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14	Genomic regions conferring resistance to multiple fungal pathogens in
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31 Abstract

32 Fungal diseases are among the most devastating biotic stresses and often cause significant losses in wheat production worldwide. A set of 173 synthetic hexaploid wheat (SHW) characterized for resistance against 33 34 fungal pathogens that cause leaf, stem and yellow rusts, yellow leaf spot, Septoria nodorum and crown rot were used in genome wide association study (GWAS), using DArT and DArTSeq markers and detected 35 36 quantitative trait loci (OTL) associated with disease resistance. Seventy four markers associated with 35 QTL were found to be significantly linked with disease resistances using a unified mixed model ($P=10^{-3}$ 37 to 10⁻⁵) of which 15 QTL originated from D genome. Six markers on 1BL, 3BS, 4BL, 6B and 6D 38 39 conferred resistance to two diseases representing 10 of the 35 QTL. A further SHW set of 147 SHWs genotyped with DArT only validated 11 QTL detected in the previous 173 SHWs. We also confirmed the 40 presence of the gene Lr46/Yr29/Sr58 in our germplasm. In addition, gene-gene interactions between 41 42 significantly associated loci and all loci across the genome revealed five significant interactions at 43 FDR<0.05. Two significant leaf rust and one stem rust interactions were thought to be synergistic while 44 another two QTL for yellow leaf spot involved antagonistic relations. To the best of our knowledge, this is the first GWAS for six fungal diseases using SHW. Identification of markers associated with disease 45 resistance to one or more diseases represents an important source for pyramiding favorable alleles and 46 47 introducing multiple disease resistance from SHW accessions into current elite wheat cultivars.

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Keywords: Linkage disequilibrium; multiple disease resistance; Synthetic hexaploid wheat;
Genome-wide association study; Gene-gene interaction; genotyping by sequencing

52 Introduction

53 Wheat is the world's third most important food crop that feeds 4.5 billion people in 95 developing countries (Braun et al. 2010). Although maintaining yield in wheat is determined by 54 genetic potential, adequate control of biotic and abiotic stresses coupled with good management 55 56 practices determine the actual vield achieved annually. Biotic stresses often cause significant challenges to increasing productivity, and have major implications for food security in many 57 regions where wheat is the chief staple, particularly in developing countries where the costs of 58 59 inputs are high. For example, the acquired virulence to the stem rust resistance gene Sr31, by the pathotype lineage designated as Ug99, and recent yellow rust epidemics, caused significant yield 60 losses for wheat production in Ethiopia, Morocco, and Syria in 2010 (Solh et al. 2012). In the 61 U.S., the estimate of cumulative disease losses for the 2011 wheat crop was 6.2% (Appel et al. 62 2011). Around 250 million dollars are spent each year in controlling foliar pathogens in Australia 63 and the degree of protection afforded by fungicides matches that provided by genetic resistance 64 (Oliver et al. 2011). Currently, identification and incorporation of resistance genes into 65 commercially grown cultivars is the most cost-effective and environmentally safe means of 66 67 controlling wheat diseases. In general, there are two kinds of resistance: qualitative or vertical and quantitative or horizontal resistance. Qualitative resistance is controlled by major genes 68 which are race-specific, often not durable, and effective in seedling and adult plants. In contrast, 69 70 quantitative resistance is controlled by minor genes that provide partial resistance and is predominantly effective in adult plants (Lagudah 2011). 71

In environments where plants are infected with multiple pathogens, multiple disease resistance (MDR) can contribute to maintaining wheat yield potential (Wissera et al. 2011). Evidence for multigenic resistance against wheat diseases goes back to the late nineteenth century, when Farrer (1898) observed transgressive segregation of resistance against rusts.
Although genes known to contribute to MDR in wheat are limited, durable genes which confer
resistance to multiple fungal pathogens in wheat have been reported (Moore et al. 2015,
Ogbonnaya 2011; Zwart et al. 2010; Lagudah et al. 2009, Spielmeyer et al. 2008; Ogbonnaya et
al. 2008; Crossa et al. 2007).

The SHW have been reported to be a repository of novel genetic diversity for wheat 80 improvement (Ogbonnaya 2011; Ogbonnaya et al. 2013). The SHW are a product of 81 hybridization from their two progenitor species, the tetraploid, Triticum turgidum (AABB) and 82 the diploid wild relative Aegilops tauschii (DD), and its synthesis is analogous to the final 83 hybridization event that is postulated to have occurred in the evolution of common bread wheat 84 85 from its progenitors (van Ginker and Ogbannaya 2007). Genetic diversity for resistance has been identified in SHW to a wide range of biotic stresses, including Hessian fly (Hatchett et al. 1981), 86 87 cereal-cyst nematode (Eastwood et al. 1991), root-lesion nematode (Thompson 2008), Septoria nodorum blotch (Loughman et al. 2001), Septoria tritici, karnal bunt (Villareal et al. 1994), 88 powdery mildew (Lutz et al. 1994), leaf rust (Assefa et al. 2000), stripe rust (Ma et al. 1995), 89 stem rust (Marais et al. 1994), yellow leaf spot (Siedler et al. 1994; Tadesse et al. 2006), leaf 90 blight (Mujeeb-Kazi et al. 2001a) and Fusarium head blight (Mujeeb-Kazi et al. 2001b). 91 Recently, SHW were reported to possess resistance to multiple diseases (Ogbonnaya 2011; 92 Zwart et al. 2010; Thompson 2008; Friesen and Faris 2004; Ogbonnaya et al. 2008; Xu et al. 93 2004). Further evidence for MDR genes existence in plants includes the detection of clusters of 94 95 quantitative trait loci for different diseases and the identification of induced gene mutations that affect plant responses to infection with different pathogens (Wissera et al. 2011; and the 96 references cited therein; Krattinger et al. 2009; Moore et al. 2015). 97

98 Identification of the genes that confer resistance to multiple diseases in wheat will facilitate and provide insight into the mechanisms that control MDR and allow for more effective deployment 99 of resistance genes in the development of wheat varieties with durable resistance to multiple 100 101 pathogens. Genome-wide association studies (GWAS), which relies on linkage disequilibrium (LD) between a genetic marker and a locus affecting a trait, were used to identify significant 102 marker trait correlations in animal and plant genetics (Shirasu and Schulze-Lefert 2003; 103 Neumann et al. 2011). In this approach, a collection of diverse accessions are phenotyped and 104 genotyped to examine marker-trait association (Shirasu and Schulze-Lefert 2003; Flint-Garcia et 105 106 al. 2003). Association mapping (AM) was first successfully used to identify alleles at loci 107 contributing to susceptibility to human diseases (Goldstein et al. 2003). The AM is now being used in an increasing number of studies in wheat to complement previous bi-parental QTL 108 109 studies (Breseghello and Sorrells 2006; Mulki et al. 2013; Joukhadar et al. 2013; Tadesse et al. 2014, 2015; Jighly et al. 2015b). Association mapping studies in combination with MDR gene 110 interaction will provide a better understanding of disease resistance (Yu and Buckler 2006). 111

In this study, we aimed to (1) identify genomic regions containing MDR loci in SHW for 112 resistances to six fungal pathogens: Puccinia triticina or leaf rust (Lr), Puccinia graminis f. sp. 113 tritici or stem rust (Sr), Puccinia striiformis f. sp. tritici or yellow rust (Yr), Pyrenophora tritici-114 repentis or yellow leaf spots (YLS), Parastagonospora (synonym: Septoria, Stagonospora, 115 Phaeosphaeria) nodorum nodorum glume and leaf blotch (SNG-SNL), and Fusarium 116 pseudograminearum or crown rot (Cr) and (2) investigate the interaction between the different 117 118 loci on disease expression to facilitate pyramiding of allele combinations across wheat genome with best performance. 119

120 Materials and Methods

121 Plant material and disease phenotyping

122 The SHW consisted of 320 lines from CIMMYT and Australia as part of the GRDC funded synthetic wheat evaluation project (Table S1). Full details of the germplasm has been described 123 124 in Mulki et al. (2013). Details of one season phenotyping for the six diseases that included 125 standard Australian checks has also been previously described by Ogbonnaya et al. (2008). Briefly, rusts were evaluated for adult resistance in three replications under field conditions 126 against the most commercially important pathotypes; Puccinia graminis f. sp. tritici (Pgt), 98-127 1,2,3,5,6 (University of Sydney Plant Breeding Institute accession number 781219); Puccinia 128 triticina (Pt), 104–1,2,3,(6), (7), 11, 13 (accession number 200347) and 76–1,3,5,10,12 129 130 (accession number 990423); and *Puccinia striiformis* f. sp. tritici (Pst), 134 E16A+ (021510). YLS was screened in four replications under controlled greenhouse conditions against three 131 isolates of Pyrenophora tritici repentis (isolate identification number 03-0148, 03-0152, 03-132 133 0053) and the Septoria tritici pathotype 79.2.1A; while Septoria nodorum damage was evaluated on both the glume (SNG) and the leaf (SNL) in three replications against the isolates WAC 4302, 134 WAC 4305, WAC 4306, and WAC 4309. All the disease reactions were scored using a scale 135 from 1 to 9 and were classified as susceptible "S" (1-2), moderately susceptible "MS" (3-4), 136 moderately resistant "MR" (5-6) and resistant "R" (7-9). Heritability of the studied traits were 137 inferred from the mixed model (Zhang et al. 2010). 138

139 <u>Genotyping</u>

The whole set (320 SHW) was genotyped with DArT markers; genomic DNA was extracted from two week old seedlings using pooled leaf samples from five individual plants, frozen in liquid nitrogen and stored at -80°C before DNA extraction. DNA extraction was carried out

143 according to Ogbonnaya et al. (2001), after which 10 µl of a 100 ng µl-1 DNA of each sample 144 was sent to Triticarte Pty. Ltd. Australia (http://www.triticarte.com.au) as a commercial service provider for whole genome scan using Diversity Arrays Technology (DArT) markers (White et 145 146 al. 2008). A subset of only 173 SHW were genotyped with DArTseq, a genotyping by sequencing (GBS) approach. The full description of the DArTseq procedure was previously 147 148 given in (Sehgal et al. 2015). Only markers with minor allele frequency (MAF) >5% and missing data <20% were selected for further analyses. The 173 SHW subset was used for the main 149 association test while the remaining 147 SHW cross validation set genotyped with only DArT 150 151 markers was used as to confirm the presence of some of the detected QTL as they are related to the main set. 152

153 <u>Statistical analysis</u>

The genotype by trait analysis was used to establish a level of variability among the wheat 154 genotypes in response to different disease resistances in order to visualize the merit of genotypes 155 156 as well as interrelationships among traits. The methodology is similar to that used for multienvironment trait genotype \times environment interaction (GGE biplot) by including the genotypes 157 as entries and the diseases as testers. The GGE biplot model decomposes genotype effect (G) 158 plus genotype x environment (GE) effects though singular value decomposition into a number of 159 160 principal components. Thus, it removes the environment noise (Yan 2001). Although this analysis is originally designed for GGE analysis, it can be applicable to any two-way data that 161 has the entry-by-tester structure. However, when using it to visualize genotype-by-trait data, the 162 trait units should be removed through standardization before applying biplot analyses (Yan and 163 164 Kang 2002). Such analysis is applicable to our data without any prior adjustments as all our disease scores were scaled from 1 (susceptible) to 9 (resistant). However, since we are 165

166 comparing greenhouse and field experiments (heterogeneous testers), the model was scaled with
167 the within trait standard error as recommended by (Yan and Kang 2002). Only SHWs with no
168 missing phenotypes were included in this analysis.

