Combination of twelve alleles at six quantitative trait loci determines grain weight in rice

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Abstract

Grain weight, which is controlled by quantitative trait loci (QTLs), is one of the most important determinants of rice yield. Although many QTLs for grain weight have been identified, little is known about how different alleles in different QTLs coordinate to determine grain weight. In the present study, six grain-weight-QTLs were detected in seven mapping populations (two F2, one F3, and four recombinant inbred lines) developed by crossing ‘Lemont’, a United States japonica variety, with ‘Yangdao 4’, a Chinese indica variety. In each of the six loci, one allele from one parent increased grain weight and one allele from another parent decreased it. Thus, the 12 alleles at the six QTLs were subjected to regression analysis to examine whether they acted additively across loci leading to a linear relationship between the predicted breeding value of QTL and phenotype. Results suggested that a combination of the 12 alleles determined grain weight. In addition, plants carrying more grain-weight-increasing alleles had heavier grains than those carrying more grain-weight-decreasing alleles. This trend was consistent in the seven mapping populations. Thus, these six QTLs might be used in marker-assisted selection of grain weight, by stacking different grain-weight-increasing or -decreasing alleles.

Introduction

Rice is a staple food crop for about half of the world’s population [1]. The improvement of rice yield is a permanent issue due to the rapid increase of global human population and to the decrease of arable land. Grain weight, one of the determinants of rice yield, is a typical quantitative trait controlled by quantitative trait loci (QTLs). Because grain weight is affected by grain length, width, and thickness, grain weight and grain shape are closely related traits. In the past two decades, a large number of QTLs responsible for rice grain weight or shape were identified [2] and some genes were cloned: Ebisu Dwarf2 (D2) [3] and D61 [4] on chromosome 1, GW2 [5] on chromosome 2, GS3 [6] and qGL3 [7] on chromosome 3, Dwarf11 (D11) [8],...
Regulation of rice grain weight by twelve alleles

Materials and methods

Mapping populations

‘Lemont’, a sheath blight-susceptible United States cultivar, was crossed with ‘Yangdao 4’, a Chinese sheath blight-resistant indica variety. The F₂ and F₃ mapping populations were initially used to identify the sheath blight-resistant QTL [42], not for mapping grain-weight-related QTLs. Six grain-weight-related QTLs were detected while analyzing the F₂ and F₃ populations, and we found that 12 alleles within these six grain-weight-QTLs acted cumulatively to control grain weight. In the present study, we used data from seven mapping populations, including the two F₂ and the F₃ populations developed in a previous study [42], and four recombinant inbred lines populations developed using the same parents, to elucidate how the 12 alleles in the six QTLs regulated grain weight and to test if these 12 alleles act additively across loci, leading to a linear relationship between the predictive breeding value of QTL and phenotype, or epistatically, leading to a nonlinear relationship between QTL values and phenotype.

GRAIN INCOMPLETE FILLING 1 (GIF1) [9], and FLOORY ENDOSPERM2 (FLO2) [10] on chromosome 4, Dwarf 1 (D1) [11], GW5/qGW5 [12,13], GS5 [14], and SRS3 [15] on chromosome 5, SMALL AND ROUND SEED1 (SRS1/DEP2) [16], GW7/GL7 [17,18], and GLW7 [19] on chromosome 7, GW8 [20] on chromosome 8, and Small And Round Seed 5 (SRS5) [21] and Short Panicle1 (SP1) [22] on chromosome 11. The fine-mapped QTLs for grain shape include GW1-1 [23], GW1-2 [23], qGRL1.1 [24], qTGW1.1a [25], and qTGW1.1b [25] on chromosome 1, GS2 [26] on chromosome 2, qGL-3a [27], gw3.1 [28], GW3 [29], TGW3b/SPP3b [30], qTGW3-1 [31], and qTGW3.2 [32] on chromosome 3, qGL4b [33] and Sprd[34] on chromosome 4, GW6 [29] and spds[35] on chromosome 6, qGL7 [36], GS7 [37], and qSS7 [38] on chromosome 7, gw8.1 [39] on chromosome 8, gw9.1 [40] on chromosome 9, and gw11 [41] on chromosome 11.

Occasionally, an allele at a specific QTL has a positive effect on grain shape while another has a negative effect. Theoretically, grain shape or weight can be manipulated by pyramiding different alleles with positive or negative effects on these traits. In rice breeding, many alleles have been mapped at different QTLs; however, which and how many alleles should be used in the marker-assisted selection of a desired phenotype are still important issues.

