference.

3.5. 2-AP Content and badh2 Gene Expression Levels

The result of 2-AP in the grains of B385 and YJY showed that 2-AP content increased with a decrease in temperature, whereas the results of *badh2* expression levels revealed a negative correlation of *badh2* with high 2-AP content (Figure 6).

In B385, 2-AP content was 7930 μ g/kg, 12,730 μ g/kg, and 20,652 μ g/kg in the GT1, GT2, and GT3 regimes, respectively. However, the *badh2* expression levels in the grains of B385 were 1, 0.6, and 0.4 for the GT1, GT2, and GT3 regimes, respectively. Student's *t*-tests showed significant differences ($p \le 0.05$) in 2-AP content among the three growth temperature regimes. Similarly, there were significant differences in the *badh2* expression levels among the three growth temperature regimes.

The 2-AP content in the grains of YJY was 8589 μ g/kg, 9746 μ g/kg, and 12,550 μ g/kg for the GT1, GT2, and GT3 regimes, respectively. However, the *badh2* expression levels in the grains of YJY were 1.4, 1.1, and 0.6 for the GT1, GT2, and GT3 regimes, respectively. Student's *t*-tests showed significant differences ($p \le 0.05$) in the 2-AP content among the three growth temperature regimes. Similarly, there were significant differences in the *badh2* expression levels among the three growth temperature regimes.



Figure 6. 2-AP content and *badh2* gene expression levels: (**a**) 2-AP content in B385; (**b**) 2-AP content in YJY; (**c**) *badh2* expression levels in B385; (**d**) *badh2* expression levels in YJY. Different lowercase letters indicate significant differences (p < 0.05) among the mean values.

4. Discussion

In the past several decades, heat wave frequency has been on the rise [40], and the trend is expected to continue in the coming years [41]. In the present study, we investigated how three different growth temperature regimes affected cooked rice elongation and expansion percentage in *indica* and *japonica* rice cultivars. Cooked rice elongation and cooked expansion are important traits that are used in assessing rice grain quality.

The findings of this study showed that the effects of growth temperature on cooked rice elongation and expansion were different in B385 and YJY. Our results, as shown in Figure 1, revealed that B385 recorded the highest cooked rice elongation percentage and cooked rice expansion percentage in GT3 (low-temperature regime) and the lowest cooked rice elongation percentage and cooked rice expansion percentage and cooked rice elongation percentage were recorded in GT1 (high-temperature regime), and the lowest cooked rice elongation percentage and cooked rice expansion percentage were recorded in GT1 (high-temperature regime), and the lowest cooked rice elongation percentage and cooked rice expansion percentage were recorded in GT3 (low-temperature regime). B385 is an *indica* cultivar, whereas YJY is a *japonica* cultivar. Rice starch properties have been shown to be correlated with cooked rice elongation. Arikit et al. [20] identified three QTLs for cooked rice elongation—two on chromosome 6 and one on chromosome 4—and observed that all three QTLs were located near starch-biosynthesizing genes. In this study, we reported a correlation between starch granule morphology and cooked rice elongation percentage.

In other to observe the arrangement of starch granules and the air spaces, we analyzed the starch granules in their natural forms. Kang et al. [12] reported less compact and smaller starch granules in *indica* cultivars, compared to more compact and larger starch granules in *japonica* cultivars. In the present study, as shown in Figure 2, we also generally observed less compact and smaller starch granules in B385 and more compact and larger starch granules in YJY.

However, we also observed that B385 grown in the GT3 regime had the most compact and largest starch granules among B385 cultivars from the three growth temperature regimes, whereas B385 grown in the GT1 regime had the least compact and smallest starch granules among B385 cultivars from the three growth temperature regimes. Conversely, YJY grown in the GT1 regime had the most compact and largest starch granules, whereas YJY grown in GT3 regime had the least compact and smallest starch granules among YJY cultivars from the three growth temperature regimes. Reports have shown that starch is correlated with cooked rice elongation and cooked rice expansion [18,20,21]. The waxy gene region is associated with starch biosynthesis in rice [49] and has been shown to be temperature-sensitive [50,51]. The waxy gene is located on chromosome 6 of rice and consists of 14 exons and 13 introns [52]. Two alleles of the waxy gene, waxy^a and waxy^b, are widely distributed in rice. The *waxy*^a allele is widely distributed in *indica* rice varieties, whereas the $waxy^{b}$ allele is widely distributed in *japonica* rice varieties [53,54]. The QTL on chromosome 6 located near the waxy gene region has been associated with cooked rice elongation and cooked rice expansion [21]. Therefore, the differences that we reported in starch granule morphology could explain why B385 grown in the GT3 regime had the highest cooked rice elongation and cooked rice expansion percentage among B385 cultivars, whereas YJY grown in the GT1 regime had the highest cooked rice elongation and cooked rice expansion percentage among YJY cultivars. Tang et al. [55] also showed that temperature affected starch properties and rice grain quality. Huang et al. [56] showed that changes in temperature affected the appearance, gel consistency, gelatinization temperature, and protein content of rice. Temperature has also been shown to affect the yield [44] and amylose content of rice [5].