Phylogenetic tree was drawn using neighbor joining algorithm implemented in DARwin software (Perrier 2006) using DArT markers for both the main and the validation sets. The R software (www.r-project.org) was used to plot the principal component analysis (PCA) using the DArT markers only while the kinship relations were plotted using the R package "heatmap" using DArT markers only.

The determination of linkage disequilibrium (LD) was described by measuring the R^2 values between markers as described by Hedrick (1987) and Weir (1996). LD statistics were calculated for each pair of markers per chromosome and across all chromosomes within each genome. The R^2 values were plotted against the genetic distance (cM) for each pair of markers within each chromosome and the second LOESS decay curves were fitted using the square root transformation (Breseghello and Sorrells 2006).

Genome association and prediction integrated tool (GAPIT) (Lipka et al. 2012) was used to perform association mapping analysis using the mixed linear model (MLM) that took into account population structure (Q) and kinship matrix (K) to control both Type-I error (Pritchard et al. 2000). The following equation was fitted in the model:

184
$$y = X\beta + Q\alpha + Z\mu + \varepsilon$$

185 Where y is the vector of phenotypes; X is a vector for the marker record relating individuals to 186 the fixed marker effects β , which we are estimating; Q is fixed effect matrix (PCA) relating individuals to the fixed effect regarding population structure vector α ; *Z* is the incidence matrix relating individuals to the random effect μ ; and ε is a vector for the random residuals.

189 Marker alleles with P values ≤ 0.001 were declared to be significantly associated with a single 190 fungal disease resistance for the six diseases studied.

The map positions of DArTSeq markers were obtained from a consensus map of 64K markers provided by DArT Pvt. Ltd., Australia. The databases <u>http://cmap.cimmyt.org/cgi-bin/cmap</u>; <u>https://ccg.murdoch.edu.au/cmap/</u> as well as the genetic maps of Detering et al. (2010), Jighly et al. (2015a) and Lowe et al. (2011) were used to compare our QTL positions with previously reported QTL.

The same datasets including genotyping, phenotyping and Q matrix were used to analyze 196 epistatic interactions between markers found to have significant main effects; and between 197 198 significant markers and other markers whether or not they were significant. A linear regression 199 model was used to calculate P values for pair-wise marker interactions including the Q matrix as 200 a covariate. The MDR gene interaction analysis was applied initially for each individual disease 201 and the significance threshold for the interactions analysis was estimated using false discovery rate (FDR) ≤ 0.05 (Table 1) considering a total number of tested interactions for each disease 202 resistance = total number of markers \times number of OTL for the trait (Benjamini and Hochberg 203 1995). For the significant interactions, a two sample t-test via 10,000 Monte-Carlo permutation 204 samples were applied to judge the significant differences between phenotypes for interacted 205 206 allelic combinations.

207 **Results**

208 <u>Multiple fungal disease screening in SHW</u>

209 All 320 SHW were screened against six fungal diseases (seven scores, Septoria Nodorum has 210 two component scoring of glume (SNG) and leaf (SNL) blotches). Infection responses varied for each disease and ranged from susceptible to resistant (Figure S1). The full details of experiments 211 212 and results for individual diseases have been reported previously (Ogbonnaya et al. 2008; Ogbonnaya 2011). Only the genotype AUS36217 showed moderately resistance response to all 213 diseases while approximately 16.25% of the SHW possessed either resistant or moderately 214 resistant reactions to at least five of the diseases evaluated in this study. The gene by trait 215 analysis resulted in a good number of genotypes close to the position of the ideal genotype 216 217 (Figure 1). The pseudo-heritability estimation inferred from the mixed model for the studied traits ranged from 22.4% for Yr to 69.4% Lr (Figure S2). 218

219 Marker coverage, genetic diversity and linkage disequilibrium

A total of 12,207 DArT (453) and DArTSeq (11,754) markers were polymorphic in the SHW 220 panel, of which 6,176 were of known map position with an average of 294.1 markers per 221 222 chromosome. One thousand five hundred and sixty six, 1,773 and 2,837 loci were mapped on the A, B and D genomes respectively, with an average distance of 1.38, 1.06 and 0.74 cM for the A, 223 224 B and D genomes. Chromosome 4B and 1A had the least number of markers with only 131 while 225 7D had the highest number of markers (711 markers). The DArTSeq markers have advantages over the original DArT markers being of higher density, of co-dominant inheritance and 226 possesses better D genome coverage. However, only 55 (12.1%) of the DArT markers were 227 distributed on the seven D genome chromosomes. Table S2 and Figure S3 show the distribution 228 229 of both DArT and DArTSeq markers across wheat genome while table S3 shows the full 230 genotypic data of both sets.

The PCA analysis was run for the 320 SHW using 453 polymorphic DArT markers. The first two principal components together explained about 21.3% of the total variation and the germplasm were wide spreading on the two axes. Interestingly, the SHW genotyped with both markers as well as the cross validation set with DArT markers clustered together except for about 20 SHWs which belonged to the validation set (~13.5% of the validation population) which clustered away from the main set (Figure 2). The phylogenetic tree and the kinship analyses showed similar results to PCA (Figure S4, S5).

Plotting intra-chromosomal R^2 values for each pair of loci against their interval genetic distance, indicated that the LD started to decrease below 0.22 after ~120 cM. However, when each genome was considered separately, the A genome started to decay at 10 cM, B genome at 2 cM while D genome was at 200 cM (Figure S6). Further, the D genome also exhibited higher intra- + inter-chromosomal R^2 values with median value about 0.2 (Figure S7). Interestingly, LD decayed faster for chromosomes 2D and 5D than the other D genome chromosomes at about 10 cM and 1 cM respectively (data not shown).

245 Association analysis of QTL for six disease resistance

Table 1 presents a summary of markers significantly associated with the various fungal diseases evaluated. There were a total of 74 DArT and DArTSeq markers representing 35 QTL that were associated with all disease resistances with R^2 values which ranged from 6 to 13.9%. The highest R^2 value was 13.9% for the SNG associated marker *wPt-8262* on 5AL followed by *wPt-2858* on 2AL associated with Yr resistance with R^2 of 13.5%. The genotypes of A and B genome associated marker for the genotypes with common durum parents were summarized in table S4 while figure S8 shows the Manhattan and QQ plots for all disease traits.

On an individual disease basis, five markers located in three genomic regions (2BL, 3BL and 253 7DL) were associated with Cr resistance with R^2 values which ranged between 8.2 and 9.3% 254 while 31 markers representing five different genomic locations on 1BS, 2DL, 3D, 6DL and 7D 255 were identified as being associated with resistance to YLS, with R^2 values which ranged between 256 6.7 and 11.4%. There were a number of chromosome regions associated with resistance to each 257 of the three rusts. Nine markers on five genomic regions, 1BL, 1DS, 2DL, 6D and 7DL, were 258 significantly linked to Lr resistance with R^2 values which ranged between 6.7 and 8.4%, while 259 nine markers associated with Yr resistance were located on 1BL-1, 1BL-2, 2AL, 2BL, 3D and 260 6BL with R² values that ranged between 9.4 and 13.5%. Twelve markers were associated with Sr 261 resistance on seven genomic regions: 1BL, 2DS-1, 2D-2, 3BS, 4BL, 6B and 6DL. The R² values 262 ranged between 6 and 10.2%. Thirteen markers on eight genomic regions (2AL, 2BL, 2DL, 3BS, 263 4BL, 5AL, 6B and 7D) were linked with resistance to SNG with R^2 values that ranged from 6.2 264 to 13.9%. Similarly, one marker on 7B was linked with SNL with an R^2 value of 8.4%. 265

Of the 35 detected QTL, ten were detected with DArT markers only, two with the diagnostic marker for Lr46/Yr29 and 22 with DArTSeq only; with only one common QTL for both marker types which is the QTL Sr05 on 4BL.

269 <u>Validation of the AM analysis of QTL for six disease resistance based on DArT markers only</u>

The validation set of 147 SHW genotyped with DArT only confirmed the multiple disease QTL *Lr46/Yr29* on 1BL as well as the SNG QTL on 3BS with the exact markers detected in the main set of 173 SHWs. Further, additional eight QTL were also confirmed with closely linked markers for Lr, Sr, SNG, SNL and YLS (Table 2). Five out of the 11 confirmed QTL were linked with MDR resistance in the main set which are Lr01, SNG04, SNG05, Sr06 and Yr02. QTL found inthe validation set only were reported in Table S5.