In a previous study, we developed two F₂ and one F₃ mapping populations by crossing ‘Lemont’, a United States sheath blight-susceptible japonica variety, with ‘Yangdao 4’, a Chinese sheath blight-resistant indica variety. The F₂ and F₃ mapping populations were initially used to identify the sheath blight-resistant QTL [42], not for mapping grain-weight-related QTLs. Six grain-weight-related QTLs were detected while analyzing the F₂ and F₃ populations, and we found that 12 alleles within these six grain-weight-QTLs acted cumulatively to control grain weight. In the present study, we used data from seven mapping populations, including the two F₂ and the F₃ populations developed in a previous study [42], and four recombinant inbred lines populations developed using the same parents, to elucidate how the 12 alleles in the six QTLs regulated grain weight and to test if these 12 alleles act additively across loci, leading to a linear relationship between the predictive breeding value of QTL and phenotype, or epistatically, leading to a nonlinear relationship between QTL values and phenotype.
Grain weight determination

Rice grains were sun-dried after harvest and stored at room temperature for at least one month before determining grain weight. One-hundred fully filled grains were randomly selected from the upper half of the panicles of each individual plant in the F_2 populations and weighed using an electronic balance. As some *indica/japonica* hybrids were sterile, some of the individuals in the mapping populations did not have 100 fully filled grains; in this case, all available grains were used. In the F_3, F_7, and F_9 populations, 50 fully filled grains were selected from 10 plants within each line (five grains per individual plant) and weighed. More than 100 fully filled grains from each line were measured in F_9 and more than 80 fully filled grains from each line were measured in F_10. The 50- to 100-grain weight data were converted to 1000-grain weight and used in the analysis.

Marker assays and QTL analysis

The strategy for identifying grain-weight-related QTLs followed the method described in Zeng et al. [43]. Briefly, we first detected the QTLs responsible for grain weight using the three primary mapping populations (F_2 and F_3 populations), and then confirmed mapping results using four permanent mapping populations (F_7 to F_10).

One hundred and seventy nine polymorphic co-dominant markers covering 12 rice chromosomes were used to identify the QTLs responsible for grain weight in the F_2 population planted in 2011 in Hangzhou and in the F_3 population planted in 2012 in Hainan. Detailed information on these 179 markers is given in Wen et al. [42]. The six grain-weight-related QTLs detected in these two populations (see Results section) were further examined in the F_2 populations planted in 2012 in Hangzhou, using 44 markers that covered the regions of these six QTLs, as described in Zeng et al. [43].

The six grain-weight-related QTLs yielded by the three primary mapping populations were further confirmed using the four RIL populations (F_7 to F_10) and 33 polymorphic markers (S1 Fig) that covered the regions of the six QTLs.

The multiple interval mapping (MIM) method was used to detect grain weight-related QTLs in the Windows QTL Cartographer 2.5 software (http://statgen.ncsu.edu/qtlcart/WQTLCart.htm), according to the models described in Zeng et al. [43]. The inclusive composite interval mapping (ICIM) [44, 45] was used to detect digenic epistatic loci using QTL Ici-Mapping Version 3.2 software [46] based on 1000 permutations (P < 0.05). Digenic epistatic loci were also confirmed by two-way analysis of variance (ANOVA) using SAS 8.01 (SAS Institute, Cary, NC, USA).

Statistical analyses

Shapiro-Wilk tests, two-way ANOVA, and linear regression analysis were performed in SAS 8.01 (SAS Institute, Cary, NC, USA).

Results

Frequency distribution of grain weight in seven mapping populations

The Shapiro-Wilk test run to check grain weight distribution in the seven mapping populations showed that data were normally distributed in three populations (F_2 grown in 2011, W = 0.99, P = 0.14; F_2 grown in 2012, W = 0.96, P < 0.01; F_3, W = 0.99, P = 0.67; F_7, W = 0.99, P = 0.03; F_9, W = 0.98, P = 0.01; F_9, W = 0.93, P < 0.01; and F_10, W = 0.99, P = 0.32). Phenotypic data distribution in the seven mapping populations is shown in Fig 1.
Grain-weight-QTLs in the primary mapping populations

The 179 polymorphic markers covering the 12 rice chromosomes used to detect the QTLs responsible for grain weight in the F\textsubscript{2} population (n = 190 individuals) planted in 2011 in Hangzhou, revealed six QTLs (qGW-1, qGW-3-1, qGW-3-2, qGW-4, qGW-7, and qGW-10) on chromosomes 1, 3, 4, 7, and 10 (Table 1, S2 Fig). QTL analysis of the F\textsubscript{3} population, deriving from 'Lemont' × 'Yangdao 4' and grown under seven environments. (a) F\textsubscript{2} population grown in 2011 in Hangzhou, (b) F\textsubscript{2} population grown in 2012 in Hangzhou, (c) F\textsubscript{3} population grown in 2012 in Hainan, (d) F\textsubscript{7} recombinant inbred line (RIL) population grown in 2014 in Hangzhou, (e) F\textsubscript{8} RIL population grown in 2014 in Hainan, (f) F\textsubscript{9} RIL population grown in 2015 in Hangzhou, and (g) F\textsubscript{10} RIL population grown in 2015 in Hainan.

