

# Transcriptional control of nutrient partitioning during rice grain filling

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## Summary

Cereal grains accumulate carbohydrates, storage proteins and fatty acids via different pathways during their development. Many genes that participate in nutrient partitioning during grain filling and that affect starch quality have been identified. To understand how the expression of these genes is coordinated during grain development, a genomic approach to surveying the participation and interactions of all the pathways is necessary. Using recently published rice genome information, we designed a rice GeneChip microarray that covers half the rice genome. By monitoring the expression of 21 000 genes in parallel, we identified genes involved in the grain filling process and found that the expression of genes involved in different pathways is coordinately controlled in a synchronized fashion during grain filling. Interestingly, a known promoter element in genes encoding seed storage proteins, AACA, is statistically over-represented among the 269 genes in different pathways with diverse functions that are significantly up-regulated during grain filling. By expression pattern matching, a group of transcription factors that have the potential to interact with this element was identified. We also found that most genes in the starch biosynthetic pathway show multiple distinct spatial and temporal expression patterns, suggesting that different isoforms of a given enzyme are expressed in different tissues and at different developmental stages. Our results reveal key regulatory machinery and provide an opportunity for modifying multiple pathways by manipulating key regulatory elements for improving grain quality and quantity.

## Introduction

The most important economic characteristics of agricultural grain crops are their yield, nutritional characteristics and culinary quality. Yield and nutritional value are mostly determined by the synthesis and storage of carbohydrates, proteins and minerals during grain filling, and culinary quality is affected by the interaction of various enzymes to produce the final structure of the starch at the molecular and granule levels. The manipulation of these pathways can result in significant improvements in nutritional value (Mazur *et al.*, 1999; Ye *et al.*, 2000). For example, reducing the amount of even one enzyme in the starch biosynthetic pathway (granule-bound starch synthase) can dramatically affect the culinary quality (Singh *et al.*, 2000; Umemoto

*et al.*, 1995), resulting in softer, less sticky cooked rice. Many genes that participate in nutrient partitioning during grain filling and that affect starch quality have been identified in rice and other cereals (e.g. Umemoto *et al.*, 1995). However, these genes and their transcriptional controls are poorly understood, especially in cereal grains.

Major biological processes such as cereal grain filling are believed to require a close coordination of gene expression among many important pathways. However, direct experimental evidence for this hypothesis has been lacking due to the absence of genomic sequence information and functional genomic technologies. To prove this hypothesis and to identify key regulators in grain development, a parallel examination of gene expression on a genome scale is necessary. Recent studies have examined gene expression

in developing *Arabidopsis* seeds, identified many important genes, and demonstrated the complexity of the process (Girke *et al.*, 2000; Ruuska *et al.*, 2002; Zhu *et al.*, 2001). However, the dramatic differences between *Arabidopsis* and cereal crops in seed structure, developmental process and storage reserves make the application of these findings to cereal grains difficult.

The recent publication of the rice genome provides us with not only a genetic blueprint but also an opportunity for studying functional genomics in rice and other cereal crops (Goff *et al.*, 2002; Yu *et al.*, 2002). Using rice genome sequence information (Goff *et al.*, 2002), we developed a GeneChip genome array to identify genes with the potential to be involved in rice grain development by examining the expression of 21 000 genes during rice plant development. Special attention was paid to the regulation of major pathways associated with grain filling. These pathways determine nutrient partitioning and as a consequence control the composition and accumulation of nutrients, thus affecting yield, nutritional characteristics, and culinary quality of the grain.

## Results and discussion

### Design of the rice GeneChip genome microarray

The rice GeneChip genome array was designed based on the sequenced genome of Nipponbare rice (Goff *et al.*, 2002). Gene sequences were selected based on computational prediction as previously described (Goff *et al.*, 2002), and with reference to matching expressed sequence tags (ESTs) and protein sequences. Predicted open reading frames from the assembly were confirmed by BLAST search against the GENBANK EST database and SWISSPROT protein database. Thus, genes represented on the array included some with known functions, some whose functions are predicted by DNA sequence analysis, and some predicted with a match to EST or protein sequences. Redundant sequences and introns were eliminated computationally.

The rice GeneChip microarray uses 25-mer oligonucleotides with sequences corresponding to the 3' sequence of open reading frames as probes. These oligonucleotide probe sequences were selected according to the standard array design procedure (Lipshultz *et al.*, 1999; Lockhart *et al.*, 1996). To increase the capacity of the GeneChip genome array so that probes for a complex genome such as that of rice could be accommodated in a single array, a novel design consisting of only perfect matched probes and a 20 µm feature size was used. The new design allows 16 probes for

each of the 21 000 rice genes to be represented on a single array. The signal distribution was calculated, and outliers were identified for each probe set. The expression level of a gene was calculated from the median hybridization signal on the probes in the corresponding probe set, excluding outliers. The absolute call (present or P, marginal or M, and absent or A) was based on the expression level and the noise background associated with each probe. The sensitivity of detection was found to be 1 : 300 000, and the dynamic range was > 500-fold, based on spike experiments (data not shown). Reproducibility studies using labelled samples prepared in parallel from identical rice total RNA, indicated that the data obtained with the rice microarray are highly reproducible, with a false-positive rate of less than 0.5% at twofold change level (Supplemental Figure 1).

