# Comparative transcriptomic analysis of peach fruits in common and high temperature conditions

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May 5, 2020

## Abstract

Temperature is a major environmental factor that affects fruit storage, but the underlying molecular mechanism is poorly understood. Here, the differences in transcriptome, ethylene production, pulp softening of postharvest peach fruits were compared between common and high temperature storage conditions. High temperature storage resulted in a lower level of ethylene production and a slower fruit softening due to the decreased expression levels of ethylene biosynthetic genes and softening related enzymes. The MEKK1-MKK2-MPK4/6 genes had high expression levels in response to high temperature condition. The decreased expression of pectinesterase, polygalacturonase, pectate lyase, pectin methylesterase and the increased expression of expansin were observed in high temperature treatment. A series of genes related to membrane stability also showed lower transcription levels, such as peroxidase, lipoxygenase 3 and superoxide dismutase 1/2. These genes were co-expressed with different auxin response factors, ethylene response factors and they composed function modules collectively correlated to physiological changes. Finally, we proposed a model of the molecular response mechanism of peach fruit at high temperature which helps to develop new approaches for maintaining fruit quality during storage.

## Introduction

The purpose of commercial storage of fruit is to lengthen shelf-time and maintain the taste of pulp. The current postharvest storage technologies mainly focus on a combined utilization of storage environment factors such as temperature, modified atmosphere and chemicals, and among them temperature control is the most widely used method for fruits and vegetables during shelf life. Although cold conditioning is a virtually irreplaceable method used to prolong the postharvest quality of horticultural products, chilling injury (CI) is triggered in tropical and subtropical fruits which are sensitive to low temperature (Teklehaimanot, 2004). CI plants have a series of cellular changes, including ethylene synthesis, membrane fluidity and cytoskeletal rearrangement, resulting in internal browning (IB), flesh breakdown, lack of juiciness, and loss of flavor, which seriously affects the commercial values of fruits (Cramer et al., 2011).

With the climatic change of global warming, high temperature stress becomes a major plant stress affecting plant cellular homeostasis, crop growth and development (Tubiello et al., 2007). Plants have evolved a series of responses to raised temperature linked with heat stress proteins (HSPs), heat stress factors (HSFs), and phytohormones such as abscisic acid (ABA), salicylic acid (SA) and ethylene (Kotak et al., 2007). Besides, the effects of high temperature have been reviewed on its inhibition of ethylene production, control of postharvest diseases and reducing CI in many fruits and vegetables (Barkaigolan and Phillips, 1991; Lurie, 1998; 2005). In kiwifruit, high temperature stress controls fruit ripening by inhibiting ethylene production and signaling sensitivity (Antunes and Sfakiotakis, 2000), similar to studies on apple (Lurie and Klein, 1990) and tomato (Lurie and Klein, 1991). However, decline of fruit firmness and increase of ethylene production were observed for banana fruit during storage at high temperature (Yan et al., 2011). Overall, numerous

studies focused on how to reduce CI and on the effect of heat treatment on ethylene metabolism, all of which showed that temperature is vital to fruit storage. However, limited studies have considered the influences of high temperature for shelf life after transient cold conditioning.

Peach (*Prunus persica* L. Batsch) has highly perishable fruits that decay quickly at ambient temperature. Although refrigeration is used to maintain flesh quality and prolong shelf-time, peach is highly sensitive to low temperature, resulting in CI. The major symptoms of postharvest CI are internal browning, mealiness or wooliness, and flesh bleeding or internal reddening with physiological disorders (Brummell et al., 2004; Lurie and Crisosto, 2005). In previous studies, heat treatment has been applied prior to cold storage to prevent or alleviate CI by acquiring CI tolerance in response to heat shock (Saltveit, 1991; Ferguson et al., 2000; Paull and Chen, 2000; Budde et al., 2006; Wang et al., 2006; Peng et al., 2009; Zhang et al., 2011). However, information is much less about high temperature conditioning after cold treatment in peach fruits.

In this study, we performed comparative transcriptomic analysis of postharvest peach fruits between high temperature (HT: 35 °C) and common temperature (CT: 25 °C) after a pre-storage at 5 °C for 2 days, and combined the comparison results with measured physiological changes to comprehend the process of peach fruit decay. This study provided new insights into the molecular mechanisms of temperature response during fruit shelf life and offered novel clues for developing the fruit storage technologies in practice.

#### Materials and methods

#### Plant materials and treatments

Red flesh peach (*Prunus persica* L. Batsch cv. Tianxianhong) (He et al., 2010) fruits with consistent color, shape and weight were harvested at commercial maturity from an orchard in Xiaogan, Hubei province, China. Uniform fruits without visual defects were selected and kept at 5 °C for 2 days after the day of harvest. Then, these fruits were randomly divided into two groups. One group was stored at CT for 7 days, and the other was stored at HT for 7 days. During shelf life, fruits were sampled at day 1, 2 and 3 as early stage as well as day 5, 6 and 7 as later stage. For each sampling point, sarcocarp was extracted and randomly distributed into two biological replicates. Then, mesocarp was sliced, frozen in liquid nitrogen and stored at -80 °C for further study.

#### Measurements of physiological changes

Some physiological parameters were measured for each sample during storage. GY-2 fruit hardness tester with a 3.5-mm-diameter head was applied to measure the pulp firmness of fruit without peel. Six peach fruits from each sample were selected, and 7 points evenly distributed over each fruit were examined and the mean of the measured values was calculated and used. To detect ethylene production, 1 kg of fruits from each sample were selected and preserved in a sealed box at the same temperature for 6 h, then 1 ml gas sample was collected to measure ethylene production using gas chromatography (Agilent Technologies 7890A GC System, USA) with 3 biological replicates. The gas chromatographic (GC) analysis of ethylene used GC Columns ( $30 \text{ m} \times 0.530 \text{ nm} \times 3.00 \text{ µm}$ ), and oven, inlet and detector temperatures were 40 °C, 250 °C and 250 °C, respectively. The ethylene standard curve was plotted with the gradients of 5 concentration values to identify the ethylene production rate. The 1-aminocyclopropane-1-carboxylic acid (ACC) synthase and ACC oxidase were extracted to measure their activities using conventional method.

#### **RNA** extraction

Total RNA was extracted from mesocarp using plant RNAOUT kit (TIANDZ, China), then the quality control of RNA was performed using 2100 Bioanalyzer system and all samples were qualified as a result. RNA samples were subjected to DNaseIdigestion (Takara, Japanese) according to instructions from the manufacturer to remove the contaminating genomic DNA. And these were purified using RNeasy MinElute Cleanup Kit (QIAGEN, Germany), and eluted with RNase-free water. Ribo-Zero Magnetic Kit (Epicentre, America) was used for depleting rRNA according to the manufacturer's protocol. Eventually, the rRNA-depleted RNA sample was used in the subsequent experiments.