Fig 1. Frequency distribution of grain weight in the seven mapping populations derived from ‘Lemont’ × ‘Yangdao 4’ and grown under seven environments. (a) F\textsubscript{2} population grown in 2011 in Hangzhou, (b) F\textsubscript{2} population grown in 2012 in Hangzhou, (c) F\textsubscript{3} population grown in 2012 in Hainan, (d) F\textsubscript{7} recombinant inbred line (RIL) population grown in 2014 in Hangzhou, (e) F\textsubscript{8} RIL population grown in 2014 in Hainan, (f) F\textsubscript{9} RIL population grown in 2015 in Hangzhou, and (g) F\textsubscript{10} RIL population grown in 2015 in Hainan.

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Grain-weight-QTLs in the primary mapping populations
from F₂ populations and planted in 2012 in Hainan (n = 160 lines), revealed that three of the six QTLs (qGW-3-1, qGW-4, and qGW-10) detected in F₂ were present in F₃ (Table 1, S3 Fig).

The six grain-weight-related QTLs resolved for F₂ and F₃ populations (Table 1) were further examined in the F₂ mapping population (n = 182 individuals) planted in 2012 in Hangzhou.

### Table 1. Grain-weight-QTLs detected by multiple interval mapping in the seven mapping populations, derived from ‘Lemont’ × ‘Yangdao 4’ and planted in seven environments.

| Mapping population (Mapping environment) | QTL name | Chr. | Marker interval | Nearest marker | LR or LOD | Additive effect (g) | Dominance effect | R² (%) |
|------------------------------------------|----------|------|-----------------|---------------|------------|---------------------|-----------------|------|
| F₂ (2011, Hangzhou)                      | qGW-1    | 1    | D134B-D144A     | D140A         | 20.20      | 1.11                | -0.07           | 10.0 |
|                                          | qGW-3-1  | 3    | D303-D309       | D307          | 9.64       | -0.78               | 0.42            | 3.6  |
|                                          | qGW-3-2  | 3    | D338B-RM3585    | D336B         | 30.28      | 1.39                | -0.23           | 12.9 |
|                                          | qGW-4    | 4    | D456-RM1111     | D463          | 32.26      | -1.35               | -0.51           | 12.9 |
|                                          | qGW-7    | 7    | D750-RM234      | RM505         | 20.95      | -1.02               | 0.15            | 8.2  |
|                                          | qGW-10   | 10   | RM496-D1053     | D1053         | 18.31      | -0.96               | -0.19           | 6.0  |
| F₃ (2012, Hainan)                        | qGW-3-1  | 3    | RM232-D315      | RM232         | 7.51       | -2.31               | 1.44            | 10.1 |
|                                          | qGW-4    | 4    | D456-RM1113     | D463          | 12.85      | -1.83               | -0.24           | 8.1  |
|                                          | qGW-10   | 10   | RM496-D1053     | D1053         | 11.16      | -1.66               | -0.15           | 6.4  |
| F₂ (2012, Hangzhou)                      | qGW-3-2  | 3    | D338B-RM3585    | RM3585        | 10.87      | 1.42                | -0.33           | 4.9  |
|                                          | qGW-4    | 4    | D456-RM1113     | D463          | 8.08       | -1.49               | 1.38            | 5.8  |
|                                          | qGW-10   | 10   | D1048-D1053     | D1053         | 7.59       | -1.07               | 1.09            | 3.5  |
| F₇ (2014, Hangzhou)                      | qGW-1    | 1    | D140A-D144A     | D140A         | 2.85       | 1.18                | -              | 6.2  |
|                                          | qGW-3-1  | 3    | D311-D315       | D315          | 2.38       | -1.24               | -              | 5.2  |
|                                          | qGW-3-2  | 3    | D335C-D336B     | RM3684        | 6.76       | 1.56                | -              | 12.0 |
|                                          | qGW-4    | 4    | D456-D457B      | D457B         | 5.36       | -1.42               | -              | 9.3  |
|                                          | qGW-7    | 7    | D746-RM505      | D746          | 4.77       | -1.40               | -              | 8.6  |
|                                          | qGW-10   | 10   | D1042-RM496     | D1048         | 3.23       | -1.12               | -              | 4.9  |
| F₆ (2014, Hainan)                        | qGW-1    | 1    | D134B-D144A     | D140A         | 3.08       | 1.07                | -              | 5.2  |
|                                          | qGW-3-1  | 3    | D309-D311       | D311          | 2.61       | -1.10               | -              | 3.3  |
|                                          | qGW-3-2  | 3    | D335C-D336B     | RM3684        | 1.93       | 0.85                | -              | 4.4  |
|                                          | qGW-4    | 4    | D456-D457B      | D456          | 6.43       | -1.59               | -              | 11.6 |
|                                          | qGW-7    | 7    | D751-RM234      | RM234         | 5.56       | -1.43               | -              | 9.0  |
|                                          | qGW-10   | 10   | D1042-RM496     | D1048         | 2.46       | -0.98               | -              | 4.0  |
| F₈ (2015, Hangzhou)                      | qGW-1    | 1    | D134B-D144A     | D140A         | 3.36       | 1.26                | -              | 6.7  |
|                                          | qGW-3-1  | 3    | D311-D315       | D315          | 1.84       | -1.16               | -              | 4.0  |
|                                          | qGW-3-2  | 3    | D335C-D336B     | RM3684        | 5.11       | 1.46                | -              | 10.3 |
|                                          | qGW-4    | 4    | D456-D457B      | D456          | 3.91       | -1.34               | -              | 7.7  |
|                                          | qGW-7    | 7    | D746-RM505      | D746          | 3.18       | -1.33               | -              | 6.7  |
|                                          | qGW-10   | 10   | D1042-RM496     | D1048         | 2.68       | -1.22               | -              | 5.2  |
| F₉ (2015, Hainian)                       | qGW-1    | 1    | D140A-D144A     | D140A         | 3.88       | 1.39                | -              | 8.8  |
|                                          | qGW-3-1  | 3    | D311-D315       | D315          | 2.54       | -1.15               | -              | 5.0  |
|                                          | qGW-3-2  | 3    | D335C-D336B     | RM3684        | 4.24       | 1.18                | -              | 7.1  |
|                                          | qGW-4    | 4    | D456-D457B      | D457B         | 5.93       | -1.47               | -              | 11.6 |
|                                          | qGW-7    | 7    | D746-RM505      | D746          | 4.57       | -1.29               | -              | 8.4  |
|                                          | qGW-10   | 10   | D1042-RM496     | D1048         | 2.12       | -0.91               | -              | 3.8  |

