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Maintaining higher leaf photosynthesis after heading stage could promote biomass accumulation in rice

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Leaf photosynthetic rate changes across the growing season as crop plants age. Most studies of leaf photosynthesis focus on a specific growth stage, leaving the question of which pattern of photosynthetic dynamics maximizes crop productivity unanswered. Here we obtained high-frequency data of canopy leaf CO_2 assimilation rate (A) of two elite rice (*Oryza sativa*) cultivars and 76 inbred lines across the whole growing season. The integrated A value after heading was positively associated with crop growth rate (CGR) from heading to harvest, but that before heading was not. A curve-smoothing analysis of A after heading showed that accumulated A at > 80% of its maximum (A_{80}) was positively correlated with CGR in analyses of all lines mixed and of lines grouped by genetic background, while the maximum A and accumulated A at ≤ 80% were less strongly correlated with CGR. We also found a genomic region (~ 12.2 Mb) that may enhance both A_{80} and aboveground biomass at harvest. We propose that maintaining a high A after heading, rather than having high maximum A, is a potential target for enhancing rice biomass accumulation.

Abbreviations

A	Net CO_2 assimilation rate per leaf area
A_{80}	Accumulated A at > 80% of A_{max}
A_{all}	Accumulated A during Phase II
A_{dec}	Accumulated A at ≤ 80% of A_{max}
AGB_I	Aboveground biomass at first sampling
AGB_{II}	Aboveground biomass at second sampling
A_{int}	Integrated A
$A_{int\ Phase\ I}$	Integrated A during Phase I
$A_{int\ Phase\ II}$	Integrated A during Phase II
A_{max}	Maximum fitted value of A during Phase II
CGR	Crop growth rate
$CGR_{Phase\ I}$	CGR during Phase I
$CGR_{Phase\ II}$	CGR during Phase II
CSSL	Chromosome segment substitution line
DAT	Days after transplanting
D_{onset}	1 Day before A declined below 80% of A_{max}
DTH	Days to heading
Koshihikari lines	Koshihikari-background CSSLs and Koshihikari
LA	Leaf area
$LA_{mean\ Phase\ I}$	Mean single LA during Phase I
$LA_{mean\ Phase\ II}$	Mean single LA during Phase II
$SPAD_{80}$	Mean SPAD value before D_{onset}

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| SPAD$_{dec}$ | Mean SPAD value after D_{onset} |
| Takanari lines | Takanari-background CSSLs and Takanari |

Rice (*Oryza sativa*) is one of the most important cereal crops worldwide. To meet the increasing demand for grain as the world's population increases, rice productivity must be increased by ~ 50% relative to the current level by 2050[1,2]. The rice yield increases during the "green revolution" depended largely on the development of semi-dwarf cultivars with greater harvest index and on greatly increased N fertilizer application[3,4]. This strategy is reaching its limits, however, because harvest index is reaching its theoretical maximum and excess application of N fertilizer causes environmental pollution[5–7]. Further enhancement of grain yield must be achieved through increases of total biomass accumulation via improved radiation use efficiency without increased nutrient inputs[8]. Single-leaf photosynthesis has long been considered a target trait for increasing radiation use efficiency[6,9,10]. Recent studies have shown the importance of enhancing single-leaf photosynthesis and crop productivity in the field[11]; for example, the promoted recovery from photoprotection increased biomass production in tobacco (*Nicotiana tabacum*)[12], and overproduction of ribulose-1,5-bisphosphate carboxylase/oxygenase (Rubisco) increased grain yield in rice[13].

Using natural genetic resources could be a useful approach for improving photosynthesis[14–16]. Wide intraspecific variation in net CO_2 assimilation rate per leaf area (*A*) has been found in several crop species, including rice[17–19] and wheat (*Triticum aestivum*)[20,21]. The underlying genetic variations can be used in quantitative genetic analyses to identify genomic regions relating to leaf photosynthesis, facilitating DNA marker-assisted selection[14,16]. An important question in such an approach is whether the enhanced *A* effectively increases total biomass production and grain yield[22]. Positive close correlations of *A* with plant (or crop) growth rate, biomass production, and final yield through large-scale surveys of diverse sets of accessions have been reported in rice[19,23,24], wheat[25,26] and soybean (*Glycine max*)[27]. Simulation analyses showed that a 25% increase in single-leaf photosynthesis based on rice genetic resources could enhance biomass production by 22–29%[28]. Furthermore, newer rice cultivars developed in Japan with high yield capacity have higher *A* than older cultivars, especially after heading[29,30]. These studies underpin the potential for enhanced productivity by improved photosynthesis achieved through the use of natural genetic resources.

In contrast, there are many conflicting results on the photosynthesis–productivity relationship. Poor correlations between *A* and biomass accumulation have been reported in rice[18,31], wheat[21] and maize (*Zea mays*)[32]. For example, Jahn et al. found a significant negative correlation between *A* and dry biomass among 20 diverse rice varieties[18]. Our previous research also showed that a near isogenic rice line with enhanced *A* significantly reduced the grain yield than its parental cultivars[33]. Many agronomists have been questioned the effects of the genetic improvement of single-leaf photosynthesis for better crop yields[34,35]. In fact, crop breeding has often selected increased leaf area production at the expense of photosynthetic capacity, as occurred in wheat[36]. The inconsistencies between studies could reduce the potential value of natural genetic resources for improving leaf photosynthesis and delay the enhancement of crop productivity.

The value of *A* changes across the growing season owing to the progression of plant age and leaf senescence[37–39]. However, most studies of the photosynthesis–productivity relationship selected only one or two growth stages for evaluation of photosynthesis[18,19,26,30]. Such a "snapshot" analysis can reveal only limited aspects of crop production and potentially cause inconsistent results. The need for comprehensive evaluation is supported by the fact that the total CO_2 uptake per tobacco plant, calculated from multiple measurements of leaves at several positions throughout the day and the growing season, agreed well with actual dry weight increase[40]. Therefore, multiple photosynthetic measurements are necessary when we examine natural genetic resources across their growing season.