#### **RNA-Seq library construction and sequencing**

Equal amounts of total RNA for each sample was used to construct 24 RNA libraries. RNA sequencing was performed on an Illumina HiSeq 2500 platform at Chinese National Human Genome Center, Shanghai, and 100 bp and 150 bp paired-end reads were generated. In more detail, 24 libraries were generated using NEB Next(r) UltraTM Directional RNA Library Prep Kit for Illumina (NEB, American), and the quality, quantity and size distribution of RNA were determined using three methods: Qubit fluorometer, 2% agarose gel electrophoresis and Agilent High Sensitivity DNA Kit. The libraries were then used in cluster generation by TruSeq PE Cluster Kit (Illumina, American), and submitted for Illumina HiSeq 2500 sequencing according to the standard operation protocols. All the raw data have been uploaded to the GEO database of NCBI (accession number: GSE122868).

#### Transcript assembly and novel transcripts annotation

To obtain high quality data, the adapters in raw data were trimmed and the reads with low quality (Q-value <20) and shorter than 36 bp were filtered using FASTX-Toolkit (version 0.7, http://hannonlab.cshl.edu/fastx\_toolkit/). The filtered FASTQ files of pair reads were justified using a custom Python script developed in our laboratory. Then, Q20, Q30 and GC content of the filtered data were calculated using FastQC (version 0.11.5, http://www.bioinformatics.babraham.ac.uk/projects/fastqc/) to confirm the quality of filtered data. All the subsequent analyses were based on the clean data with high quality. Paired-end clean reads were mapped against Prunus persica L. Batsch reference genome (prunus\_persica/genome\_v2.0.a1) from the genome database (GDR) (Jung et al., 2008) using Tophat (version 2.1.1) (Trapnell et al., 2009). To generate transcripts for each sample, the above results were assembled using Cufflinks suite (version 2.2.1) (Trapnell et al., 2010; Roberts et al., 2011; Trapnell et al., 2012). Novel transcripts were annotated using BLASTX (Altschul et al., 1990; Altschul et al., 1997) against the NCBI nr database and using Blast2GO (version 5) (Conesa et al., 2005) to perform InterProScan analyses. Then, the novel transcripts were annotated and categorized into 3 principal Gene Ontology (GO) categories: biological process, molecular function and cellular component (The Gene Ontology Consortium et al., 2000; The Gene Ontology Consortium, 2017). Besides, the pathway annotations were generated using SBH method in the KEGG Automatic Annotation Server (KAAS, version 2.1) (Moriya et al., 2007).

## Quantification of gene expression levels and differential expression analysis

We used Cuffdiff (Trapnell et al., 2013) to calculate gene expression level as FPKM (fragments per kilobase of exon per million reads mapped) value, and generated the adjusted P-values of false discovery rate (FDR) between different conditions using the Benjamin-Hochberg method (Benjamini and Hochberg, 1995; Benjamini and Yekutieli, 2001). FPKM value of each gene was calculated. Genes with a corrected FDR of 5% and |Log<sub>2</sub>ratio| [?] 1 were assigned as differentially expressed genes (DEGs) using R software (version 3.2.5). Wilcoxon signed rank test was used for the comparison of gene expression levels during 7 days between CT and HT conditions.

## Gene co-expression network analysis

All transcripts in samples were used to perform co-expression analysis to describe the correlation patterns among genes and identify regulatory modules. Weighted gene co-expression network analysis (WGCNA) were conducted using R software package WGCNA based on expression profiles (Langfelder and Horvath, 2008). Firstly, the pairwise correlation coefficients between all genes were calculated and further transformed into adjacency matrix with a soft threshold power of 12. To counter the effects of spurious or missing connections, topological overlap similarity was measured from the adjacency matrix (Yip and Horvath, 2007). Then, modules were detected as branches of the dendrogram using hierarchical clustering with the DynamicTreeCut algorithm and assigned to different colors(Langfelder et al., 2008). Intramodular connectivity was calculated based on the expression profiles of the module members to identify the highly connected intramodular hub genes. Besides, the correlations between gene expression profile and the phenotype measurements of interest were also calculated to explore the association of modules to external traits. Finally, Cytoscape (version 3.5.1) was used to visualize the network connections and calculate the link weights to indicate the hub-genes in selected modules (Shannon et al., 2003).

# Quantitative real-time PCR (qRT-PCR) validation

In order to confirm the reliability and accuracy of the RNA-Seq analysis, qRT-PCR was performed on a set of 6 genes randomly selected from DEGs. Firstly, total RNA was extracted from approximately 3g of frozen tissues using E.Z.N.A<sup>(r)</sup>. Plant RNA Kit (OMEGA, R6827) by following the producer's instructions. Genomic DNA was removed to obtain DNA-free RNA which was reversely transcribed to first-strand cDNA using PrimeScript RT reagent Kit with gDNA Eraser (TaKaRa, RR047A). Based on sequences from the peach genome database (Jung et al., 2008), gene specific primers were designed (**Supplementary Table S1**) and evaluated using NCBI Primer-BLAST (Ye et al., 2012). Translation initiation factor 1A (PpeIF-1A, ppa002870m) was used as the reference gene for data normalization according to a previous publication (Kou et al., 2017). With diluted cDNA, qRT-PCR was performed using PowerUp SYBR Green Master Mix (Thermo Fisher Scientific, A25741) on QuantStudio 6 Flex Real-Time PCR Systems (Life Technologies) with previously described primer pairs. Samples for each condition were examined in 3 technical replicates and the mean Ct was calculated. The 2<sup>-Ct</sup> method was used to assess the relative gene expression level between two temperature conditions at every time point.

#### Results

#### Changes of firmness and ethylene production in peach fruits

To measure the internal physiological variation in peach fruits, the changes of firmness and ethylene production were examined at 6 time points for CT and HT storage conditions, respectively. Interestingly, the peach fruits at HT showed a much higher level of firmness than the fruits at CT, and this was accompanied by a significantly lower level of ethylene production of 0.05  $\mu$ l/g/h in HT samples (**Figure 1**). After 3 days, firmness showed almost steady trend in both treatments. Besides, CT samples stayed in high ethylene production rate of more than 0.2  $\mu$ l/g/h on all days. These data indicated that firmness and ethylene production were correlated with each other, but ethylene may not be the only influential factor on firmness.

## Gene expression profiling during peach ripening and novel transcripts annotation

To reveal the molecular responses to HT and CT in post-harvest peach fruits, samples with two biological replicates from 6 time points were processed to construct 24 RNA libraries. A total of 684 M reads were generated with an average length of 100 bp, ranging from 10.18 to 21.57 M raw reads per library (**Supplementary Table S2**). The reads data were pre-processed by trimming adapters and filtering out short reads (< 36 bp) and low-quality reads (Q < 30). After pre-processing, 562 Mb (82.22%) high-quality sequences were retained. The remaining paired reads were mapped to the *Prunus persica* reference genome, and the total mapped rate was approximately 92.26% in average (**Supplementary Table S3**).

