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66 **Abstract** Low transpiration rates under fully irrigated conditions decrease plant water use  
67 at vegetative stage and then increase the water availability during grain filling and then  
68 the terminal drought tolerance in pearl millet. 113 recombinant inbred lines developed  
69 from a cross between H77/833-2 and PRLT2/89-33 (terminal drought sensitive × tolerant  
70 genotype) were evaluated to map transpiration rate (Tr, a proxy for canopy conductance),  
71 organs weight, leaf area and thickness and study their interactions. Transpiration rate was  
72 increased by two H77/833-2 and two PRLT2/89-33 alleles on linkage group (LG) 2,  
73 whose importance depended on the vapor pressure deficit. The two H77/833-2 and one  
74 PRLT2/89-33 alleles co-mapped to a previously identified major terminal drought

75 tolerance QTL, although in a much smaller genetic interval. The other Tr allele from  
76 H77/833-2 also enhanced biomass dry weight and co-located with a formerly identified  
77 stover and tillering QTL. Leaf characteristics were linked to two loci on LG7. Plant water  
78 use was increased and decreased by different loci combinations for Tr, tillering, and leaf  
79 characteristics, whose respective importance depended on the environmental conditions.  
80 Therefore, different alleles influence plant water use, have close interactions with one  
81 another and with the environment, so that different ideotypes for plant water use exist or  
82 could be designed, from specific allele combinations conferring particular physiological  
83 characteristics for specific adaptation to a range of terminal drought conditions.

84

85 **Key words** Transpiration rate (Tr) • Vapor pressure deficit (VPD) • Leaf development •  
86 drought • Genotype-by-environment interaction (G×E) • QTL interaction

87

## 88 **Introduction**

89 Recent decades have seen an increased research interest in crops' drought tolerance  
90 improvement. Pearl millet [*Pennisetum glaucum* (L.) R. Br.] is considered a drought  
91 tolerant crop *per se*, yet there exists considerable genotypic yield variation in drought  
92 stress environments (Bidinger and Hash 2004; Bidinger et al. 1987). Pearl millet is  
93 commonly grown on marginal lands of the semi-arid tropics where severe terminal  
94 droughts are the most yield destructive factors (Mahalakshmi et al. 1987).

95 The breeders' efforts to identify drought tolerant material and localize the genomic  
96 segments responsible for drought tolerance are generally based on yield performance in  
97 targeted environments, although  $G \times E$  interaction effects on yield frequently hamper  
98 these selection efforts (e.g. Banziger and Cooper 2001; Tuberosa et al. 2007).  $G \times E$   
99 interactions likely reflect the relative importance of certain plant mechanisms and/or their  
100 interactions to specific environments, which can lead to specific adaptation to drought  
101 conditions. Further progress in drought tolerance breeding then depends on the  
102 identification of tolerance mechanisms and on the understanding of interactions of these  
103 mechanisms among them and with the environment (Blum 1988; Ludlow and Muchow  
104 1990; Fussell et al. 1991). Several successful examples have been reviewed (Sinclair et  
105 al. 2004).

106 A major terminal drought tolerance quantitative trait locus (DT-QTL) was identified in  
107 two independent mapping populations on LG2 explaining up to 32% of pearl millet grain  
108 yield variability in severe terminal drought environments; i.e. such where crop growth  
109 depends almost entirely on moisture stored in the soil profile (Bidinger and Hash 2004;  
110 Yadav et al. 2002, 2004; Bidinger et al. 2007). A recent physiological dissection of  
111 mechanisms and traits underlying the DT-QTL has pointed to water conserving  
112 mechanisms being associated with the DT-QTL (Kholová et al. 2010a, b). This current  
113 hypothesis - that these traits, mostly expressed under non-stressed conditions (vegetative  
114 developmental stage), allow water saving in the soil profile throughout the season and  
115 make it available for the grain filling period - is in agreement with the fact that the DT-  
116 QTL confers better grain filling and seed setting (Serraj et al. 2005; Vadez et al. 2011).  
117 However, trait interaction with the environment is also critical (e.g. Tardieu et al. 2000;  
118 Raymond et al. 2003). Indeed, the lower transpiration rate of tolerant entries ( $T_r$ ; g water  
119 transpired  $\text{cm}^{-2}$  leaf area) (Kholová et al. 2010a) was also sensitive to the vapor pressure  
120 deficit (VPD) (Kholová et al. 2010b). Similar mechanisms have recently been  
121 characterized in sorghum (Gholipoor et al. 2010), groundnut (Devi et al. 2010), chickpea  
122 (Zaman-Allah et al. 2011). Therefore, not only a low transpiration rate is important for  
123 water saving in pearl millet, but also how this trait responds to the environment. So,  
124 mapping of these traits requires careful consideration of the environmental conditions in  
125 which they are assessed.

126 Although several pearl millet near-isogenic lines containing the DT-QTL (NIL-QTLs)  
127 had lower  $T_r$  (Kholová et al. 2010 a, b), not all NIL-QTL exhibited yield advantage under  
128 terminal drought conditions (Serraj et al. 2005), suggesting that recombination event(s) in  
129 that region might have "excluded" the beneficial fragments in some of the NIL-QTL.  
130 Studies in *A. thaliana* reported a genomic region responsible for drought avoidance co-  
131 mapping with a region contributing to a constitutively lowered  $T_r$  and simultaneously  
132 leading to an enhanced TE (Masle et al. 2005; McKay et al. 2008). Following these  
133 examples, our current hypothesis is that only critical portions of the large DT-QTL,  
134 linked to specific mechanisms, matter for the terminal drought tolerance of pearl millet  
135 and these needs to be accurately mapped to enhance the precision of marker assisted  
136 introgression. In addition,  $T_r$  is only one component of plant water use, which likely

137 interacts with other components of plant water use (tillering, leaf area, leaf thickness).  
138 Therefore we hypothesized that Tr would be the leading trait of the DT-QTL region, and  
139 that total plant water use could be finely regulated through interactions of genomic  
140 regions involved in plant water use, including Tr.

141 The overall objective of this study was to map QTL for Tr and their interactions with  
142 other traits related to plant water use. Specifically, this work intended to: i) Assess  
143 whether putative Tr QTLs co-map with the DT-QTL region, ii) Identify other genomic  
144 regions related to plant water use (tillering, biomass components, leaf characteristics), iii)  
145 Cross-compare the identified QTLs of Tr and growth related traits with previous mapping  
146 studies in pearl millet, and iv) Assess how individual or interactive loci determine total  
147 plant water use and deduce linkages between traits, based on the genomic regions  
148 involved and their interaction with the environment, to design specific ideotypes.