Conventional open gas exchange systems require several to tens of minutes to acclimatize a leaf to the leaf chamber, limiting the number of samples to be examined[41]. To overcome this limitation, we recently created a new closed gas exchange system (MIC-100; Masa International Corporation, Kyoto, Japan), which takes 15–20 s per measurement, ~ 90% less than conventional open gas exchange systems. We hypothesize that with the new measurement system, tracing photosynthetic dynamics of multiple rice accessions across their growing season will tell us which photosynthetic dynamics can maximize productivity and which developmental stage should be targeted in breeding for photosynthesis.

In previous studies, our research group determined that the *indica* cultivar Takanari, which has one of the highest grain yields among Japanese rice cultivars, accumulated more biomass than Nipponbare and Koshihikari, standard *japonica* cultivars[42,43]. Since then, Takanari has been widely used to analyse the physiological and molecular mechanisms of biomass accumulation[44–50] and their effects on grain yield[51–54]. Although the higher biomass accumulation in Takanari is characterized by a higher net assimilation rate around the full heading stage, which could be partly explained by the higher leaf photosynthetic capacity, only rough analysis of gas exchange during growth has been conducted[43]. Here, we aimed at collecting the data on temporal changes in canopy photosynthesis of Koshihikari and Takanari over the entire growing season by using the MIC-100 to analyse its association with crop growth rate (CGR) and total biomass accumulation. We assumed that photosynthesis in the uppermost fully expanded leaf is representative of canopy photosynthesis, since it has the highest photosynthetic capacity and receives the strongest radiation in the canopy[43,46,55]. We also observed ontogenic changes of chlorophyll content (SPAD value) and single leaf area (single LA). To analyse the phenotypic variation caused by introgressions between the cultivars, we used reciprocal sets of chromosome segment substitution lines (reciprocal CSSLs) derived from a Koshihikari/Takanari cross[52,56]. Each CSSL carries a single genomic segment from the donor cultivar (either Koshihikari or Takanari) in the genetic background of the other cultivar, and the full set of substituted segments covers the entire genome[52,57]. The variation in flowering date is much smaller in CSSLs than in other populations such as recombinant inbred lines, which is advantageous in examining whether
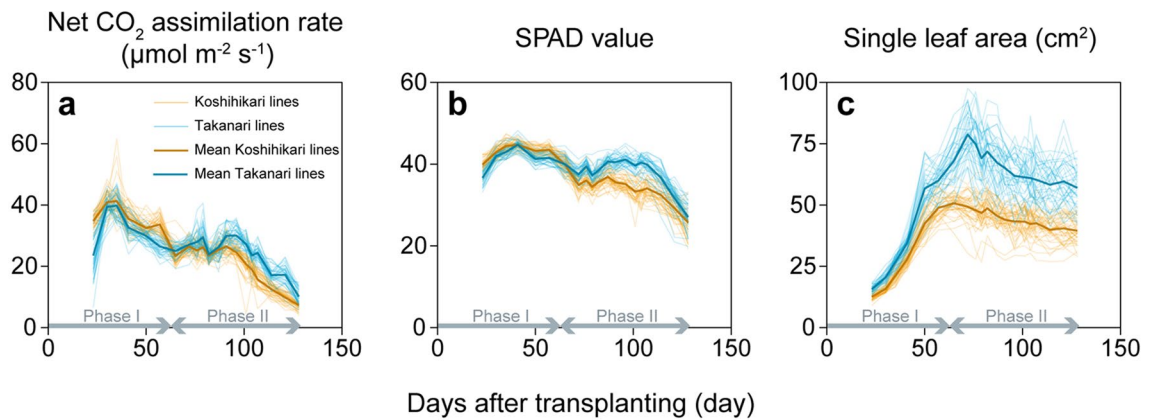
Figure 1. Dynamics of (**a**) net CO_2 assimilation rate, (**b**) SPAD value and (**c**) single leaf area across the entire growing season. Koshihikari lines, Koshihikari-background CSSLs and Koshihikari; Takanari lines, Takanari-background CSSLs and Takanari ($n = 3$). Mean phenotypic values are also shown. Phase I, transplanting to first biomass sampling (71 days after transplanting, DAT); Phase II, first biomass sampling to second biomass sampling (129 DAT).

changes in photosynthesis affect biomass accumulation. From this study, we propose that maintaining a high rate of photosynthesis after heading, rather than having a high maximum photosynthetic rate, can increase total biomass accumulation.

Results

Ontogenic changes in photosynthesis and biomass accumulation. We divided the growth period into Phase I—from transplanting to the first biomass sampling (at heading)—and Phase II—from the first sampling to the second sampling (at harvest) (Fig. 1). (See days to heading [DTH] data of all rice lines in Supplementary Dataset S1.) As a general trend, A reached the maximum at around 30–35 days after transplanting (DAT) and then gradually decreased over time (Fig. 1a). During Phase I, A values of Takanari-background CSSLs and Takanari (Takanari lines) were lower by 10% in average than those of Koshihikari-background CSSLs and Koshihikari (Koshihikari lines). During Phase II, A values of Takanari lines remained higher than those of Koshihikari lines (Fig. 1a). SPAD values showed a similar trend (Fig. 1b). Single LA gradually increased with crop growth and reached a maximum at around 65 DAT in Koshihikari lines and 72 DAT in Takanari lines (Fig. 1c). Single LA of Takanari lines was larger than that of Koshihikari lines during Phase I, and larger still during Phase II (Fig. 1c).