In other to determine if chemical compounds also played some roles in the differences observed in cooked rice elongation and cooked rice expansion in B385 and YJY, we carried out further analyses. The PCA result in Figure 3 showed that growth temperature affected the metabolome of both B385 and YJY. From the PCA result, we observed that, in each cultivar, the three replicates grown in the same temperature regime were clustered together. This result shows that growth temperature had profound effect on the grain and suggests that the differences observed in cooked rice elongation and cooked rice expansion were as a result of differences in growth temperature.

In addition to PCA, we carried out heatmap analysis (Figure 4), which revealed that, in B385, cyclohexanol had its highest abundance in grains grown in the GT3 regime, whereas, in YJY, cyclohexanol had its highest abundance in grains grown in the GT1 regime. The correlation between cyclohexanol and cooked rice elongation and expansion percentage suggests that cyclohexanol likely plays some roles in cooked rice elongation and cooked rice expansion. It is unclear why, in B385, cyclohexanol had its highest abundance in the GT1 regime. The possible explanation for this could be that the metabolites reacted differently with cyclohexanol in B385 compared to YJY. According to Hu et al. [1], there is significant variation in the relative abundance of metabolites in *indica* and *japonica* rice cultivars.

In Figure 5 we showed the results of unmilled grain length and perimeter. The results showed that, in both B385 and YJY, grains that were harvested from the GT3 regime had the longest length and largest perimeter, whereas the grains that were harvested from the GT1 regime had the shortest length and smallest perimeter. Our results also showed that, in both B385 and YJY, the differences in unmilled grain length and perimeter (Figure 5) between rice grains harvested in the three growth temperature regimes were much smaller, compared to the differences in cooked rice elongation and cooked rice expansion (Figure 1). On the basis of these results, we can speculate that the mechanism of grain elongation and expansion during rice growth and development differs from the mechanism of cooked rice elongation and cooked rice elongation and cooked rice elongation.

Lastly, we also investigated the effect of temperature on 2-AP, the major compound associated with fragrance in rice. Our results showed that, in both B385 and YJY, grains harvested from rice plants grown in GT3 had the highest content of 2-AP, whereas grains harvested from rice plants grown in GT1 had the lowest content of 2-AP (Figure 6a,b). The *badh2* gene is responsible for fragrance in rice [34–36,57]. We also discovered that, in both B385 and YJY, grains harvested from rice plants grown in the GT3 regime had the lowest expression of *badh2*, whereas grains harvested from rice plants grown in the GT1 regime had the highest expression levels of *badh2* (Figure 6c,d). These findings are in agreement

with Hinge et al. [27] who reported that a negative expression of *badh2* is associated with the biosynthesis of 2-AP in fragrant rice. Our results showed that low temperature increased the biosynthesis of 2-AP in both *indica* and *japonica* rice cultivars.

The findings of this study revealed that the effect of growth temperature on cooked rice elongation and cooked rice expansion varies in *indica* and *japonica* rice cultivars. Since cooked rice elongation and cooked rice expansion are important traits used in determining rice grain quality, more studies should be carried out to understand the genetic basis of the difference. Our results also suggest that the mechanism of rice grain elongation and expansion differs from the mechanism of cooked rice elongation and cooked rice expansion. Lastly, we showed that low temperature increased the biosynthesis of 2-AP in both *indica* and *japonica* rice cultivars. The popularity of Basmati rice around the globe is due to its fragrance and extensive elongation after cooking. This study showed that high temperature is detrimental to both traits that make Basmati rice popular. It has been predicted that heat wave frequency will increase in the coming years; therefore, it is important for rice breeders to understand the effect of temperature on rice quality, so as to develop new cultivars with better grain quality.

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