149

## 150 **Materials and methods**

### 151 Plant material

152 The recombinant inbred line (RIL) population used in this study was based on the cross  
153 between terminal drought tolerant inbred PRLT2/89-33 and terminal drought sensitive  
154 inbred H77/833-2 (Hash et al. 1999). These parental inbred lines cross was advanced to  
155 F6 generation recombinant inbred lines (RILs) through single seed descent method. DNA  
156 was isolated from F6 inbred lines for genotyping with SSR and DArT markers (Supriya  
157 et al. 2011). Phenotypic evaluation was assessed on test-cross hybrids of these inbred  
158 parental lines, developed by crossing the inbred lines to male sterile line tester 834A  
159 (Stegmeier et al. 1998). Use of testcross hybrids is desired mainly to restore heterotic  
160 vigor of inbred lines, because pearl millet is a highly cross-pollinated species and suffers  
161 severely from inbreeding depression (Jones et al. 1995).

162

### 163 Phenotyping and plants growing conditions

164 The RIL population of 113 testcross hybrids and two parental testcross genotypes were  
165 sown into 20-cm diameter plastic pots filled with 5kg of Alfisol. Each pot was sown with  
166 several seeds in 4 separate hills, thinned to one plant per hill one week after sowing and  
167 to two homogenous plants per pot at two weeks after sowing. Adequate fertility was

168 provided with 300mg diammonium phosphate  $\text{kg}^{-1}$  soil at sowing and 200 mg urea  $\text{kg}^{-1}$   
169 soil at 15 days after sowing (DAS). For logistical reasons, five experimental sets  
170 (replications) were sown sequentially on 24/11, 26/11, 28/11, 2/12 and 4/12/2009. The  
171 maximum/minimum temperature and relative humidity percentage at day/night averaged  
172 36/15°C and 35/94% during the growth period but fluctuated (Supplementary Table 1 and  
173 Figure 1). Each experimental set contained one pot of each RIL testcross genotype and  
174 three pots of each parental testcross genotype; plants were maintained well-watered  
175 during the entire duration of the experiment. Phenotyping was initiated at 18/12, 21/12,  
176 23/12, 28/12 and 31/12 for set 1-5, so that plants had similar age in all sets at the time of  
177 measurement, (25-27 days) and all were at vegetative stage, i.e. the stage well prior the  
178 terminal drought would naturally occur and when water saving mechanisms were shown  
179 to operate (see Kholová et al. 2011a, b, c). Prior to experimentation, pots were watered to  
180 field capacity. The soil was covered with a plastic sheet and a 3 cm layer of plastic beads  
181 to limit soil evaporation. In each experimental set, six check pots containing no plants but  
182 treated similarly were kept to assess the extent of soil evaporation.

183 Pots were weighed three times at 7:00 a.m., 10:30 a.m. and 2:30 p.m. The weighing  
184 took typically ten minutes and the pots were weighed following the same sequence, so  
185 that the time interval between pot weighing was the same for all pots. These timings were  
186 chosen to assess plant transpiration (T) during a period with low evaporative demand in  
187 the morning hours (average VPD 1.57 kPa) and during a period with high evaporative  
188 demand in the early afternoon hours (average VPD 3.53 kPa), following previous results  
189 in similar experiments (Kholová et al. 2010b). After the third weighing, plants were re-  
190 watered to pot capacity, left to drain overnight and the same procedure was repeated the  
191 following day using the same set of plants (except of the set 5, which was assessed only  
192 once). After the last weighing on the second day of observation in a given set, the plants  
193 were harvested and leaf area (LA) measured immediately (using LA meter, LI3000  
194 model, Li-Cor, Lincoln Nebraska, US) and later used for calculation of  $\text{Tr}$  ( $\text{g water cm}^{-2}$   
195  $\text{leaf area h}^{-1}$ ). Other parameters were also measured; root dry weight (RDW, measured in  
196 set 3-4-5), stem dry weight (StDW), leaf dry weight (LDW), shoot dry weight (ShDW;  
197 StDW + LDW), biomass dry weight (BDW = RDW+ShDW; measured in set 3-4-5),  
198 specific leaf weight (SLW=LDW/LA). The hourly temperature and humidity were

199 recorded in two spots of the experimental set to calculate the average VPD within the  
200 time interval of observation. Spacing between the pots was wide so that the leaf area  
201 index was below one, avoiding mutual leaf shading.

202

203 Genotyping and linkage map development

204 The linkage map consisting of 321 markers (258 DArT and 63 SSR) was used to identify  
205 the QTL. The details on genotyping and map construction are available in Supriya et al.  
206 (2011). The F6 generation of that population is characterized by increased homozygosity  
207 accompanied by increase in segregation distortion, which is common in pearl millet but  
208 also in other crops (see Supriya et al., 2011). In short, about 35% of the markers showed  
209 segregation distortion, with about 10/25% in favor of H77/833-2/ PRLT2/89-33. Most of  
210 the markers showing distortion in favor of PRLT2/89-33 were concentrated on LG1 and  
211 LG6. More details on the segregation distortion can be found in Supriya et al. (2011).  
212 While segregation distortion can cause an overestimation of the recombination frequency  
213 between markers, some argue that segregation distortion has little effect on marker order  
214 and map length (Hackett and Broadfoot, 2003). This phenomenon was not overly  
215 important in two of the linkage groups (LG2 and LG7) in which many of the QTLs  
216 reported here were identified. Therefore, while we are aware that segregation distortion  
217 could be an issue for QTL detection in many crops, we assumed that much of the  
218 conclusions that are drawn in this paper, in large part from information in LG2 and LG7,  
219 would remain valid, as previously argued (Semagn et al., 2006). The earlier Qi et al.  
220 (2004) consensus linkage map using SSR and RFLP information allowed us cross-  
221 comparison of our results to previous mapping studies (Yadav et al. 2002, 2003, 2004,  
222 Nepolean et al. 2006 and Bidinger et al. 2007).

223

224 Statistical analysis

225 Since some traits such as the transpiration rate (Tr) depended on VPD at the time of the  
226 experiment (Kholová et al. 2010b), and others like the leaf area could be influenced by  
227 VPD conditions during plant growth (Kholová et al. 2010c), the analysis was performed  
228 both on individual experimental sets and on the best unbiased linear predicted values  
229 (BLUPs; calculated using SAS, version 9.2) which were generated for every trait and

230 used in mapping analysis. The variation within and between sets was assessed by the set  
231 average, standard error (SD), minimum and maximum trait values. Differences between  
232 parental genotypes across experimental sets were further evaluated using block ANOVA  
233 design with blocks defining particular observations in time. Simple correlation were  
234 analyzed between the BLUPs for each trait (CoHort software, 6.204, Monterey).

235 The composite interval mapping approach (CIM) was used to detect QTLs using  
236 PLABQTL, where QTLs are initially identified by simple interval mapping (SIM) and  
237 then used as co-variants for CIM, with a F-to-enter value of 8. Additive model was  
238 engaged in detecting the QTL effect for any individual loci and additive  $\times$  additive model  
239 (A $\times$ A) was employed to detect interacting loci (Utz and Melchinger 1996). A threshold  
240 of 2.5 was used and 1000 bootstrap runs were performed using the same software.