Integrated A (A_{int}), the apparent total CO_2 uptake calculated by sum of trapezoidal area under each pair of adjacent measurements, was 10% lower in Takanari lines than in Koshihikari lines during Phase I, but was 23% higher during Phase II ($P < 0.001$; Fig. 2a). Mean single LA was significantly higher in Takanari lines than in Koshihikari lines during Phase I, and even higher during Phase II ($P < 0.001$; Fig. 2b). There was no significant difference in aboveground biomass at the first sampling (AGB_I) or in CGR during Phase I ($CGR_{Phase I}$) between Koshihikari lines and Takanari lines, while AGB at the second sampling (AGB_{II}) and CGR during Phase II ($CGR_{Phase II}$) were significantly higher in Takanari lines than in Koshihikari lines, by 25% and 40%, respectively ($P < 0.001$; Fig. 2c,d). The standard deviation (SD) in each background was larger during Phase II than during Phase I (for instance, for CGR in Koshihikari lines: 0.72 during Phase I but 2.51 during Phase II; Supplementary Table S1). These results indicate that the genetic differences between Koshihikari and Takanari and between lines of each genetic background were more notable during Phase II than during Phase I. The AGB_{II} was closely correlated with $CGR_{Phase II}$ ($r = 0.97$), not with $CGR_{Phase I}$ ($r = 0.34$; Supplementary Fig. S4). $CGR_{Phase I}$ was not correlated with A_{int} during Phase I ($A_{int\ Phase I}$) ($r = -0.10$) and was only slightly correlated with mean single LA during Phase I ($LA_{mean\ Phase I}$) ($r = 0.28$), while $CGR_{Phase II}$ was strongly correlated with these values ($r = 0.75$ for A_{int} during Phase II [$A_{int\ Phase II}$], $r = 0.82$ for mean single LA during Phase II [$LA_{mean\ Phase II}$]; Supplementary Fig. S4). These results indicate that AGB_{II} depends largely on $CGR_{Phase II}$, which in turn is correlated closely with photosynthesis and single LA during Phase II.

Curve-smoothing analysis during Phase II and associations of parameters with crop growth rate. For detailed analysis of photosynthetic dynamics during Phase II, we applied curve-smoothing analysis to the A and SPAD values (Fig. 3a,d). Both curves were upward-convex, peaking several days after beginning of Phase II, and decreased over time. The total area under the curve (A_{all}) and the maximum A (A_{max}) were higher in Takanari than in Koshihikari, by around 26% each (Fig. 3b,c). When A_{all} was divided into accumulated A at > 80% of A_{max} (A_{80}) and accumulated A at ≤ 80% of A_{max} (A_{dec}) at D_{onset} (1 day before A declined below 80% of A_{max}), Takanari had a higher A_{80} than Koshihikari but a similar A_{dec} (Fig. 3b,c). Takanari also had higher values of $SPAD_{80}$ and $SPAD_{dec}$ (the mean SPAD values of the two phases divided at D_{onset}) than Koshihikari (Fig. 3e,f). The values of all CSSLs are shown in the Supplementary Dataset S1.
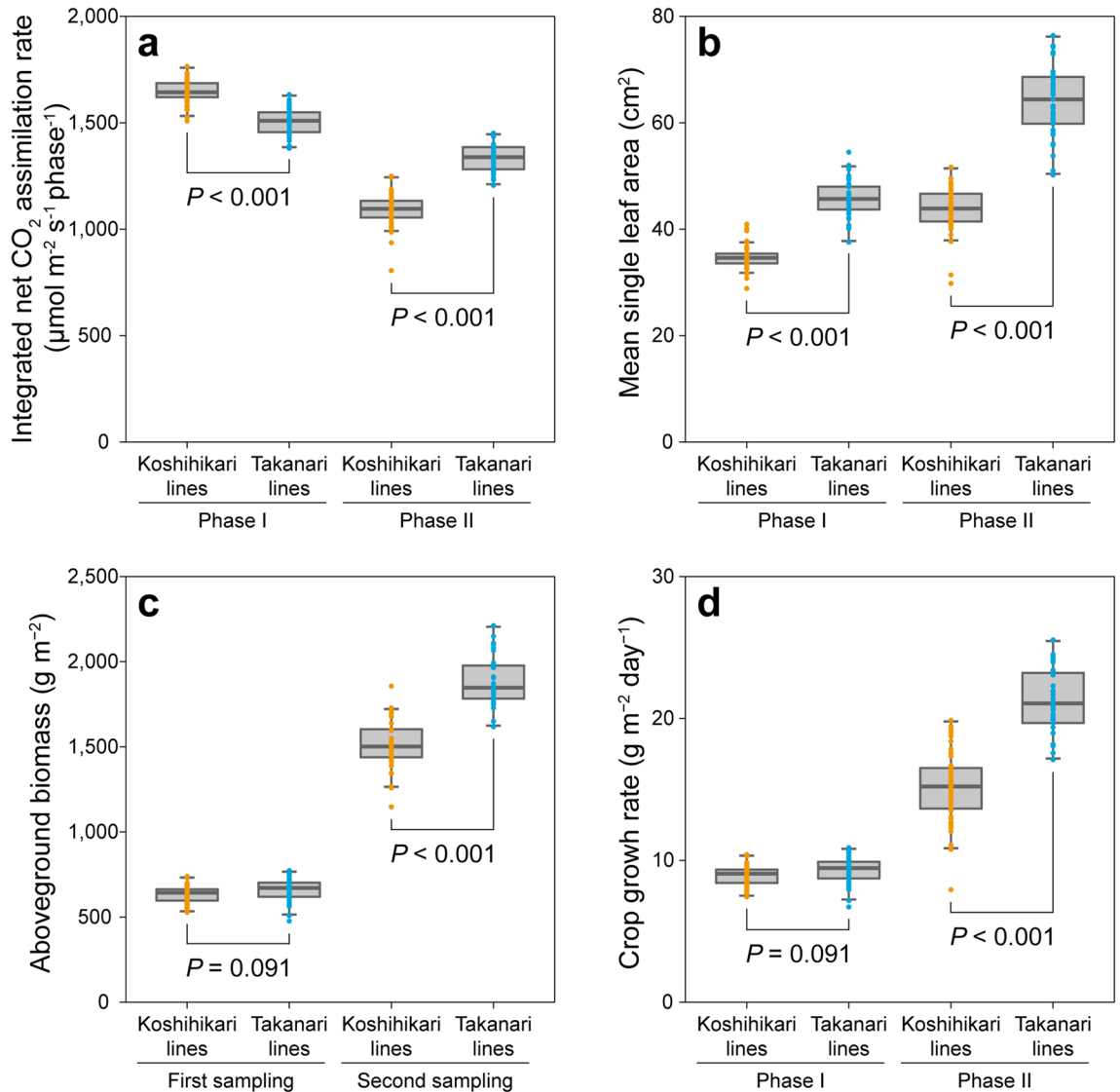
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Figure 2. Comparisons of phenotypes between Koshihikari lines and Takanari lines. (**a**) Integrated net CO_2 assimilation rate, (**b**) mean single leaf area, (**c**) dry weight of aboveground biomass, (**d**) crop growth rate. Abbreviations as in Fig. 1. Boxplots: central line, median; boxes, interquartile range (IQR); whiskers, $1.5 \times IQR$; points, actual data.

