Creation and judicious application of a wheat resistance gene atlas

Amber N. Hafeez¹, Sanu Arora¹, Sreya Ghosh¹, David Gilbert¹, Robert L. Bowden², Brande B. H. Wulff¹

5

1 2 3

4

6

7

8

¹John Innes Centre, Norwich Research Park, Norwich, UK

²USDA-ARS, Hard Winter Wheat Genetics Research Unit, Manhattan, KS 66506, USA

9 Abstract

10 Disease resistance (R) gene cloning in wheat (Triticum aestivum) has been accelerated by the recent 11 surge of genomic resources, facilitated by advances in sequencing technologies and bioinformatics. 12 However, with the challenges of population growth and climate change ahead of us, it is vital not 13 only to clone and functionally characterise a few handfuls R genes, but to do so at an 14 agroecologically relevant scale. Pathogen populations are continually changing, and breeders must 15 have tools and resources available to respond to those changes as quickly as possible if we are to 16 safeguard our daily bread. To meet this challenge, we propose the creation of a wheat R gene atlas 17 by an international community of researchers and breeders. The atlas would take the form of an 18 online directory from which sources of resistance could be identified and deployed to achieve more 19 durable resistance to the major wheat pathogens, such as wheat rusts, blotch diseases, powdery 20 mildew and wheat blast. We present a costed proposal detailing how the interacting molecular 21 components governing disease resistance could be captured from both the host and pathogen 22 through biparental mapping, mutational genomics and whole-genome association genetics. We 23 explore options for the effective configuration and genotyping of diversity panels of hexaploid and 24 tetraploid wheat, as well as their wild relatives and major pathogens, and discuss how the atlas 25 could inform a dynamic, durable approach to R gene deployment. Set against the current magnitude of wheat yield losses worldwide (recently estimated at 209 million tonnes each year; Savary et al., 26 27 2019a), this endeavour presents one route for bringing R genes from the lab to the field at a 28 considerable speed and quantity.

29

30 Introduction

31 The recent discovery of charred breadcrumbs in an ancient Natufian fireplace in north-eastern 32 Jordan revealed that bread making was practised long before the dawn of agriculture (Arranz-33 Otaegui et al., 2018). This early bread, made from wild grasses (Arranz-Otaegui et al., 2018), would 34 have required extensive labour to forage, peel and grind the grains. It took another 3,000 years 35 before wild grasses were domesticated and cultivated, which gave farmers far greater control over 36 food production and thereby laid the foundation for early civilisations in the Fertile Crescent. 37 Today, wheat (Triticum aestivum) provides 18% of the calories and 19% of the protein consumed 38 by humankind (FAOSTAT, 2017; http://www.fao.org/faostat/en/#data/FBS). The sudden 39 disruption of this supply can lead to famine and civil unrest; for example, many observers have 40 noted the correlation between poor wheat harvests around the world in 2010, the associated sharp 41 rise in the price of bread in North Africa and the Middle East, and the Arab Spring, which led to 42 the toppling of governments across the region (Zurayk and Khalidi, 2011).

43

44 Diseases and pests constitute a major limitation to wheat production, reducing the world's projected 45 harvest by an average of 21% every year (Savary et al., 2019a; Fig. 1). The top four pests and 46 diseases account for over half of this loss (Fig. 1). These damaging agents are seldom evenly spread; 47 their sudden and unexpected appearance can rapidly cause an epidemic leading to large-scale 48 regional crop failure (Saari and Wilcoxson, 1974; Hovmøller, Walter and Justesen, 2010; Islam et 49 al., 2016). Control measures include pesticides, quarantine and breeding to combine genetic 50 variation for enhanced resistance with other traits, such as grain yield. Genetic resistance constitutes 51 an economical and environmentally friendly way to control disease and is especially important for 52 those farmers who lack access to pesticides, whether due to prohibitive costs or regulations. 53 Moreover, the frequent and excessive application of pesticides can lead to selection for pathogen

resistance to these chemical compounds (Omrane *et al.*, 2017), further demonstrating the need for genetic resistance in crops.

56

57 A series of polyploidisation events in the evolutionary history of wheat, followed by domestication 58 10,000 years ago, sampled only a fraction of the genetic diversity at each successive step (Lu, 2020; 59 Fig. 2). Breeding over the last 200 years has further reduced this diversity (Pont et al., 2019; Zhou 60 et al., 2020), with modern farming practices portioning the remaining diversity into monocultures prone to epidemics. It has long been recognised that the wild progenitors, landraces and 61 62 domesticated relatives of bread wheat constitute a reservoir of genetic diversity that can be 63 exploited to improve disease and pest resistance (Feuillet, Langridge and Waugh, 2008). Indeed, 64 over the last 100 years, the bread wheat gene pool has been endowed with 204 exotic resistance (R) 65 genes, constituting 44% of the 467 R genes designated in wheat (Fig. 2; Table S1). Notable 66 successes include the stem rust resistance genes Sr2, Sr25 and Sr31 introduced from emmer wheat 67 (Triticum turgidum), tall wheat grass (Thinopyrum obtusiflorum) and rye (Secale cereale), 68 respectively (Pan, 1940; Friebe et al., 1994; Lukaszewski, 2000). Unfortunately, the breeding 69 timelines are typically long (15 to 20 years; Erickson, 1945) and suffer from linkage drag – the co-70 introduction of deleterious linked alleles (Olson et al., 2010; Niu et al., 2014). Moreover, when 71 only single R genes are deployed, these are often rapidly overcome by the pest or pathogen 72 (McDonald and Linde, 2002).

73

74 In this review, we argue that, combined with large-scale phenotyping, sequenced diversity panels 75 of (i) wheat and wild progenitors and (ii) pathogen isolates causing major diseases of wheat could 76 be employed to rapidly identify and clone large numbers of R genes and their corresponding 77 pathogen effectors. Our vision is to create an atlas of characterised R genes from bread and durum 78 wheat, as well as their direct tetraploid and diploid progenitors, to support wheat pre-breeding and 79 breeding. Combined with the monitoring of effectors in pathogen populations, this would enable 80 conventional breeders and genetic engineers to more efficiently and judiciously manage natural 81 variation for disease resistance, for example by eliminating varieties reliant on a single R gene and 82 creating and maintaining broad-spectrum R gene stacks effective against many strains of different 83 pathogens.