Relative abundance of genes was calculated and normalized as FPKM, and the robustness and reproducibility of data were indicated by high Pearson correlation coefficients (> 0.97) among biological replicates for all comparison pairs (**Supplementary Table S4**). Besides, we identified 1,281 novel transcripts which were aligned to the reference genome but not included in the 26,873 protein-coding genes (**Supplementary Data**). The lengths of those transcripts ranged from 46 to 215,643 bp, with an average length of 3,045 bp. The biological functions of novel transcripts were annotated with Gene Ontology (GO) terms by successively using BLASTx (against the NCBI database) and Blast2GO; they were also subjected to KAAS to obtain the KEGG Orthology (KO) identifiers. Finally, 353 transcripts were classified into 3 GO categories and 176 transcripts have KO annotations (**Supplementary Figure S1 & Table S5**).

#### Analysis of DEGs

To identify DEGs between HT and CT conditions, the samples of each time point (day) were compared and the DEGs were detected. Firstly, we counted the expressed genes in each sample and found that peach fruits at CT underwent a more substantial decrease in the number of expressed genes compared with HT (**Figure 2a**). A total of 7,245 DEGs (P < 0.05 and  $| \log_2 \text{ ratio } | [?] 1$ ) were identified in all comparison pairs between

HT and CT. The numbers of up- and down-regulated DEGs were shown in **Figure 2b** . Interestingly, there is a strong decline in the numbers of both up-regulated and down-regulated genes at ripening stage. The number of up-regulated DEGs reached summit on day 2 with 2,778 genes, showing the most significant response to HT in transcriptome.

Several groups of transcription factors (TFs) were identified involved in plant responses to diverse abiotic stresses including temperature and drought. Here, 301 TFs from all DEGs were identified belonging to 49 TF families. Among all the TF families, ethylene response factors (ERFs) showed the highest numbers (44) compared with others (**Figure 2c**). These data suggest the important role of ERFs in high-temperature response.

GO analysis was performed to dissect the functions of DEGs. As a result, 2,665 up-regulated DEGs and 1,990 down-regulated DEGs were classified into 3 main GO categories: cellular component (CC), biological process (BP) and molecular function (MF). In up-regulated DEGs, the most abundant BP subcategories were 'nucleobase-containing compound metabolic process', 'gene expression' and 'nucleic acid metabolic process' (**Figure 3a**). In down-regulated DEGs, the major BP subcategories were 'organic substance biosynthetic process', 'cellular macromolecule biosynthetic process' and 'cellular nitrogen compound biosynthetic process' (**Figure 3b**). Besides, only down-regulated DEGs had enriched groups in CC and MF which are 'cytoplasm', 'structural constituent of ribosome' (**Figure 3b**), etc.

## Mitogen-activated protein kinase (MAPK) cascades response to HT stress

HT induces changes of cytoplasmic calcium signaling, which exerts regulatory effects on plant development and stress responses (Berridge et al., 2003; Perochon et al., 2011). Among the 7 genes of calmodulin (CALM), Prupe.3G266000 and Prupe.4G269100 showed higher transcript abundance in CT fruits, while Prupe.1G089100 was on the contrary (**Figure 4a**).

The MAPK cascades are one of the major signaling pathways and highly conserved in evolution for the transformation of extracellular stimuli into intracellular responses in eukaryotic cells (Hirt, 1997; Tena et al., 2001; Zhang and Klessig, 2001; Nakagami et al., 2005). The MAPK cascades consist of three interconnected protein kinase modules: MAPK kinase kinase (MEKK), MAPK kinase (MKK), MAPK. In MAPK gene families, we found that MEKK1-MKK2-MPK4 and MPK6 had high expression levels responding to HT (**Figure 4b**), which were also detected in *A. thaliana*responding to salt, drought and cold (Teige et al., 2004). Therefore, MEKK1-MKK2-MPK4/6 module is the most likely signaling pathway activated during HT stress.

# Expression of genes related to auxin biosynthesis, transport and signaling

Tryptophan (Trp) is a precursor for auxin (indole-3-acetic acid, IAA) (Woodward and Bartel, 2005), whose related genes were shown to be differentially expressed under CT and HT in post-harvest peach fruits. Although the expression level of tryptophan synthase alpha chain (TRPA; Prupe.3G144500) was decreased on day 2 in both treatments (**Figure 5**), the expression level of tryptophan synthase beta chain (TRPB; Prupe.4G207900) showed a peak on day 2 and reached the maximum on day 7 for the CT condition but not for the HT condition. The expression level of another auxin biosynthetic enzyme, indole-3-glycerol phosphate synthase (IGPS; Prupe.3G196200), manifested different trends between HT and CT at early stage. Overall, HT reduces tryptophan biosynthetic enzyme expression level compared with CT.

Several Trp-dependent pathways, which are generally named after an intermediate, have been proposed, including indole-3-pyruvic acid (IPA) pathway, indole-3-acetamide (IAM) pathway, tryptamine (TAM) pathway and indole-3-acetaldoxime (IAOx) pathway (Woodward and Bartel, 2005; Zhao, 2012). In IPA pathway [Trp - IPA - IAA], the FPKM value of tryptophan aminotransferase of *Arabidopsis*(TAA1) was less than 5 in all samples, but the expression of indole-3-pyruvate monoxygenase (YUCCA) significantly increased on day 2 at HT. In IAM pathway [Trp - IAM - IAA], the amidase (AMI; Prupe.6G327700) had increased expression at the early stage under both temperatures. In TAM pathway [Trp - TAM - indole-3-acetaldehyde (IAAld) - IAA], aldehyde dehydrogenase (NAD+) (ALDH2B7; Prupe.1G255200) under HT showed lower expression

than CT in the whole storage period. To sum up, IPA pathway is affected most by HT in our work.

The expression patterns of auxin-related genes were evaluated to understand their responses to HT. It was found that the expression of auxin influx carrier 1 (AUX1) decreased most on day 2 (Figure 5) under both temperature conditions, but auxin efflux carrier component (Pin-formed, PIN5) had a higher expression level under CT. The auxin response factor (ARF) genes in group II increased at the later stage for CT rather than HT condition (Supplementary Figure S2).

These auxin-responsive genes have been classified into three major groups: Aux/IAA, small auxin-up RNA (SAUR), and Gretchen Hagen 3 (GH3) (Guilfoyle, 1999; Liscum and Reed, 2002). Aux/IAAs were sorted into three groups based on cluster analysis (**Figure 6**), which bind transcription factors of ARF family (**Supplementary Figure S2**). Generally, the genes within Group I were down-regulated with time, while the genes in Group III showed a higher level of expression in HT fruits (**Figure 6**). Based on the clustering results, SAUR genes were divided into four groups which had different responses to CT and HT (**Supplementary Figure S3**). In addition, the gene GH3.1 (Prupe.6G226100) showed a higher expression level under CT compared with HT, while the other three members of GH3 gene family (GH3.6, Prupe.8G248400; GH3.1, Prupe.8G137900; GH3.17, Prupe.1G213200) showed higher expression levels under CT in the later stage (**Figure 5**).