276 Multiple-fungal disease resistance loci

Out of the 35 detected QTL, three, 17 and 15 QTL were detected on A, B and D genomes 277 respectively. Six markers on five wheat chromosomes (1BL, 3BS, 4BL, 6B and 6D) were 278 279 significantly associated with resistance to two different fungal pathogens representing 10 out of the detected 35 QTL (Table 1). Figure S9 represents the allelic effects of the MDR markers. 280 Only the marker *Lr46/Yr29* on 1BL was significantly associated with resistance to Yr and Lr in 281 coupling while the other five markers were associated with the two diseases in repulsion. The 282 markers wPt-3921 on 3BS, 1094836 on 4BL and 1019982 on 6B were associated with Sr and 283 284 SNG resistances while the markers 1126111 and 1126778 on 6D were associated with Lr and YLS. 285

On the chromosome arm bases, genomic regions on 1BL, 2DL and 7DL possessed the highest 286 287 number of QTL with four. The 1BL arm contain two genomic regions that contain the Lr46/Yr29288 MDR QTL as well as Yr QTL (Yr01) which lies at genetic position of 162.3 cM and the Sr QTL Sr02 at 289 cM. The chromosome arm 2DL carries the unmapped QTL Sr03 and the QTL Lr03, 289 YLS02 and SNG03 between the genetic positions 252.2 cM for YLS02 and 289.8 cM for 290 SNG03. The 7DL arm possessed four QTL, Cr03, Lr05, SNG08 and YLS05. Unfortunately, the 291 position of the 7DL QTL could not be precisely determined because of distance they spanned 292 due to the large LD blocks. Another interesting region was found on chromosome arm 2BL 293 between 163.8 and 179.5 cM carrying the QTL Cr01, SNG02 and Yr04. The long arm of 294 chromosome 2A also carry the QTL SNG03 at 129.8 cM and Yr03 at 82.2 cM (Table 1). 295

297 Significant interactions were detected for YLS, Sr and Lr only while no interactions were detected for the other disease resistances (Table 2). The Lr OTL on chromosome 6D showed two 298 interactions with regions on 3BL and 6B, while the Sr QTL on 2DS showed a single interaction 299 300 with the marker 1262585 on 2AS. Two interactions for the YLS resistance QTL on 6DL were detected with loci on 1DL and 6B. The R² values ranged from 15.9% for the YLS interaction 301 6DL/6B to 24.4% for the YLS interaction 6DL/1DL. Comparing the allele combination disease 302 score for the interacted alleles showed that Lr and Sr interactions are synergistic while YLS 303 interactions are antagonistic as the two Lr and the Sr resistance alleles showed high resistance 304 305 response when combined with the interacted alleles of the markers 2280676, 1208017 and 1262585; respectively (Figure 3). 306

307 **Discussion**

This study describes the use of GWAS to identify loci underlying individual and multiple disease 308 309 resistances, and their interaction in SHW. The SHWs consisted of 320 genotypes produced from 310 interspecific crosses between 222 Aegilops tauschii accessions and 50 elite Triticum turgidum lines which were previously evaluated for several fungal and root diseases (Ogbonnaya et al. 311 2008; Ogbonnaya 2011; Mulki et al. 2013). The present study was carried out for six important 312 fungal diseases. Only nine genotypes of the 320 SHW showed complete resistance to all 313 diseases, however, about 20% of the SHW possessed either a resistant or moderately resistant 314 315 reaction to two or more diseases.

316 Linkage disequilibrium

317 GWAS studies are highly dependent on LD decay determined by the interval genetic distance between loci, recombination rate and the number of generations since the most recent 318 common ancestor (Mackay and Powell 2006). To the best of our knowledge, this germplasm has 319 320 longer LD blocks than any other previously described wheat germplasm. However, when each genome was considered separately, we found that the extensive decay was on the D genome only 321 322 (except for 2D and 5D) while the other two genomes have a comparable or lower LD decay than results from other studies in wheat. The longest ranges reported so far on wheat were estimated 323 at between 30 and 40 cM (Crossa et al. 2007; Dreisigacker et al. 2008; Jighly et al. 2015b); while 324 other studies reported a decay of about 1-2 cM (Tadesse et al. 2014; Tadesse et al. 2015). 325 Compared to bi-parental mapping, GWAS can target more favorable loci and have better 326 mapping resolution as it exploits more diversity but it is also limited in detecting rare variants 327 and can have higher type I error due to population structure (Pritchard et al. 2000; Flint-Garcia et 328 al 2003, 2005; Breseghello and Sorrells 2006). It has been reported by other authors that for 329 genome wide association mapping, genetic materials characterized by high LD are preferable 330 331 due to the reasonably low number of markers required to reveal a significant marker-trait association but materials with low LD and efficient number of markers can lead to higher 332 333 mapping resolution (Flint-Garcia et al 2003; Maccaferri et al. 2006). However, such a long range LD in D genome (about 200 cM) will cause huge uncertainty on the accuracy of the QTL 334 position. The high LD indicates the existence of narrow genetic diversity and high population 335 336 structure of the Aegilops tauschii parents used to develop the SHW germplasm in this study. On the other hand, the marker coverage (one marker every 1.38 cM for A genome and one every 337 338 1.06 cM for B genome) in this study was sufficient for a whole-genome association scan in the 339 SHW population.

340 <u>Fungal disease resistance characterization in SHW</u>

341 *Novel QTL detection in SHW*

342 The present study detected one QTL for each of Sr and YLS in genomic regions that have not been previously reported for those diseases. Our analysis revealed two Sr QTL on 2D of 343 344 which one is located in the region of Sr46 gene (Yu et al. 2015) while the other QTL is 345 associated with the SNP markers 1101415 and 1102301. Despite the very long LD observed in 346 the D genome, the two SNP markers have no LD with the Sr46-associated markers indicating that they may be associated with a novel Sr resistance gene. Similarly a haplotype block of eight 347 SNP markers on 6DL including the marker 1037337 which mapped at the position 169.1 cM 348 were linked to a novel YLS QTL of which the marker 1139583 had the lowest P value of 1.6×10^{-10} 349 4 with R² value of 8.8%. To the best of our knowledge, no YLS QTL has been mapped on 6DL 350 in the region of this QTL. 351

The present study confirmed the introduction of novel genes from *Ae. tauchii* to bread wheat germplasm regardless the accurate positioning on the genome. This study can guide future research to develop bi-parental populations with one synthetic parents possessing potentially value with the reported novel genes or initiating synthetic germplasms with more diverse *Ae*. *tauchii* resources for GWAS studies. *Previously reported disease resistance loci*

Five different QTL were detected for each of Lr and YLS. For both diseases, four out of the five QTL were found in the D genome of which one was common but in repulsion on chromosome 6D. All of the Lr D genome QTL identified in this study were found on regions known to carry introduced leaf rust resistance genes from wild relatives. *Lr19* was introduced to hexaploid wheat chromosome 7D from *Agropyron elongatum* (Gupta et al. 2006) and *Lr38* 362 originated from Agropyron intermedium (Mebrate et al. 2008). The OTL identified in the SHW used in the present study may be homoeologous to Lr19 and Lr38. The other two genes are Lr39363 and Lr42 which were found originally in Aegilops tauschii (Singh et al. 2004; Sun et al. 2010). 364 On the other hand, SHW has been extensively used to control YLS (Alam and Gustafson 1988; 365 Xu et al. 2004; Tadesse et al. 2006; Singh et al. 2006) and the chromosome 3D gene Tsn3, 366 detected in our germplasm, is one of the best examples (Tadesse et al. 2007). The other D 367 genome YLS QTL in the SHW germplasm were located on chromosomes 2DL and 7D and were 368 previously reported in hexaploid landrace germplasm through association mapping (Gurung et al. 369 370 2011). Further studies will be necessary to determine whether the SHW alleles associated with resistance are similar to those of the wild species alleles in future QTL studies. 371

Although the SHW in this study were not tested against any of stem rust Ug99 isolates, 372 all the Sr QTL identified in this study were found on regions that carry Ug99 resistance except 373 374 for the untested novel QTL on chromosome 2DS (Yu et al. 2011, 2014; Guerrero-Chavez et al. 2015). The 1BL gene Sr58 was reported to carry Ug99 resistance and was found in durum 375 germplasm (Herrera-Foessel et al. 2011). We also detected the gene Sr46 on 2DS in the SHW 376 germplasm which was first reported in the Aegilops tauschii accession "Clae 25" (Yu et al. 377 2015); and a QTL in the regions of the gene Sr37 which was previously reported in durum wheat 378 chromosome 4BL (Singh et al. 2013). Further evaluation of the SHW in Ug99 hotspots is 379 required to confirm Ug99 resistance in the SHW. 380

Only three QTL were reported to be associated with Cr resistance genes of which the SNP marker *1384280* identified in the current study on 2BL QTL was previously reported in durum wheat near the marker *wPt-9336* (Eberhard 2011). Poole et al. (2012) and Ma et al. (2010) reported QTL in hexaploid wheat in two genomic regions on 3BL and 7DL QTL,
respectively, consistent with the result from the current study.

Zegeve et al. (2014) detected a seedling Yr QTL on chromosome 3DL in an SHW 386 germplasm through association mapping. However, it is difficult to determine whether the 3D 387 388 QTL identified in this study is similar to the previously reported QTL since the two SNP markers (100136169 and 1267912) in the current study are unmapped and the LD started to decay after 389 200 cM for D genome in this germplasm. On the other hand, we identified a number of QTL in 390 genomic regions that were previously found to carry Yr resistance in hexaploid wheat on 391 chromosome regions 1BL, 2AL and 6BS (Basnet et al. 2014; Dedryver et al. 2009; Rosewarne et 392 393 al. 2013; Santra et al. 2008). We also detected the presence of the Yr29 gene which is found in 394 both durum and hexaploid wheat (William et al. 2003; Herrera-Foessel et al. 2011). Similarly, all the SNG/SNL QTL identified in the current study were located on genomic regions previously 395 396 reported to carry SNG/SNL QTL in bread wheat (Table 1) (Shankar et al. 2008; Czembor et al. 397 2003; Adhikari et al. 2011; Cockram et al. 2015; Schnurbusch et al. 2003; Kumar et al. 2010; Aguilar et al. 2005). 398

399 <u>Detection of MDR loci</u>

Using MLM we identified six markers on five different chromosomes (1BL, 3BS, 4BL, 6B and 6D) associated with MDR loci in SHW of which only the 1BL QTL showed coupling phase with the resistances associated with the well documented gene Lr46/Yr29. The 3BS, 4BL and 6B QTL showed associations with Sr and SNG while the 6D QTL was associated with Lr and YLS. Earlier studies reported the clustering of resistance genes in specific regions. Sukhwinder-Singh et al (2012) reported that it is not uncommon in wheat to find regions