- 84
- 85

86 Molecular components of the atlas

B7 During infection, pathogens secrete proteins known as effectors or avirulence (Avr) proteins. Plant hosts have evolved surface and intracellular immune receptors to recognise these molecules. They are generally encoded by R genes, and often interact with effectors in a gene-for-gene relationship (Flor, 1971). Effector detection triggers the initiation of defence responses that can limit pathogen proliferation in the host. These interacting molecules are the essential components of the atlas. Their structure, function and evolution have been explored in more detail in other reviews (e.g., Jones and Dangl, 2006; Cook, Mesarich and Thomma, 2015).

94

95 Diversifying selection, acting on variation generated by recombination and mutation, has often 96 resulted in great diversity between R gene loci (Kuang et al., 2004; Van de Weyer et al., 2019; 97 Hatta et al., 2020). The vast majority of major-effect dominant R genes cloned to date have been 98 found to encode intracellular nucleotide-binding and leucine-rich repeat (NLR) immune receptors 99 (Kourelis and Van Der Hoorn, 2018). NLR-mediated resistance is typically race-specific (i.e., gene-100 for-gene) and operates at all stages of plant growth (Periyannan et al., 2017). Some dominant race-101 specific R genes encoding membrane-anchored surface receptors have also been identified, such as 102 Xa21 (Song et al., 1995), conferring bacterial blight resistance in rice (Oryza sativa), and Stb6 103 (Saintenac et al., 2018), conferring resistance to Septoria tritici Blotch (STB). There are also some 104 cases of cloned recessive R genes; for example, the mlo gene in barley (Hordeum vulgare) and 105 wheat encodes a multi-transmembrane protein and confers resistance to powdery mildew (Wang et 106 al., 2014; Acevedo-Garcia et al., 2017). Examples of non-NLR R genes in wheat include the cloned 107 rust adult plant resistance (APR) genes, which encode proteins belonging to disparate structural 108 classes, including an ABC transporter (Lr34; Krattinger *et al.*, 2009), a protein kinase (Yr36; Fu *et al.*, 2009) and a hexose transporter (Lr67; Moore *et al.*, 2015). These non-NLRs are effective only 110 at the adult plant stages, are not race- or pathogen-specific, and are more quantitative in nature, 111 conferring only partial resistance. This may make them less vulnerable to the process of reciprocal 112 pathogen co-evolution since they present a relatively weak selection pressure.

113

114 The wheat R gene catalogue must be expanded to facilitate deployment in a variety of combinations, 115 with the aim of slowing down pathogen co-evolution and improving durability. Cloning genes 116 offers insight into their mechanism of function, which in turn allows R genes with complementary 117 functions to be combined. Perfect markers can also be designed from cloned R genes, facilitating 118 their tracking in breeding programs and integration with quantitative resistance. Combining this 119 with information about the corresponding effectors, such as their frequencies in pathogen 120 populations and their fitness costs, will help to predict combinations of R genes that provide 121 effective and durable resistance.

122 123

124 **Populating the atlas:** *R* genes

125 Methods of *R* gene cloning

126 To date, 38 wheat R genes have been cloned, more than half of which have been contributed by the 127 species other than bread and durum wheat (Table S2). The process of isolating R genes from wider 128 gene pools is challenging, however, and it is progressively more difficult to transfer genetic material 129 to wheat from the secondary and tertiary gene pools (Harlan and de Wet, 1971). Conventionally, a 130 biparental mapping population would be generated, using parents with contrasting phenotypes 131 followed by the selfing of the offspring to generate a segregating population (Fig. 2). The mapping 132 population is genotyped and phenotyped to facilitate the coarse mapping of the R gene locus, 133 followed by high-resolution mapping and positional cloning. This resource-intensive, time-134 consuming process is often hampered by suppressed recombination between the mapping parents 135 - particularly when the target R gene resides in chromatin from the secondary or tertiary gene pool.

136

137 Mutational genomics can overcome the limitation of recombination. This strategy is based on 138 mutagenesis using a mutagen, such as ethyl methanesulfonate, followed by the phenotypic 139 screening and sequencing of multiple independently-derived susceptible mutants to identify the 140 candidate gene. Mutagenesis can be combined with capture-based methods to reduce the 141 complexity of the sequence data gathered from genomes. The NLR gene family shares distinct 142 protein motifs that can be used to guide the design of specific probes for R gene enrichment 143 sequencing (RenSeq; Jupe et al., 2013). Mutational genomics combined with RenSeq (MutRenSeq) 144 was used to isolate the wheat rust resistance genes Sr22, Sr26, Sr45, Sr61, Yr5a, Yr5b and Yr7, and 145 the powdery mildew resistance gene Pm21 (Table S2; Steuernagel et al., 2016; Marchal et al., 146 2018; Xing et al., 2018; Zhang et al., 2020); however, capture-based methods are biased towards 147 the annotated genes for which probes have been designed. To reduce genome complexity in an 148 unbiased and lossless manner, specific chromosomes can be flow sorted and sequenced from the 149 wild type and several independent mutants, followed by a sequence comparison for the 150 identification of a candidate gene (MutChromSeq; Sánchez-Martín et al., 2016). With declining 151 sequencing costs, such reduced representation methods may not be necessary even for large 152 Triticeae genomes.

153

154 These methods require the genetic isolation of the R gene followed by further crossing or 155 mutagenesis, which is time consuming and generally restricted to the cloning of one gene per 156 population. Performing mutagenesis on wild species can be particularly challenging due to their 157 poor agronomy and, in the case of diploids, limited genetic redundancy, which necessitates the 158 generation of mutant populations more than ten times larger than those required for hexaploid wheat 159 (Uauy, Wulff and Dubcovsky, 2017). An alternative is to take advantage of Mother Nature's own genetically structured populations that have accumulated recombinations and mutations over 160 161 thousands of generations. This can be achieved through association mapping with diversity panels,

which can determine genotype-trait correlations to permit the identification of markers tightly
linked to the trait of interest (Togninalli *et al.*, 2018), providing the opportunity to clone many genes
of interest from one sequence-configured population.