## Expression of genes related to ethylene biosynthesis and signaling pathway

Ethylene is biosynthesized by S-adenosylmethionine synthetase (SAMS) from the amino acid methionine to S-adenosyl-L-methionine (SAM), and SAM is then converted by 1-aminocyclopropane-1-carboxylic acid (ACC) synthase (ACS) to ACC which is further catalyzed by ACC-oxidase (ACO) to ethylene. Notably, the activity of ACS determines the rate of ethylene production (Yu et al., 1979). Similar to ethylene production (**Figure 1b**), the peach fruits at CT were higher than HT in the enzyme activities of ACO and ACS at most time points (**Figure 7**).

Expressions of genes involved in ethylene biosynthesis and signaling were examined to understand the lower ethylene production in HT fruits. Among these, the expression of 5 genes (SAMS5, Prupe.1G107000; SAMS1, Prupe.3G004000; SAMS3, Prupe.7G128500; ACS1, Prupe.2G176900; ACO1, Prupe.3G209900) were significantly higher at CT than HT (**Figure 8a**), which agreed with the physiological data of ACO/ACS activities (**Figure 7**).

Ethylene is perceived by a family of five membrane-localized receptors that are homologous to bacterial two-component histidine kinases involved in sensing environmental changes (Stepanova and Alonso, 2009). According to the homology with Arabidopsis, four peach ethylene receptors were identified, including ethylene receptors 1 (ETR1; Prupe.1G556000), ETR2 (Prupe.1G034300), ethylene response sensor 1 (ERS1; Prupe.8G265200) and ethylene insensitive 4 (EIN4; Prupe.6G348000). The expression levels of ETR2 and ERS1 at CT were generally higher than HT, while those of ETR1 and EIN4 were not obvious (Figure 8b ). Constitutive triple response 1 (CTR1; Prupe.7G117700), the downstream element of ethylene receptors, showed significantly decreased expression on day 2 with an average of 2.69-fold change, and then kept in low FPKM value at later time points (Figure 8b). Especially, EIN2 (Prupe.6G235600), whose function is a positive regulator of the ethylene pathway (Stepanova and Alonso, 2009), displayed reverse trends of expression levels between CT and HT. EIN3 (Prupe.2G058500, Prupe.2G058400) exhibited declining expression level on day 2. Besides, ERFs were sorted into four groups based on hierarchical clustering (Supplementary Figure S4a). Group I showed a higher level of transcripts in HT condition, indicating that group I genes might play a significant role in heat stress response (Supplementary Figure S4b). Therefore, temperature caused complicated responses in receptor genes and downstream signaling genes of ethylene in both CT and HT conditions.

#### Expression of genes related to

# flesh softening

The enzymes involved in cell wall reconstruction are the key factors for keeping cell shape and maintaining me-

chanical strength of peach fruits (Hayama et al., 2006). We found that 5 genes had higher FPKM values in CT fruits, including beta-glucosidase (BGlu), polygalacturonase (PG, Prupe.4G261900 and Prupe.4G262200), pectate lyase (PLY) and pectin methylesterase (PME) (**Supplementary Figure S5**). The mean FPKM value of PG (Prupe.4G262200) was 6,359.39, significantly higher than other genes (P -value < 0.01). Notably, PG (Prupe.4G261900), PLY (Prupe.1G239900) and PME (Prupe.7G192800) displayed a markedly distinct expression pattern that HT treated fruits had extremely low expression levels at all time points. Expansin protein (EXP) is connected with cell enlargement and cell wall change induced by plant hormones such as gibberellin, cytokinin, ethylene and brassinosteroids (Sampedro and Cosgrove, 2005). We found that EXP2 (Prupe.1G276700) had nearly constant expression levels at all time points in HT condition, and EXP1 (Prupe.2G263600) had opposite responses to CT and HT in transcriptional level during storage. Overall, these genes cooperate to prevent flesh softening in HT.

### Expression of genes related to enzymatic browning

Enzymatic browning impairs the sensory properties of fruits such as color and flavor, as a result of oxidative polymerization of phenolic compounds catalyzed by polyphenol oxidase (PPO) and peroxidase (POD) (Nicolas et al., 1994). Besides, the relationships between fruit browning and antioxidant enzymes such as lipoxygenase (LOX, EC 1.13.11.12), superoxide dismutase (SOD, EC 1.15.1.1) and catalase (CAT, EC 1.11.1.6), have been reported previously (Inzé and Montagu, 1995). There is no obvious trend in mRNA levels of POD genes during shelf life, while two genes (Prupe.1G29900, Prupe.3G278900) were up-regulated in CT condition, contrary to Prupe.4G042100 (PPO), Prupe.4G021100 (POD) and Prupe.2G005300 (LOX) (**Supplementary Figure S6**). Particularly, the expression levels of SOD1 and SOD2 were increased at the middle stage in CT condition and mostly higher than HT condition. Enzymatic browning is a strong and complex response to HT according to our research.

## Correlation between co-expression modules and physiological changes

The expression data and traits data of all samples were used in Weighted Gene Coexpression Network Analysis (WGCNA) and the relationships between them were visualized (**Supplementary Figure S7**). By using hierarchical clustering and dynamic tree cut method, co-expression modules were obtained (**Supplementary Figure S8**); after merging and filtering, a total of 28 modules remained; among them, the largest module (MEpaleturquoise) contains 2,691 genes while the smallest module (MEdarkorange2) only includes 181 genes (**Supplementary Table S6**).

The relationships between modules and physiological traits were examined (Figure 9). Firmness showed high correlation with the expression levels of genes from MEdarkorange2 and MEdarkred modules (R > 0.7) and anti-correlation with those from MElightyellow, MEdarkgrey and MEbrown4 modules (R < -0.7). Ethylene production was significantly correlated with six modules (P < 0.01), including MEsaddlebrown, MElightgreen, MEbisque4, MElightsteelblue1, MEskyblue3 and MEpaleturquoise. MEskyblue3 module was positively correlated with LOX2 (R = 0.86) but negatively correlated with ASA (R = -0.7). MEgrey module had no significant (P < 0.05) correlation with all physiological changes. Notably, the levels of AAO, AMS, LOX2,  $O_2^-$  and  $\beta$ -Gal displayed similar correlations with ethylene in many modules.

To further explore the biological function of each module, GO annotation and enrichment analysis were performed. As shown (**Supplementary Figure S9**), MEdarkgrey module was enriched in the GO term of endopeptidase Clp complex in cellular component category; MEskyblue3 module was enriched in the GO term of amino acid kinase activity; MElightyellow module was enriched in catalytic activity in molecular function category. Moreover, the sub-network involving all the above genes was extracted from the whole co-expression network (**Supplementary Figure S10**). The sub-network is roughly parted into two clusters: the cluster in the upper side contains genes mostly from MEskybule module and the cluster in the lower side contains genes from other modules. The genes AUX/IAA, SAUR and SAMS3 from the bisque4 module had high degrees in the sub-network, indicating that they played key roles in the correlations with other modules.