406 inherited as MDR loci. They argued that these are typically due to absence of recombination 407 from alien chromosomal segments, such as the Yr, Sr and powdery resistances from rye chromosome 1RS segment or the triple rust and nematode resistances from Ae. ventricosa 408 409 introgressed on wheat chromosome 2A. These introgressed segments were shown to carry diverse and multiple gene clusters that encode nucleotide binding and leucine rich repeat 410 sequences, the most frequent class of plant disease resistance genes. However, the SHW have no 411 history of alien introgression to explain the MDR identified in this study which will make it 412 easier to pyramid the four MDR QTL we detected in repulsion. Previous reported isolated wheat 413 414 MDR genes with pleiotropic effects include Lr34 and Lr67 (Krattinger et al. 2009; Moore et al. 2015). 415

416 MDR can be a result of genes with pleiotropic effect, unlinked genes or a cluster of resistance genes. The gene Lr46/Yr29/Sr58/Pm39/Ltn2 on 1BL exhibits MDR (William et al. 417 418 2003) and it was previously reported in CIMMYT durum wheat (Herrera-Foessel et al. 2011). In 419 the present study, the resistance allele of Lr46 diagnostic marker was associated with Lr and Yr resistances. Although this marker was not associated with Sr resistance in this germplasm, the 420 421 SNP 1006460 showed a potential association with Sr58 as it is physically close to the Sr58422 linked marker Xbarc80 (Yu et al. 2014). Further, both Lr46/Yr29 and Sr58 were detected in the validation set. Additional MDR region was located on chromosome 2BL within 15.7 cM which 423 contain QTL for SNG02, Yr04 and Cr01. Interestingly, 46 SHWs carry the resistance alleles of 424 the three QTL together. 425

Although most of the markers in the present study were associated with a single disease only, some of these were previously reported to be linked with different disease resistance genes and stresses in previous studies using different germplasm. The marker *wPt-2757* on 3BS was associated with fusarium head blight, Sr and grain yield under salinity conditions (Bhavani et al.
2011; Agnes et al. 2014; Genc et al. 2013). Similarly, the SNG/Sr associated marker *wPt-3921*(chromosome 3BS) was previously reported to be linked to fusarium head blight, Sr, and Yr
(Bhavani et al. 2011; Agnes et al. 2014; Chen et al. 2012) while the 4BL marker *wPt-8543*associated with SNG was also associated with Sr and Yr in previous reports (Zwart et al. 2010;
Letta et al. 2013).

435 <u>Gene-gene interaction</u>

436 The interaction between loci was investigated to elucidate the mechanism of disease 437 resistance and provide evidence for epistasis or pleiotropy. Five significant interactions were 438 identified that contributed to Lr, Sr and YLS in the SHW between one QTL for each of the 439 previous diseases and one or two other genomic loci (Table 3). The two Lr interactions as well as the Sr interaction were synergistic as combination between the resistance and the significantly 440 441 interacted alleles showed superior phenotypes (Figure 3); while the YLS interactions can be considered as antagonistic because only the susceptible alleles showed significant difference 442 with both marker alleles interacting. However, studying those interactions in a larger population 443 size will confirm their presence and can facilitate better understanding for their molecular basis. 444 Synergistic interactions are favorable for breeding programs but they will need continued 445 tracking for the presence of both alleles while antagonistic interactions will require eliminating 446 genotypes carrying the negative interacted alleles during the breeding progress. Knowledge of 447 these interactions will enhance genetic gains in deploying and breeding for MDR as a mean of 448 controlling both biotrophic and necrotrophic pathogens. 449

Our study explored the possible role of polyploidy in MDR in wheat, having a genome 450 with three homeoologous sets of chromosomes, and suggests the existence of interactions 451 between genes involved in various fungal disease resistances. Earlier, a comprehensive study 452 453 (Segre et al. 2005) demonstrated systematic epistatic interactions using yeast as a model organism. The study emphasized the co-dependency of genes from various functional categories 454 to establish a phenotypic difference. Specifically, the authors showed that epistatic interactions 455 could be organized into a network formed by functional modules and that interactions between 456 functional modules are more likely to occur than within modules. In our study, the module could 457 458 be thought of as a biological pathway, and the interactions between the loci would imply crosstalk between these pathways. As underlined by Moore and White (2007), making biological 459 interpretations from statistical models of epistasis is difficult to do for any method since we are 460 trying to make inferences about biological processes at the cellular level in an individual from 461 statistical summaries of variation in a population. Further investigations of these results could 462 provide insight into understanding different resistance gene relationships as well as mechanisms 463 that contribute to different resistance gene networks. 464

465 Conclusion

Molecular markers identifiably linked with multiple disease resistance genes will be particularly effective for breeding programs in order to facilitate and improve the selection for different disease resistance genes simultaneously. The ultimate aim of this study is to generate knowledge so that MDR can be effectively deployed for the development of wheat cultivars possessing durable multiple disease resistance. In this study, we identified markers associated with Sr, Yr, Lr, Cr, SNG, SNL and YLS of which some were associated with up to two diseases, some of which were novel. This is the first association mapping study that reported markers associatedwith the resistance for six diseases together.

474 Competing interest

475 The authors declare that they have no competing interest.

476 Abbreviations

- 477 MDR, Multiple disease resistance; SHW, Synthetic Hexaploid Wheat; MLM, Mixed Linear
- 478 Model; QTL, Quantitative Trait Loci; GWAS, Genome Wide Association Study; LD, Linkage
- 479 Disequilibrium; Lr, Leaf Rust; Sr, Stem Rust; Yr, Yellow Rust; YLS, Yellow Leaf Spot; SNG,
- 480 Septoria Nodorum Glume Blotch; SNL, Septoria Nodorum Leaf Blotch; Cr, Crown Rot; DArT,
- 481 Diversity Arrays Technology.

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489 **References**

Adhikari TB, Jackson EW, Gurung S, Hansen JM, Bonman JM (2011) Association mapping of quantitative
resistance to *Phaeosphaeria nodorum* in spring wheat landraces from the USDA National Small Grains
Collection. Phytopathology 101(11):1301-1310

- 493 Ágnes SH, Szabolcs LK, Mónika V, László P, János P, Csaba L, Ákos M (2014) Differential influence of QTL
 494 linked to Fusarium head blight, Fusarium-damaged kernel, deoxynivalenol contents and associated
 495 morphological traits in a Frontana-derived wheat population. Euphytica 200(1):9-26
- 496 Aguilar V, Stamp P, Winzeler M, Winzeler H, Schachermayr G, Keller B et al (2005) Inheritance of field resistance
- 497 to *Stagonospora nodorum* leaf and glume blotch and correlations with other morphological traits in hexaploid
- 498 wheat (*Triticum aestivum* L.). Theor Appl Genet 111(2):325-336
- 499 Alam KB, Gustafson JP (1988) Tan-spot resistance screening of Aegilops species. Plant Breeding 100:112–118
- Appel JA, DeWolf E, Bockus WW, Todd T (Preliminary 2011) Kansas wheat disease loss estimates. Kansas
 cooperative plant disease survey report, August 18-2011
- Assefa S, Fehrmann H (2000) Resistance to wheat leaf rust in *Aegilops tauschii* Coss and inheritance of resistance in
 hexaploid wheat. Genet Resour Crop Evol 47:135–140
- Basnet BR, Singh RP, Ibrahim AMH, Herrera-Foessel SA, Huerta-Espino J, Lan C, Rudd JC (2014)
 Characterization of *Yr54* and other genes associated with adult plant resistance to yellow rust and leaf rust in
 common wheat Quaiu 3. Mol breed 33(2):385-399
- 507 Benjamini Y, Hochberg Y (1995) Controlling the false discovery rate: a practical and powerful approach to multiple
 508 testing. J R Statist Soc B 57:289–300
- 509 Bhavani S, Singh RP, Argillier O, Huerta-Espino J, Singh S, Njau P, Brun S, Lacam S and Desmouceaux N (2011)
- Mapping durable adult plant stem rust resistance to the race Ug99 group in six CIMMYT wheats. 2011 BGRI
 Technical Workshop, pp 43–53
- 512 Braun HJ, Atlin G, Payne T (2010) Multi-location testing as a tool to identify plant response to global climate
 513 change. Reynolds, CRP. (Ed.) Climate change and crop production, CABI, London, UK.
- 514 Breseghello F, Sorrells MS (2006) Association mapping of kernel size and milling quality in wheat (*Triticum*515 *aestivum* L.) cultivars. Genetics 172:1165-1177

- 516 Chen J, Chu C, Souza EJ, Guttieri MJ, Chen X, Xu S, et al (2012) Genome-wide identification of QTL conferring
 517 high-temperature adult-plant (HTAP) resistance to stripe rust (*Puccinia striiformis* f. sp. *tritici*) in wheat. Mol
 518 breed 29(3):791-800
- 519 Cockram J, Scuderi A, Barber T, Furuki E, Gardner KA, Gosman N, Kowalczyk R, Phan HP, Rose GA, Tan KC,
- 520 Oliver RP (2015) Fine-Mapping the Wheat Snn1 Locus Conferring Sensitivity to the Parastagonospora
- 521 *nodorum* Necrotrophic Effector *SnTox1* Using an Eight Founder Multiparent Advanced Generation Inter-Cross
- 522 Population. G3: Genes Genomes Genetics 5(11):2257-66
- 523 Crossa J, Burgueño J, Dreisigacker S, Vargas M, Herrera-Foessel SA, Lillemo M, Singh RP, Trethowan R,
- 524 Warburton M, Franco J, Reynolds M, Crouch JH, Ortiz R (2007) Association analysis of historical bread wheat
- 525 germplasm using additive genetic covariance of relatives and population structure. Genetics 177:1889–1913
- 526 Czembor PC, Arseniuk E, Czaplicki A, Song Q, Cregan PB, Ueng PP (2003) QTL mapping of partial resistance in
 527 winter wheat to *Stagonospora nodorum* blotch. Genome 46(4):546-554
- Dedryver F, Paillard S, Mallard S, Robert O, Trottet M, Nègre S, Verplancke G, Jahier J (2009) Characterization of
 genetic components involved in durable resistance to stripe rust in the bread wheat 'Renan'. Phytopathology
 99:968–973
- 531 Detering F, Hunter E, Uszynski G, Wenzl P, Andrzej K (2010) A consensus genetic map of wheat: ordering 5,000
 532 Wheat DArT markers. 20th ITMI & 2nd WGC Workshop, 1–5 September, Beijing
- Dreisigacker S, Kishii M, Lage J, Warburton M (2008) Use of synthetic hexaploid wheat to increase diversity for
 CIMMYT bread wheat improvement. Aust J Agric Res 59:413–420
- Eastwood RF, Lagudah ES, Appels R, Hannah M, Kollmorgen JF (1991) *Triticum tauschii*: a novel source of
 resistance to cereal cyst nematode (*Heterodera avenae*). Aust J Agric Res 42:69–77
- 537 Eberhard FS (2011) Molecular marker assisted selection for crown rot resistance in *Triticum turgidum* ssp.
 538 durum (Doctoral dissertation, University of Southern Queensland)