165

166 **Building diversity panels**

167 For the successful implementation of association genetics, effort must be made to develop suitable 168 diversity panels - collections of individual accessions representing the genetic and phenotypic 169 diversity of a population or species. There are several diversity panels of wheat and wild wheat 170 progenitors available from different gene banks around the globe; however, many gene banks lack 171 sufficiently informative catalogues, leading to redundancy between collections. Singh et al. (2019) 172 found that over 50% of Aegilops tauschii accessions had been duplicated both within and between 173 gene banks. Similarly, Bonman et al. (2015) explored genetic diversity among wheat accessions 174 from the USDA National Small Grains Collection and found that most of the accessions were nearly 175 identical to at least one other accession in the core subset. Given the cost of managing germplasm 176 resources, it would be useful to compare the stocks held in different gene banks and weed out 177 duplicate accessions. This would permit the more efficient utilisation of the germplasm and lower 178 the barrier to mobilising novel genetic variation into breeding programs. Such a curation effort has 179 been undertaken by the Seeds of Discovery project (CIMMYT, Mexico), wherein ~80,000 wheat 180 accessions have been genotyped and core lines representing the genetic diversity of wheat have 181 been identified (Sansaloni et al., 2020).

182

183 A good diversity panel evenly captures the genetic diversity of the species across its distributional 184 range. Uneven sampling may increase the effect of population demographic history on genome-185 wide association studies (GWAS); for example, the presence of accessions that are highly 186 genetically and phenotypically similar can potentially inflate the allelic frequencies and linkage 187 disequilibrium (LD) among unlinked loci, which can cause false positive associations (Arora et al., 188 2017). This can be mitigated through the removal of such accessions and the application of 189 statistical methods to control the impact of population structure (Zhang et al., 2010; Bartoli and 190 Roux, 2017). Additionally, if a phenotype is controlled by several genes or alleles which are each 191 specific to different genetic groups within the population, the power to detect a candidate gene is 192 reduced. The effects of genetic and allelic heterogeneity can be effectively controlled by performing 193 analyses separately for each genetic group. This can result in greater power and resolution, despite 194 the reduction of panel size. Of course, association genetics is not a viable approach in all cases; for 195 example, some genes may be extremely rare, such as the lettuce (Lactuca sativa) downy mildew 196 resistance gene Dm3, which was found to be present in only 1 of 1033 wild accessions (Kuang et 197 al., 2006). It would also be difficult to identify candidate genes through GWAS when the LD blocks 198 of the associated region are very large, such as in non-recombining alien chromosome segments. 199 Through characterising 'low-hanging fruit' via association mapping, those accessions containing 200 unexplained resistance sources can be interrogated by generating biparental mapping or mutant 201 populations. Thus, this approach can help to ensure that the best cloning method is applied to each 202 gene.

In short, while a large and diverse panel increases the power of association, care must be taken to avoid a skewed population structure. Phenotyping a panel can be both difficult and expensive, and germplasm may be limited; therefore, it is advisable to first evaluate the phenotypic variation in a reduced core set of accessions that captures the majority of allelic diversity. Phenotypes exhibiting sufficient variation in the reduced core set are more likely to be worth carrying forward on the whole panel.

209

210 Genotyping diversity panels

Most association studies to date have used single-nucleotide polymorphisms (SNPs) as genetic markers, since they are widely distributed across the genome and can be cost-effectively scored using arrays containing probes for thousands of SNPs. These arrays typically only capture a fraction of the genetic variation within a population however, since they fail to capture structural variants

such as copy number variations (CNVs) and insertion–deletions (indels). Furthermore, the preselection of SNPs with high minor allele frequencies may reduce the likelihood of finding markers

in LD with rare resistances.

218 Another option is to perform reduced representation sequencing, such as exome or gene family 219 capture sequencing, or whole-genome shotgun sequencing. Rather than using SNPs, reference bias 220 can be mitigated by performing associations directly on k-mers, sub-sequences of length k, which 221 can be generated directly from raw sequence reads (Audano, Ravishankar and Vannberg, 2018; 222 Rahman et al., 2018: Arora et al., 2019: Voichek and Weigel, 2020). If k-mer variation in the panel 223 is correlated with phenotypic variation, then k-mers significantly associated with the trait of interest 224 can be used to assemble the reads from which they were derived or mapped directly to a *de novo* 225 assembly generated from an accession expressing the trait. For example, association genetics in 226 combination with RenSeq (AgRenSeq) was successfully applied to an Aegilops tauschii diversity 227 panel, which allowed the rapid identification of four stem rust R genes (Arora et al., 2019).