241 The genotype matrix mapping (GMM, software, version 2.1) approach was used to  
242 assess putative interactions between loci (Isobe et al. 2007). In our case the number of  
243 interacting loci was limited to two and three because of the modest RIL population size.  
244 Nevertheless, the GMM approach uses a different method of QTL identification (GMM  
245 uses F-measures algorithm of QTL detection) than PLABQTL software does (CIM), and  
246 the single QTL estimation cannot be rigorously compared between these two methods.

247 Principal component analysis (PCA) was used to visualize the investigated traits'  
248 relations in multidimensional space using R software (version 2.11.1). PCA output was  
249 further used to map common genetic background (pleiotropy) of all three major  
250 components, where each major component clubbed together related traits (using  
251 PLABQTL). For this PCA analysis only the BLUP means were used. The broad sense  
252 heritability ( $h^2$ ) was calculated as  $h^2 = \sigma^2G / (\sigma^2G + \sigma^2E)$  with GenSTAT (version 12)

253

254

## 255 **Results**

256 Individual QTLs determining transpiration rate (Tr)

257 Tr at low VPD (morning hours) was about half than Tr at high VPD (noon hours) but, as  
258 expected, there was also variability between sets within particular VPD regime (details in  
259 Suppl. Table 1). The Tr of tolerant PRLT2/89-33 was among the lowest values of the Tr  
260 distribution (morning-noon Tr; 0.011-0.025 g cm<sup>-2</sup> h<sup>-1</sup>), and was 40-45% lower at low-

261 high VPD than sensitive H77/833-2 which tended to the opposite end of the Tr  
262 distribution (morning-noon Tr; 0.016-0.035 g cm<sup>-2</sup> h<sup>-1</sup>), with several transgressive  
263 segregants on both sides of the distribution (Suppl. Table 2). There was highly significant  
264 genotypic effect for Tr under both low and high VPD.

265 Three QTL for the transpiration rate mapped in the major DT-QTL interval on linkage  
266 group 2: (i) one QTL under low VPD conditions only, around 260 cM (between 258 and  
267 264 cM) and hereafter referred to LG2, 260 for simplicity, where '260' is used as a short  
268 name for the full confidence interval. As expected, the terminal drought sensitive  
269 H77/833-2 provided the allele for the LG2, 260 QTL for Tr under low VPD, which was  
270 responsible for up to 26% of the Tr variation; (ii) One QTL explaining up to 16% of Tr  
271 variation under low VPD, located at LG2, 322 cM, with a positive effect from H77/833-2  
272 (Suppl. Table 3, Fig. 1b). This QTL controlled Tr under both low and high VPD  
273 conditions, although the QTL accounted only for maximum of 13% of the phenotypic  
274 variations explained (PVE) in high VPD conditions. Interestingly, the VPD condition in  
275 which this QTL was identified under low VPD was relatively higher (2.19 kPa) compared  
276 to the average morning VPD of the other experimental sets. (iii) One QTL explaining up  
277 to 14% of Tr variation under low VPD only, located on LG2, 315, with a positive effect  
278 from PRLT2/89-33 (Suppl. Table 3, Fig. 1b). A fourth QTL for Tr, explaining up to 25%  
279 of the Tr variation, was found on LG2, 10, away from the major DT-QTL region, under  
280 low VPD conditions only, with a positive allele contributed by PRLT2/89-33 parent.  
281 Interestingly, the very same genome position was also found controlling biomass  
282 accumulation and its components (LG2, 10; see below). Additionally, few minor loci  
283 affecting Tr were located on LG3 and LG7 (Suppl. Table 3).

284 In sum, the transpiration rate (Tr, g water cm<sup>-2</sup> leaf area h<sup>-1</sup>) was strongly linked to  
285 several major QTL regions across the range of VPD conditions, in particular three  
286 different regions co-mapping with the DT-QTL, two of which with a positive allele from  
287 the sensitive parent and one of these specific to high VPD conditions, but also another  
288 region unreported before with positive loci being contributed by the PRLT2/89-33 allele,  
289 suggesting the complexity of the transpiration rate trait, but also its rather simple genetic  
290 determination (Suppl. Table 3, Fig. 1).

291

292 Individual QTL determining biomass and its components

293 Variation in biomass and components was found both across the RIL population and  
294 experimental sets (Suppl. Table 2). PRLT2/89-33 developed about 60% larger LA and  
295 thinner leaves at this early developmental stage than H77/833-2 (Suppl. Table 2), in  
296 agreement with earlier report (Kholová et al. 2010c).

297 Biomass accumulation was influenced by multiple genomic regions across LG1, LG2,  
298 LG4, LG6, LG7 (Suppl. Table 4, Fig. 1, Suppl. Fig. 2). A major QTL explaining up to  
299 22% variability in the BDW and its components (LDW, SDW, RDW, StDW and ShDW)  
300 was located on LG2, 10, with a positive effect from drought sensitive H77/833-2.  
301 Another QTL explaining more than 10% of the variation, was found on LG7, 110, with  
302 positive allele from terminal drought tolerant PRLT2/89-33. Several smaller QTLs were  
303 found on LG1, explaining usually less than 10% of the variability. Few other alleles were  
304 also identified on LG1, 54, LG4, 100 and LG6, 20-50.

305 Interestingly, the positive PRLT2/89-33 allele for biomass dry weight on LG7, 110 also  
306 explained 29% of the leaf area (LA) variations and 21% of the leaf dry weight (LDW)  
307 variations. Another locus on LG7, 75, explained up to 15% of the variation in the specific  
308 leaf weight (SLW) with positive allele from H77/833-2, and up to 12% LA variation with  
309 positive allele from PRLT2/89-33. So, this locus, distinct from LG7, 110, appeared to  
310 play a specific role on balancing leaf area and leaf thickening (high SLW indicating thick  
311 leaves). The above discussed positive PRLT2/89-33 allele on LG 2, 10 also explained up  
312 to 18% of the SLW variation (Suppl. Table 4; Fig.1). None of QTL interactions detected  
313 for biomass traits using the A×A model in PLABQTL software was further considered  
314 because these interactions couldn't explain higher portion of variation compared to single  
315 detected QTL.

316

317 Individual QTLs determining transpiration (T)

318 The RIL population segregated widely for transpiration related traits. Despite its 60%  
319 higher leaf area PRLT2/89-33 had only 25-20% higher transpiration than H77/833-2 at  
320 this developmental stage under low and high VPD (Suppl. Table 2), which was related to  
321 a 40-45% lower Tr at low-high VPD in PRLT2/89-33 than in H77/833-2.