- Faris JD, Friesen TL (2005) Identification of quantitative trait loci for race-nonspecific resistance to tan spot in
 wheat. Theor Appl Genet 111:386-392
- 541 Farrer W (1898) The making and improvement of wheats for Australian conditions. AgricGaz NSW 9:131–168
- Flint-Garcia SA, Thornsberry JM, Buckler ES (2003) Structure of linkage disequilibrium in plants. Annu Rev Plant
 Biol 54:357-374
- Flint-Garcia SA, Thuillet AC, Yu J, Pressoir G, Romero SM, Mitchell SE, Doebley J, Kresovich S, Goodman MM
 and Buckler ES (2005) Maize association population: a high-resolution platform for quantitative trait locus
 dissection. Plant Journal 44:1054–1064
- 547 Friesen TL, Faris JD (2004) Molecular mapping of resistance to *Pyrenophora tritici-repentis* race 5 and sensitivity
 548 to *PtrToxB* in wheat. Theor Appl Genet 109:464-471
- Genc Y, Oldach K, Gogel B, Wallwork H, McDonald GK, Smith AB (2013) Quantitative trait loci for agronomic
 and physiological traits for a bread wheat population grown in environments with a range of salinity levels. Mol
 breed 32(1):39-59
- 552 Goldstein DB, Tate SK, Sisodiya SM (2003) Pharmacogenetics goes genomics. Nat Rev Genet 4:937-947
- Guerrero-Chavez R, Glover KD, Rouse MN, Gonzalez-Hernandez JL (2015) Mapping of two loci conferring
 resistance to wheat stem rust pathogen races TTKSK (Ug99) and TRTTF in the elite hard red spring wheat line
 SD4279. Mol Breed 35(1):1-10
- Gupta SK, Charpe A, Prabhu KV, Haque QMR (2006) Identification and validation of molecular markers linked to
 the leaf rust resistance gene *Lr19* in wheat. Theor Appl Genet 113(6):1027-1036
- 558 Gurung S, Mamidi S, Bonman JM, Jackson EW, del Rio LE, Acevedo M, Mergoum M, Adhikari TB (2011)
- 559 Identification of novel genomic regions associated with resistance to *Pyrenophora tritici-repentis* races 1 and 5
- 560 in spring wheat landraces using association analysis. Theor Appl Genet 123:1029–1041

- Gurung S, Mamidi S, Bonman JM, Xiong M, Brown-Guedira G, Adhikari TB (2014) Genome-wide association
 study reveals novel quantitative trait Loci associated with resistance to multiple leaf spot diseases of spring
 wheat. PLoS ONE 9(9):e108179
- Hatchett JH, Martin TJ, Livers RW (1981) Expression and inheritance of resistance to Hessian fly in synthetic
 hexaploid wheats derived from *Triticum tauschii* (Coss) Schmal. Crop Sci 21:731–734
- Hedrick PW (1987) Gametic disequilibrium measures: proceed with caution. Genetics 117:331-374
- Herrera-Foessel SA, Singh RP, Huerta-Espino J, Salazar VC, Lagudah ES (2011) First report of slow rusting gene
 Lr46 in durum wheat. Borlaug Global Rust Initiative, June 13-16, 2011 Technical Workshop, St Paul,
 Minnesota, USA pp191
- Jighly A, Joukhadar R, Alagu M (2015a) SimpleMap: A Pipeline to Streamline High-Density Linkage Map
 Construction. The Plant Genome 8(2). DOI:10.3835/plantgenome2014.09.0056
- 572Jighly A, Oyiga BC, Makdis F, Nazari K, Youssef O, Tadesse W, Abdalla O, Ogbonnaya FC (2015b) Genome-wide
- 573 DArT and SNP scan for QTL associated with resistance to stripe rust (*Puccinia striiformis* f. sp. *tritici*) in elite

574 ICARDA wheat (*Triticum aestivum* L.) germplasm. Theor Appl Genet 128:1277–1295

- Joukhadar R, El-Bouhssini M, Jighly A, Ogbonnaya FC (2013) Genomic regions associated with resistance to five
 major pests in wheat. Mol Breed 32:943–960
- 577 Krattinger SG, Lagudah ES, Spielmeyer W et al (2009) A putative ABC transporter confers durable resistance to
 578 multiple fungal pathogens in wheat. Science 323:1360–1363
- 579 Kumar U, Joshi AK, Kumar S, Chand R, Röder MS (2010) Quantitative trait loci for resistance to spot blotch caused
- 580 by *Bipolaris sorokiniana* in wheat (*T. aestivum* L.) lines 'Ning 8201' and 'Chirya 3'. Mol breed 26(3):477-491
- 581 Lagudah ES (2011) Molecular genetics of race non-specific rust resistance in wheat. Euphytica 179:81–91
- 582 Lagudah ES, Krattinger SG, Herrera-Foessel S, Singh RP, Huerta-Espinoso J, Spielmeyer W, Brown-Guedira G,
- 583 Selter LL, Keller B (2009) Gene-specific markers for the wheat gene Lr34/Yr18/Pm38 which confers resistance
- to multiple fungal pathogens. Theor Appl Genet 119: 889-898

- Letta T, Maccaferri M, Badebo A, Ammar K, Ricci A, Crossa J, Tuberosa R (2013) Searching for novel sources of
 field resistance to Ug99 and Ethiopian stem rust races in durum wheat via association mapping. Theor Appl
 Genet 126(5):1237-1256
- Lipka AE, Tian F, Wang Q, Peiffer J, Li M, Bradbury PJ et al (2012) GAPIT: genome association and prediction
 integrated tool. Bioinformatics 28(18):2397-2399
- Loughman R, Lagudah ES, Trottet M, Wilson RE, Mathews A (2001) Septoria nodorum blotch resistance in
 Aegilops tauschii and its expression in synthetic amphiploids. Aust J Agric Res 52:1393–1402
- 592 Lowe I, Jankuloski L, Chao S, Chen X, See D, Dubcovsky J (2011) Mapping and validation of QTL which confer
- partial resistance to broadly virulent post-2000 North American races of stripe rust in hexaploid wheat. Theor
 Appl Genet 123(1):143-157
- Lutz J, Hsam SLK, Limpert E, Zeller FJ (1994) Powdery mildew resistance in *Aegilops tauschii* Coss. and synthetic
 hexaploid wheats. Genet Resour Crop Evol 41:151–158
- 597 Ma H, Singh RP, Mujeeb-KaziA (1995) Resistance to stripe rust in *Triticum turgidum*, *T. tauschii* and their
 598 synthetic hexaploids. Euphytica 82:117–124
- 599 Ma J, Li HB, Zhang CY, Yang XM, Liu YX, Yan GJ, Liu CJ (2010) Identification and validation of a major QTL
- 600 conferring crown rot resistance in hexaploid wheat. Theor Appl Genet 120(6):1119-1128
- 601 Maccaferri M, Sanguineti MC, Natoli E, Araus-Ortega JL, Bensalem M et al (2006) A panel of elite accessions of
- durum wheat (*Triticum durum* Desf.) suitable for association mapping studies. Plant Genet Resour 4:79–85
- 603 Mackay I, Powell W (2006) Methods for linkage disequilibrium mapping in crops. Trends Plant Sci 12:57–63
- 604 Marais GF, Potgieter GF, Roux HS (1994) An assessment of the variation for stem rust resistance in the progeny of
- a cross involving the *Triticum* species *aestivum*, *turgidum* and *tauschii*. S Afr J Plant Soil 11:15–19
- Mebrate SA, Oerke EC, Dehne HW, Pillen K (2008) Mapping of the leaf rust resistance gene Lr38 on wheat
 chromosome arm 6DL using SSR markers. Euphytica 162(3):457-466

- Moore JH, White BC (2007) Tuning Relief for genome-wide genetic analysis. In: Marchiori E, Moore JH,
 Rajapakse JC. Lecture Notes in Computer Science Volume 4447. New York: Springer. Pp. 166-175
- 610 Moore JW, Herrera-Foessel S, Lan C, Schnippenkoetter W, Ayliffe M, Huerta-Espino J, Lillemo M, Viccars L,
- 611 Milne R, Periyannan S, Kong X (2015) A recently evolved hexose transporter variant confers resistance to
- 612 multiple pathogens in wheat. Nature genetics 47:1494–1498
- 613 Mujeeb-Kazi A, Cano S, Rosas V, Cortes A, Delgado R (2001a) Registration of five synthetic hexaploid wheat and
- seven bread wheat lines resistant to wheat spot blotch. Crop Sci 41:1653–1654
- Mujeeb-Kazi A, Delgado R, Juarez L, Cano S (2001b) Scab resistance (Type II: spread) in synthetic hexaploid
 germplasm. Ann Wheat Newsl 47:118–120
- 617 Mulki MA, Jighly A, Ye G, Emebiri LC, Moody D, Ansari O, Ogbonnaya FC (2013) Association mapping for
- soilborne pathogen resistance in synthetic hexaploid wheat. Mol Breed 3:299-311
- 619 Neumann K, Kobiljski B, Denčić S, Varshney RK, Börner A (2011) Genome-wide association mapping: a case
 620 study in bread wheat (*Triticum aestivum* L.). Mol Breed 27:37–58
- 621 Ogbonnaya FC (2011) Development, management and utilization of synthetic hexaploid in wheat improvement. In:
- Bonjean AP, Angus WJ, van Ginkel M. The World Wheat Book A history of Wheat Breeding Volume 2.
 Lavoisier, Paris, France. pp. 823-843
- 624 Ogbonnaya FC, Abdalla O, Mujeeb-Kazi A, AG Kazi, Xu Steven, Gosman N, Lagudah ES, Bonnett D, Sorells ME,