- 228 When the *de novo* assembly used as a reference for *k*-mer mapping is fragmented, it can be difficult 229 to infer the complete sequence of the target gene. The situation can become more complex when a 230 candidate gene is in LD with other genes in the vicinity of the true candidate; this may result in 231 distinct association signals, implying several candidate genes are responsible for the phenotype. 232 These problems can be mitigated through the use of a better-quality assembly to fetch the haplotype 233 block surrounding the candidate gene. The continued drop in the cost of DNA sequencing now 234 makes it economically feasible to generate a library of high-quality *de novo* assemblies for the core 235 accessions that represent most of the genetic diversity in the panel; for example, 38 accessions are 236 enough to represent 95% of the pan-NLR repertoire in Arabidopsis thaliana (Van de Wever et al., 237 2019). In this review, we have classified Triticeae assemblies into four categories - gold+, gold, 238 silver and bronze—by the quality of the information that they provide (Fig. 4). By implementing a 239 tiered sequencing approach, the maximum amount of genetic diversity can be captured while 240 limiting computational and sequencing costs.
- 241 The first step in sequence-configuring a diversity panel is to perform cost-effective genotyping 242 (e.g., genotyping-by-sequencing (Elshire et al., 2011) or low-coverage whole-genome skim 243 sequencing (Huang et al., 2009)) to permit quality checking for the removal of duplicates and 244 accessions with high levels of residual heterogeneity. This facilitates a population structure analysis 245 for the identification of major genetic groups and genetic relationships among accessions in the 246 population. Following this survey, accessions representing each genetic group can be selected to 247 generate gold+ assemblies consisting of chromosome-level pseudomolecules (IWGSC et al., 2018); 248 for example, eight to 11 accessions to represent the sub-groups in wheat (Wingen et al., 2014; 249 Balfourier et al., 2019) or two to represent the main Aegilops tauschii sub-groups (Mizuno et al., 250 2010). Gold+ assemblies provide the position of all genes in their physical context, allowing the 251 position of a new candidate gene to be compared with known genes, the anchoring of contigs from 252 fragmented assemblies to infer their position, and the calling of SNP variation from shallow 253 sequencing data.
- 254 Gold-level assemblies can be used to define the haplotype blocks in the genome. Depending on the 255 size of the LD blocks, the scaffold size of these assemblies should be in the range of ~ 100 kb to 256 several Mb. This allows the interrogation of all genes in the LD block of an associated region. 257 Moreover, gold-level assemblies allow the identification of structural variants, which are important 258 determinants of plant phenotype (Alonge et al., 2020; Liu et al., 2020) including disease resistance 259 (Cook et al., 2012). The gene(s) most strongly correlated with the phenotype can then be identified 260 as the most likely candidate(s) for functional validation. To maximise the representation of the 261 haplotype diversity within a panel, 20-30 geographically and genetically distinct accessions 262 representing genetic sub-groups within each major group could be assembled to gold-level 263 standard.
- More cost-effective silver-level assemblies can be generated for additional tens of accessions, with scaffold sizes ranging from 5 to 15 kb. They provide gene-level resolution, including regulatory regions, which can be useful for designing and engineering gene constructs for the functional

validation of candidate genes. They can also be anchored to the reference assemblies for theidentification of small-scale structural variation.

269 The gold+, gold and silver assemblies could be used to construct an inter-connected graph-based 270 pangenome assembly containing the majority of the structural and sequence variation, as recently 271 demonstrated in soybean (Glycine max) (Liu et al., 2020). Pangenomes generated for other Triticum 272 species sequenced as part of the atlas project could also be combined to form a genus-wide "super-273 pangenome" (Khan et al., 2020). Following this, bronze-level sequencing generated from low-274 coverage Illumina reads can be carried out cost-effectively to genotype hundreds of individuals; 275 one-fold coverage or less is likely sufficient to impute their haplotype structure for use in GWAS 276 (Gilly et al., 2019).

Additional features could be included, such as the epigenetic status of gold-level accessions (Gardiner *et al.*, 2015), which, when combined with RNA-seq data for all accessions in the panel (Harper *et al.*, 2012), could provide insight into the regulation of gene expression (Kawakatsu *et al.*, 2016). This may help to explain disease resistance or virulence that cannot be elucidated through the interrogation of sequence variation alone; for example, epigenetics and small RNAs may play a role in the pathogenicity of the wheat leaf rust pathogen *Puccinia triticina* (Wu *et al.*, 2017).

283

Populating the atlas: Effectors

285 Not all combinations of R genes in a stack will be successful. Functional suppression is a common 286 problem in wheat breeding, especially following the introgression of chromosomes from wild 287 relatives with a lower ploidy level; resistance from these sources may become less potent, or even 288 ineffective, once in a hexaploid wheat background (Bai and Knott, 1992; Innes and Kerber, 1994; 289 McIntosh et al., 2011; Chen, Liu and Gao, 2013; Hiebert et al., 2020). One example is the post-290 translational suppression of the rve-derived powdery mildew NLR Pm8 by the orthologous wheat 291 gene Pm3, likely through the formation of non-functional protein complexes (Hurni et al., 2014). 292 It is therefore important to rigorously test the function of individual R genes in stacks to ensure that 293 single R genes do not become exposed to pathogens in isolation due to non-functioning stack 294 components. This is difficult or impossible to determine through pathogen assays due to epistasis 295 from the recognition of multiple effectors; however, with cloned effectors, it is possible to probe 296 the function of individual stack components using heterologous delivery systems. For example, the 297 functional verification of the Stagonospora nodorum host-selective toxin SnTox1 was carried out 298 by producing the effector protein in yeast then infiltrating the culture filtrate into wheat leaves to 299 induce necrosis (Liu et al., 2012). The improvement of transient expression systems in wheat, such 300 as virus-mediated overexpression (VOX) (Bouton et al., 2018) and transient expression in wheat 301 protoplasts (Saur et al., 2019), has facilitated the rapid functional analysis of intracellular effectors. 302

303 Cloning effectors

304 There are several approaches to cloning effector genes. Variation can be generated through 305 mutagenesis (Salcedo et al., 2017; Kangara et al., 2020), but there are challenges associated with 306 using mutant populations to clone effector genes: the presence of more than one nucleus in some 307 pathogen species (e.g. dikaryotic Puccinia spp. and stinking smut, Tilletia tritici), labour-intensive 308 bulking, applying an appropriate mutagen dose, and the difficulty of accurately identifying mutant 309 variants. Positional mapping has been used to clone effectors, such as from powdery mildew (Praz 310 et al., 2017) and Hessian fly (Aggarwal et al., 2014); however, the sexual recombination required 311 for creating a mapping population may not be straightforward for all pathogens and pests. The 312 sexual cycle is unknown for some, while others have complex heteroecious lifecycles involving 313 multiple hosts; for example, the wheat stem rust pathogen (Puccinia graminis) requires an alternate 314 host (usually barberry, Berberis vulgaris) to complete its sexual lifecycle.