### Selection of grain filling genes

The mRNA expression levels of 21 000 genes in 33 rice samples, including 17 from various stages of grain filling (Table 1), were investigated following the protocol illustrated in Figure 1. Briefly, from the 21 000 rice genes, we first identified 491 genes whose products are presumably involved in or associated with three major pathways of nutrient partitioning: the synthesis and transport of carbohydrates, proteins and fatty acids, based on their sequence annotation (Goff *et al.*, 2002) and functional classification. We realize that gene annotation based on sequence homology alone cannot be relied upon as evidence that a gene is involved in a particular pathway, especially if the annotation is based on multiple rounds of automated annotation (Goff *et al.*, 2002; Yu *et al.*, 2002). However, the functions of many genes in the list have been verified experimentally according to previous reports.

Cluster analysis of the expression patterns of these 491 genes identified 98 that are preferentially expressed during grain development. Using these genes as bait, we searched 21 000 genes for those with similar grain-preferential expression patterns, using pattern matching based on a correlation among 33 samples. An additional 171 genes with a high correlation to the bait ( $r = 0.85$ ) were identified. Thus, we considered these 269 genes to be 'grain filling genes' (Supplemental Table 1).

To exclude the possibility that the 98 grain filling genes were identified by random chance, a bootstrap analysis was employed where the same number of genes were randomly selected from the 491 genes, 100 times. In contrast to the nucleated 'grain filling gene' cluster, the randomly sampled gene clusters showed a constant expression pattern in

**Table 1** Rice samples included in the study

Description	Days after germination
Root, germinating seedling stage	5
Leaf, germinating seedling stage	5
Leaf, 3–4 leaf stage	18
Root, tillering stage	49
Leaf, tillering stage	49
Leaf, tillering stage	49
Panicle, booting stage 1–3 cm	60
Panicle, booting stage 4–7 cm	62
Panicle, booting stage 8–14 cm	64
Panicle, booting stage 15–20 cm	66
Root, booting stage	60
Leaf, booting stage	60
Leaf, booting stage	60
Root, panicle emergence	78
Stem, panicle emergence	78
Panicle, panicle emergence	78
Inflorescence, no grains	88
Stem, maturation	90
Root, maturation	90
Leaf, maturation	90
Stem, senescence	100
Leaf, senescence	100
Grain day 0 post-anthesis	79
Grain day 2 post-anthesis	81
Grain day 4 post-anthesis	83
Grain day 7 post-anthesis	86
Grain day 9 post-anthesis	88
Grain soft dough (≈ 14 days post-anthesis)	93
Grain hard dough (≈ 21 days post-anthesis)	100
Embryo	88
Endosperm	88
Seed coat	88
Aleurone	88

the 17 grain samples examined (data not shown). The expression patterns of 100 randomly sampled gene clusters are significantly different compared to that of the grain filling genes ( $P < 0.0005$ ). While the encoded gene products of these 269 grain filling genes are active in different pathways, the expression levels of these genes were found to increase synchronously during grain development (Figure 2A).

### Expression pattern and functional classification of the grain filling genes

The spatial distribution of the transcripts of the nutrient partitioning genes in developing grains indicated, by extrapolation of mRNA levels to biological functions, that the endosperm is the main sink for all the nutrients studied, especially carbohydrates and proteins (Figure 2B). However, the

expression of genes involved in fatty acid biosynthesis is more balanced between the embryo and endosperm.

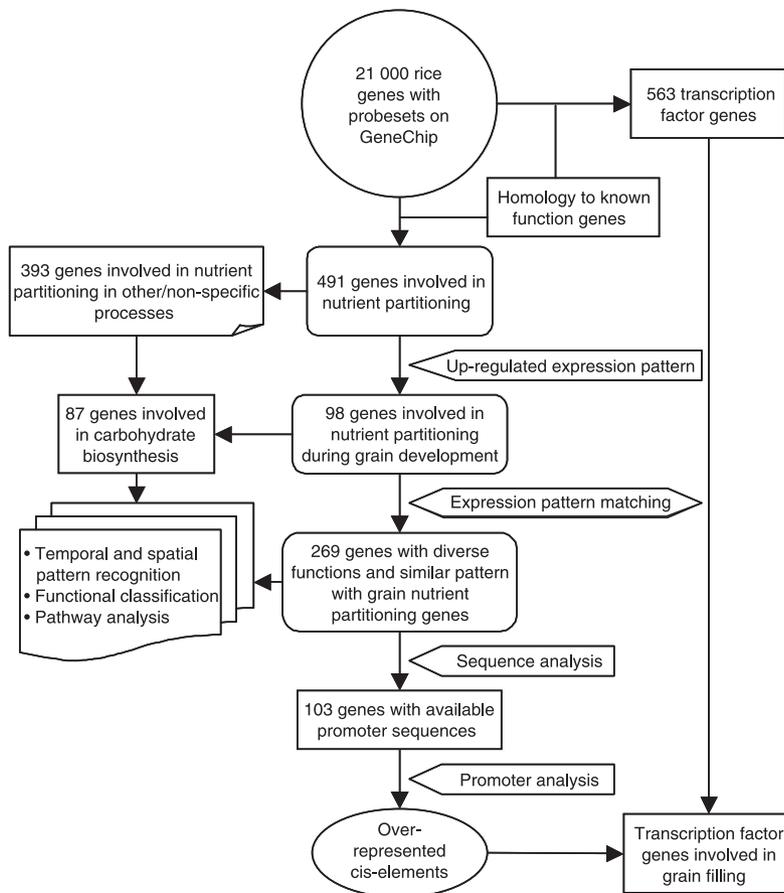
The deduced products of the grain filling genes have diverse functions (Figure 2C). Among the 269 grain filling genes, 42 are involved in starch biosynthesis, 28 in lipid biosynthesis, and 33 in seed storage protein synthesis. Interestingly, 30 genes in this set encode various transporters, such as sugar transporters, ABC transporters, amino acid/peptide transporters, phosphate transporters and nitrate transporters. As expected, the largest category consists of genes with unknown or unclassified functions (Figure 2C), consistent with the genome annotation in rice (Goff *et al.*, 2002; Yu *et al.*, 2002).