## Confirmation of DEGs by qRT-PCR

To validate the RNA-Seq data, six genes were randomly selected from the peach fruit DEGs for qRT-PCR analysis using PpeIF-1A as the internal control gene. The ratio of gene expression levels between CT and HT at each time point were calculated for both the RNA-Seq and qRT-PCR experiments. As shown in **Supplementary Figure S11**, the fold-changes in base-2 logarithm were similar between the two technologies, which confirmed the reliability of our transcriptome measurement.

#### Discussion

Peach fruits are usually harvested in hot summer, and in transport, softening, decay and browning are accelerated. Responses to high temperature during fruit ripening and senescence involve a series of physiological and molecular changes. Little information is available on the transcriptomic responses to high temperature in postharvest peach fruits. Here, HT conditioning after cold treatment was performed and it showed beneficial effects to the 'Tianxianhong' peach fruits (flesh firmness without cold injury). The factors affecting fruit quality during storage were identified as ethylene metabolism, cell wall enzymes and cellular oxidase which showed different responses to high temperature. We summarized our transcriptomic findings into a rough model for the high temperature response process in peach fruits (**Figure 10**). First, MEKK1-MKK2-MPK4/6 are highly expressed, which was regarded as the stress signal transduction process following HT. Then, the low expression levels of ACS1 and ACO reduced biosynthesis of ethylene and the decreased expression of TRPB, IGPS and ALDH2B7 reduced auxin production. A series of genes involved in flesh softening and membrane stability were influenced by these response factors such as ARFs, GH3 and ERFs. Finally, fruit quality in storage was improved under HT.

MAPK cascades play a key role in various cellular processes with accurate signal transduction via phosphorylation of their substrate proteins (Ichimura et al., 2002). In plants, MAPKs have been identified in abiotic stress and hormonal responses, innate immunity, disease resistance and developmental programs (Cristina et al., 2010). Among them, abiotic stress induction of MAPK genes and increased MAPK kinase activity have been detected when plants are subjected to salt, drought, cold, ozone and oxidative stresses (Mizoguchi et al., 1996), but there have been few studies of the MAPKs under high temperature stress in plants. In our study, the MEKK1-MKK2-MPK4/6 displayed high transcript abundances under HT. This is similar to the findings in the research of plant MAPK signaling during abiotic stress. In A. thaliana, MKK2 plays a pivotal role in cold and salt stress responses following the stress-induced MEKK1 and followed by the downstream MAPK4 and MAPK6 (Teige et al., 2004). MAPK4 and MAPK6 are also rapidly activated by wounding and touch associated with tyrosine phosphorylation (Ichimura et al., 2002). In addition, high temperature up-regulates the expression of MPK6 and AtMPK6-phosphorylated HSFA2 might participate in the response in A. thaliana (Li et al., 2012b). While in tomato, SIMPK1, a close homolog to AtMPK6, showed a negative effect on thermotolerance by regulating antioxidant defense via its substrate SISPRH1 involved in this pathway (Ding et al., 2018). To sum up, these data identified that the MEKK1-MKK2-MPK4/6 cascades mediate high temperature response in peach. Analyzing loss and over-expression of these genes in peach fruit would help to determine their potential effects in HT stress.

Ethylene is a major plant hormone involved in the regulation of many fruit developmental processes from maturation to ripening and senescence (Bapat et al., 2010; Pech et al., 2012; Kumar et al., 2014) . It was identified as a trigger and promoter in typical climacteric fruits ripening and can crosstalk to other phytohormones including auxin (Aux), ABA, jasmonic acid (JA) through controlling their biosynthesis pathway and signaling pathway (Kumar et al., 2014). However, there are few studies on the effect of temperature on ethylene metabolism and the corresponding molecular mechanism. In our study, the expression levels of ACO and ACS genes and their enzyme activities were both decreased in HT samples, resulting in lower ethylene production than CT fruits, which indicated that the ethylene biosynthesis that is affected by heat stress plays an important role in peach fruit ripening process. Similarly, in grapevine berry, ACO and ACS genes were also less expressed under the high temperature regime of 41.7 °C (the maximum air temperature) (Pastore et al., 2017). In Kiwifruit, fruit ripening was inhibited by decreased ACS and ACO activities at high temperature above 30 °C (Antunes and Sfakiotakis, 2000). These showed that temperature has direct effect on the process of ethylene biosynthesis especially on its ACO and ACS enzymes. But what exact

reason the maturity inhibition effect is attributed to has not been determined; for example, it can be a lack of ethylene production, the inability to react to ethylene, or other reasons (Burg, 1962). EIN3 and ERFs. the downstream elements of ethylene signaling pathway, play important roles in development, defense, and environment related responses in fruits (Gutterson and Reuber, 2004; Mizoi et al., 2012; Licausi et al., 2013). The ERF proteins, specifically binding to an AGCCGCC element (GCC box), were found in the promoter region of ethylene-regulated genes and could respond to ethylene, pathogens, and wounding (Ohme-takagi and Shinshi, 1995). In this study, the expression levels of ERFs under HT condition were clustered into several groups (Supplementary Figure S4) and co-expressed with several genes related to membrane oxidation and cell wall metabolism (Supplementary Figure S10). In Arabidopsis, ERF genes were involved in cell expansion which requires the proteins EXP and the actin modeling factor ADF5 (Marsch-Martinez et al., 2006), and also link to ethylene signaling and auxin biosynthesis (Mao et al., 2016). Ethylene response element binding protein (EREBP, Prupe.1G432000) in group II (Supplementary Figure S4) was co-expressed with PE, POD and AUX genes in peach fruits, and its ortholog APD1(AT4G13040.1) in Arabidopsis has been reported as an important regulator for basal plant defense and abiotic stress response (Giri et al., 2014). This raises a possibility that several downstream genes associated with flesh softening and membrane oxidation could be involved in the ERFs response to heat stress. Clarifying the relationship between them should be a goal of future work on heat response.

It has been reported that MAPK cascades regulate ethylene biosynthesis and signal transduction by protein phosphorylation and the expression of ACS genes (Meng and Zhang, 2013; Li et al., 2017). ACS proteins are substrates of MPK3 and MPK6, and the phosphorylation of ACS results in an increase in ethylene production in tobacco and *Arabidopsis*(Liu and Zhang, 2004; Han et al., 2010; Li et al., 2012a). In our results, the expression of MAPK4 and MAPK6 were induced by high temperature at early stage (**Figure 4b**) and meanwhile low ACS1 expression and ethylene production were observed. This implies the potential association between MAPK cascades and ACS genes in peach fruits, which needs further experimental verification.

In summary, we proposed a model of the molecular response mechanism of peach fruit at high temperature: under HT condition, MAPK cascade acts as a signal sensor and triggers the down-regulation of ethylene production and auxin synthesis; ERF/ARF proteins regulate cell wall enzymes and membrane enzymes; these processes ultimately help to maintain fruit quality. A series of direct or indirect possible regulations are proposed in the model, such as ACS1/ACO for ethylene production and EXP for fruit hardness. Future validation of these regulations will enhance our understanding on the high temperature response of fruits. The findings of this study provide new insights into the molecular mechanism of temperature adaptation and have implications for high temperature domestication of fruits.