315

316 Another approach would be to screen a genetically diverse set of pathogen isolates against a 317 differential set of wheat lines that contain known R genes – the complement to association genetic 318 studies focussed on the cloning of host R genes. While improvement on the host side could focus 319 on capturing lost genetic solutions to the problem of disease resistance (perhaps in wild grasses 320 with smaller genomes), on the pathogen side, the opportunity exists to sample swathes of the 321 standing genetic variation that contributes to virulence in the field, which is most directly relevant 322 to agriculture (Talas et al., 2016). Association studies have so far been used to clone effectors from 323 the pathogens Magnaporthe oryzae (Yoshida et al., 2009), Zymoseptoria tritici (Zhong et al., 2017) 324 and Stagonospora nodorum (Gao et al., 2016). Given the small size of pathogen genomes (in the 325 range of 30 to 60 Mbp for fungal plant pathogens (Aylward et al., 2017)), whole-genome 326 association genetics is feasible. Fewer than 100 sequenced pathogen isolates would likely be 327 sufficient to clone the major genes that have a gene-for-gene interaction with the host (Sánchez-328 Vallet et al., 2018), although for some pathogens a lack of sexual recombination and gene flow 329 could limit the power of association studies. Furthermore, by compiling pathogen diversity panels, 330 we can also elucidate the genetic structure of pathogen populations. This is a gateway to exploring 331 the evolutionary history and potential of pathogens, and therefore to better understanding the 332 durability of host resistance, which would aid in planning for future epidemics (McDonald and 333 Linde, 2002).

334

335 A two-way association genetics approach, where the analysis is carried out on the host and pathogen 336 in tandem, could increase the analytical power enough to identify components in host-pathogen 337 interactions with minor effects. A phenotyping-free strategy was adopted by Bartha et al. (2013) 338 for analysis of the human-HIV pathosystem, revealing that human SNPs were associated with 339 amino acid variations in the virus HIV-1 protein, providing stronger signals than when human SNPs 340 were associated with viral load. This genome-to-genome analysis could be adapted to detect signals 341 of coevolution between plants and their pathogens through an 'ecological genomics approach', 342 where the genome sequences of a host diversity panel and its adapted pathogen strains are linked 343 (Bartoli and Roux, 2017). There is potential for this method to identify variation in R or Avr loci in 344 both the host and pathogen, respectively, that may be difficult to derive from phenotypic data alone.

345

Reverse genetics can also be applied to identify effectors. Putative effectors can be elucidated from
whole-genome sequences of pathogens *in silico* through the identification of effector characteristics
such as small size (<30 kDa), high cysteine content, proximity to repetitive sequences, expression
patterns, and the presence/absence in known virulent and avirulent isolates (Liu *et al.*, 2012).

350

To date, only eight pathogen effectors corresponding to cloned wheat *R* genes have been identified (**Table S3**); however, as more pathogen pangenomes are sequenced, the power to identify effector genes will increase, whether through association genetics or *in silico* identification and confirmation. One example is *SnTox1*, as the properties of the previously cloned *SnToxA* and *SnTox3* genes contributed to its cloning (Liu *et al.*, 2012).

356

357 Capturing disease response phenotypes

358 An important consideration when screening pathogen diversity panels is the laborious handling and 359 calibration of inoculum for so many isolates. High-throughput procedures and equipment would be 360 required, while more standardised and precise methods could help to provide the clear phenotypes 361 that facilitate association studies. The sensitivity of some pathogens to environmental conditions 362 can render interactions incomparable between institutions or even particular growth chambers. 363 Techniques such as detached leaf assays (Arraiano, Brading and Brown, 2001) can help to minimise 364 environmental factors, facilitate the testing of multiple pathogen isolates at once without cross-365 contamination and also reduce the risk of pathogen escape (therefore removing the need for high-366 level containment facilities). The precision and efficiency of phenotyping could be improved 367 through techniques such as automated image analysis, which potentially allow a greater array of 368 virulence phenotypes to be captured in each experiment, such as pycnidia or pustule number, size, 369 density and other quantitative measures (Stewart and McDonald, 2014; Stewart et al., 2016; Xu et 370 al., 2017; Bueno-Sancho et al., 2019). Quantitative trait loci that account for host resistance to these 371 components of disease aggressiveness can then be identified from diversity panels using association 372 genetics (Yates et al., 2019).

374 The use of purified or transiently expressed effectors for phenotyping could overcome several 375 limitations. For apoplastic pathogens such as Zymoseptoria tritici and Stagonospora nodorum, 376 culture filtrates of pathogen or yeast strains expressing effectors of interest can be injected into 377 leaves to cause an interaction (Liu et al., 2012; Ben M'Barek et al., 2015); however, such methods 378 are not effective for intracellular haustoria-forming pathogens. Deploying transient expression 379 systems such as VOX across entire diversity panels would be a great challenge, but the use of 380 purified or transiently expressed effectors would alleviate containment demands as well as 381 potentially provide clearer phenotypes. These methods could also increase the number of host 382 diversity panels available for cloning R genes, since some pathogen-wild grass combinations may 383 result in incompatible or non-host interactions (e.g., as was observed between Aegilops tauschii and 384 Zymoseptoria tritici; Seifbarghi et al., 2009) that could potentially be overcome through the 385 introduction of effector proteins alone.

386

387 Due to the need for well-developed pathogen diversity collections, expertise and equipment, 388 phenotyping would likely be restricted to a few specialised labs. As such, there would be a need for 389 global co-operation to achieve the atlas as efficiently as possible. Where multiple labs are involved, 390 standardised processes should be implemented to reduce the impact of environmental factors. 391 Ultimately, as phenotyping improves, so does our ability to clone both host R and pathogen Avr 392 genes.