### Identification of common *cis*-elements shared by grain filling genes

To clarify the transcriptional control of the coordinated processes involved in grain filling, and to identify common regulatory elements, the promoter sequences for the 269 genes were extracted according to the following procedure. The probe set sequences were used to BLASTN align (Altschul *et al.*, 1997) against the predicted genes (Goff *et al.*, 2002). Promoter sequences from predicted genes that aligned ( $1E-20$ ) with the probe sequences were then extracted using a custom PERL script. Only 103 of the 269 grain filling genes contain the 1.5 kb upstream sequences (Supplemental Table 2). These promoter sequences were analysed by ALIGNACE (Roth *et al.*, 1998). We could not identify any common novel *cis*-elements that were over-represented in this grain filling gene cluster. This may be due to the higher GC content of the rice genome (Goff *et al.*, 2002) relative to the genomes of the organisms that were used to develop the program.

We then analysed 16 *cis*-elements that appear to play a role in grain development (Table 2). Comparison of the percentage of occurrence of each element in the promoters of genes in the grain gene cluster and in the promoters of all the genes represented in the microarray revealed that the AACA element appears to be over-represented in the 103 available promoters of the grain gene cluster.

To demonstrate the over-representation of the AACA element, we performed a bootstrap analysis (Efron and Tibshirani, 1994). One thousand control promoter sets, each of which contains 103 promoters from genes that were randomly selected from the rice genome microarray, were generated. In parallel, the grain filling gene cluster was randomly sampled to generate 1000 sets of 103-grain gene promoters. The ratio of the total number of occurrences of the AACA element in each grain gene promoter set to that



**Figure 1** Schematic diagram of the data mining process used in this study. Grain filling genes were selected based on homology to known function genes, and their expression in 33 samples was determined during rice development.

in a corresponding control promoter set was computed. A ratio greater than one indicated that the element occurred more often in grain promoters than in control promoters. A histogram was generated to visualize the ratio of distribution for the AACA element in each pair of promoter sets (grain filling gene set vs. control gene set). As shown in Figure 3A, the ratio for the AACA element in each pair of 1000 promoter sets ranged from 0.833 to 2.21, and 977 promoter sets had a ratio greater than 1. Thus, at a 95% confidence level ( $P$ -value 0.046), the AACA element is over-represented among the promoters from the grain filling gene cluster. For comparison, we applied the same bootstrap analysis to the ASF1-like element. As shown in Figure 3B, the ratio for the ASF1-like element in 1000 promoter sets ranged from 0.46 to 2.13, and 568 promoter sets had a ratio which was less than or equal to 1. It is therefore clear that the ASF1-like element is not statistically over-represented in the grain gene promoters.

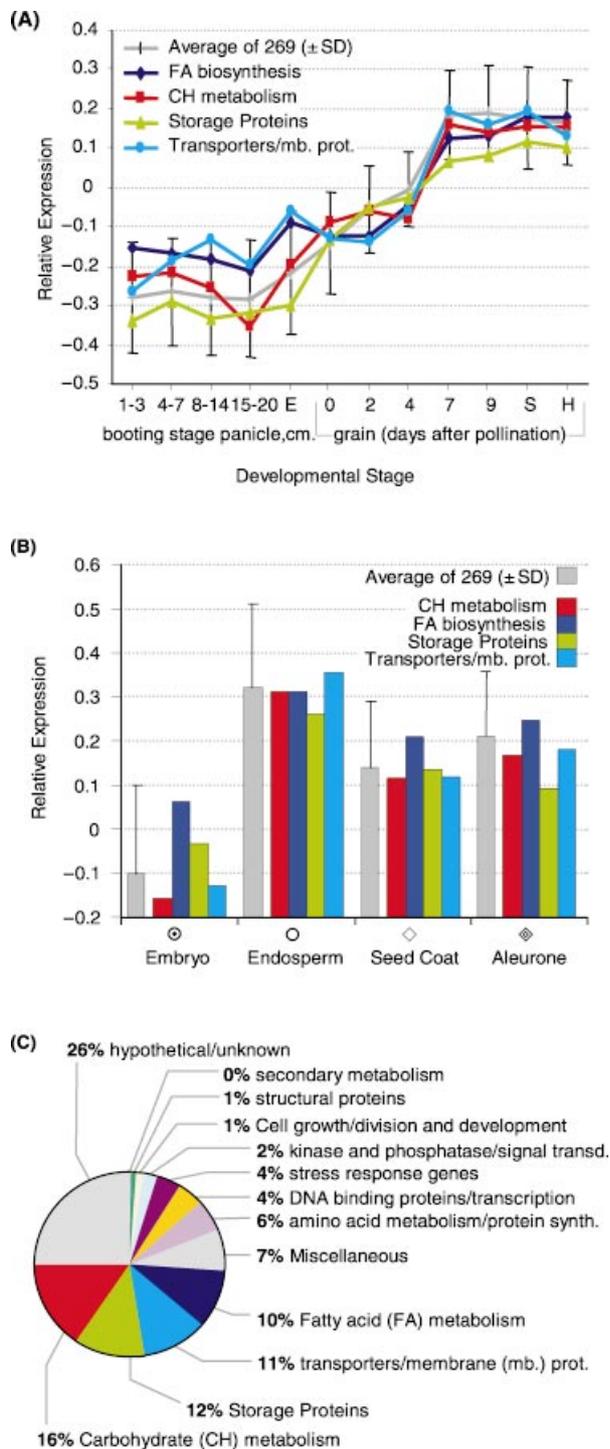
The AACA element is conserved among the promoters of many genes encoding seed storage proteins and is required for full expression of the rice *GluB-1* gene (Wu *et al.*, 2000). Among the 103 genes in the grain gene cluster, 63 contain 1–7 copies of the AACA element per promoter. Interestingly,