aMarker interval is defined by the flanking marker closest to the limit of the detection peak.
bLR values are presented for F₂ and F₃ populations, and LOD values are presented for F₇, F₈, F₉ and F₁₀ populations.
cPositive additive effects indicate that ‘Lemont’ increased grain weight and a negative additive effect indicated ‘Yangdao 4’ increased grain weight.
dPhenotypic variation explained by an individual QTL.

- , no data.

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The 44 markers covering the regions of these six QTLs used to analyze this F2 population detected three QTLs: qGW-3-2, qGW-4, and qGW-10 on chromosomes 3, 4, and 10 (Table 1, S4 Fig).

Grain-weight-QTLs confirmation using RIL populations

The six grain-weight-QTLs detected in the three primary mapping populations were further confirmed in the four RIL populations (n = 220 lines) using 33 polymorphic markers that covered the regions of the six QTLs. These 33 markers represented 274.8 cM, with an average of 10.2 cM between adjacent markers (S1 Fig). All the six grain-weight-QTLs identified in the three primary mapping populations were detected in the four RIL populations (Table 1, S5 to S8 Figs).

QTLs-by-environment and QTLs-by-population interactions

Using a two-way ANOVA, we examined if the six grain-weight-QTLs significantly interacted with environments or mapping populations. The closest markers to the six QTLs in each mapping population were used to represent the QTL genotypes. Only three significant QTLs were detected in the F3 population planted in 2012 in Hainan and in the F2 population planted in 2012 in Hangzhou (Table 1). We used multiple interval mapping to identify the closest markers to the other three putative grain-weight-QTLs in these two populations, and the heterozygotes of F2 populations were omitted from the following two-way ANOVA.

No significant interactions were detected between each of the six grain-weight-QTLs and environment (Table 2), suggesting that the effects of these QTLs were stable across the different mapping environments. In addition, no significant interactions were detected between grain-weight-QTLs and populations, except for qGW-7 (Table 3). This is in agreement with

Table 2. Quantitative trait loci (QTLs)-by-environment interactions examined using two-way analysis of variance. As seven mapping environments were considered (three primary and four recombinant inbred line mapping populations), there were six degrees of freedom. Because there were two genotypes at each QTL (heterozygotes were omitted and not used in the analysis), the degree of freedom for QTL was 1.