The correlations between biomass accumulation and photosynthetic parameters after heading showed that $CGR_{Phase II}$ was closely correlated with A_{all} (Fig. 4). In turn, A_{all} was closely correlated with A_{max}, A_{80} and D_{onset}, and was moderately negatively correlated with A_{dec}. These results suggest that A_{all} is determined mainly by A_{80}, the magnitude of which can be explained by both A_{max} and D_{onset}. $CGR_{Phase II}$ was positively correlated with DTH and $LA_{mean\ Phase II}$, indicating that a later heading date and a larger single LA could enhance biomass accumulation. $SPAD_{80}$ was positively correlated with A_{80}, but $SPAD_{dec}$ was not correlated with A_{dec}.

Analysis by genetic background.   The results of the above analyses should be affected considerably by the genetic background, because the Takanari lines had consistently higher values of most parameters after heading. So we conducted separate analyses by genetic background. AGB_{II} was closely correlated with $CGR_{Phase II}$ in each background ($r = 0.94$ for Koshihikari lines, $r = 0.88$ for Takanari lines; Supplementary Fig. S5). $CGR_{Phase II}$ was not correlated with A_{max} in either background ($r = -0.12$ for Koshihikari lines, $r = 0.16$ for Takanari lines), but it was significantly correlated with A_{80} ($r = 0.31$ for Koshihikari lines; $r = 0.43$ for Takanari lines) and with D_{onset} ($r = 0.43$ for Koshihikari