proteins encoded by these predicted genes appear to have diverse cellular functions, including carbohydrate and fatty acid metabolism, nutrient transport, transcription and translation. Genes encoding storage proteins were also found. This extends previous findings (Wu *et al.*, 2000) and suggests that the AACA element could play a key role in coordinating various major pathways during grain development.

#### Identification of transcription factors involved in grain filling

Although transcription factors that bind to the AACA element have not yet been identified, this element is similar to the type II MYB consensus sequence, AMCWAMC, which is required for the expression of several genes such as the parsley *PAL1* gene (Rushton and Somssich, 1998). This suggests that MYB proteins may also be involved in controlling the expression of grain filling genes.

To examine the involvement of transcription factors in the transcriptional control of grain filling, we analysed the expression patterns for 563 known and putative transcription



**Figure 2** Overview of relative mRNA expression during rice grain filling. (A) Representation of expression profiles for 269 grain filling genes. The x-axis shows the developmental stages and the y-axis shows the relative expression level. E indicates the panicle at emergence, S is the soft dough stage ( $\approx$  14 days post-anthesis), and H is the hard dough stage ( $\approx$  21 days post-anthesis). The expression levels for genes whose gene products belong to different classes, including fatty acid (FA) and carbohydrate (CH) biosynthesis, storage proteins and transporters, and for the 269 genes were averaged based on the normalized expression level for each gene belonging to that class or in the 269-gene group ( $\pm$  standard

**Table 2** *cis*-element table with references

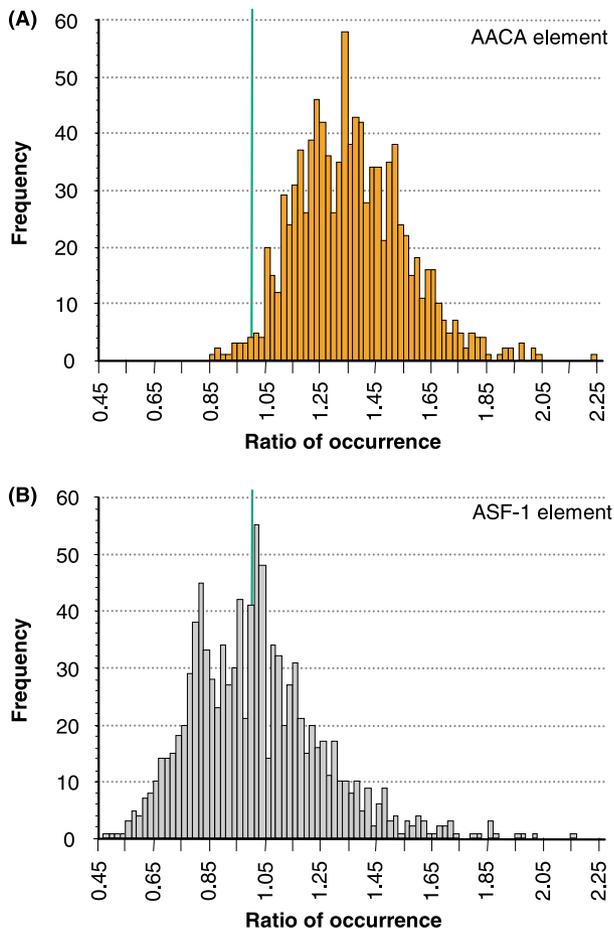
<i>Cis</i> -element	Sequence	Reference
Cold	CCGAC	(Baker <i>et al.</i> , 1994)
G-box	CACGTG	(Hwang <i>et al.</i> , 1998)
AACA motif	AACAAAA	(Wu <i>et al.</i> , 2000)
GCN4	TGA(G/C)TCA	(Onodera <i>et al.</i> , 2001)
C-box	TGACGTCA	(Cheong <i>et al.</i> , 1998)
GCC-box	TAARAGCCGCC	(Leubner-Metzger <i>et al.</i> , 1998)
Amylase	TATCCAY	(Hwang <i>et al.</i> , 1998)
GARE	RTAACRRANTCYGG	(Hwang <i>et al.</i> , 1998)
GT1 box	GGTTAA	(Eyal <i>et al.</i> , 1995)
In amylase	CGACG	(Hwang <i>et al.</i> , 1998)
BS1	AGCGGG	(Lacombe <i>et al.</i> , 2000)
DPBF-1	ACACNNG	(Kim <i>et al.</i> , 1997)
ASF1 like	TGACGT	(Washida <i>et al.</i> , 1999)
E-box	CANNTG	(Ellerstrom <i>et al.</i> , 1996)
Prolamin-box	TGYAAAG	(Mena <i>et al.</i> , 1998)
I-box (core)	GATAAG	(Rose <i>et al.</i> , 1999)

factor genes during grain filling. Cluster analysis identified a group of transcription factor genes with expression patterns similar to that of the 269 grain filling genes. This cluster includes genes such as *RITA*, a bZIP type transcription factor gene that is highly expressed in aleurone and endosperm tissues and may be important in regulating gene expression in developing rice grains (Onodera *et al.*, 2001). Other genes included in this cluster are *Dof* genes, whose gene products can activate the expression of seed storage protein genes by binding to the prolamine-box (Vicente-Carbajosa *et al.*, 1997), and nine known and putative *MYB* genes (Figure 4). The correlation between the gene expression patterns of these transcription factors and their previously identified functions suggests their involvement during rice grain filling. To confirm their functions *in vivo*, DNA binding assays are being performed for genes encoding selected transcription factors, using a strategy that has been successful in yeast (Ren *et al.*, 2000).