Tsujimoto H (2013) Synthetic hexaploids: Harnessing species of primary gene pool for wheat improvement.
Plant Breeding Reviews 37:35-122

- Ogbonnaya FC, Imtiaz M, Bariana HS, McLean M, Shankar M, Hollaway GJ, Trethowan R, Lagudah ES, van
 Ginkel M (2008) Mining synthetic hexaploids for multiple disease resistance to improve wheat. Aust J Agric
 Res 59:421-431
- Ogbonnaya FC, Seah S, Delibes A, Jahier J, Lopez-Brana I, Eastwood RF, Lagudah ES (2001) Molecular-genetic
 characterisation of a new nematode resistance gene in wheat. Theor Appl Genet 102:623–629

- 632 Oliver RP, Tucker M, Rybak K, Antoni E, Lichtenzveig J (2011) Managing fungicide resistance in broad acre 633 cropping in Australia. Research update report in GRDC Australia. 634 (http://www.grdc.com.au/director/events/researchupdates?item id=C13F2CCD0DF0838ED195B4C05D522FD 635 5&pageNumber=1)
- 636 Perrier X, Jacquemoud-Collet JP: DARwin software. 2006, http://darwin.cirad.fr/
- Poole GJ, Smiley RW, Paulitz TC, Walker CA, Carter AH, See DR, Garland-Campbell K (2012) Identification of
 quantitative trait loci (QTL) for resistance to Fusarium crown rot (*Fusarium pseudograminearum*) in multiple
 assay environments in the Pacific Northwestern US. Theor Appl Genet 125(1):91-107
- 640 Pritchard JK, Stephens M, Donnelly P (2000) Inference of population structure using multilocus genotype data.
 641 Genetics 155:945-959
- Rosewarne GM, Herrera-Foessel SA, Singh RP, Huerta-Espino J, Lan CX, He ZH (2013) Quantitative trait loci of
 stripe rust resistance in wheat. Theor Appl Genet 126(10):2427-2449
- Santra DK, Chen XM, Santra M, Campbell KG, Kidwell KK (2008) Identification and mapping QTL for hightemperature adult-plant resistance to stripe rust in winter wheat (*Triticum aestivum* L.) cultivar 'Stephens'.
 Theor Appl Genet 117:793–802
- 647 Schnurbusch T, Paillard S, Fossati D, Messmer M, Schachermayr G, Winzeler M, Keller B (2003) Detection of
 648 QTLs for Stagonospora glume blotch resistance in Swiss winter wheat. Theor Appl Genet 107(7):1226-1234
- 649 Segrè D, DeLuna A, Church GM, Kishony R (2005) Modular epistasis in yeast metabolism. Nat Genet 37:77-83
- 650 Sehgal D, Vikram P, Sansaloni CP, Ortiz C, Saint Pierre C, Payne T et al (2015) Exploring and Mobilizing the Gene
- 651 Bank Biodiversity for Wheat Improvement. PLoS ONE 10(7):e0132112
- 652 Shankar M, Walker E, Golzar H, Loughman R, Wilson RE, Francki MG (2008) Quantitative trait loci for seedling
 653 and adult plant resistance to *Stagonospora nodorum* in wheat. Phytopathology 98(8):886-893
- 654 Shirasu K, Schulze-Lefert P (2003) Complex formation, promiscuity and multi-functionality: protein interactions in
- disease-resistance pathways. Trends in Plant Science 8(6):252-258

- 656 Siedler H, Obst A, Hsam SLK, Zeller FJ (1994) Evaluation for resistance to *Pyrenophora tritici-repentis* in *Aegilops* 657 *tauschii* Coss. and synthetic hexaploid amphiploids. Genet Resour Crop Evol 41:27–34
- 658 Singh A, Pandey MP, Singh AK, Knox RE, Ammar K, Clarke JM, Clarke F, Singh RP, Pozniak CJ, DePauw RM,
 659 McCallum B, Cuthbert RD, Randhawa HS, Fetch T (2013) Identification and mapping of leaf, stem and stripe
 660 rust resistance QTL and their interactions in durum wheat. Mol Breed 31:405–418
- Singh PK, Mergoum M, Ali S, Adhikari TB, Elias EM, Hughes GR (2006) Identification of new sources of
 resistance to tan spot, *Stagonospora nodorum* blotch, and *Septoria tritici* blotch of wheat. Crop
 science 46(5):2047-2053
- 664 Singh S, Franks CD, Huang L, Brown-Guedira GL, Marshall DS, Gill BS, Fritz A (2004) Lr41, Lr39, and a leaf rust
- resistance gene from *Aegilops cylindrica* may be allelic and are located on wheat chromosome 2DS. Theor Appl
 Genet 108(4):586-591
- Solh M, Nazari K, Tadesse W, Wellings CR (2012) The growing threat of stripe rust worldwide. Paper presented at:
 Borlaug Global Rust Initiative (BGRI) conference, Beijing, China. 1–4 Sept. 2012
- 669 Spielmeyer W, Singh RP, McFadden H, Wellings CR, Huerta-Espino J, Kong X, Appels R, Lagudah ES (2008) Fine
- 670 scale genetic and physical mapping using interstitial deletion mutants of Lr34/Yr18: a disease resistance locus
- effective against multiple pathogens in wheat. Theor Appl Genet 116:481–490
- 672 Sukhwinder-Singh, Hernandez MV, Crossa J, Singh PK, Bains NS, Singh K, Sharma I (2012) Multi-Trait and
 673 Multi-Environment QTL Analysis for Resistance to Wheat Diseases. PLoS ONE 7(6):e38008
- Sun X, Bai G, Carver BF, Bowden R (2010) Molecular Mapping of Wheat Leaf Rust Resistance Gene. Crop science
 50(1):59-66
- Tadesse W, Hsam SL, Wenzel G, Zeller FJ (2006) Identification and Monosomic Analysis of Tan Spot Resistance
 Genes in Synthetic Wheat Lines (L.× Coss.). Crop science 46(3):1212-1217
- Tadesse W, Hsam SLK, Zeller FJ (2007) Evaluation of common wheat cultivars for tan spot resistance and
 chromosomal location of a resistance gene in the cultivar 'Salamouni'. Plant Breed 125:318–322

- Tadesse W, Ogbonnaya FC, Jighly A, Nazari K, Rajaram S, Baum M (2014) Association mapping of resistance to
 yellow rust in winter wheat cultivars and elite genotypes. Crop Science 54(2):607-616
- Tadesse W, Ogbonnaya FC, Jighly A, Sanchez-Garcia M, Sohail Q, Rajaram S, Baum M (2015) Genome-Wide
 Association Mapping of Yield and Grain Quality Traits in Winter Wheat Genotypes. PLoS ONE
 10(10):e0141339.
- Thompson JP (2008) Resistance to root-lesion nematodes (*Pratylenchusthornei* and *P. neglectus*) in synthetic
 hexpaloid wheats and their durum and *Aegilops tauschii* parents. Aust J Agric Res 59:432–446
- van Ginkel M, Ogbonnaya FC (2007) Novel genetic diversity from synthetic wheats in breeding cultivars for
 changing production conditions. Field Crops Research 104:86–94
- 689 Weir BS (1996) Genetic data analysis II: methods for discrete populations genetic data. Sinauer Associates,
 690 Sunderland
- 691 Villareal RL, Mujeeb-Kazi A, Fuentes-Davila G, Rajaram S, Toro ED (1994) Resistance to karnal bunt (*Tilletia* 692 *indica* Mitra) in synthetic hexaploid wheats derived from *Triticum turgidum* × *T. tauschii*. Plant
 693 breeding 112(1):63-69
- White J, Law JR, Mackay I, Chalmers KJ, Smith JSC, Kilian A, Powell W (2008) The genetic diversity of UK, US
 and Australian cultivars of *Triticum aestivum* measured by DArT markers and considered by genome. Theor
 Appl Genet 116:439-453
- William M, Singh RP, Huerta-Espino J, Islas SO, Hoisington D (2003) Molecular marker mapping of leaf rust
 resistance gene *Lr46* and its association with stripe rust resistance gene *Yr29* in wheat. Phytopathology 93:153159
- 700 Wissera RJ, Kolkmanb JM, Patzoldta ME, Hollandc JB, Yud J, Krakowskyc M, Nelsonb RJ, Balint-Kurtie PJ
- (2011) Multivariate analysis of maize disease resistances suggests a pleiotropic genetic basis and implicates a
 GST gene. Proc Natl Acad Sci USA 108(18):7339-7344

- Xu SS, Friesen TL, Mujeeb-Kazi A (2004) Seedling resistance to tan spot and *stagonospora nodorum* blotch in
 synthetic hexaploid wheats. Crop Sci 44:2238-2245
- Yan W (2001) GGEBiplot a Windows application for graphical analysis of multi-environment trial data and other
 types of two-way data, Agron J 93:1111–1118Yan W, Kang MS (2002) Cultivar Evaluation Based on Multiple
- 707 Traits. In: GGE biplot analysis: A graphical tool for breeders, geneticists, and agronomists. CRC press.
- Yu G, Zhang Q, Friesen TL, Rouse MN, Jin Y, Zhong S et al (2015) Identification and mapping of Sr46 from *Aegilops tauschii* accession CIae 25 conferring resistance to race TTKSK (Ug99) of wheat stem rust
 pathogen. Theor Appl Genet 128(3):431-443
- Yu J, Buckler ES (2006) Genetic association mapping and genome organization of maize. Curr Opin Biotechnol
 17:155–160
- Yu LX, Barbier H, Rouse MN, Singh S, Singh RP, Bhavani S et al (2014) A consensus map for Ug99 stem rust
 resistance loci in wheat. Theor Appl Genet 127(7):1561-1581
- Yu LX, Lorenz A, Rutkoski J, Singh RP, Bhavani S, Huerta-Espino J, Sorrells ME (2011) Association mapping and
 gene-gene interaction for stem rust resistance in spring wheat germplasm. Theor Appl Genet 123:1257–1268
- 717 Zegeye H, Rasheed A, Makdis F, Badebo A, Ogbonnaya FC (2014) Genome-wide association mapping for seedling
- and adult plant resistance to stripe rust in synthetic hexaploid wheat. PLoS ONE 9(8):e105593.
- Zhang Z, Ersoz E, Lai CQ, Todhunter RJ, Tiwari HK, Gore MA, Bradbury PJ, Yu J, Arnett DK, Ordovas JM
 Buckler ES (2010) Mixed linear model approach adapted for genome-wide association studies. Nature genetics
 42(4):355-360
- Zwart RS, Thompson JP, Milgate AW, Bansal UK, Williamson PM, Raman H, Bariana HS (2010) QTL mapping of
 multiple foliar disease and root-lesion nematode resistances in wheat. Mol Breed 26:107–124