322 A QTL explaining 9% and 5% of the T variation under high and low VPD was found on  
323 LG7, 110, with positive allele from PRLT2/89-33. Under low VPD conditions there was  
324 a significant positive effect of loci LG2, 260 (up to 10%) and LG2, 322 (up to 8%) on T,  
325 both from sensitive parent H77/833-2, co-located in loci controlling Tr. Under high VPD  
326 conditions, only the locus LG2, 10 explained up to 18% of the variation. Again, any  
327 detected A×A QTL interactions could not explain higher portion of variation than single  
328 detected QTL. In sum, the total amount of water transpired (T) in low and high VPD  
329 conditions were controlled by loci that were also linked to Tr and biomass components,  
330 and to a QTL on LG3, 25, explaining 13% of the variation, with positive allele from  
331 H77/833-2 (Suppl. Fig.2; Suppl. Table 3 and 4).

332

### 333 Analysis of trait relationships and mapping of PCA

334 A simple correlation analysis (Suppl. Table 5) and a principal components analysis (PCA,  
335 Fig 2 and Suppl. Table 6,) were performed to decipher the relationships between  
336 parameters. As expected, simple correlation analysis showed that the majority of  
337 investigated traits were inter-related. The purpose of the PCA was to group individual  
338 parameters in a more comprehensive manner. Three principal components (PC) explained  
339 86% of the variability. The PC1 (60%) had strong positive loading from all shoot  
340 biomass traits and transpiration (T), and relatively strong negative loading from Tr and  
341 SLW which agrees well with the strong negative correlations between these traits (Suppl.  
342 Table 5). The PC2 (20%) had strong negative loading from Tr, SLW, and somewhat T  
343 under low VPD. Finally, the PC3 (6%) had a strong negative loading for root dry weight  
344 (RDW) and a strong positive loading from the transpiration under low VPD (TM) (Suppl.  
345 Table 6). Interestingly, both analyses showed that Tr was significantly, though less  
346 strongly, related to traits corresponding to the biomass and/or absolute values of T under  
347 high VPD while the Tr-TM relationship was non-significant. Simultaneously, all biomass  
348 traits and T were positively related (Fig. 2, Suppl. Table 5).

349 To assess the pleiotropy of putative QTL regions the coordinate values of RIL lines on  
350 each of the three main principal vectors and of each PC clusters were used in a CIM  
351 analysis. A single QTL for PC2 on LG2, 322 (14%) was found, with a positive allele  
352 from tolerant parent PRLT2/89-33 (Suppl. Table 4). Considering the strongest loadings

353 of this PC2 were Tr and SLW, we interpret that both these traits are probably cross-  
354 regulated from this genome portion.

355

356 Interaction of QTLs affecting transpiration rate (Tr)

357 GMM analysis showed that the interaction of two and three loci could in many cases  
358 increase the PVE compared to single locus PVE (Table 1). Although the RIL population  
359 exhibited some level of segregation distortion preferring male alleles (Supriya et al.  
360 2011), a majority of the interaction estimates were supported by a reasonable number of  
361 RILs allowing reliable analysis (Table 1). The major loci found by GMM were identical  
362 to those found using CIM approach, although GMM output could not be rigorously  
363 compared to CIM results from PLABQTL. In the following text symbols A, B, H stand  
364 for alleles originated from sensitive parent (H77/833-2), tolerant parent (PRLT2/89-33)  
365 and their heterozygous alleles combination (AB) respectively. Only the strongest QTLs  
366 or QTL interactions are discussed.

367 The major loci for Tr identified through CIM (namely LG2, 260 and LG2, 315) had  
368 large interactions with other loci and consequently explained more variation than the sum  
369 of their single locus effects (Table 1). Tr under low VPD was increased by the  
370 combination of alleles on LG2, 315(B)-LG2, 261(A) (positive effect 26%) and/or from  
371 the LG7, 75 (A)-LG2, 216 (B)-LG1, 115(A) (positive effect 29%) (Fig.3a). Similarly, Tr  
372 under high VPD was increased by the interaction of LG7, 75 (A)-LG2, 315 (B)-LG2, 258  
373 (A) (positive effect 23%). Surprisingly, the allele on LG2, 322 (A), though identified as  
374 single strong QTL enhancing Tr in the CIM analysis, did not interact with other loci of  
375 similar effect on Tr (note: LG2, 315 (B) and LG2, 322 (A) appear to be two distinct  
376 antagonistic QTLs).

377

378 Interaction of QTLs affecting biomass and biomass components

379 Total biomass (BDW) was positively influenced by the single effect of LG2, 0 (A, 20%),  
380 a locus that was also identified in the CIM analysis. No allele combinations could explain  
381 a higher proportion of the variation than this single region on LG2, 0 (A) (Table 1).

382 Biomass increases were mostly explained by a higher leaf biomass (LDW), which was  
383 linked to a single locus on LG7, 113 (B, 11%) and in particular to the allele combination

384 of LG7, 107 (B)-LG5, 13 (B)-LG2, 0 (A) (17%). Leaf area was also strongly influenced  
385 by this LG7 region (around 110, B, 15%) but also by a different locus on LG7, 75 (A).  
386 The combination of alleles on LG7, 71 (A)-LG2, 205 (A) and on LG7, 107 (A)-LG2, 323  
387 (A)-LG2, 260 (A) decreased LA (-19%). By contrast, combination of alleles on LG7, 71  
388 (B)-LG7, 113 (B)-LG2, 0 (A), and on LG7, 71 (B)-LG2, 0 (A) increased LA, explaining  
389 21% and 22% of the variations. Finally, most of SLW variation was also dependent on  
390 three alleles combination on LG7, 75 (A)-LG1, 296 (A)-LG1, 115 (A) and LG7, 75 (A)-  
391 LG1, 296 (A)-LG1, 131 (A) explaining 17 and 19% of SLW variation. The remaining  
392 biomass part, root dry weight, was strongly influenced by the combinations of alleles on  
393 LG7, 81(B)-LG4, 18 (B)-LG2, 346 (A), explaining 36% of the RDW variation, where  
394 PVE estimates were based on 10 RILs carrying that marker combination (Table 1).

395

#### 396 Interaction of QTLs affecting transpiration (T)

397 The percentage variation in absolute transpiration (T) also increased with allele  
398 combinations, although many of these loci were not identified by the CIM algorithm  
399 (Suppl. Table 3 and Table 1). The most effective allele combination positively  
400 influencing T in low VPD conditions (TM) was: LG5, 10 (B)-LG2, 319 (A)-LG1, 75(B)  
401 (17%) (Fig. 3b). In contrast, T at high VPD regime (TA) was strongly and positively  
402 influenced by single effect of QTL on LG2, 0 (A, 13%), this loci being the same  
403 influencing biomass in the CIM analysis (Suppl. Table 3 and Table 1, Fig. 3c). Under  
404 high VPD also, the following combination of three alleles from loci on LG7, 122 (A)-  
405 LG5, 23 (A)-LG7, 173 (A) (17%) and LG4, 98 (A)-LG1, 194 (A)-LG1, 46 (B) (18%) had  
406 a negative effect on TA. In sum, a majority of strong alleles' combinations participating  
407 in T regulation combined "biomass" QTLs effect with the effects of loci playing a part in  
408 Tr regulation (Suppl. Tables 3 and 4, Fig.1).