### Isoforms as mechanisms for intra-pathway regulation

To examine the potential participation and regulation of genes encoding different isoforms in the grain-filling process, the mRNA dynamics of 87 genes on the rice genome array involved

deviation, SD). (B) Bar graph representation of the average expression level ( $\pm$  SD) for the 269 genes in various grain organs at 9 days post-anthesis. Each organ type is indicated on the x-axis and the relative expression level is shown on the y-axis. (C) Pie chart representation of the functional classification of the predicted gene products of the 269 genes found to be involved in grain development. The percentage for each functional category is shown.

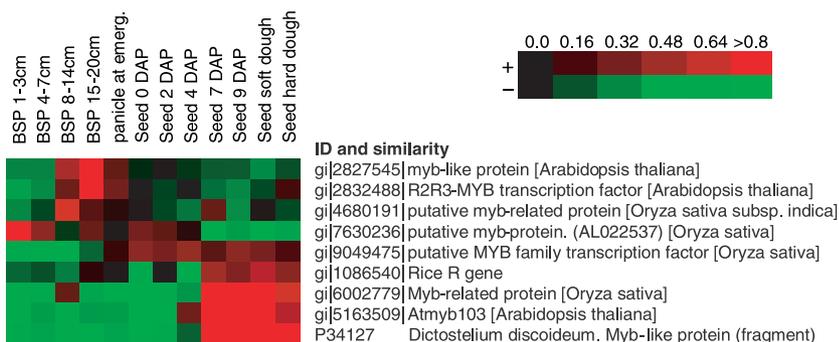


**Figure 3** Histogram of the ratio of occurrence of the AACA motif and the ASF1-like element in the grain gene cluster vs. control gene cluster. The histogram was generated as described in the text and is depicted for the AACA motif (A) and the ASF1-like element (B). The x-axis shows the ratio computed by dividing the total number of occurrences of either the AACA motif or the ASF1-like element in a given bootstrapped set of grain cluster genes, by that in a corresponding control gene cluster. The green line indicates a ratio of 1. The y-axis shows the frequency of a given ratio for each element.

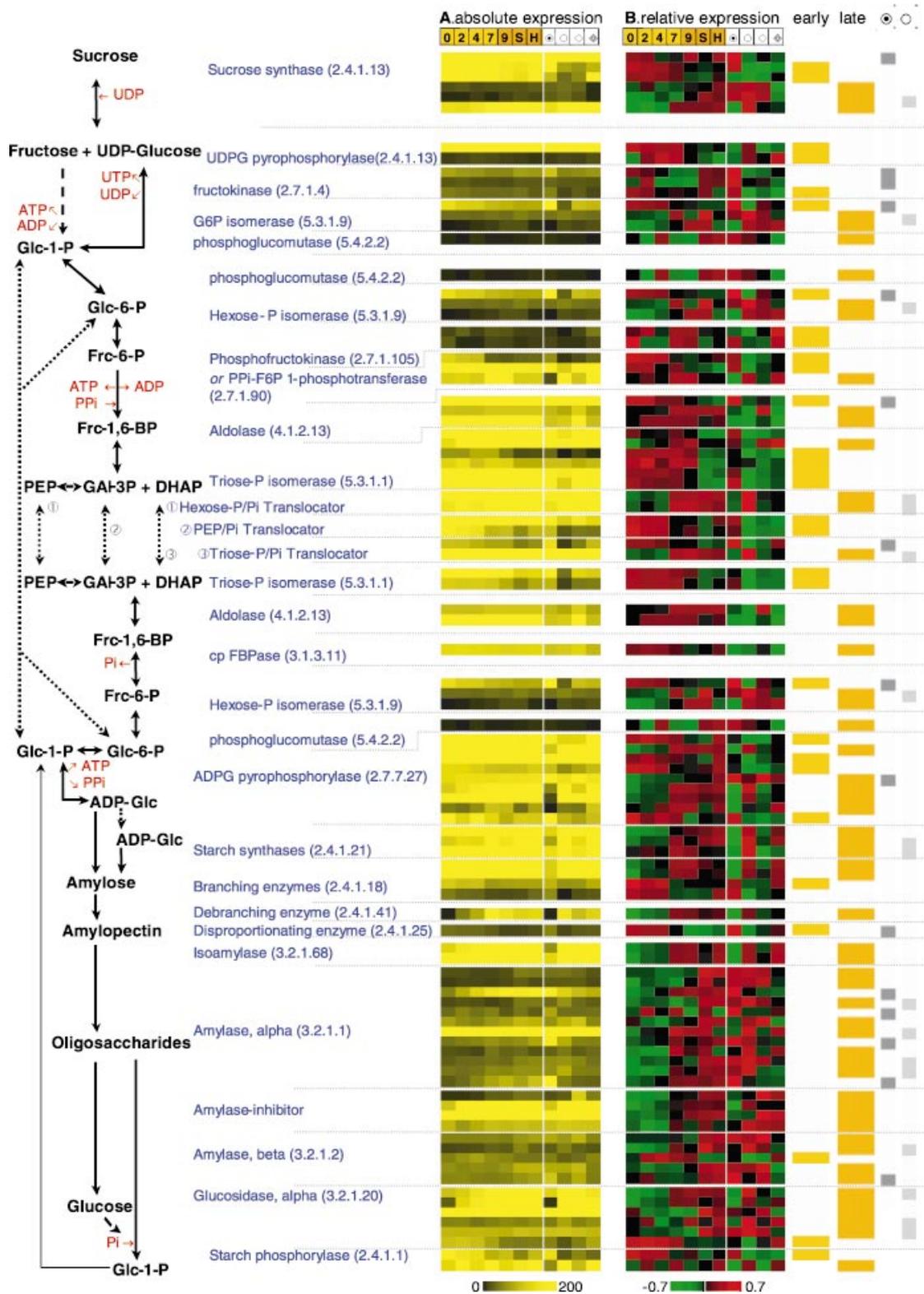
in carbohydrate metabolism were studied (Supplemental Table 3).