393

394

Applying the atlas to wheat breeding 395

396 With the cost of genetic research continually falling, especially for wild relatives with 397 comparatively small genomes, the ideal of a wheat R gene atlas seems ever more realisable. 398 Previous GWAS in Aegilops tauschii ssp. strangulata identified all of the stem rust resistance genes 399 that had been designated in this subspecies (Arora et al., 2019). Extrapolating from this, and 400 assuming the atlas would explore 10 hosts, this could potentially lead to the cloning of ~100 genes 401 for the three rusts alone. The 10 host panels would include: winter, spring and landrace panels of 402 bread wheat; elite and landrace panels of durum wheat; the direct progenitor species; and key wild 403 or domesticated relatives that have made the largest contributions to R gene diversity in wheat, such 404 as Thinopyrum obtusiflorum and rye (Table S1). Major pathogens to target first could include the 405 three wheat rusts, powdery mildew and the blotch diseases (STB, SNB, spot blotch and tan spot). Sequencing all this material would cost \$7.6 million and 75 full-time equivalents over five years to 406 407 carry out the bulking, pathology, molecular biology and bioinformatics work (Table S4). This is 408 on par with the staff numbers at The Sainsbury Laboratory, Norwich, UK, for which the running 409 ~\$10 million (https://find-and-update.companycosts are per year 410 information.service.gov.uk/company/03346853). The atlas could therefore be produced for 411 \$58.6 million, or \$2.9 million per G20 country, over five years. This would include the development 412 of a web-based portal where phenotypes can be plugged in and analysis automated through the use 413 of cloud computing resources, as well as a hub from which information on genes cloned through 414 the project could be accessed. Given the gross value of wheat production worldwide (\$114.0 billion; 415 FAOSTAT, 2018; http://www.fao.org/faostat/en/#data/QV), the loss of 21% of yield to pests and 416 diseases (Savary et al., 2019) could be valued at around \$31.2 billion dollars. It is therefore clear 417 that the cost of generating the atlas is negligible compared with the magnitude of the problem. Even 418 if the atlas were only to reduce loss to pathogens by one percentage point, this would still be 419 equivalent to a 31-fold return on the investment (not taking factors such as inflation into account).

420

421 The wheat R gene atlas could take the form of an online directory providing free access to R genes, 422 their allelic variation, molecular markers and sequences, as well as the prevalence of Avr effectors 423 in locally sampled pathogen populations. This information could then be fed into a model which 424 would select the optimal number of R genes required to provide broad-spectrum resistance to 425 pathogen populations in target regions, while maximising the potential for durability by ensuring 426 each pathogen isolate is recognised by multiple R genes (Fig. 5a). This would reduce the selection 427 pressure on individual R genes, prolonging their efficacy in the field.

429 Tracking effectors in the environment

430 Plant pathogens evolve rapidly (Oliver, 2012), so their populations would ideally be surveyed 431 constantly to identify changes to their effector complement that could impact the efficacy of 432 existing R genes in the field. Optimally, trap plots could be used to pick up rare variants; if placed 433 next to sexual hosts, single-R-gene host differentials can be used to sample the sexual recombinants 434 (Wellings et al., 2009). This could enhance early-warning systems, such as those in Ethiopia, which 435 facilitate the optimisation of variety choice and fungicide use in response to outbreaks – particularly 436 pertinent concerns for smallholder farmers (Allen-Sader et al., 2019). To do this effectively 437 however, in-field pathogen surveillance infrastructure must be co-ordinated at the local, national 438 and global scale (Carvajal-Yepes et al., 2019).

439

428

440 There are several methods under development for the monitoring of pathogen populations and their 441 virulence. One example is "field pathogenomics", where RNA-seq data is generated from pathogen-442 infected leaf samples collected in the field. Phylogenetic and structural analyses based on the most 443 variable SNPs within the pathogen population are employed to gain insight into the genetic groups 444 present (Hubbard et al., 2015; Bueno-Sancho et al., 2017). This has been used to demonstrate 445 population shifts in wheat yellow rust (Puccinia striiformis f. sp. tritici) in the UK (Hubbard et al., 446 2015) and to rapidly determine that a wheat blast outbreak in Bangladesh in 2016 was caused by a 447 South American lineage of the blast fungus (Magnaporthe orzae; Islam et al., 2016). The method 448 can work with portable real-time sequencing devices such as the MinION (Oxford Nanopore 449 Technologies) for full analysis at the site of collection (Radhakrishnan et al., 2019). Since there can 450 be considerable variation in virulence even between closely related pathogen strains, methods 451 which deliver phylogenetic readouts may not provide sufficient resolution to detect shifts in 452 pathogen virulence based on subtle changes in effector complement. With an atlas of cloned 453 effectors, however, existing surveillance technologies could be tailored to detect pathogen effector 454 complements. A case in hand is PathoTracer, which monitors sequences in pathogen TAL effectors 455 to inform variety choice and the editing of recessive susceptibility genes in rice, ensuring resistance 456 to bacterial blight (Xanthomonas oryzae pv. oryzae) (Eom et al., 2019).

457 458

459 Developing effective *R* gene stacks

460 Although wild relatives and landraces may provide novel sources of genetic resistance that can be 461 unlocked through genomics, the challenge to mobilise these resistances into elite wheat varieties 462 still remains. Introducing genes through traditional breeding often results in linkage drag, while 463 some species may not be sexually compatible with wheat or may generate progeny that suffer from 464 abnormalities that hinder development, such as hybrid necrosis (Bomblies and Weigel, 2007). It 465 may also be difficult to mobilise genes that exist in repulsion, as exemplified by Pm64 and Yr5466 (Zhang et al., 2019). Moreover, it would take many generations to combine multiple genes in the 467 same background; for example, combining four broad-spectrum R genes for each of the three rusts 468 (i.e., 12 genes) in an elite background would require 19 generations using a crossing approach 469 which (i) selects for recombinants around the genes of interest in the first two backcrosses, followed 470 by (ii) four generations of backcrossing and marker-assisted selection for the R gene and the elite 471 background to generate near-isogenic lines with a >98% elite background. Next, (iii) a stepwise 472 crossing approach would be used to combine the genes in twos, fours, sixes, eights, tens, and finally 473 12 (Figure 6). The early incorporation of a male sterile mutation such as Ms3 would reduce the 474 number of emasculations required (Guttieri, 2020). The strategy of starting with near-isogenic lines 475 would minimise the accumulation of linkage drag from agronomically diverse and poor 476 backgrounds in the final stack. Under optimal speed-breeding conditions in a spring wheat 477 background (Ghosh et al., 2018; Watson et al., 2018), this could be achieved in under four years; 478 however, if this were reduced to two diseases with selection for three genes per disease, the timeline 479 could be reduced to 14 generations over around 2.5 years. Introgressing this many R genes into 480 winter wheat varieties would take much longer unless vernalisation requirements can be 481 circumvented (Hickey *et al.*, 2019). Targeting three diseases (stem rust, stripe rust and STB) would 482 be required in large parts of sub-Saharan Africa, while in Europe targeting stripe rust and STB 483 would be sufficient to substantially reduce reliance on fungicides (Savary *et al.*, 2019). An 484 advantage of this scheme is that it allows background quantitative resistance to be preserved, but it 485 would be a Sisyphean struggle to retain these genetically separated stack components when 486 cultivars are often swiftly turned over to maintain genetic gains in yield.