lines; Supplementary Fig. S5, Fig. 5a–c). The association between $CGR_{Phase II}$ and D_{onset} in Takanari lines was close to significant ($r = 0.28$, $P = 0.091$; Supplementary Fig. S5b, Fig. 5c). These results indicate that maintaining a high rate of photosynthesis for longer, rather than having a higher A_{max}, was related to higher biomass accumulation during Phase II in each background. We also found a significant relationship between $CGR_{Phase II}$ and $LA_{mean\ Phase II}$ in each background ($r = 0.44$ for Koshihikari lines, $r = 0.49$ for Takanari lines; Supplementary Fig. S5, Fig. 5d). The factors affecting total biomass accumulation are presented in Fig. 5e.
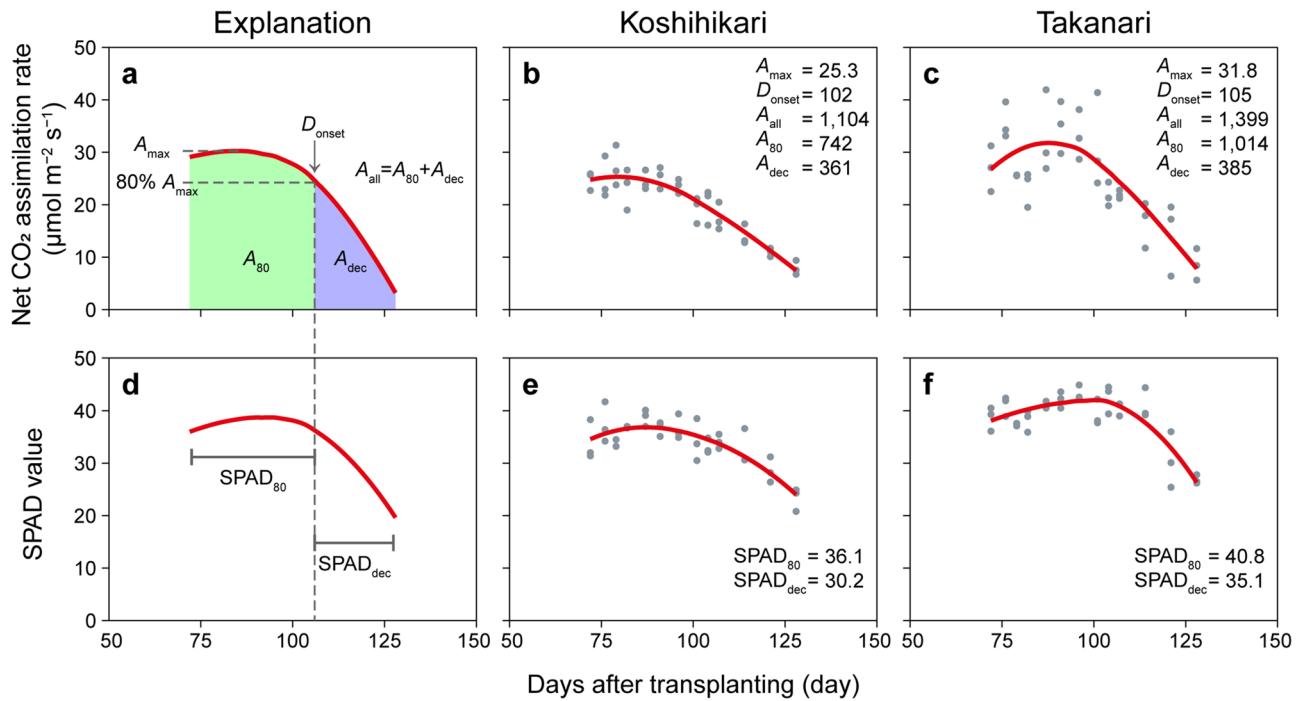
Figure 3. Curve-smoothing analysis for net CO_2 assimilation rates (A) and SPAD values during Phase II. (**a**) A curve. A_{max}, maximum fitted value of A; D_{onset}, 1 day before A declined below 80% of A_{max}; A_{all}, accumulated A during Phase II; A_{80}, accumulated A from 72 DAT to D_{onset}; A_{dec}, accumulated A from D_{onset} to 128 DAT. (**b,c**) Curve-smoothing analysis of A for (**b**) Koshihikari and (**c**) Takanari. Grey points, actual data; red lines, smoothed curves. (**d**) SPAD curve. $SPAD_{80}$, mean SPAD value before D_{onset}; $SPAD_{dec}$, mean SPAD value after D_{onset}. (**e,f**) Curve-smoothing analysis of SPAD for (**e**) Koshihikari and (**f**) Takanari.
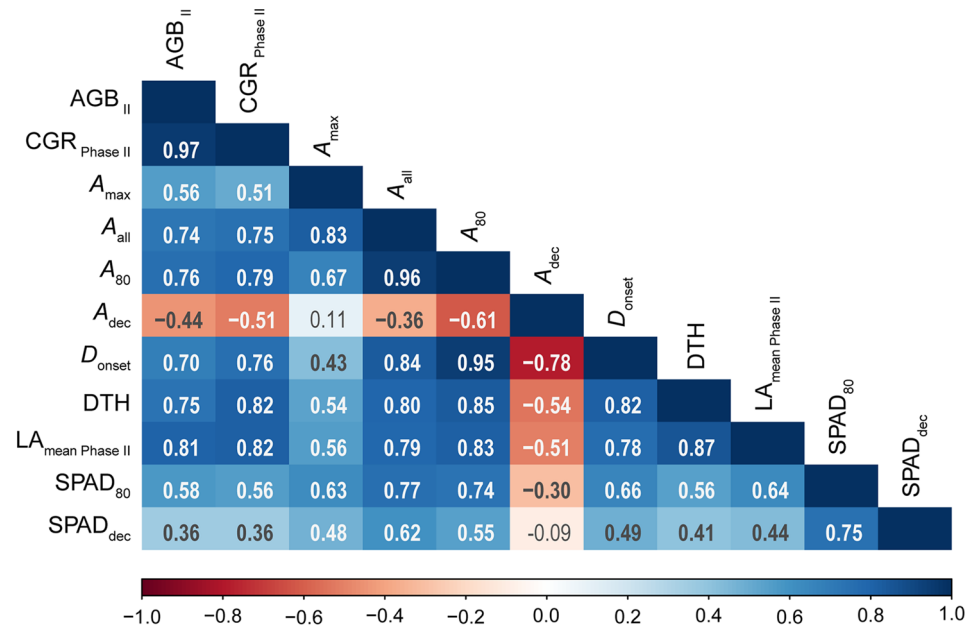