We found that 82% of the enzymes in the carbohydrate metabolic pathway may be represented by isoforms, as determined by sequence analysis of the multiple probe sets on the microarray (Figure 5). Due to the gene prediction methods used to generate the probe sets on the GeneChip, we cannot exclude the possibility that two probe sets may query the same mRNA. However, the expression profile of every probe set shown here has unique and distinct features in terms of spatial and temporal distribution and their promoter sequences, strongly suggesting that mRNAs for different isoforms are in fact being queried.

Two genes encoding the small subunits of ADPG pyrophosphorylase are expressed early in grain development, in conjunction with a single gene encoding a large subunit (Figure 5, Supplemental Table 3). Genes encoding three other large subunits are up-regulated later in development, from 4 days after anthesis, in conjunction with the up-regulation of the starch synthase genes and two genes for branching enzymes (involved in amylose and amylopectin biosynthesis, respectively). The expression of an additional gene encoding the small subunit also increases over this time period. The expression of genes encoding different isoforms may be related to the shift to storage starch production and to a postulated concomitant shift to cytoplasmic ADP-glucose production. Interestingly, two genes encoding other isoforms of the branching enzyme are expressed early during grain development and are then expressed less during maturation. These isoforms may be involved in transitory starch synthesis for energy purposes during early stages (these isoforms are also expressed in leaves). Two other isoforms are expressed at higher levels throughout development, with the highest expression occurring around 7–9 days post-anthesis. Similar results were obtained for branching enzyme genes in wheat kernels (Morell *et al.*, 1997).



**Figure 4** Expression patterns of nine putative MYB transcription factor genes showing preferential expression during grain filling. BSP, booting-stage panicle; DPA, days post-anthesis.



**Figure 5** Pathway of starch biosynthesis in rice with corresponding spatio-temporal gene expression levels. Dotted arrows indicate a transport process. Dashed arrows indicate that intermediate steps have been omitted. Key for panels (A) and (B): 0, 2, 4, 7, 9 are days post-anthesis. S is soft dough stage, H is hard dough stage (approximately 14 and 21 days post-anthesis, respectively),  $\odot$  embryo,  $\circ$  endosperm,  $\diamond$  seed coat, and  $\blacklozenge$  aleurone at 9 days post-anthesis. Panel (A) represents absolute expression levels. Units are 'average intensity' (Supplemental Figure 1). Panel (B) represents relative expression levels. 'Early' and 'late' indicate genes falling into different clusters after cluster analysis. Genes that are up-regulated in embryo and endosperm are indicated by the dark grey and light grey markings, respectively. See text for a description of how the genes were selected.

We also observed distinct spatial expression patterns for genes encoding different isoforms (Figure 5). For example, we observed that three different sucrose synthase isoforms are preferentially expressed in developing grain tissues: two of them are expressed more highly at the start of grain development (0 days post-anthesis) and one is up-regulated towards the end of grain development. Other isoforms with low expression in grains are expressed strongly in stems or roots. Among the sucrose synthase isoforms that are preferentially expressed in grains, at least three isoforms with spatially distinct expression patterns have been reported: one in aleurone, another in endosperm, and a third in grain tissues other than the endosperm (Wang *et al.*, 1999a; Yen *et al.*, 1994). Different amylases and glucosidases were also found to be expressed in different rice grain tissues (Figure 5), as previously reported (Awazuha *et al.*, 2000).

The expression of the two genes encoding sucrose synthase isoforms and one gene encoding small subunits of ADPG pyrophosphorylase isoforms among the 10 grain samples was examined by quantitative RT-PCR. A high correlation between the results from rice GeneChip microarray and from quantitative RT-PCR was observed, with an average correlation coefficient of 0.92 (Supplemental Figure 2), thus validating the specificity of the probe sets and our observations based on the microarray results.

By examining gene expression in the carbohydrate metabolic pathway, we not only confirmed the presence of different genes encoding isoforms of the same enzyme in this pathway during grain development (Awazuha *et al.*, 2000; Wang *et al.*, 1999b), but also demonstrated both gene redundancy and coordinated expression of gene families. The differential expression of various isoforms in this pathway suggests their functional differences and gives an insight into how structural gene expression patterns determine the process of grain filling. It suggests that transcription control is a primary mechanism for determining endosperm development.