### Author Contributions

Conceived and designed the experiments: B.G.M., C.A.L. Performed the experiments: X.W., K.L.C., Z.H.T., B.Z.W. Analyzed the data: X.W., B.Z.W., B.G.M. Wrote the paper: X.W., B.Z.W., B.G.M. Revised the paper: C.A.L.

## Funding

This work was supported by the National Basic Research Program of China (973 Program, Grant 2013CB127103), the National Natural Science Foundation of China (Grant NO. 31570844) and the National Natural Science Foundation of China (Grant NO. 31672205).

#### Acknowledgments

Helpful discussion with Ling-Ge Niu is appreciated.

#### **Conflict of Interest**

The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

# Data availability statements

The datasets analyzed for this study can be found in the GEO database of NCBI (accession number: GSE122868).

# **Supplementary Materials**

Supplementary data associated with this article can be found in the online version

# Figure Legends

**Figure 1.** Firmness and ethylene production in peach fruit after harvest during shelf life. (a) Flesh firmness. (b) Ethylene production rate. Peach fruits were primarily held at 5 degC for 2 days and then stored at 25 degC or 35 degC for 7d. P-values indicated the significance of difference between HT and CT which were calculated by Wilcoxon signed rank test. HT, high temperature (35 degC); CT, common temperature (25 degC).

**Figure 2.** Overview of gene expression differences between HT and CT. (a) Number of genes expressed during shelf life. (b) Number of DEGs identified between HT and CT at each time point (adjusted-P < 0.05). (c) The number of DEGs in TF family. Up, up-regulated; Down, down-regulated; HT, high temperature; CT, common temperature; DEGs, differentially expressed genes.

**Figure 3.** GO enrichment of differentially expressed genes. (a) GO enrichment of up-regulated DEGs. (b) GO enrichment of down-regulated DEGs. HT, high temperature; CT, common temperature; DEGs, differentially expressed genes.

**Figure 4.** Expression profiles of CALMs (a) and MAPKs (b) genes. P-values indicated the significance of difference between HT and CT which were calculated by Wilcoxon signed rank test. HT, high temperature; CT, common temperature; FPKM, fragments per kilobase of exon per million reads mapped; CALM, calmodulin; MAPK, mitogen-activated protein kinase.

**Figure 5.** Expression profiles of genes related to auxin biosynthesis, transport and signaling. P-values indicated the significance of difference between HT and CT which were calculated by Wilcoxon signed rank test. HT, high temperature; CT, common temperature; FPKM, fragments per kilobase of exon per million reads mapped; TRPA, tryptophan synthase alpha chain; TRPB, tryptophan synthase beta chain; IGPS, indole-3-glycerol phosphate synthase; YUCCA, indole-3-pyruvate monooxygenase; AMI, amidase; ALDH, aldehyde dehydrogenase (NAD+); AUX1, auxin influx carrier; TIR, transport inhibitor response.

**Figure 6.** Aux/IAA clustering in HT and CI fruits. (a) Clustering of expression profiles of Aux/IAA genes. The color from green to red means the expression level from low to high. (b) The average expression level of genes in each clustering group during HT and CT storage. HT, high temperature; CT, common temperature; FPKM, fragments per kilobase of exon per million reads mapped.

**Figure 7.** Enzymatic activity changes in peach fruit during different temperature shelf life. (a) ACO, 1-aminocyclopropane-1-carboxylic acid oxidase. (b) ACS, 1-aminocyclopropane-1-carboxylic acid synthase. P-values indicated the significance of difference between HT and CT which were calculated by Wilcoxon signed rank test. HT, high temperature; CT, common temperature.

Figure 8. Expression profiles of genes related to (a) ethylene biosynthesis and (b) signaling pathway. P-values indicated the significance of difference between HT and CT which were calculated by Wilcoxon signed rank test. HT, high temperature; CT, common temperature; FPKM, fragments per kilobase of exon per million reads mapped; SAMS, S-adenosylmethionine synthetase; ACO, 1-aminocyclopropane-1-carboxylic acid oxidase; ACS, 1-aminocyclopropane-1-carboxylic acid synthase; ETR, ethylene receptor; ERS, ethylene response sensor; EIN, ethylene insensitive; CTR, constitutive triple response; SIMKK, mitogen-activated protein kinase kinase; EBF, EIN3-binding F-box protein.

**Figure 9.** Relationship between modules and physiological traits. The correlation coefficient R and the corresponding P-value (in parenthesis) are shown in each grid. The color in heatmap from blue to red means the correlation coefficient from negative (-1) to positive (1).

Figure 10. A proposed model for postharvest peach fruit response to high temperature. Red color indicates positive effect and green color indicates the opposite.