Table 1. List of significant markers that are associated with six fungal disease resistances and previously reported genes and QTL in

725	the regions of QTL identified in this study.
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Disease	QTL	Marker	Chr ^a	Position	Р	MAF ^b	R ²	FDR ^c	Add ^d	Gene/Marker	Reference
Cr	Cr01	1384280	2BL	179.5	4.3E-04	0.31	9.2	0.95	0.6	wPt-9336	Eberhard 2011
Cr	Cr02	983467	3BL	130.3	8.7E-04	0.25	8.2	0.95	0.6	wPt-5390	Poole et al. 2012
Cr	Cr03	3022945	7DL	265.4	1.0E-03	0.15	8.0	0.95	-0.7	wPt-3462	Ma et al. 2010
Cr	Cr03	1365344	7DL^*	-	8.8E-04	0.25	8.2	0.95	0.6	wPt-3462	Ma et al. 2010
Cr	Cr03	3021273	7DL^*	-	4.0E-04	0.43	9.3	0.95	0.5	wPt-3462	Ma et al. 2010
Lr	Lr01	Lr46/Yr29 ¹	1BL	-	5.8E-04	0.28	8.4	0.95	-1.7	Lr46	William et al. 2003
Lr	Lr02	985475	1DS	47.8	8.6E-04	0.13	6.7	0.95	-1.2	Lr42	Sun et al. 2010
Lr	Lr03	1106131	2DL	257.2	8.1E-04	0.27	6.7	0.95	-1.5	Lr39	Singh et al. 2004
Lr	Lr03	1097758	$2DL^*$	-	3.1E-04	0.25	7.8	0.95	-1.1	Lr39	Singh et al. 2004
Lr	Lr04	<i>1126111</i> ²	$6D^*$	-	1.0E-03	0.25	4.9	0.95	1.1	Lr38	Mebrate et al. 2008
Lr	Lr04	<i>1126778</i> ²	6D*	-	9.1E-04	0.24	5.5	0.95	1.1	Lr38	Mebrate et al. 2008
Lr	Lr04	3027151	6D*	-	3.0E-04	0.20	7.9	0.95	1.6	Lr38	Mebrate et al. 2008
Lr	Lr05	1047131	7DL	198.2	2.8E-04	0.31	8.0	0.95	1.3	Lr19	Gupta et al. 2006
Lr	Lr05	2337373	7DL^*	-	8.8E-04	0.27	6.6	0.95	1.3	Lr19	Gupta et al. 2006
SNG	SNG01	wPt-1657	2AL	129.8	3.1E-05	0.20	13.4	0.19	0.8	QSng.daw-2A	Shankar et al. 2008
SNG	SNG02	1107710	2BL	163.8	8.1E-04	0.30	8.5	0.81	1.2	XU36894	Czembor et al. 2003
SNG	SNG03	wPt-7825	2DL	289.8	4.6E-05	0.14	12.8	0.19	0.9	wPt-665102	Adhikari et al. 2011
SNG	SNG04	wPt-8079	3BS	18.1	7.7E-04	0.16	8.6	0.81	0.7	Xbarc147	Czembor et al. 2003
SNG	SNG04	wPt-2757	3BS	26.3	3.3E-04	0.20	9.8	0.63	0.7	Xbarc147	Czembor et al. 2003
SNG	SNG04	wPt-3921 ³	3BS	27.9	8.3E-04	0.17	7.8	0.81	0.7	Xbarc147	Czembor et al. 2003
SNG	SNG05	1094836 ⁴	4BL	78.2	1.0E-03	0.45	6.2	0.91	0.7	QSng.daw-4B	Shankar et al. 2008
SNG	SNG06	wPt-8262	5AL	233.0	2.3E-05	0.16	13.9	0.19	0.9	QSnn.niab-5A.1	Cockram et al. 2015
SNG	SNG07	1019982 5	$6B^*$	-	9.7E-04	0.06	8.2	0.81	1.5	QSng.sfr-6BL	Schnurbusch et al. 2003
SNG	SNG08	1263913	7DS	44.6	1.5E-04	0.35	11.0	0.42	2.0	QSb.bhu-7D	Kumar et al. 2010
SNG	SNG08	1233921	7DL	224.4	3.6E-04	0.32	9.7	0.63	-2.0	QSb.bhu-7D	Kumar et al. 2010

SNG	SNG08	1216888	7DL^*	-	1.7E-04	0.32	10.8	0.42	-1.9	QSb.bhu-7D	Kumar et al. 2010
SNG	SNG08	1227840	$7DL^*$	-	7.0E-04	0.31	8.7	0.81	-1.1	QSb.bhu-7D	Kumar et al. 2010
SNL	SNL01	1208964	$7B^*$	-	1.4E-03	0.35	8.4	1	0.9	QSnl.eth-7B3	Aguilar et al. 2005
Sr	Sr01	1006460	1BL	289.0	2.4E-04	0.48	9.7	0.81	-0.9	Sr58	Yu et al. 2014
Sr	Sr02	1088175	2DS	36.1	3.3E-04	0.34	9.3	0.81	-1.1	Sr46	Yu et al. 2015
Sr	Sr02	2247181	2DS	40.8	7.7E-04	0.42	8.1	0.98	-1.2	Sr46	Yu et al. 2015
Sr	Sr02	1109593	$2DS^*$	-	1.8E-04	0.38	10.1	0.81	-1.0	Sr46	Yu et al. 2015
Sr	Sr03	1101415	$2DL^*$	-	4.0E-04	0.37	9.0	0.81	2.2	-	Novel
Sr	Sr03	1102301	$2D^*$	-	5.0E-04	0.36	8.5	0.88	1.8	-	Novel
Sr	Sr04	wPt-3921 ³	3BS	27.9	1.1E-03	0.19	7.5	0.98	-0.7	wPt-3921	Yu et al. 2014
Sr	Sr05	1094836 ⁴	4BL	78.2	1.1E-03	0.44	7.7	0.98	-0.9	Sr37	Yu et al. 2014
Sr	Sr05	wPt-8543	4BL	98.0	4.6E-04	0.21	8.8	0.81	-0.8	Sr37	Yu et al. 2014
Sr	Sr06	1019982 ⁵	$6B^*$	-	1.1E-03	0.07	6.0	0.98	-1.3	wPt-5333	Yu et al. 2011
Sr	Sr07	983699	6DL	190.9	3.8E-04	0.38	9.1	0.81	-0.8	Sr29	Yu et al. 2014
Sr	Sr07	2255204	6DL	194.0	1.7E-04	0.25	10.2	0.81	-1.2	Sr29	Yu et al. 2014
YLS	YLS01	wPt-2706	1BS	109.6	5.0E-04	0.34	7.5	0.29	-0.6	QTs.fcu-1BS	Faris & Friesen 2005
YLS	YLS02	3034128	2DL	252.2	5.0E-04	0.06	7.5	0.29	-1.2	wPt-664805	Gurung et al. 2011
YLS	YLS02	2242263	2DL	254.3	5.6E-04	0.07	7.4	0.3	-1.2	wPt-664805	Gurung et al. 2011
YLS	YLS02	1385233	2DL	292.4	7.4E-04	0.06	7.0	0.35	-1.2	wPt-664805	Gurung et al. 2011
YLS	YLS02	1052396	$2DL^*$	-	2.1E-05	0.06	11.4	0.15	-1.4	wPt-664805	Gurung et al. 2011
YLS	YLS02	1101263	$2DL^*$	-	6.9E-04	0.07	7.1	0.34	-1.1	wPt-664805	Gurung et al. 2011
YLS	YLS02	1072100	$2DL^*$	-	4.6E-04	0.07	7.6	0.29	-1.2	wPt-664805	Gurung et al. 2011
YLS	YLS02	1092634	$2DL^*$	-	1.2E-04	0.05	9.3	0.2	-1.4	wPt-664805	Gurung et al. 2011
YLS	YLS02	1097383	$2DL^*$	-	3.1E-04	0.06	8.0	0.29	-1.2	wPt-664805	Gurung et al. 2011
YLS	YLS02	1100277	$2DL^*$	-	1.2E-04	0.05	9.3	0.2	-1.4	wPt-664805	Gurung et al. 2011
YLS	YLS02	1100904	$2DL^*$	-	5.0E-04	0.06	7.5	0.29	-1.2	wPt-664805	Gurung et al. 2011
YLS	YLS02	1118682	$2DL^*$	-	1.2E-04	0.05	9.3	0.2	-1.4	wPt-664805	Gurung et al. 2011
YLS	YLS02	1135085	$2DL^*$	-	5.6E-04	0.06	7.3	0.3	-1.2	wPt-664805	Gurung et al. 2011
YLS	YLS02	1144738	$2DL^*$	-	3.7E-05	0.06	10.7	0.15	-1.5	wPt-664805	Gurung et al. 2011
YLS	YLS02	1319101	$2DL^*$	-	5.0E-04	0.06	7.5	0.29	-1.2	wPt-664805	Gurung et al. 2011