#### Mechanistic shifts suggested by transporter transcript levels

A cluster analysis of the relative expression levels indicates that genes encoding carbohydrate metabolic enzymes can be broadly grouped into two phases: early and late grain development (Figure 5). Often, a different gene encodes an enzyme in each phase. One isoform of a triose-phosphate/phosphate translocator is expressed at a higher level during earlier stages of grain development. In contrast, two isoforms of a hexose-phosphate translocator and another isoform of a

triose-phosphate translocator are expressed at higher levels toward the end of grain filling.

To characterize the transcription control of the genes expressed in early and late phases, we searched for common regulatory *cis*-elements among the available promoters of these genes. No statistically significant elements were identified among the promoters of the late gene cluster. However, a few elements were identified from the 18 promoters of 31 genes belonging to the early gene cluster (data not shown). Although we cannot confirm the significance of the presence of these regulatory elements by bootstrap analysis, due to the small number of available promoters, multiple classes of grain-filling promoters may be involved in fine tuning the process, by differentially regulating the expression of the subgene groups.

Our observations also suggest that different mechanisms for the synthesis and transport of hexose equivalents occur at different stages during grain development. PEP appears to play a more important role during early stages of grain development, because genes encoding two isoforms of a PEP-Pi translocator are relatively highly expressed at this stage. We still do not know if the majority of hexose equivalents are transported to the amyloplast during the linear phase of starch accumulation as ADP-glucose, as occurs in maize endosperm development (Shannon *et al.*, 1998). However, the expression of a *Brittle* homologue does indeed increase almost twofold during seed development (data not shown).

#### Conclusions

Our results are consistent with the idea that rice grain filling is a highly coordinated process. The synthesis and transport of carbohydrates, storage proteins and fatty acids are co-regulated starting at the mRNA level. These co-regulated genes contain an over-represented element, the AACA motif, in their promoters. We hypothesize that this element, along with other unidentified elements, may interact with certain key transcription factors, including those identified in this study, to regulate and coordinate the transcription of nutrient partitioning genes during grain filling. Within each pathway, the expression levels of genes encoding different isoforms of enzymes are spatially and temporally defined, as shown with the carbohydrate metabolic pathway, demonstrating an additional fine regulation of gene expression at the intra-pathway level.

The rice genome array used in this study, along with the complete genome information, provides a powerful tool for studying and understanding gene function, not only in this important crop, but in other cereal species as well, since rice

shows great synteny and high sequence similarity with other cereal genomes (Goff *et al.*, 2002).

## Experimental procedures

### Materials and GeneChip microarray experiments

Nipponbare rice (*Oryza sativa* L. ssp. *Japonica*) was grown in a greenhouse with a 12 h light cycle, at 29 °C during the day and 21 °C during the night. Humidity was maintained at 30%. Plants were grown in pots containing 50% Sunshine mix and 50% nitrohumus. Tissues were collected from at least five plants and pooled for each time point. The samples were homogenized in liquid nitrogen prior to RNA isolation. Immature embryo, endosperm, aleurone and seed coat samples were dissected from grains of 88-day-old plants. For the aleurone layers, samples were prepared according to a previously described procedure (Fath *et al.*, 1999). A complete sample list and description is listed in Table 2.

The experiments were performed as previously described (Zhu *et al.*, 2001). Briefly, total RNA was isolated using Qiagen RNeasy columns (Qiagen, Chatsworth, CA) and examined by gel electrophoresis for integrity and by spectrometry for purity. To ensure data quality, only samples with A260/A280 ratios of 1.9–2.1 were included in the study. Total RNA (5 µg) from each sample was reverse transcribed at 42 °C for 1 h using 100 pmol of the oligo dT(24) primer containing a 5'-T7 RNA polymerase promoter sequence [5'-GGCCAGTGAATTGTAATACGACTCACTATAGGGAGGCGG-(dT)24-3], 50 mM Tris-HCl (pH 8.3), 75 mM KCl, 3 mM MgCl<sub>2</sub>, 10 mM dithiothreitol (DTT), 0.5 mM dNTPs, and 200 units of SuperScript II reverse transcriptase (Life Technologies). The second strand of cDNA was synthesized using 40 units of *E. coli* DNA polymerase I, 10 units of *E. coli* DNA ligase and 2 units of RNase H in a reaction containing 25 mM Tris-HCl (pH 7.5), 100 mM KCl, 5 mM MgCl<sub>2</sub>, 10 mM (NH<sub>4</sub>)<sub>2</sub>SO<sub>4</sub>, 0.15 mM b-NAD<sup>+</sup>, 1 mM dNTPs, and 1.2 mM DTT. The reaction proceeded for 2 h at 16 °C and was terminated using EDTA. Double-stranded cDNA products were purified by phenol/chloroform extraction and ethanol precipitation.

Biotinylated complementary RNAs (cRNAs) were transcribed *in vitro* from synthesized cDNA by T7 RNA Polymerase (ENZO BioArray High Yield RNA Transcript Labelling Kit, Enzo). cRNAs were purified using affinity resin (Qiagen RNeasy Spin Columns) and randomly fragmented by incubating at 94 °C for 35 min in a buffer containing 40 mM Tris-acetate (pH 8.1), 100 mM potassium acetate and 30 mM magnesium acetate to produce molecules of approximately 35–200 bases.

The labelled samples were mixed with 0.1 mg/mL sonicated herring sperm DNA in a hybridization buffer containing 100 mM 2-N-morpholino-ethane-sulphonic acid (MES), 1 M NaCl, 20 mM EDTA, 0.01% Tween 20, denatured at 99 °C for 5 min, and equilibrated at 45 °C for 5 min before hybridization. The hybridization mix was then transferred to the rice GeneChip microarray cartridge and hybridized at 45 °C for 16 h on a rotisserie at 60 r.p.m.