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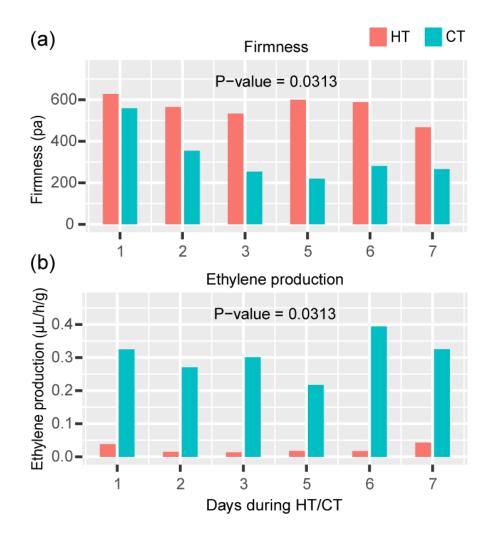
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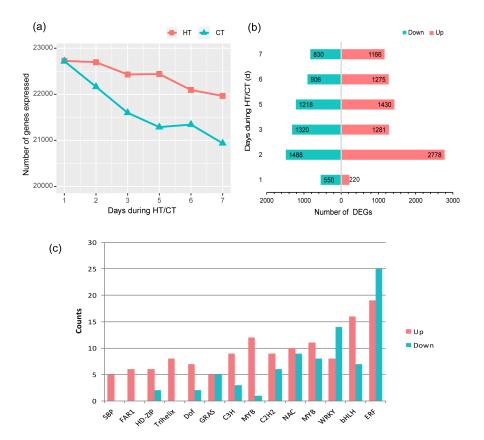
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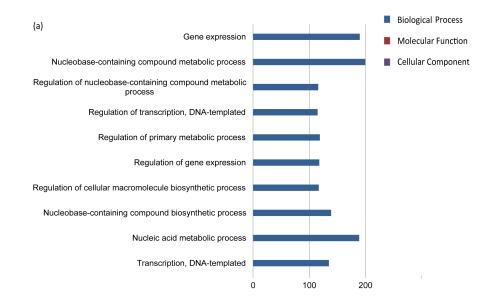
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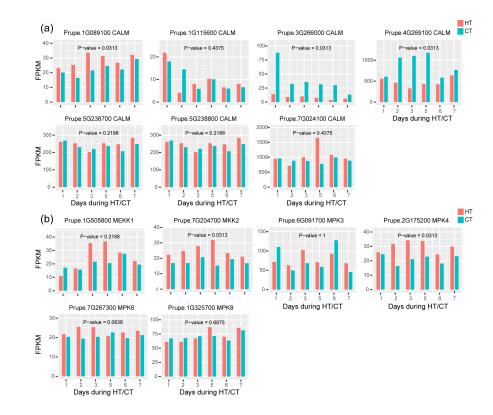
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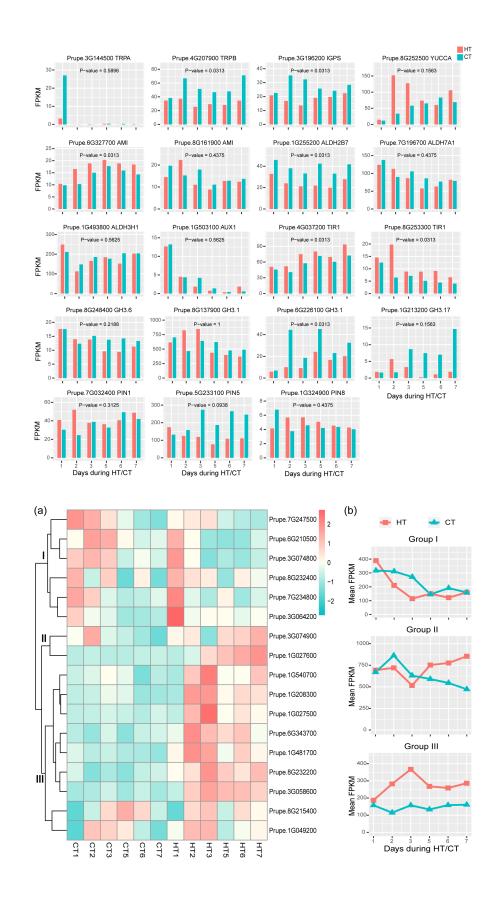


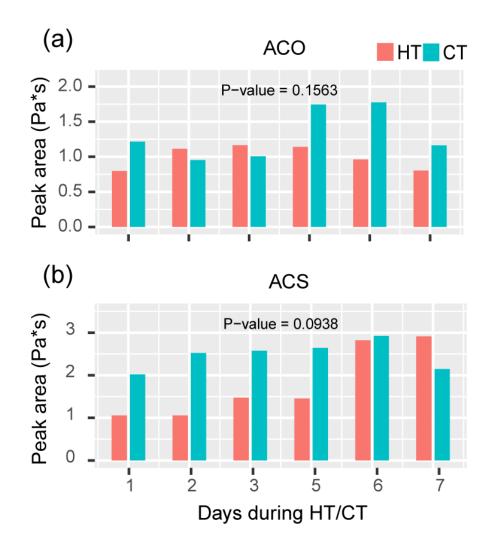


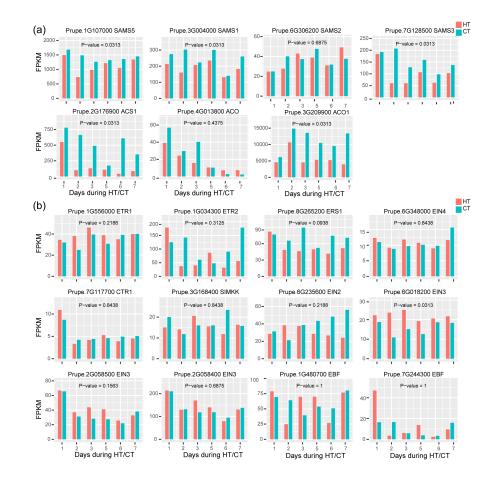


(b) Translation			
Organonitrogen compound biosynthetic process			
Organic substance biosynthetic process			
Cellular macromolecule biosynthetic process			
Cellular nitrogen compound biosynthetic process			
Protein ubiquitination			
Protein modification by small protein conjugation			
Gene expression			
Mitochondrial transport			
Inorganic ion transmembrane transport			
Structural constituent of ribosome		•	
Transcription factor activity, sequence-specific dna binding			
Ubiquitin-protein transferase activity			
Ribosome		•	
Cytoplasm			
Mitochondrial membrane			
Mitochondrion			
	0	100	200
		Counts	