409

#### 410 Heritability analysis

411 Broad sense heritability coefficient ( $h^2 = \sigma_G / (\sigma_G + \sigma_E)$ ) of Tr was high (0.84 and 0.80 in  
412 low and high VPD, respectively). The heritability of other investigated traits was; 0.70  
413 (TM), 0.74 (TA), 0.46 (StDW), 0.53 (ShDW), 0.27 (RDW), 0.45 (BDW), 0.50 (LDW),  
414 0.63 (LA), 0.44 (SLW).

415

416 **Discussion**

417 Several major loci were related to transpiration rate (a proxy for leaf conductance), leaf  
418 characteristics (area, thickness) and biomass. Transpiration rate (Tr) was linked to four  
419 major loci on LG2, 10; LG2, 260; LG2, 315 and LG2, 322, three of them co-mapping  
420 with a previously identified major terminal drought tolerance QTL interval on LG2. The  
421 relative importance of these regions for Tr determination was dependent on current vapor  
422 pressure deficit. The locations of these major QTLs were consistent with previous studies  
423 on similar plant material. The majority of QTLs identified by GMM were consistent with  
424 those detected by PLABQTL and showed that the combined action of some strong loci  
425 and/or loci of negligible individual effect (e.g. for biomass components) could explain a  
426 far higher portion of trait variation than single locus effects. The PCA clearly indicated  
427 that, depending on PC dimension, Tr and transpiration (T) vectors had either same or  
428 opposite direction. The genetic analysis then also pointed out that T depended mostly on  
429 loci interactions involving Tr-related loci and biomass-related loci. The heritability of the  
430 traits was high and the loci linked to them were usually very small, which opens the  
431 possibility to breed, for example by marker-assisted recurrent selection (MARS), lines  
432 having specific allele combinations leading to set levels of plant water use, towards  
433 adaptation to specific drought conditions.

434

435 Transpiration rate (Tr)

436 The major QTLs for the investigated traits were obtained consistently, though not always  
437 across experimental sets. Such situation was expected because both the environmental  
438 conditions in which the plants developed and in which Tr was assessed varied, and these  
439 have been reported to greatly affect water use traits, in particular leaf area and Tr  
440 (Kholova et al., 2011c). In this report, it was shown for instance that leaf area  
441 development of PRLT2/89-33 was decreased under high VPD conditions. In the case of  
442 Tr, QTL explaining large percentage of the Tr variation were found in the region on LG2  
443 previously identified as the major QTL determining drought tolerance (DT-QTL) in two  
444 populations (Yadav et al. 2002, 2004; Bidinger 2007). In this region, two major positive  
445 alleles from sensitive parent H77/833-2 (LG2, 260 and LG2, 322) spanned a genetic

446 interval of 6 and 8 cM which is much smaller than interval of the DT-QTL between  
447 markers *Xpsmp2237*, 193cM and *Xpsmp2059*, 328cM. This is in agreement with the  
448 lower Tr under fully-irrigated conditions of near-isogenic lines (NILs) introgressed with  
449 the DT-QTL (Kholová et al. 2010a, b). Yet, two other strong regions controlling Tr, both  
450 with positive alleles contributed by tolerant PRLT2/89-33 were identified on LG2 (LG2,  
451 10cM and LG2, 315). The LG2, 10 locus with allele from H77/833-2 also enhanced  
452 biomass probably through tillering, whereas the allele from PRLT2/89-33 at this locus  
453 might be related to leaf expansion and thickening processes. The LG2, 315 allele from  
454 PRLT2/89-33 was also an important region interacting with other Tr influencing loci.

455 Interestingly, all four QTL on LG2 affected Tr under low VPD, whereas only LG2, 322  
456 from sensitive H77/833-2 had a strong effect on Tr under high VPD. In view of our  
457 previous results showing a close involvement of the DT-QTL on a reduction of Tr under  
458 high VPD in lines introgressed with the DT-QTL but cultivated under low VPD  
459 conditions of the glasshouse (Kholova et al., 2011b), we could have expected to find  
460 more QTL for Tr under high VPD. Here, the plants were cultivated outdoors, under  
461 higher VPD conditions than the glasshouse. Our recent work also shows that the Tr  
462 differences between parental lines are smaller when the plants developed under high VPD  
463 conditions (Kholova et al., 2011c), and this is related to a lower leaf area development of  
464 PRLT2/89-33. Such results indicate the existence of different, but inter-linked,  
465 physiological mechanisms to regulate Tr, in which the environmental conditions play an  
466 important role (similarly in Kholová et al. 2011 c). From our data we interpret that two  
467 loci (LG2, 322 and, to a lesser extent LG2, 260) may increase Tr synergistically across  
468 wide VPD range while others may modulate this “Tr tuning” when environment changes.  
469 For example, there may be an antagonistic influence of the PRLT2/89-33 alleles on LG2,  
470 10 and LG2, 315 on Tr under low VPD that may neutralize the effects of LG2, 260 and  
471 LG2, 322. This observation is in complete agreement with Yadav et al. (2002) where the  
472 very same regions were described and suggested to counteract each other effect on grain  
473 yield and panicle harvest drought tolerance indexes depending on the onset of drought  
474 and its severity. Therefore, from the physiological point of view, the balance of several  
475 interacting mechanisms determine Tr, depending on the prevailing environmental  
476 conditions: (i) mechanisms determined by LG2, 260, LG2, 322 (H77/833-2 allele

477 increasing Tr); (ii) mechanisms related to leaf area and may be leaf thickening influenced  
478 by presence of PRLT2/89-33 positive allele on LG2, 315, their interaction with loci on  
479 LG7, 75 (allele influencing leaves thickening from H77/833-2) and LG2, 10 (PRLT2/89-  
480 33 allele influencing leaves mass, area, and thickening), This simple genetic  
481 determination of Tr, an important trait contributing to terminal drought tolerance of pearl  
482 millet, opens the possibility to recombine different sets of alleles towards desired Tr level  
483 for fitness under specific drought situations.