| QTL by environment interaction | Degree of freedom | Type I sum of squares | Mean square | F value | P    |
|-------------------------------|------------------|----------------------|-------------|---------|------|
| Environment                   | 6                | 1433.28              | 238.88      | 19.02   | <.01 |
| QTL                           | 1                | 978.16               | 978.16      | 77.90   | <.01 |
| qGW-1 × Environment           | 6                | 37.29                | 6.21        | 0.49    | 0.81 |
| Environment                   | 6                | 1292.87              | 215.48      | 15.94   | <.01 |
| QTL                           | 1                | 102.99               | 102.99      | 7.62    | <.01 |
| qGW-3-1 × Environment         | 6                | 44.80                | 7.47        | 0.55    | 0.77 |
| Environment                   | 6                | 1461.80              | 243.63      | 19.93   | <.01 |
| QTL                           | 1                | 1437.97              | 1437.97     | 117.63  | <.01 |
| qGW-3-2 × Environment         | 6                | 126.45               | 21.07       | 1.72    | 0.11 |
| Environment                   | 6                | 1266.74              | 211.12      | 17.50   | <.01 |
| QTL                           | 1                | 1404.27              | 1404.27     | 116.38  | <.01 |
| qGW-4 × Environment           | 6                | 3.96                 | 0.66        | 0.05    | 0.99 |
| Environment                   | 6                | 1368.39              | 228.07      | 18.17   | <.01 |
| QTL                           | 1                | 652.12               | 652.12      | 51.96   | <.01 |
| qGW-7 × Environment           | 6                | 114.64               | 19.11       | 1.52    | 0.17 |
| Environment                   | 6                | 1309.43              | 218.24      | 16.59   | <.01 |
| QTL                           | 1                | 398.59               | 398.59      | 30.30   | <.01 |
| qGW-10 × Environment          | 6                | 71.87                | 11.98       | 0.91    | 0.49 |
the fact that qGW-7 was not detected in two populations: it was present in five populations (Table 1).

### Digenic epistasis in the seven mapping populations

Digenic epistatic loci were detected using inclusive composite interval mapping (ICIM) and the QTL IciMapping software, and their significance was further confirmed by two-way ANOVA. No significant digenic epistatic QTLs were detected in the F_2 population planted in 2011 in Hangzhou, using the 179 markers that covered the 12 rice chromosomes. Ten pairs of digenic epistatic loci were found in the F_3 population that derived from this F_2 population (Table 4) and seven of them were significant, according to the two-way ANOVA performed using one of the flanking markers to represent the loci (S1 Table). One pair of digenic epistatic loci was detected in the F_2 population grown in 2012 in Hangzhou (Table 5) using 44 markers, and this was confirmed significant by the two-way ANOVA (S2 Table). No significant digenic epistatic loci were detected in the RIL populations, probably because only 33 markers were used to genotype these populations. These results suggested that epistasis is involved in the regulation of grain weight (Tables 4 and 5), although no significant interactions were detected among the six grain-weight-related QTLs (qGW-1, qGW-3-1, qGW-3-2, qGW-4, qGW-7, and qGW-10).

### Regulation of grain weight by 12 alleles in six QTLs

Based on the QTLs-by-environment interaction analysis, the effects of the six grain-weight-QTLs were stable across the different environments. These six QTLs did not significantly
interact, according to ICIM results. We further analyzed the coordination between the different alleles from these six QTLs regulating grain weight.

In each of the six QTLs (\(qGW-1\), \(qGW-3-1\), \(qGW-3-2\), \(qGW-4\), \(qGW-7\), and \(qGW-10\)), there was an allele from one parent that increased grain weight and one allele from the other parent that decreased it. The six grain-weight-increasing alleles were \(qGW-1\text{LE}\), \(qGW-3-1\text{YD}\), \(qGW-3-2\text{LE}\), \(qGW-4\text{YD}\), \(qGW-7\text{YD}\), and \(qGW-10\text{YD}\), and the six grain-weight-decreasing alleles were \(qGW-1\text{YD}\), \(qGW-3-1\text{LE}\), \(qGW-3-2\text{YD}\), \(qGW-4\text{LE}\), \(qGW-7\text{LE}\), and \(qGW-10\text{LE}\); ‘\(LE\)’ or ‘\(YD\)’ suffixes in QTL names indicate the allele was inherited from the ‘Lemont’ or the ‘Yangdao 4’ parent, respectively.

A linear regression analysis was performed to examine if the 12 alleles in the six QTLs acted additively across loci leading to a linear relationship between the predicted breeding values of QTLs and the phenotype. Such a linear relationship implies that plants carrying more grain-weight-increasing alleles have heavier grains than those carrying more grain-weight-decreasing alleles. We first calculated the genotypic value of each individual plant (or line) in the seven mapping populations, which was used as the predictive breeding value of each individual plant or line. The genotypic value of an individual plant or line was calculated by adding the

Table 4. Pairs of digenic epistatic loci detected in the \(F_2\) population, derived from ‘Lemont’ × ‘Yangdao 4’, and grown in 2012 in Hainan, by using inclusive composite interval mapping.