487

488 As an alternative to traditional crossing, multi-R gene stacks can be generated through DNA 489 engineering and transformation. This has been demonstrated in cultivated potato (Solanum 490 tuberosum) using three R genes against late blight from wild Solanum relatives (Ghislain et al., 491 2019). Transgene stacking allows all of the R genes to be combined at a single locus, which ensures 492 that the stack remains intact in downstream breeding programs, avoiding separation and therefore 493 the exposure of single R genes to the pathogen (Wulff and Moscou, 2014; Fig. 5b). DNA synthesis 494 and assembly technology now allows for the rapid generation of constructs from tens to several 495 hundreds of kbp (Gibson et al., 2008; Petersen and Stowers, 2011; Weber et al., 2011; Annaluru et 496 al., 2014), while improvements to transformation will make it easier to deliver large constructs into 497 the wheat genome (Richardson et al., 2014; Lowe et al., 2016; Hayta et al., 2019; Debernardi et al., 498 2020).

499

500 Quantitative and/or broad-spectrum R genes can play an important role in stacks due to their 501 durability and ability to boost the function of other R genes; for example, resistance to leaf rust can 502 be enhanced through a combination of Lr34/Yr18/Sr57 and Lr68, and resistance to all three rusts 503 can be increased significantly through a combination of Sr2/Yr30 and Lr34/Yr18/Sr57 (Randhawa 504 et al., 2018). The as-vet uncloned rust R gene Sr_2 provides partial APR, resulting in a slow-rusting 505 phenotype that has remained effective in commercial wheat varieties for ~100 years (Ellis et al., 506 2014). This demonstrates the importance of maintaining strong background resistance through 507 breeding. Indeed, the combination of multiple minor APR genes forms the basis of the CIMMYT 508 breeding programme for rust resistance (Bhavani et al., 2019). Although originally linked in 509 repulsion on chromosome 3B, the Fhb1 and Sr2 genes have been combined to provide a baseline 510 of resistance to both Fusarium head blight and stem rust (Zhang et al., 2016) and the coupled genes 511 have been mobilised in CIMMYT germplasm (He et al., 2020). The use of genetic modification 512 (GM) cassettes would avoid the laborious process of developing lines in which genes in repulsion 513 become coupled. Quantitative genes can also be combined with race-specific R genes to provide 514 more durable resistance; in near-isogenic lines of oilseed rape (Brassica napus) all containing the 515 R gene Rlm6 but differing in quantitative resistance to black leg disease, Rlm6 resistance was 516 overcome within three growing seasons when deployed on its own, but remained effective after 517 five years when combined with quantitative resistance (Brun et al., 2010).

- 518
- 519

520 Gene stewardship

R gene stewardship can be defined as the careful and responsible management of *R* genes to remain effective during prolonged use. Gene stewardship may be directed towards decreasing the probability that virulent mutants arise, or towards reducing selection pressure for new virulent mutants after they arise. Although gene stewardship is often associated with gene deployment strategies, it also encompasses a broad range of activities including understanding *R* gene function and specificity in the host, *Avr* effector gene function and specificity in the pathogen, the identification of *R* genes in cultivars, and pathogen virulence frequency surveys.

528

The history of a gene's exposure to pathogens may account for much of its effect in the field; genes which come from a background that has never been exposed to particular pathogens are likely to be more effective. In fact, 'broad-spectrum' resistance refers to the ability of an *R* gene to recognise all corresponding *Avr* alleles present in many isolates at a particular point in time, and does not guarantee long-term durability (Ellis *et al.*, 2014). Even non-host resistance, in which a host species 534 is immune to all races of a particular pathogen species, opens up opportunities for pathogens to 535 make a host jump once these genes are overcome. The wheat blast pathogen, for example, emerged 536 after rye-infecting blast strains infected wheat lines lacking functional Rwt3 resistance. Selection 537 for the loss of the *PWT3* effector then allowed the widespread infection of *Rwt3* wheat lines (Inoue 538 et al. 2017). It is therefore imperative to closely monitor the distribution of R genes in agricultural 539 systems worldwide to prevent the development of cultivars with compromised resistance profiles, 540 such as those with R gene stacks necessitating only a few stepwise mutations in the pathogen to be 541 overcome. Releasing novel sources of resistance as part of stacks and employing good gene 542 stewardship practices could reduce the occurrence of such gene collapses.

543

544 R genes can be divided into three groups based on their need for stewardship. Group A genes do 545 not require stewardship. These include certain genes proven to be durable in the field, such as the 546 APR genes Lr34/Yr18/Sr57, Lr46/Yr29/Sr58, and Sr2/Yr30/Lr27. It also includes newly cloned 547 genes such as Lr67/Yr46/Sr55 or Yr36 that lack classic recognition-triggered immunity motifs and 548 are therefore predicted to be inherently more durable than other R genes. Non-race-specific 549 recessive R genes, such as *mlo*, are also expected to be inherently durable (Wang *et al.*, 2014; 550 Acevedo-Garcia et al., 2017). Group A would also include genes that are already widely deployed, 551 genes that are already widely defeated by virulent pathogen races, and genes that have relatively 552 minor effects on disease severity.