# Module-trait relationships

MEmediumpurple3 -0.03 -0.24 0.013 -0.44 0.03 0.06 -0.43 -0.3 0.06 -0.44 0.05 0.07 -0.44 0.55 0.11 -0.41 0.55 0.11 -0.14 0.55 0.11 -0.14 0.55 0.11 0.41 0.55 0.11 0.41 0.55 0.011 0.011 0.01 0.021 0.021 0.021 0.021 0.021 0.021 0.021 0.021 0.021 0.021 0.021 0.021 0.021 0.011 0.011 0.011 0.011 0.011 0.011 0.011 0.021 0.021 0.021 0.021 0.021 0.011 <th></th>	
MElightcyan1 0.007 0.6 0.52 -0.007 0.04 0.24 -0.17 -0.38 0.034 -0.07 0.06 -0.23 -0.38 0.39 0.11   MEfloralwhite -0.57 0.30 0.49 (0.4) <	
MEfloralwhite -0.57 (0.7) 0.13 (0.7) 0.043 (0.7) -0.61 (0.7) 0.7 -0.14 (0.7) 0.03 (0.7) -0.14 (0.8) 0.13 -0.14 (0.7) 0.14 0.18 -0.14 0.18 -0.14 0.18 -0.14 0.18 -0.14 0.18 -0.14 0.18 -0.14 0.18 -0.14 0.18 -0.14 0.18 -0.14 0.18 -0.14 0.18 -0.14 0.18<	
MEdarkolivegreen 0.07 0.24 0.037 0.05 0.04 0.057 0.14 0.055 0.14 0.056 0.16 0.16 0.05 0.05 0.23 0.049 0.23 0.049 0.23 0.021 0.42 0.44 0.05 0.07 0.08 0.01 0.055 0.07 0.08 0.01 0.055 0.07 0.08 0.01 0.055 0.07 0.08 0.01 0.07 0.05 0.07 0.07 0.07 0.07 0.07 0.07	
MEskyblue (0.3) (0.3) (0.4) (0.1) (0.7) (0.1) (0.2) (0.4) (0.7) (0.4) (0.9) (0.9) (0.6) (0.6) (0.2) (0.2) (0.2) (0.2) (0.3) (0.2)	
MEsaddlebrown	
MEcyan -0.42 -0.36 -0.668 -0.27 -0.5 0.48 0.19 -0.21 -0.69 0.082 0.38 -0.81 -0.099 -0.13 0.15 0.67 0.077 -0.13 (0.5 0.07) -0.13 (0.5 0.07) (0.8) (0.7) (0.6) (0.02) (0.8) (0.7) (0.6) (0.02) (0.8) (0.7) (0.6) (0.02) (0.8) (0.7) (0.6) (0.2) (0.8) (0.7) (0.6) (0.2) (0.8) (0.7) (0.6) (0.2) (0.8) (0.7) (0.6) (0.2) (0.8) (0.7) (0.6) (0.2) (0.8) (0.7) (0.6) (0.2) (0.8) (0.7) (0.6) (0.2) (0.8) (0.7) (0.6) (0.2) (0.8) (0.7) (0.6) (0.8) (0.7) (0.6) (0.8) (0.7) (0.6) (0.8) (0.7) (0.6) (0.8) (0.7) (0.8) (0.7) (0.6) (0.8) (0.7) (0.8) (0.8) (0.7) (0.8) (0.7) (0.8) (0	5
MEgrey60 0.014 -0.5 -0.59 -0.21 -0.32 -0.02 0.57 0.021 -0.35 0.44 0.04 -0.52 0.068 0.079 0.4 0.85 0.033 -0.3 (0.1) (0.0)	5
MEgreen	
MEdarkorange2	
MElightgreen 0.5 -0.4 -0.38 -0.52 -0.24 0.47 0.34 0.45 -0.79 0.35 0.33 -0.78 -0.52 0.42 -0.091 0.55 -0.35 -0.28 0.42 0.091 0.55 -0.35 -0.28 0.42 0.091 0.55 -0.35 -0.28 0.49 0.091 0.55 0.33 0.49 0.091 0.55 0.33 0.49 0.49 0.49 0.49 0.49 0.49 0.49 0.49	
MEbisque4 -0.48 -0.33 -0.0085 -0.67 -0.06 0.71 0.014 0.07 -0.83 0.23 0.58 -0.76 -0.35 0.055 -0.22 0.45 0.13 -0.19 0.14 0.07 0.08 0.51 0.05 0.050 0.004 0.3 0.8 0.51 0.1 0.7 0.61	
MElightsteelblue1 -0.71 -0.19 0.14 -0.66 -0.029 0.86 -0.3 0.35 -0.87 0.92 0.67 -0.71 -0.6 0.21 -0.37 0.14 -0.27 -0.071 (0.5) (0.7) (0.02) (0.9) (4e-04 (0.4) (0.3) (2e-04 (0.8) (0.02) (0.009) (0.04) (0.5) (0.2) (0.7) (0.4) (0.8)	
MEskyblue3 053 014 0.023 044 0.096 0-7 0.1 0-038 093 0-23 0.32 0.85 0.48 0-29 0.35 0-047 0.19 0.46 (0.1)	
MEplum1 0.54 0.0088 -0.073 -0.053 0.49 0.018 -0.073 -0.053 0.49 0.43 -0.22 -0.06 0.69 0.086 -0.067 0.73 0.34 -0.1 0.13 -0.39 0.25 0.23 0.14 0.14 0.14 0.14 0.14 0.14 0.14 0.14	
MEwhite 0.14 0.34 0.19 0.15 0.092 0.086 0.38 0.29 0.08 0.08 0.20 0.30 0.05 0.43 0.21 0.6 0.34 0.26 0.13 0.05 0.57 0.03 0.05 0.57 0.03 0.05 0.57 0.03 0.05 0.57 0.03 0.05 0.57 0.03 0.05 0.57 0.05 0.05 0.05 0.05 0.05 0.05	
MElightyellow 0.59 0.47 0.47 0.47 0.08 -0.23 -0.7 0.34 -0.89 -0.054 0.31 0.35 -0.46 -0.059 -0.22 0.61   0.01 0.04 0.11 0.01 0.04 0.05 0.01 0.31 0.35 -0.46 -0.059 -0.22 0.22 0.61	
MEred 0.57 0.44 0.35 0.79 -0.36 -0.34 -0.05 -0.41 0.43 -0.56 -0.41 0.37 0.26 -0.26 0.082 -0.36 -0.054 0.24 0.40 0.40 0.40 0.40 0.40 0.40 0.4	
MEbrown40.38 0.45 0.3 0.049 -0.49 0.08 -0.44 -0.53 0.25 -0.77 0.27 0.31 0.091 -0.42 -0.12 -0.62 0.11 0.9 0.10 0.09 0.1 0.08 0.1 0.08 0.1 0.000 0.01 0.000 0.1 0.08 0.2 0.7 0.000 0.01 0.000 0.00 0.00 0.00 0.0	
MEdarkgrey (0.3) (0.05) (0.05) (0.05) (0.2) (0.4) (0.1) (0.01) (0.6) (2e-04) (0.2) (0.5) (0.3) (0.1) (0.5) (0.06) (0.3) (0.01)	).5
MEbrown 0.39 0.084 0.091 0.81 0.16 -0.44 0.11 -0.016 0.42 0.066 -0.5 0.35 0.15 0.02 0.27 -0.034 -0.12 -0.16 0.51   0	
MEorange 0.062 -0.025 0.054 0.54 0.54 -0.3 -0.18 0.32 -0.16 -0.079 0.0064 -0.41 -0.27 0.093 -0.11 0.23 0.38 -0.041 -0.31 (0.9) (0.07) (0.09) (0.07) (0.9) (0.9) (0	
MEroyalblue -0.22 0.00074 0.4 0.41 -0.0048 0.28 -0.14 0.12 -0.36 0.0092 -0.07 -0.39 -0.27 0.048 -0.035 0.14 -0.3 -0.33 (0.5) (1) (0.2) (0.2) (1) (0.4) (0.7) (0.7) (0.7) (0.2) (1) (0.8) (0.2) (0.4) (0.9) (0.9) (0.7) (0.3) (0.3) (0.3)	
MEdarkturquoise 049 0.1 -018 0.15 027 -056 025 0.17 051 0.1 -051 049 022 0.16 -0002 -02 0022 -0.2 (0.5)	
MEdarkred 0.58 -0.55 -0.75 -0.089 0.2 -0.61 0.62 0.24 0.25 0.71 -0.38 0.64 0.19 0.17 0.52 0.6 0.025 -0.38 (0.05) 0.05 0.05 0.05 0.05 0.05 0.05 0.05	
MEpaleturquoise 0.82 -0.26 -0.51 0.17 0.54 -0.87 0.36 0.28 0.72 0.56 -0.63 0.62 0.25 0.16 0.36 0.056 0.026 -0.27 -1	
MEgrey -025 -017 -011 02 -039 -0026 024 012 -013 -0058 00056 015 -0093 044 -011 -0011 -02 -025 (0.4) (0.5) (0.7) (0.5) (0.2) (0.9) (0.4) (0.7) (0.7) (0.9) (1) (0.5) (0.8) (0.2) (0.7) (1) (0.5) (0.4)	
$e_{ij} = e_{ij} = e$	