Figure 4. Pearson's correlation coefficients of pairs of traits (biomass accumulation, CO_2 assimilation and other agronomic traits) during Phase II among all lines examined. Values in bold type are significant ($P < 0.05$, two-sided t-test). Blue, positive correlation; red, negative correlation. AGB_{II}, dry weight of aboveground biomass harvested at 128 DAT; $CGR_{Phase\,II}$, crop growth rate during Phase II; DTH, days to heading; $LA_{mean\,Phase\,II}$, mean value of single leaf area during Phase II. Other abbreviations as in Fig. 3.
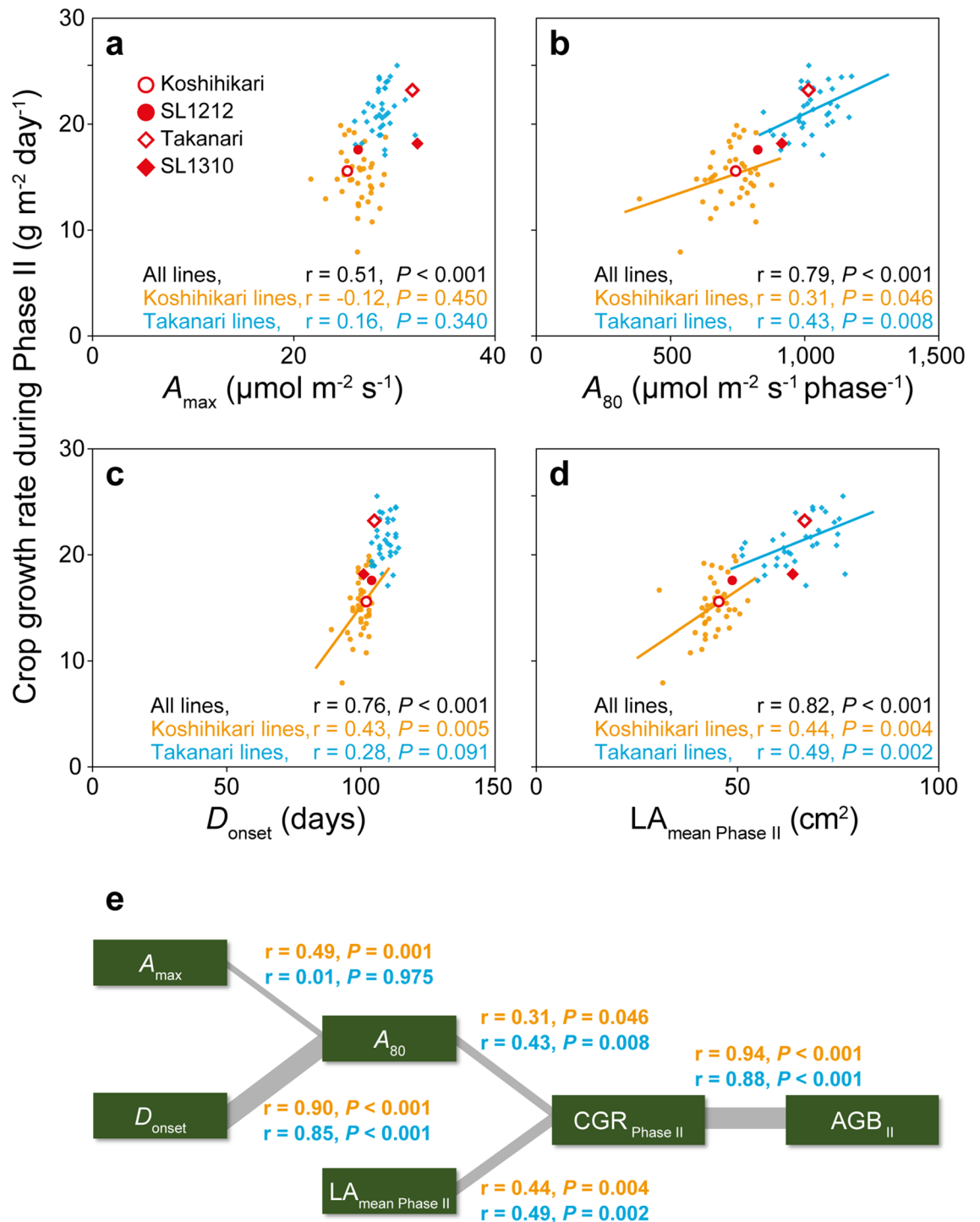
Figure 5. Relationships between $CGR_{Phase\,II}$ and (**a**) A_{max}, (**b**) A_{80}, (**c**) D_{onset} and (**d**) $LA_{mean\,Phase\,II}$. Orange, Koshihikari lines; blue, Takanari lines. (**e**) Schematic model showing the factors affecting biomass accumulation. Abbreviations as in Figs. 3 and 4.

By multiple linear regression analysis, the combined contribution of A_{80} and $LA_{mean\,Phase\,II}$ to $CGR_{Phase\,II}$ variation was 25% for Koshihikari lines and 31% for Takanari lines.

Among the CSSLs, A_{80} values of SL1212 and SL1310, with a single genomic segment on chromosome 3 from the introgression parent, were, respectively, 11% higher than that of Koshihikari and 10% lower than that of Takanari (Supplementary Fig. S6b). $SPAD_{80}$ was similar between each pair of the parent and the CSSL, suggesting less difference in biochemical properties (Supplementary Fig. S6c). AGB_{II} and $CGR_{Phase\,II}$ of SL1212 were 13% and 13%, respectively, higher than those of Koshihikari, and those of SL1310 were 14% and 28% lower than those of Takanari (Supplementary Fig. S6d,e). These results suggest that genes on the genomic region of chromosome 3

(17.0–29.2 Mb) regulate both photosynthesis and total biomass accumulation. We also found some yield-related genes included in this genomic region (Supplementary Table S2; Supplementary Dataset S2)[58].

Discussion

Improving leaf photosynthetic capacity has long been considered a promising target to increase biomass production and yield in crop species[6,9,10]. However, poor correlations between leaf photosynthetic rate and biomass accumulation or yield have been reported[18,21,31,32,59], perhaps in part owing to limited datasets. To understand the association of photosynthetic rate and biomass accumulation across the entire growing season, we obtained high-frequency data of A, SPAD and single LA of the canopy leaf and tested correlations with CGR using reciprocal CSSLs and their parental cultivars.

During Phase I (transplanting to heading), differences in leaf photosynthesis had little effect on biomass production. Takanari lines had lower A and SPAD values and larger single LA than Koshihikari lines (Figs. 1, 2). AGB_I and $CGR_{Phase I}$ did not differ between Koshihikari and Takanari lines (Fig. 2), which can be explained by the offset of the lower A by the larger single LA in Takanari lines. Taylaran et al. likewise showed that Takanari had a similar plant growth rate to Koshihikari during the vegetative stage owing to its lower net assimilation rate but the higher mean leaf area per plant[43]. We also found a smaller variation in these traits among lines of each background (41 Koshihikari lines, 37 Takanari lines) during Phase I than during Phase II (Fig. 2; Supplementary Table S1), which suggests that the genomic introgressions between the cultivars have little effect on phenotypic expression before heading. In contrast, a wide genetic variation in biomass accumulation (227%) among 204 global mini-core accessions and 11 elite Chinese rice cultivars at the mid-vegetative stage (60 days after emergence) was reported[19]. The authors also showed that A under low light was highly related to biomass accumulation, suggesting that simultaneous improvements of photosynthetic rate and biomass accumulation during early growth can be achieved by using a diverse set of germplasms[19].