484

#### 485 Leaf characteristics

486 Leaf area and leaf thickness are other critical factors influencing plant's transpiration and  
487 one of the objectives of the study was to compare their genetic regulation to that of Tr.  
488 Leaf weight and leaf area were influenced by a major regions on LG7, 110 (positive  
489 allele from PRLT2/89-33) and a smaller region on LG2, 10 (positive allele from  
490 H77/833-2). The LA QTL on LG7 from PRLT2/89-33 agrees with our recent results of a  
491 higher leaf area in PRLT2/89-33 than in H77/833-2 under low VPD conditions (Kholová  
492 et al. 2010c). This QTL is also in line with a stover yield QTL found in the same genomic  
493 region on LG7 (Yadav et al. 2002; Bidinger et al. 2007). This "stover yield" QTL was  
494 found under low VPD only, which also agree with an enhanced leaf area development  
495 under low VPD in tolerant genotype (PRLT2/89-33; Kholová et al. 2010c). In synthesis,  
496 we suggest the action of the LG7, 110 regions may be specific to leaf expansion and is  
497 probably prevalent under low VPD conditions of growth.

498 In contrast, SLW, was positively influenced by the PRLT2/89-33 allele LG2, 10, the  
499 H77/833-2 alleles on LG2, 204 and LG7, 75, and few minor alleles on LG1. Therefore it  
500 appears that leaf thickening processes (proxied by SLW) might be mostly related to the  
501 H77/833-2 positive alleles on LG2, 204 and LG7, 75, which are also distinct from those  
502 affecting LA and LDW. This is in line with observations on *A. thaliana* showing  
503 independent genetic control of meristematic cell division and proliferation (Tsuge et al.  
504 1996; Tsukaya 2005). The allele from PRLT2/89-33 at the LG2, 10 loci increased SLW,  
505 whereas the H77/833-2 allele at that locus increased stem weight / tillering (as discussed  
506 further). We hypothesized this locus to pre-determine the carbon assimilates allocation  
507 towards leaves or stems. Similar principle was recently emphasized for sorghum where

508 the “tillering” *versus* “leafy” phenotype was discussed as result of internal plant  
509 competition for carbon sink (Kim et al. 2010a, b). The plants directing their carbon  
510 sources towards leaf mass were also hypothesized to be more capable of withstanding  
511 harsh drought conditions, however genotypes investing in tillering were hypothesized to  
512 succeed in environments where water is plentiful (Hammer et al. 1996; Kim et al. 2010  
513 a), which fits our case.

514 Interestingly, H77/833-2 allele LG7, 75 interacted closely with loci LG2, 260  
515 (H77/833-2)–LG2, 315 (PRLT2/89-33) and increased Tr under high VPD. Therefore it  
516 appears that the plant possessing thick leaves and both Tr enhancing mechanisms on  
517 LG2, 260 and 315 loci would have higher Tr values. This fact fits with the PCA showing  
518 Tr and SLW being closely related and mapping results of PC2 where a common QTL  
519 was found for both these traits combination (LG2, 320).

520

521 Biomass – total biomass, root, stem and shoot

522 The phenotypic expression of biomass and its components relied largely on the presence  
523 of one allele from H77/833-2 on LG2, 10 locus and one allele from PRLT2/89-33 on  
524 LG7, 110 (Suppl. Table 4). The presence of LG2, 10 alleles from H77/833-2 explained  
525 also 12% of root biomass variation and 19% of stem weight variation. These results agree  
526 with previous reports (Bidinger 2004, 2007; Yadav 2002, 2003, 2004). A region close to  
527 LG2, 10 was previously identified to contribute to increased biomass and stover yield  
528 under optimal conditions (Yadav et al. 2002). This positive H77/833-2 allele was also  
529 responsible for an increased number of panicles, likely related to the higher tillering habit  
530 of this genotype (Yadav et al. 2002). This region on LG2 also increased tillering in other  
531 work (Poncet et al. 2002; Nepolean 2002). The GMM analysis of biomass and its  
532 components confirmed these results by showing a single locus on LG2, 0 increasing total  
533 biomass and stem dry weight, whereas no combination of effect explained a notably  
534 larger percentage of the variation for these traits.

535

536 Absolute transpiration (T)

537 Water saving mechanisms under non-stress conditions are hypothesized to keep water in  
538 the soil profile to sustain grain filling and are therefore critical for the terminal drought

539 tolerance of crops (Vadez et al. 2011). Therefore, the ultimate purpose of this study was  
540 to dissect the genetic regulation of absolute transpiration. The GMM approach  
541 strengthened the idea (Isobe et al. 2007; Ravi et al. 2010) that synergistic action of  
542 several QTLs loci can add up effects on complex quantitative traits, like T here.  
543 However, these previous studies limited themselves to listing the possible effects of  
544 multiple loci interaction and highlighting the need for consideration of these interactions  
545 when employing markers in breeding programs, but did not explain the important  
546 physiological implications of specific trait combinations for adapting to variable drought  
547 scenario.

548 CIM showed that water used (T) depended on several loci – in most cases similar to  
549 those determining Tr (Suppl. Table 3, Fig 1), biomass accumulation and its partitioning  
550 (LG2, 10, LG7, 110), and also on independent QTL on LG3 (LG3, 28cM). However,  
551 none of these loci had large individual effect on T, except LG2, 10. The outcome of the  
552 GMM analysis validated the hypothesis that larger proportion of the variation in plant's  
553 transpiration could be explained by loci interaction (Fig. 3 band c). Interestingly, under  
554 low VPD, all interactions involved loci related to Tr with contribution from the sensitive  
555 H77/833-2 allele, and all interactions increased plant transpiration. By contrast, under  
556 high VPD conditions, none of the interaction involved Tr loci but rather leaf and tillering  
557 characteristics loci, with both tolerant and sensitive allele being involved in positive and  
558 negative interaction effects on T. Plant's transpiration could be tuned up by alleles  
559 enhancing biomass accumulation (LG2, 10 and possibly few minor QTLs on LG1, LG4,  
560 LG5, and LG6) and tuned up or down by mechanisms decreasing Tr, depending on allele  
561 presence (LG2, 260; LG2, 315), themselves closely interacting with LA- and SLW-  
562 related loci on LG7. For instance, ideotypes with thicker leaves lower LA and high  
563 biomass (high tillering) had higher transpiration. This knowledge considerably deepens  
564 the understanding of G×E interactions and opens the possibility to design plant ideotypes  
565 with desired levels of transpiration, then suited for specific target environment. For  
566 example, in environments where water is intermittently available through the season, the  
567 focus would likely be on ideotypes capable of maximizing water uptake. In environments  
568 where incoming rainfall is limited and water supply restricted to soil moisture (terminal  
569 drought situation), the focus would be on ideotypes capable of using water slowly and

570 leaving some for the grain filling period (e.g. low T). This latter ideotype would consist  
571 of genotypes having alleles responsible for low tillering phenotype, higher LA and thin  
572 leaves (lower SLW). Similar concept was previously presented for sorghum using  
573 simulation modeling (Hammer et al. 1996; Hammer et al. 2006; Kim et al. 2010 a, b).