The hybridized arrays were then rinsed and stained in a fluidics station (Affymetrix). They were first rinsed with wash buffer A (6× SSPE (0.9 M NaCl, 0.06 M NaH<sub>2</sub>PO<sub>4</sub>, 0.006 M EDTA), 0.01% Tween 20, 0.005% Antifoam) at 25 °C for 10 min and incubated with wash buffer B (100 mM MES, 0.1 M NaCl, 0.01% Tween 20) at 50 °C for 20 min, then stained with Streptavidin Phycoerythrin (SAPE) 100 mM MES, 1 M NaCl, 0.05% Tween 20, 0.005% Antifoam, 10 mg/mL SAPE 2 mg/mL BSA at 25 °C for 10 min, washed with wash buffer A at 25 °C for 20 min and stained with biotinylated antistreptavidin antibody at 25 °C for 10 min. After staining, arrays were stained with SAPE at 25 °C for 10 min and washed with wash buffer A at 30 °C for 30 min. The probe arrays were scanned twice, and the intensities were averaged with an Agilent GeneArray Scanner using GeneChip Suite 4.0 (Affymetrix).

### Data transformation and cluster analysis

The average intensity of all probe sets of each array was scaled to 100 so that the hybridization intensity of all arrays was equivalent. Genes encoding products potentially involved in the transport and synthesis of carbohydrates, fatty acids, and storage proteins were selected based on their sequence homology to known genes. Expression levels of the selected genes were processed before being subjected to cluster analysis according to the following procedure. First, any expression values (average fluorescence signals) that were less than 5 were adjusted to 5. Then, the adjusted expression values were log<sub>2</sub>-transformed, median centred, and normalized among the selected genes, so that the sum of squares for each expression vector was equal to one, in order to better visualize the change in shape of the profile over time and space, regardless of the magnitude of expression level. The processed data were then used for cluster analysis using CLUSTER (Eisen *et al.*, 1998) with self-organizing maps, followed by complete linkage hierarchical clustering of both genes and experiments. The results were visualized with TREEVIEW (Eisen *et al.*, 1998).

Data for the putative nutrient partitioning genes (identified from cluster analysis) that are preferentially expressed during

grain filling were then imported into GENESPRING (Silicon Genetics, Redwood, CA). Genes with similar expression patterns (i.e. correlation coefficients greater than 0.85) as the original bait genes, were further selected and are collectively referred to as grain filling genes.

The confidence of finding 98 grain filling genes was assessed through bootstrapping the 491 genes 100 times. For each cycle, 98 genes were randomly selected from the 491 genes. Then Pearson correlation coefficients were calculated between the average of the 98 randomly selected genes and that of the 98 grain filling genes, and the *P*-value was deduced from the 100 Pearson correlation coefficients using the following equations:

$$t = \frac{\bar{X} - \mu}{S_{\bar{X}}}; S_{\bar{X}} = \frac{S}{\sqrt{N}}$$

### Promoter analysis

The promoter sequences of the grain filling genes were identified by BLAST search of the open reading frame sequences of these genes against the published predicted rice gene sequences (Goff *et al.*, 2002). The predicted gene sequence that was the best match, with scores greater than 1E-20, was used to represent the open reading frame. The 1.5 kb regions upstream from the putative ATG start site were extracted using a custom Perl script.

### Analysis of starch biosynthesis pathway

Data series for probe sets were considered for analysis if the average intensity was above 25 in any sample in the series (Supplemental Figure 1). The transformed data were then loaded into GENESPRING (Silicon Genetics, Redwood, CA). A pathway for starch biosynthesis and degradation was generated from several sources (Dennis and Emes, 1990; Kruger, 1990; Myers *et al.*, 2000; Stitt, 1990) and was converted to a GIF file and imported into GeneSpring. Expression level display boxes were drawn on this GIF using the mapping function in GENESPRING. Genes were selected for display at the appropriate location on this image based on their annotation (Goff *et al.*, 2002). For genes that have a cytoplasmic and a plastidic isoform, the isoforms were differentiated based on the annotation where possible.

### Validation of microarray data

Quantitative RT-PCR assays were performed on an ABI Prism 7700 (Applied Biosystems, Foster City, CA), as previously described using the primers and probe sets specific to genes

encoding isoform described (Supplemental Figure 2). A standard curve consisting of serial 1 : 5 dilutions was prepared with RNA concentrations of 50 ng/μL, 10 ng/μL, 2 ng/μL, 0.4 ng/μL and 0.08 ng/μL. Relative expression levels were interpolated by comparison with standard curves with a correlation coefficient of 0.99 or greater. Relative expression levels were normalized to the expression level of a rice polyubiquitin gene in each sample, which was expressed at a constant level. All reactions were performed in triplicate.

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### Supplementary material

To confirm the conclusions of the paper, the supplemental data can be accessed through the journal's website <<http://wip.blackwellpublishing.com/products/journals/suppmat/PBI/PBI006/PBI006sm.htm>> and the authors' website <[http://tmri.org/gene\\_exp\\_web/](http://tmri.org/gene_exp_web/)>. To get sequence information for the Sequence IDs (Probe Set IDs) referred in the paper, go to <[http://tmri.org/gene\\_exp\\_web/rice\\_probesets.html](http://tmri.org/gene_exp_web/rice_probesets.html)> and enter the Sequence ID (e.g. OS000759.1\_at, OS\_ORF006203\_at) into the query template provide.

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