During Phase II (heading to harvest), photosynthetic parameters were closely associated with biomass accumulation. The A value of Takanari lines increased and remained higher than that of Koshihikari lines until the final examination (Fig. 1a). The positive correlations between photosynthetic parameters (A_{max}, A_{all}, A_{80}) and biomass accumulation parameters ($CGR_{Phase II}$ and AGB_{II}) in the analysis of all datasets combined indicate that the consistently higher photosynthetic capacity in Takanari lines contributes to the enhanced biomass accumulation compared to Koshihikari lines (Fig. 4). The large difference in A between Koshihikari and Takanari after heading stage has been repeatedly reported[43–45,48]. This is explained in part by the enhanced root system development in Takanari, increasing water and nitrogen uptake[43]. Additionally, the steeper nitrogen distribution to the upper canopy leaf in Takanari can lead to the effective use of sunlight[6]. In the separate analysis of each background, $CGR_{Phase II}$ and A_{80} were significantly correlated in both Koshihikari and Takanari lines (Supplementary Fig. S5). Interestingly, in this analysis, A_{max} was not correlated with $CGR_{Phase II}$ in either Koshihikari or Takanari lines (Fig. 5a, Supplementary Fig. S5). In addition, A_{max} was not correlated with A_{80} in Takanari lines, although it was significantly correlated in Koshihikari lines (Supplementary Fig. S5), suggesting that increasing A_{max} is not always an efficient strategy for enhancing biomass accumulation. Many physiological and molecular analyses have focused on the maximum photosynthetic rate of the flag leaf on the assumption that it has the highest photosynthetic activity in the crop canopy after heading, which would be closely correlated with biomass accumulation and yield[26,44,56,60,61]. However, our results show that maintaining a high rate of photosynthesis after heading, rather than having a high A_{max}, is more closely associated with biomass accumulation. We identified a genomic region that may simultaneously increase (or decrease) A_{80} and $CGR_{Phase II}$ without increasing A_{max} (Fig. 5, Supplementary Fig. S6). We propose that as limited evaluation of photosynthesis could select lines with poor biomass accumulation, ontogenic changes in photosynthesis after heading should be examined for simultaneously enhancing photosynthetic performance and biomass accumulation.

The variation in $LA_{mean Phase II}$ was also associated with the variation in $CGR_{Phase II}$ in both the combined analysis of all lines and the separate analyses of Koshihikari and Takanari lines (Figs. 4, 5d, Supplementary Fig. S5). This suggests that breeding for the selection of plants with larger flag leaves may enhance the total biomass accumulation. However, very large leaves and too many tillers could reduce sunlight penetration into the canopy, thereby increasing canopy respiration rate and decreasing the total biomass accumulation[62]. This issue may not be obvious in our results, but it should be considered in different growth environments.

Although we found significant correlations of A_{80} and $LA_{mean Phase II}$ with $CGR_{Phase II}$, the combined contribution of A_{80} and $LA_{mean Phase II}$ to $CGR_{Phase II}$ variation was only 25–31%. This indicates the presence of other major determinants behind the variation in CGR. The first possibility is tiller growth: active tillering increases the total leaf area of a plant, greatly contributing to total biomass accumulation and panicle number[63]. Although we did not examine tiller numbers here, panicle number varies widely among these CSSLs[52]. The second possibility is the photosynthetic capacity and single LA of leaves at lower positions. A recent study showed that the balance of photosynthetic capacity between the flag leaf and the leaf immediately below it has significant effects on canopy photosynthesis in wheat[64]. The third possibility is the degree of light penetration to the bottom of the canopy. Better light penetration, which is achieved by large leaf inclination angles and decreased chlorophyll content of the canopy leaves, can maximize canopy photosynthesis[6,65]. Takanari has one of the highest leaf inclination angles among rice cultivars, which is considered an important determinant of its higher biomass accumulation[66]. The fourth possibility is adaptation to the environment, especially light and vapour pressure deficit. Sunlight reaching the leaf surface fluctuates on the order of minutes to seconds owing to cloud, wind and self-shading[67]. The time-lag inherent in reaching a new steady-state rate of photosynthesis after a fluctuation would diminish the total carbon gain[68,69]. The photosynthetic rate can decrease in the afternoon on sunny days with high vapour pressure deficit, so-called "midday depression", largely because of closed stomata and photoinhibition[3,70]. So we need a comprehensive simulation model using these complex physiological factors and the association of the

underlying genomic regions to explain the difference in biomass accumulation among lines. Our high-frequency datasets of photosynthesis may contribute to the development of such a model.

In conclusion, maintaining a higher photosynthetic rate, rather than achieving the maximum rate, after heading was closely associated with biomass accumulation. We identified a genomic region likely to simultaneously increase A_{80} and biomass accumulation, although further investigation is necessary. We propose that examination of the dynamics of photosynthesis throughout the entire growing period is important to the use of natural genetic resources for breeding selection. In contrast, the limited contribution of A_{80} to biomass production suggests essential roles of other physiological factors in biomass variation. A comprehensive model explaining the role of genetic variation in biomass accumulation by multiple physiological properties and the roles of key genes is required.