574

### 575 **Conclusion**

576 Four QTLs for Tr were found, two from H77/833-2 (sensitive genotype) and two  
577 PRLT2/89-33 (tolerant genotype) alleles on chromosome (LG) 2, the importance of each  
578 region being dependent on the environmental conditions at the time of measurement.  
579 Three of these Tr QTLs mapped to a region previously identified as the major terminal  
580 drought tolerance QTL on LG2, explained large variation of the Tr phenotypic variance,  
581 and spanned small genome portions. Two QTL were specific to low VPD conditions.  
582 Absolute transpiration was closely linked to interaction of Tr loci from sensitive  
583 H77/833-2, with plant biomass and leaf characteristics (from LG7) under low VPD  
584 whereas transpiration under high VPD conditions resulted from interaction of loci for  
585 biomass and leaf characteristics. This study revealed the genetic basis of different traits  
586 influencing plant water use under non-stressed conditions, their genetic basis, their  
587 interactions with the environment (G×E), and opens the possibility to engineer successful  
588 ideotypes with set level of water use from specific combinations of alleles for location  
589 specific requirements.

590

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594

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**Table 1** Genotype matrix mapping (GMM) mapping analysis of BLUP means of investigated traits; i.e. leaf dry weight (LDW), root dry weight (RDW), shoot dry weight (ShDW), stem dry weight (StDW), biomass dry weight (BDW), leaf area (LA) specific leaf weight (SLW). Transpiration rate (Tr) and absolute transpiration (T) are presented with suffix M which stands for measurements under low VPD (morning) and with suffix A representing measurements under high VPD (noon hours). F represents the significance level for particular QTL or QTL combination. Following column shows the number of lines carrying this particular marker combination in the RIL population. In the column locus (allele) is presented the QTL peak marker along with the origin of alleles; A, B, H stands for alleles originated from H77 (sensitive), PRLT (tolerant) and H means heterozygous locus (A and B present in genome). For any particular QTL or their combination, the percentage of variation explained (PVE) is shown (positive value signify the QTL combination increases the trait value and *vice versa*). Table shows exact QTL peak marker position with regards to linkage group (LG) and the interval identified by CIM to which this marker probably belongs

Trait name	No. of lines	F	Number of QTLs	Locus(allele)	PVE	Peak QTL position (LG, cM)	Probable CIM QTL corresponding interval (LG, interval)
TrM	17	10.46	1	P13113(A)	<b>11.38</b>	6, 32	6, 40
	42	12.55	1	P12608(A)	<b>9.98</b>	4, 97	4, 100
	69	15.63	1	P8443(A)	<b>11.17</b>	2, 322	2, 322
	63	16.68	1	P8464(A)	<b>13.19</b>	2, 258	2, 260
	67	14.24	1	P6013(A)	<b>11.20</b>	2, 204	2, 205
	19	12.20	1	P8984(B)	<b>11.62</b>	2, 0	2, 10
	40	14.08	1	P10103(A)	<b>10.82</b>	1, 115	X
	10	<b>41.76</b>	<b>2</b>	<b>P11469(B) P8139(A)</b>	<b>24.60</b>	<b>2, 315-2, 261</b>	<b>2, 315 – 2, 260</b>
	10	<b>64.81</b>	<b>3</b>	<b>P9089(A) P9529(B) P10103(A)</b>	<b>29.27</b>	<b>7, 75-2, 216-1, 115</b>	<b>7, 75 –X-X</b>
	TrA	35	7.86	1	P7046(A)	<b>6.30</b>	7, 71
43		7.62	1	P10653(A)	<b>5.58</b>	1, 138	1, 130
40		8.07	1	P10103(A)	<b>6.26</b>	1, 115	X
10		26.15	2	P11469(B) P8139(A)	<b>15.50</b>	2, 315-2, 261	2, 315-2, 260
7		<b>50.85</b>	<b>3</b>	<b>P9089(A) P11469(B) P8464(A)</b>	<b>22.85</b>	<b>7, 75-2, 315- 2, 258</b>	<b>7, 75-2, 315-2, 260</b>
TM	56	13.84	1	Xipes0154(B)	<b>7.33</b>	7, 113	7, 110
	58	13.07	1	P9391(B)	<b>7.76</b>	7, 87	7, 75
	16	24.56	2	P7046(A) P12228(A)	<b>-12.44</b>	7, 71-5, 17	7, 75-X
	18	32.38	3	P9391(B) Xctm21(A) P9306(A)	<b>13.15</b>	7, 87-2, 319-2, 308	7,75-2, 322-2,315
	7	33.25	3	Xipes0105(B) Xctm21(A) P10902(A)	<b>15.47</b>	2, 26-2, 319-2, 156	X-2,322-X
	12	32.97	3	Xipes0015(B) P6931(B) Xctm21(A)	<b>15.34</b>	7, 21-6, 37-2, 319	X-6,40-2,322
	12	32.70	3	P11397(B) P7861(B) P12641(A)	<b>15.04</b>	6, 88-2, 356-2, 240	X-X-2, 260
	13	33.41	3	P11628(B) Xctm21(A) P12077(B)	<b>15.31</b>	5, 42-2, 319-1, 75	X-2,322-1,80
	9	<b>32.68</b>	<b>3</b>	<b>P13090(B) Xctm21(A) P12077(B)</b>	<b>16.99</b>	<b>5, 10-2, 319-1, 75</b>	<b>X-2,322-1,80</b>
	TA	74	<b>19.91</b>	<b>1</b>	<b>P8984(A)</b>	<b>13.49</b>	<b>2,0</b>
21		28.86	2	P12604(A) P11369(A)	<b>-12.24</b>	7, 122-1, 173	7, 110-1, 200
29		26.17	2	P11960(B) P8182(B)	<b>12.12</b>	7, 107-1, 72	7, 110 – 1,80
12		<b>36.11</b>	<b>3</b>	<b>P12604(A) P11502(A) P11369(A)</b>	<b>-16.63</b>	<b>7, 122-5, 23-7, 173</b>	<b>7,110-X-1, 200</b>
21		35.13	3	P9391(B) P13090(B) P11990(B)	<b>13.35</b>	7, 87-5, 10-1, 77	7,75-X-1,80
23		35.60	3	P9391(B) P8984(A) P10013(B)	<b>14.48</b>	7, 87-2, 0-1, 161	7,75-2, 10-X
22		33.99	3	Xipes0145(B) P8984(A) P11369(B)	<b>14.51</b>	7, 113-2, 0-7, 173	7, 110-2, 10-1, 200
10		<b>34.97</b>	<b>3</b>	<b>P12608(A) P7542(A) P11403(B)</b>	<b>-17.86</b>	<b>4, 98-1, 194-1, 46</b>	<b>4, 100-1, 200-1, 52</b>
47		29.29	1	P11960(B)	<b>15.01</b>	7, 107	7, 110
20		<b>49.44</b>	<b>2</b>	<b>P6612(A) P6013(A)</b>	<b>-19.45</b>	<b>7, 71-2, 205</b>	<b>7, 75-2, 205</b>
LA	36	52.28	2	P7046(B) P8984(A)	<b>21.77</b>	7, 71-2, 0	7, 75-2, 10
	27	<b>53.35</b>	<b>3</b>	<b>Xipes0154(B) P7046(B) P8984(A)</b>	<b>21.05</b>	<b>7, 113-7-71-2,0</b>	<b>7, 110-7, 75-2, 10</b>
	22	54.38	3	P11960(A) P6665(A) P11702(A)	<b>-18.85</b>	7, 107-2, 323-2, 264	7, 110-2, 322-2, 260
	56	26.62	1	Xipes0154(B)	<b>10.78</b>	7, 113	7, 110
LDW	41	43.81	2	Xipes0154(B) P8984(A)	<b>14.14</b>	7, 113-2,0	7, 110-2, 10
	22	<b>51.81</b>	<b>3</b>	<b>P11960(B) P12052(B) P8984(A)</b>	<b>17.16</b>	<b>7, 107-5,13-2,0</b>	<b>7, 110-X-2, 10</b>
	67	15.91	1	P6013(A)	<b>7.13</b>	2, 205	2, 205
SLW	18	35.34	2	P9089(A) P9529(B)	<b>11.51</b>	7, 75-1,216	7, 75-X
	19	35.77	2	P9089(A) Xicmp4010(B)	<b>11.20</b>	7, 75-1,216	7, 75-1, 200