| Chr. 1 | Left Marker 1 | Right Marker 1 | Chr. 2 | Left Marker 2 | Right Marker 2 | LOD  | PVE (%) | Add1 | Add2 | Dom1 | Dom2 | Add by Add | Add by Dom | Dom by Add | Dom by Dom |
|--------|---------------|----------------|--------|---------------|---------------|------|--------|------|------|------|------|------------|------------|------------|------------|
| 1      | D108C         | RM1201         | 7      | RM3404        | RM182         | 5.37 | 12.63  | 0.58 | -0.06| 0.12 | 0.55 | -0.51      | -2.10      | -0.17      | 0.06       |
| 1      | D122E         | D128A          | 4      | D436          | D440          | 5.95 | 10.09  | -1.10| 0.62 | 0.85 | 0.32 | 0.73       | 1.06       | -1.47      | -1.23      |
| 1      | D128A         | RM1297         | 6      | RM1340        | D643          | 5.12 | 9.74   | -0.90| 0.92 | 1.30 | 1.41 | -0.42      | 0.88       | -1.24      | -1.62      |
| 2      | D205          | D208           | 9      | D927          | RM409         | 5.50 | 11.79  | -0.62| -0.13| -0.54| -0.69| -1.31      | 0.63       | 0.23       | 1.26       |
| 2      | RM3685        | D236           | 3      | D336B         | RM3585        | 5.01 | 12.14  | 1.51 | 2.21 | -0.20| 0.31 | -0.35      | -0.87      | -1.90      | 0.51       |
| 3      | D301          | D303           | 9      | D933          | RM7424        | 5.29 | 10.09  | -0.50| -0.52| 0.06 | -0.40| -0.25      | 1.08       | 1.44       | -0.53      |
| 3      | D307          | D309           | 4      | D440          | D444          | 5.15 | 9.95   | -0.57| 0.45 | 1.17 | 0.50 | -0.56      | -0.48      | -1.40      | -1.44      |
| 3      | D331B         | RM5813         | 11     | D1133         | D1142         | 5.54 | 9.77   | -1.56| -0.67| 0.87 | 0.83 | -1.17      | 1.80       | 0.60       | -1.47      |
| 6      | RM1340        | D643           | 11     | D1133         | D1142         | 5.33 | 12.35  | 0.95 | -0.55| 0.59 | 0.17 | 1.74       | -0.72      | 0.70       | -0.14      |
| 11     | RM26155       | D1113          | 11     | D1133         | D1142         | 6.73 | 13.62  | 1.20 | -1.08| 2.03 | 2.19 | 0.96       | -1.87      | 1.24       | -3.72      |

Chr. 1 and Chr. 2 are the first and second chromosome positions of the detected digenic epistatic loci, respectively. LOD: logarithm of odds. PVE (%): phenotypic variation explained by digenic epistatic interaction. Add1: estimated additive effect of the first digenic locus. Add2: estimated additive effect of the second digenic locus. Dom1: estimated dominance effect of the first digenic locus. Dom2: estimated dominance effect of the second digenic locus. Add by Add: additive-by-additive digenic interaction. Add by Dom: additive-by-dominance digenic interaction. Dom by Add: dominance-by-additive digenic interaction. Dom by Dom: dominance-by-dominance digenic interaction.

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Table 5. The pair of digenic epistatic loci detected in the \(F_2\) population, derived from ‘Lemont’ × ‘Yangdao 4’ and grown in 2012 in Hangzhou, using inclusive composite interval mapping.

| Chr. 1 | Left Marker 1 | Right Marker 1 | Chr. 2 | Left Marker 2 | Right Marker 2 | LOD  | PVE (%) | Add1 | Add2 | Dom1 | Dom2 | Add by Add | Add by Dom | Dom by Add | Dom by Dom |
|--------|---------------|----------------|--------|---------------|---------------|------|--------|------|------|------|------|------------|------------|------------|------------|
| 12     | D1252         | RM1246         | 7      | D755          | D760          | 5.43 | 12.48  | -0.65| -1.20| -1.24| -0.89| 0.53       | 1.18       | 1.61       | 2.64       |

Chr. 1 and Chr. 2 are the first and second chromosome positions of the detected digenic epistatic loci, respectively. LOD: logarithm of odds. PVE (%): phenotypic variation explained by digenic epistatic interaction. Add1: estimated additive effect of the first digenic locus. Add2: estimated additive effect of the second digenic locus. Dom1: estimated dominance effect of the first digenic locus. Dom2: estimated dominance effect of the second digenic locus. Add by Add: additive-by-additive digenic interaction. Add by Dom: additive-by-dominance digenic interaction. Dom by Add: dominance-by-additive digenic interaction. Dom by Dom: dominance-by-dominance digenic interaction.