Methods

Plant cultivation.
Collection of plant material, must comply with relevant institutional, national, and international guidelines and legislation. The rice seeds of Koshihikari and Takanari and reciprocal sets of CSSLs (41 lines in Koshihikari background, 39 lines in Takanari background)[52] were obtained from Institute of Crop Science, National Agriculture and Food Research Organization, Tsukuba, Japan, with a material transfer agreement. Lines SL1208, SL1335 and SL1336 had a dwarf plant structure, probably due to hybrid breakdown associated with the interaction of *hbd2* and *hbd3*, and SL1320 did not produce panicles during the experiment, probably owing to the inserted *Hd1* gene[52]. We excluded these four lines from our analyses. Seeds were sown in plastic cups filled with artificial soil on 7 May 2019, and the seedlings were grown until the fourth to fifth leaf stage in the greenhouse. They were transplanted into a paddy field (an alluvial clay loam) of Tokyo University of Agriculture and Technology (35° 39′ N, 139° 28′ E) on 22 May with a basal dressing of inorganic fertilizer supplying 30 kg N, 60 kg P, and 60 kg K ha^{-1}. One-third of the total N was applied as ammonium sulphate, and the other two-thirds as slow-release urea (LP-50 & LPS-100; JCAM Agri Co., Ltd, Tokyo, Japan). No topdressing was applied. The plant density was 22.2 m^{-2} (at a spacing of 30 cm × 15 cm) with one plant per hill, and plants were grown under submerged conditions. Each line was grown in three replicate plots in 2 rows of 20 plants (60 cm × 300 cm). Plots were randomized, but lines of each background group were planted adjacent (Supplementary Fig. S1).

Phenotypic analysis.
The uppermost newly expanded leaf on the main tiller of one plant per plot was used for phenotypic analyses. The net CO_2 assimilation rate was measured with a closed-type portable photosynthesis system (MIC-100; Masa International Corporation, Kyoto, Japan; https://www.weather.co.jp/catalog_html/MIC-100.html), which consists of a console and a chamber head with an aperture area of 2 cm × 3 cm (Supplementary Fig. S2a). A non-dispersive infrared sensor at the bottom of the chamber measures CO_2 concentration every 0.1 s. To prevent rapid inactivation of the leaf's photosynthetic activity, a light-emitting diode lamp at the chamber top supplies a photosynthetic photon flux density of 1200 µmol photons m^{-2} s^{-1}. After an intact leaf is enclosed in the chamber clip, air flow from the atmosphere is blocked off, and the rate of decrease of CO_2 concentration from 400 to 390 ppm is monitored to calculate net CO_2 assimilation rate. Each measurement was completed within 20 s. Measurements were taken in sunlight between 08:00 and 13:00 h on dry days (the solar radiation during measurements was 500–1300 µmol photons m^{-2} s^{-1}). The SPAD value as a proxy for leaf chlorophyll content was measured with a chlorophyll meter (SPAD-502; Konica Minolta, Osaka, Japan; Supplementary Fig. S2b). Leaves were sampled and transported to the laboratory without dehydration. The leaves put in a transparent folder were passed through a commercial document scanner (ScanSnap iX1500; Fujitsu, Kanagawa, Japan; Supplementary Fig. S2c). The single LA and the partial LA in the MIC-100 chamber were measured in ImageJ software (National Institutes of Health, Bethesda, MD, USA). The partial LA was used for the calculation of net CO_2 assimilation rate per leaf area (A, µmol m^{-2} s^{-1}). Measurements were conducted once a week from 3 weeks after transplanting (14 June, 23 DAT) to harvest (27 September, 128 DAT), and additional measurements were also conducted around heading and mid-ripening stage (20 days in total). In total, 246 leaves were measured per day, 4632 leaves during the experiment. A_{int} was calculated by summing the trapezoidal area under each pair of adjacent measurement cycles. Mean single LA was calculated as the average of linear interpolated values.

Sampling of aboveground biomass.
The aboveground biomass was examined at heading (1 August, 71 DAT; AGB_I) and harvest (28 September, 129 DAT; AGB_{II}). Eight plants in each plot were sampled and air-dried in a greenhouse until weighing. Air-dried samples of parental plants were dried in a ventilated oven to calculate the water content ratio of the air-dried samples. The biomass accumulation was expressed as dry weight (g) per m^2. CGR from transplanting (considered as 0) to heading (Phase I) and from heading to harvest (Phase II) were calculated.

Curve smoothing and statistical analysis.
All statistical analyses were performed in R v. 4.0.2 software[71]. The changes in A and SPAD values during Phase II in each rice line were smoothed by the Locally Weighted Scatterplot Smoother (LOESS) algorithm with the smoothing parameter fixed at 1.0[72]. We defined A_{max} (µmol m^{-2} s^{-1}) as the maximum fitted value of A, and D_{onset} (day) as 1 day before A declined below 80% of A_{max} (Fig. 3a). We also defined A_{all} (µmol m^{-2} s^{-1} phase^{-1}) as accumulated A by curve-smoothing during Phase II (from 72 to 128 DAT), A_{80} (µmol m^{-2} s^{-1} phase^{-1}) as accumulated A from 72 DAT to D_{onset}, and A_{dec} (µmol m^{-2} s^{-1} phase^{-1}) as accumulated A from D_{onset} to 128 DAT (Fig. 3a). We show the changes in correlation coefficients between $CGR_{Phase II}$ and A_{10} to A_{90} (accumulated A at > 10% to > 90% of A_{max}, Supplementary Fig. S7). $SPAD_{80}$ is the mean SPAD value from 72 DAT to D_{onset}, and $SPAD_{dec}$ is mean SPAD value from D_{onset} to 128 DAT.

Statistical differences were tested by Welch's two-sided *t*-test. Pearson's correlation coefficient was calculated, and the significance of relationships was tested by two-sided *t*-tests.

Data availability
All data and plant materials are available from the corresponding author on reasonable request.

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Author contributions

A.J.N. and S.A. designed the experiments. S.H., S.O., N.S., A.N., and K.T. performed the experiments. S.H., S.O., and S.A. wrote the manuscript. K.K., T.O., and A.J.N. contributed to finalization of the manuscript.

Competing interests

The authors declare no competing interests.

Additional information

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