	9	55.23	3	P9089(A) P8244(A) P10103(A)	17.05	7, 75-1,296-1,115	7, 75-X-1,100
	7	55.87	3	P9089(A) P11894(A) P10103(A)	19.05	7, 75-1,296-1,131	7, 75-X-X
RDW	74	14.25	1	P8984(A)	22.20	2,0	2, 10
	22	19.59	2	Xpsmp2203(B) P10184(B)	22.36	7, 113-4,0	7, 110-X
	3	19.93	2	P6932(B) Xipes0101(H)	53.65	5,3-1,108	X-1,80
	11	20.21	2	P10768(A) P8984(B)	-24.26	4,106-2,0	4, 100-2, 10
	23	20.33	2	P7958(B) P7330(A)	24.02	4, 96-2, 336	4, 100-2,322
	27	19.49	2	P7958(B) P8694(A)	22.52	4, 96-2, 20	4, 100-2, 10
	10	38.16	3	P9936(B) P11711(B) Xipes0218(A)	36.37	7, 81-4,18-2, 346	7, 75-X-X
BDW	74	26.16	1	P8984(A)	20.25	2,0	2, 10
	50	35.22	2	P9721(B) P8984(A)	17.67	7,67-2,0	7, 75-2, 10
	16	40.68	3	Xpsmp2203(B) P8694(A) Xctm12(B)	22.75	7, 113-2, 332-1,202	7, 110-2, 322-1, 200
	36	43.07	3	P9721(B) P7494(B) P8984(A)	18.97	7,67-5,13-2,0	7, 75-X-2, 10
	19	41.46	3	P8694(A) P10594(A) Xctm12(B)	20.54	2, 332-2,14-1,202	2, 322-2, 10-1, 200
LDW	56	26.62	1	Xipes0154(B)	10.78	7, 113	7, 110
	41	43.81	2	Xipes0154(B) P8984(A)	14.14	7, 113-2, 0	7, 110
	22	51.81	3	P11960(B) P12052(B) P8984(A)	17.16	7, 107-5, 13-2,0	7, 110-X-2, 10
StDW	74	24.83	1	P8984(A)	20.95	2,0	2, 10
	21	31.08	2	Xipes0154(A) P9529(B)	-17.61	7, 113-1, 216	7, 110-X
	20	31.72	2	P6478(A) P7387(A)	-17.51	4, 98-1,183	4, 100-1, 200
	27	33.29	2	P10110(A) P8268(B)	-16.66	4, 95-2, 249	4, 100-2,260
	15	31.08	2	P10110(A) P8984(B)	-20.74	4, 95-2, 0	4, 100-2,10
	31	30.94	2	P6665(A) P8268(B)	-15.51	4, 95-2, 323	4, 100-2, 322
	21	55.58	3	P12608(A) P6665(A) P8268(B)	-21.85	4, 98-2, 323-2, 249	4, 100-2,322-2,260
ShDW	56	24.56	1	Xipes0154(B)	10.90	7, 113	7, 110
	74	24.68	1	P8984(A)	15.78	2,0	2, 10
	41	45.25	2	Xipes0154(B) P8984(A)	15.15	7, 113-2, 0	7, 110-2, 10
	22	55.19	3	P11960(B) P12052(B) P8984(A)	18.30	7, 107-5, 13-2,0	7, 110-X-2, 10

## Figure captions

**Fig. 1** Visualization of approximate QTLs positions within the linkage groups of major importance (LG; chromosomes 1, 2, and 7, letter a to c) consisting of SSR and DArT markers and their positions in cM. QTLs were detected for all investigated traits, i.e. leaf dry weight (LDW), root dry weight (RDW), shoot dry weight (ShDW), stem dry weight (StDW), biomass dry weight (BDW), leaf area (LA) specific leaf weight (SLW) and principal components (PCA 1, 2, 3). Transpiration rate (Tr) and absolute transpiration (T) are presented with suffix M which stands for measurements under low VPD (morning hours) and with suffix A representing measurements under high VPD (noon hours). QTLs are shown for particular replications (suffix of trait name indicates day of measurement in December 2009) and for replication based BLUP means (indicated as BLUP suffix of the trait). The content of the brackets behind the trait name stands for the 95% confidence interval of particular QTL. Red or blue colored font indicates that the positive effect comes from PRLT (tolerant) or H77 (sensitive) allele. Approximate positions of QTLs previously detected are also visualized on the sides of the chromosomes

**Fig. 2** Graphical output of principal component analysis (PCA). In the bi-plot the values of traits vectors are presented in red arrows (i.e. transpiration rate (Tr), absolute transpiration (T), leaf dry weight (LDW), root dry weight (RDW), shoot dry weight (ShDW), stem dry weight (StDW), biomass dry weight (BDW), leaf area (LA) specific leaf weight (SLW); Traits with suffix M were measured during 7:30-10:30 a.m. and traits with suffix A were measured during 10:30 a.m.-2:30 p.m)) based on two major principal components (PC1-x axis; PC2 – y axis). The numbers represents recombinant inbred lines numbers (RIL numbers) and its position shows the particular RIL traits loadings with regards to PC1 and PC2

**Fig. 3** QTL interactions from the GMM analysis for the transpiration rate in the morning under low VPD conditions (TrM) and in the afternoon under high VPD conditions (TrA) (a), for the transpiration in the morning (TM) (b), and for the transpiration in the afternoon (TA) (c)