YLS	YLS02	2241933	$2DL^*$	-	5.0E-04	0.06	7.5	0.29	-1.2	wPt-664805	Gurung et al. 2011
YLS	YLS02	2242411	$2DL^*$	-	5.0E-04	0.06	7.5	0.29	-1.2	wPt-664805	Gurung et al. 2011
YLS	YLS03	1116422	3DS	8.3	2.2E-04	0.14	8.5	0.26	-0.9	tsn3	Tadesse et al. 2007
YLS	YLS03	1122499	3D	97.7	4.4E-05	0.29	10.4	0.15	1.1	tsn3	Tadesse et al. 2007
YLS	YLS03	1089159	3DL	170.1	7.1E-04	0.26	7.1	0.34	-0.8	tsn3	Tadesse et al. 2007
YLS	YLS03	3020470	3DL	270.5	4.9E-05	0.30	10.3	0.15	1.0	tsn3	Tadesse et al. 2007
YLS	YLS03	3222137	$3DL^*$	-	4.5E-04	0.37	7.6	0.29	-1.6	tsn3	Tadesse et al. 2007
YLS	YLS04	1037337	6DL	169.1	7.9E-04	0.13	6.9	0.36	0.8	-	Novel
YLS	YLS04	100018632	6DL^*	-	9.4E-04	0.26	6.7	0.4	-0.7	-	Novel
YLS	YLS04	1114521	6DL^*	-	3.7E-04	0.20	7.9	0.29	0.8	-	Novel
YLS	YLS04	<i>1126111</i> ²	6DL^*	-	8.3E-03	0.24	5.0	0.74	-0.6	-	Novel
YLS	YLS04	1126778 ²	6DL^*	-	7.7E-04	0.23	5.5	0.61	-0.7	-	Novel
YLS	YLS04	1139583	6DL^*	-	1.6E-04	0.37	8.8	0.25	0.7	-	Novel
YLS	YLS04	1233591	6DL^*	-	2.2E-04	0.15	8.5	0.26	0.8	-	Novel
YLS	YLS04	2249359	6DL^*	-	2.4E-04	0.30	8.4	0.26	1.0	-	Novel
YLS	YLS05	1054897	7DL^*	-	9.3E-04	0.21	6.7	0.4	-0.7	wPt-730876	Gurung et al. 2011
Yr	Yr01	988333	1BL	162.3	6.8E-04	0.41	10.4	1	0.9	QYr.tam-1B	Basnet et al. 2014
Yr	Yr01	1093720	$1BL^*$	-	5.7E-04	0.35	10.7	1	1.0	QYr.tam-1B	Basnet et al. 2014
Yr	Yr02	LR46/Yr29 ¹	1BL	-	4.4E-04	0.28	11.1	0.95	-1.5	Yr29	William et al. 2003
Yr	Yr03	wPt-1615	2AL	212.0	1.2E-04	0.35	13.5	0.76	0.8	QRYr2A.2	Dedryver et al. 2009
Yr	Yr03	wPt-2858	2AL	212.0	1.2E-04	0.35	13.5	0.76	0.8	QRYr2A.2	Dedryver et al. 2009
Yr	Yr04	wPt-8776	2BL	167.7	5.6E-04	0.25	10.7	1	0.8	-	Novel
Yr	Yr05	100136169	3D*	-	5.5E-04	0.36	10.8	1	-0.7	-	Zegeye et al. 2014
Yr	Yr05	1267912	3D*	-	4.5E-04	0.24	11.2	1	-1.2	-	Zegeye et al. 2014
Yr	Yr06	wPt-8153	6BS	25.8	9.2E-04	0.32	9.4	1	0.7	QRYr6B.1	Santra et al. 2008

^a Chr: Chromosome; ^b MAF: minor allele frequency; ^c FDR: false discovery rate; ^d Add: Additive effect; ^{*} Chromosomes determined
 by linkage disequilibrium with other markers; Numbers from ¹⁻⁵ account for markers with multiple associations.

Disease	QTL	Marker	Chr ^a	Р	MAF ^b	R ²	MM ^c
Lr	Lr01	LR46	1BL	3.8E-03	0.22	4.2	LR46 *
Lr	Lr05	tPt-4614	7DL	1.9E-03	0.48	7	1047131
SNG	SNG04	wPt-3921	3BS	3.5E-03	0.33	5.6	wPt-3921 *
SNG	SNG04	wPt-8079	3BS	1.9E-03	0.48	7	wPt-8079
SNG	SNG04	wPt-2757	3BS	2.1E-03	0.49	6.7	wPt-2757
SNG	SNG05	wPt-7412	4BL	5.0E-03	0.45	6.7	1094836 *
SNL	SNL01	wPt-5069	7B	5.0E-03	0.2	7.6	1208964
Sr	Sr01	wPt-6690	1BL	3.1E-03	0.48	5.1	1006460
Sr	Sr06	wPt-1113	6B	2.4E-03	0.39	5.6	1019982 *
Sr	Sr07	wPt-2518	6DL	2.4E-03	0.44	5.6	2255204
YLS	YLS01	wPt-9524	1BS	4.5E-03	0.14	5.6	wPt-2706
YLS	YLS02	wPt-2644	2DL	4.5E-03	0.41	5.6	1052396
Yr	Yr02	LR46	1BL	3.1E-03	0.4	4.5	LR46 *

729 Table 2: List of validated QTL and their associated markers.

730

731 ^a Chr: Chromosome

732 ^bMAF: minor allele frequency

^c MM: main set marker

^{*} Account for markers with multiple associations.

735

737 Table 3 Gene–gene interactions for the studied disease resistances.

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Disease	ID	QTL	Marker1	R/S ^a	Chr ^b	Marker2	Alleles	Chr ^b	Pos ^c	R ²	Р	FDR
Lr	GG01	Lr04	1126778	A/G	6D*	2280676	A/G	3BL*	-	21.9	9.1E-08	8.2E-07
Lr	GG01	Lr04	1126778	A/G	6D*	3222491	C/G	3BL	264	16.7	3.2E-07	2.5E-06
Lr	GG01	Lr04	1126778	A/G	6D*	1E+08	A/G	3BL*	-	21.3	3.1E-07	1.6E-06
Lr	GG02	Lr04	1126778	A/G	6D*	1208017	A/G	6B*	-	16.3	5.4E-07	3.3E-06
Lr	GG02	Lr04	3027151	A/C	6D*	2277702	C/T	6B*	-	16.4	5.7E-07	4.1E-06
Sr	GG03	Sr03	1101415	A/G	2DS*	1262585	A/G	2AS	16	18.2	4.8E-07	1.2E-06
Sr	GG03	Sr03	1102301	T/C	2DS*	1262585	A/G	2AS	16	19.2	1.7E-07	5.9E-07
YLS	GG04	YLS04	1139583	T/C	6DL*	1225863	C/T	1DL	217	24.4	6.6E-07	2.5E-06
YLS	GG05	YLS04	1126778	G/A	6DL*	1862984	C/G	6B*	-	15.9	3.3E-07	8.2E-07

739

740 ^a R/S: resistance/susceptible alleles

- 741 ^b Chr: Chromosome
- ^c Pos: Position on the linkage map (cM)

744 FIGURE LEGENDS

Figure 1 Gene-by-trait bi-plot of the reaction of SHWs to the six studied diseases, *Septoria Nodorum* has two scores (SNG and SNL). The arrow in the middle of the circles represents the position of the ideal genotype. Both PC1 and PC2 explained about 42.75% of the total variation. Green names represent SHWs while blue names represents traits.

Figure 2 Principal component analysis of the studied 320 SHWs. The red crosses represent the validation set while the blue squares represent the main set. The first two principal components explained together about 21.3% of the total variation.

Figure 3 Average disease score (the allelic effect) for each allele combination of the interactions a) GG01; b) GG02; c) GG03; d) GG04; and e) GG05. Significant differences were estimated via permuted t-test and the stars indicate levels of significance, "*" = P < 0.05; "*" = P< 0.01; *** = P < 0.001; "-" = not significant. For interactions detected with multiple markers in table 3, the highest P value only was presented here. X-axis is the allele combination between the resistance (R) and the susceptible (S) alleles with marker alleles that interacted.

759 Supporting Information

- Table S1 List of the 320 synthetic hexaploid wheat genotypes used in this study, theirpedigrees and their phenotypes scored from 1 (susceptible) to 9 (resistant).
- Table S2 The number of mapped DArT and DArTSeq markers on each wheat chromosome
- Table S3 The full genotypic data for both main and validation sets
- Table S4 Genotypes of the associated marker for the main set
- Table S5 QTL detected in the validation panel only
- Figure S1 Results of the response of 320 SHWs to each of the six diseases evaluated. YLS =
- yellow leaf spot, Cr = crown rot, Lr = leaf rust, Sr = stem rust, Yr = yellow rust, SNL =
- 768 Stagonospora nodorum leaf blotch, SNG = Stagonospora nodorum glume blotch. S =
- susceptible, MS = moderately susceptible, MR = moderately resistant, and R = resistant
- Figure S2 Pseudo-heritability estimation inferred from the mixed model for the studied traits
- Figure S3 Map position of both DArT (red) and DArTSeq (black) markers on wheat genome
- Figure S4 Phylogenetic tree of the 320 SHWs, red genotypes represent the main set while
- blue genotypes represent the validation set
- Figure S5 Kinship relations for the 320 SHWs

Figure S6 Scatter plot for the genetic distance against R^2 value for each pair of markers on the same chromosome (LD decay) for a) whole genome; b) genome A; c) genome B; d) genome D. Red lines represent the LOESS second degree smoothing while the blue horizontal lines represents the R^2 cut off 0.2

- Figure S7 Inter-chromosomal R^2 values for each pair of markers for each genome
- Figure S8 Manhattan and QQ plots for studied traits. Cr = crown rot, Lr = leaf rust, Sr = stem
- rust, Yr = yellow rust, SNL = *Stagonospora nodorum* leaf blotch, SNG = *Stagonospora nodorum*

- glume blotch and YLS = yellow leaf spot. Chromosomes were numbered starting from the
- homoeologous chromosome group one to seven with within group order of A, B and D genome,
- respectively. Chromosome 22 represents the unmapped markers.
- Figure S9 The average disease score (the allelic effect) for the alleles of the markers with
- multiple associations. For the 6D QTL, we used only the marker *1126778*.