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estimated additive effects of each of the six QTLs in the RIL populations. A positive additive effect was used if a locus carried a grain-weight-increasing allele, and a negative additive effect was used if a locus carried a grain-weight-decreasing allele. For the F2 mapping populations, the genotypic value of an individual plant was calculated by adding the estimated additive effects and dominance effects of each of the six QTLs. The dominance effects of heterozygotes were summed to the additive effects of the homozygotes across the six loci in the F2 populations. The additive or dominance effects of the six QTLs are listed in Table 1. Because only three significant QTLs were detected in the F3 population planted in 2012 in Hainan and in the F2 population planted in 2012 in Hangzhou, the additive or dominance effects of the other three putative QTLs were resolved by the MIM method using Windows QTL Cartographer 2.5.

Linear regression analysis between the genotypic value and grain weight of all individual plants or lines in the seven mapping populations (Fig 2) revealed significant relationships (F2 grown in 2011, F = 96.95, P < 0.0001; F2 grown in 2012, F = 41.36, P < 0.0001; F3, F = 65.42, P < 0.0001; F7, F = 120.14, P < 0.0001; F8, F = 92.02, P < 0.0001; F9, F = 79.39, P < 0.0001, and F10, F = 103.74, P < 0.0001). The coefficient of determination (R2) was used as an estimate of the cumulative heritability of the six QTLs, revealing it was 41%, 18%, 32%, 39%, 33%, 30%, and 36% for the F2 grown in 2011, F2 grown in 2012, F3, F7, F8, F9, and F10, respectively. These results demonstrated that the 12 alleles in the six QTLs acted additively in grain weight regulation. Thus, plants carrying more grain-weight-increasing alleles had heavier grains than those carrying more grain-weight-decreasing alleles.

Discussion

Seven mapping populations (two F2, one F3, and four RIL) and three genetic linkage maps were used in the present study to identify the QTLs responsible for rice grain weight. A common linkage map generated with 179 markers, which covered the 12 rice chromosomes, was used to detect QTLs in the F2 population planted in 2011 in Hangzhou and in its descendant F3 population planted in 2012 in Hainan. This yielded six grain-weight-QTLs, which were further examined in a second F2 population planted in 2012 in Hangzhou. To save time and labor, we did not analyze this population with the 179 markers covering all 12 chromosomes. Instead, we constructed a linkage map with 44 markers covering the regions of the grain-weight-QTLs detected in the F2 and F3 populations.

The six QTLs detected in the three primary mapping populations were further confirmed using four RIL populations, using a common linkage map constructed with 33 markers that covered the locations of these QTLs. This method saved time and labor but some of the grain-weight-QTLs with minor effect might have been neglected, as only two of the seven mapping populations were analyzed with markers covering all 12 chromosomes. Still, this strategy was successfully used for identifying the QTLs responsible for grain length in a previous study [43] and, because we could confirm the QTLs detected in the present study, we believe this is a reliable method for studying relevant traits concerning rice grain shape or weight.

To compare the positions of the QTLs found in the present and in previous studies, we first determined the largest marker-flanking intervals of the six grain-weight-QTLs according to the mapping results in the four RIL populations (Table 1), as we believed that the results were more accurate in RIL than in F2 or F3. The largest marker intervals for qGW-1, qGW-3-1, qGW-3-2, qGW-4, qGW-7, and qGW-10 were D134B-D144A, D309-D315, D335C-D336B, D456-D457B, D746-RM234, and D1042-RM496, respectively. The genes/QTLs responsible for grain shape or grain weight that were cloned or fine mapped on chromosomes 1, 3, 4, and 7 in previous studies were illustrated and compared with the QTLs detected in the present study.
Fig 2. Linear regression analysis between 1000-grain-weight and genotypic values of individual plants/lines in the seven mapping populations (two F2, one F3, and four recombinant inbred line (RIL) populations), derived from ‘Lemont’ × ‘Yangdao 4’ and grown under different environmental conditions. (a) F2 population grown in 2011 in Hangzhou, (b) F2 population grown in 2012 in Hangzhou, (c) F2 population grown in 2012 in Hainan, (d) F2 RIL population grown in 2014 in Hangzhou, (e) F8 RIL population grown in 2014 in Hainan, (f) F9 RIL population grown in 2015 in Hangzhou, and (g) F10 RIL population grown in 2015 in Hainan. The genotypic value of each individual plant/line was calculated by adding the estimated additive effects of the six quantitative trait loci (QTLs) in the RIL populations, or by adding the estimated additive effects and dominance effects of the six QTLs in the F2 populations. The dominance effects of the heterozygotes were summed to the additive effects of the homozygotes across the six loci to determine QTL genotypic values in the F2 populations. When calculating genotypic values, a positive additive effect was used if a locus carried a grain-weight-increasing allele, and a negative additive effect was used if a locus carried a grain-weight-decreasing allele.

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Chromosome 10 was not illustrated because no grain-shape-QTLs or grain-weight-QTLs were cloned or fine mapped on this chromosome. There were no QTLs co-localized with \( qGW-4 \) or \( qGW-10 \) but \( qGW-1 \) was co-localized with \( qGRL1 \), a QTL identified by Singh et al. [24]. However, it is not clear whether the two QTLs are in the same gene. The QTL \( qGW-3-1 \) was adjacent to \( qGL-3-1 \), a grain-length-QTL that we previously identified using the same ‘Lemont’ × ‘Yangdao 4’ mapping populations [43]. It is possible that \( qGW-3-1 \) and \( qGL-3-1 \) are in the same gene, but further studies are needed to confirm this. The QTL \( qGW-3-2 \) was co-localized with \( qTGW3 \) [32] and \( qGL-3-2 \) [43], the latter being a grain-length-related QTL identified by us in a previous study using the same mapping populations. Thus, \( qGW-3-2 \) and \( qGL-3-2 \) might be in the same gene. The QTL \( qGW-7 \) was co-localized with \( SRS1 \) [16], \( GL7/GW7 \) [17,18], \( GS7 \) [37], \( qSS7 \) [38], and \( qGL-7 \) [43]. Although \( SRS1 \) [16] and \( GL7/GW7 \) [17,18] were cloned, it is not clear if \( qGW-7 \) is allelic to either or both of them, based on the available information.

Grain weight is one of the most important determinants of rice yield. Because it directly influences grain yield, it has attracted great attention within the rice genetic research community. A large number of QTLs responsible for grain weight have been reported in previous studies, but it is still not clear how the different alleles in the several grain-weight-QTLs coordinated to determine grain weight. In the present study, we found an allele increasing and another decreasing grain weight within each of the six grain-weight-QTLs identified. We also

Fig 3. Comparison of the grain-shape- or grain-weight-related genes mapped on chromosomes 1, 3, 4, and 7 in the present and previous studies. Numbers to the left of the chromosome bar indicate the physical position (Mb) of the corresponding markers. The physical positions of the markers were determined using the basic local alignment search tool (BLAST) on the National Center for Biotechnology Information (NCBI) website (https://www.ncbi.nlm.nih.gov/) and the Nipponbare (IRGSP-1.0) as the reference sequences.

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found that plants carrying more grain-weight-increasing alleles had heavier grains than those carrying more grain-weight-decreasing alleles. Regression analysis indicated that the 12 alleles in the six QTLs acted additively across loci, leading to a linear relationship between genotypic values and phenotype. Given that these six QTLs did not interact with each other, they might be involved in six independent pathways. Although the six QTLs detected in this study were mapped in relatively rough marker intervals, the closest markers to these QTLs can be used in marker-assisted breeding to pyramid the number of alleles needed to form a desired phenotype. However, caution must be taken because it is not known if the effect of the 12 alleles from the six QTLs is maintained when genes are introduced into different genetic backgrounds.

**Supporting information**

S1 Fig. The 33 polymorphic markers used in the QTL analysis of the four RIL populations. Numbers at the left of the chromosome bars indicate the genetic positions (cM) of the corresponding markers.

(TIF)

S2 Fig. LOD score curves of the QTLs for grain weight detected in the F2 population grown in 2011 in Hangzhou.

(TIF)

S3 Fig. LOD score curves of the QTLs for grain weight detected in the F3 population grown in 2012 in Hainan.

(TIF)

S4 Fig. LOD score curves of the QTLs for grain weight detected in the F2 population grown in 2012 in Hangzhou.

(TIF)

S5 Fig. LOD score curves of the QTLs for grain weight detected in the F7 RIL population grown in 2014 in Hangzhou.

(TIF)

S6 Fig. LOD score curves of the QTLs for grain weight detected in the F8 RIL population grown in 2014 in Hainan.

(TIF)

S7 Fig. LOD score curves of the QTLs for grain weight detected in the F9 RIL population grown in 2015 in Hangzhou.

(TIF)

S8 Fig. LOD score curves of the QTLs for grain weight detected in the F10 RIL population grown in 2015 in Hainan.

(TIF)

S1 Table. Two-way analysis of variance used to confirm the digenic epistatic loci detected in the F3 population, derived from 'Lemont' × 'Yangdao 4', and grown in 2012 in Hainan, using inclusive composite interval mapping. DF: degrees of freedom; SS: sum of squares; *, P < 0.05; **, P < 0.01.

(DoCX)

S2 Table. Two-way analysis of variance used to confirm the digenic epistatic loci detected in the F2 population, derived from 'Lemont' × 'Yangdao 4', and grown in 2012 in
Hangzhou, using inclusive composite interval mapping. DF: degrees of freedom; SS: sum of squares; *, P < 0.05; **, P < 0.01.

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