553

554 Group B genes are strongly recommended for stewardship. They include resistance genes that are 555 undefeated or defeated by only one or a few races. Group B genes are still very useful, but they are 556 expected to be vulnerable to defeat by new virulent races. Some examples would be Yr5, Yr15, Sr22 557 and Sr26. Group B genes should be deployed only in combinations with other major-effect and 558 quantitative genes. Combinations should be designed to withstand one or more new mutations to 559 virulence in the pathogen while still preventing pathogen reproduction. For example, the stem rust 560 isolate TTRTF is virulent to three of five genes included in a recently-developed wheat R gene 561 stack, which could limit the efficacy and durability of the stack in regions where this isolate is 562 present (Luo et al., 2021). The atlas would be an invaluable resource for analysing the vulnerability 563 of R gene combinations to extant pathogen populations and maximising the number of independent 564 mutations required in each pathogen race to defeat the combination. The combinations could be 565 dynamically updated, with old inadequate combinations being removed from production. Group B 566 gene stewardship would require the co-operation of breeding programs to achieve the common 567 good of preserving these genes over the long term. Existing cultivar release programmes (such as 568 the UK Recommended List) could be leveraged by awarding "extra points" to cultivars carrying 569 multiple R genes to regionally prevalent pathogen populations, boosting the incentive to breed for 570 durable resistance.

571

572 Group C is for formal gene stewardship programs. Genes from uncrossable alien species or newly 573 designed synthetic genes are good candidates for Group C. The gene sequences will be known and 574 can be patented for use in transgenic cassettes, preventing the genes from being deployed 575 irresponsibly elsewhere. Currently, there are active patents associated with ten wheat R genes 576 (Table S5). Combinations should be designed to withstand at least three independent mutations to 577 virulence and still prevent all reproduction in the pathogen. Again, the atlas will inform the selection 578 of R genes to maximise durability and gene stewardship. If the pyramid is going to face a sexual 579 population of the pathogen, a larger stack would be needed. Knowledge of pre-existing virulence 580 frequencies would aid the design of appropriate combinations. Further, stacking R genes operating 581 through different defence pathways would ensure diverse sources of resistance are acting against 582 pathogens, which could enhance durability.

582 583

584 Reducing the exposure of *R* genes in the field

585 Novel sources of resistance could increase the durability of stacks, but their deployment in 586 monoculture may not be enough to protect crops in the long term. The rate of evolution of pathogens 587 combined with their huge volume in agricultural systems increases the likelihood that the multiple 588 mutations required to overcome a stack will occur. This is especially the case if the pathogen is reproducing sexually and is not eliminated completely in resistant lines (which is often the case with apoplastic pathogens such as *Zymoseptoria tritici*; Stotz *et al.*, 2014), or if virulence to stack components is already present in the population (Stam and McDonald, 2018). In addition, the development of new stacks is costly. It is therefore important that steps are taken to keep the pathogen effective population size as small as possible, reducing the likelihood that virulence would evolve.

595

596 One way to reduce the rate of evolution of virulence to newly deployed R genes is to employ 597 'dynamic diversity' (McDonald, 2014). Strong selection pressure from static monoculture crop 598 fields enhances the efficiency of directional selection to overcome host resistance. A dynamic 599 diversity approach would involve strategic and frequent changes to the resistance repertoire present 600 in the field at any one time, disrupting selection for Avr evolution in the pathogen. This approach 601 can be applied to any cropping system or genotype (Fig. 5c). Furthermore, the progress made by 602 pathogens towards virulence within a growing season may hamper fitness in the succeeding season 603 when different host genotypes are introduced. In this vein, it is also important to minimise the 604 occurrence of "green bridges" between growing seasons, which can facilitate epidemics by 605 increasing the pathogen effective population size. This could be a factor in stem rust epidemics in 606 the Ethiopian Highlands, where conditions allow for two wheat seasons per year (Allen-Sader et 607 al., 2019).

608

609 The development of multilines, which differ in their R genes but are otherwise isogenic, could 610 ensure that uniformity in heading date and grain quality is maintained while the R genes being 611 presented to pathogens are diversified. This strategy has proven successful in the past; for example, 612 in the deployment of barley multilines for control of mildew in former East Germany (Wolfe et al., 613 1992). However, contemporary breeding programmes are unlikely to consider such a strategy due 614 to regulatory bottlenecks, such as the capacity of seed producers to handle many varieties and the 615 need to keep track of varieties in terms of Plant Breeder's Rights and to maintain uniformity within 616 varieties (Louwaars, 2018). Another option for diversifying resistance profiles in the field is the use 617 of cultivar mixtures. Susceptible varieties with more desirable backgrounds could be released in 618 mixtures where 25% of plants are resistant, which has been successfully employed in durum wheat 619 to reduce STB disease severity by 48% compared with susceptible pure stands (Ben M'Barek et al., 620 2020). This strategy lacks the advantage of preserving uniformity in the field, but would allow the 621 benefits of durable R gene stacks to be reaped even if they have not yet been mobilised in locally 622 adapted germplasm.

623

624 When new sources of major genetic resistance are identified, there can be a temptation to 625 immediately release them to the market to maximise yields and profit in the short term. The 626 commercial cultivation of resistant varieties can lead to rapid adaptation of the pathogen and the 627 breakdown of resistance in as little as five years, as was demonstrated by the case of the wheat 628 variety 'Gene' in response to STB; this virulence can persist in the pathogen population even after 629 use of the cultivar diminishes (Cowger, Hoffer and Mundt, 2000). It is therefore important to ensure 630 that the immense investment of time and resources required for the deployment and/or cloning of 631 R genes is not wasted through an immediate exposure to pathogen populations. Gene squandering 632 could be avoided by empowering breeders with tools such as the atlas and supporting their training 633 in molecular biology and bioinformatics – a growing need that was made clear through recent 634 personal communication with wheat breeders.

- 635
- 636

637 **Outlook**

638 Here, we have discussed using genomics-assisted methods, association mapping in particular, for 639 the rapid and widespread discovery and cloning of both R and Avr genes. Once diversity panels 640 have been established, they can be evaluated for practically any trait of interest. New sources of

641 variation can also be incorporated by increasing the panel size or the genetic information captured,

642 potentially increasing the power of GWAS to identify the genomic features underlying traits of
643 interest. In this model, value can be continually added to diversity panels as and when motivation,
644 time and funds allow.

645

646 Through an international effort, we envisage compiling a catalogue of R genes and corresponding 647 Avr genes—the atlas. This would be a revolutionary tool with which breeders could select bespoke 648 R gene combinations that address disease problems in response to regional pressures. Once stacks 649 are introduced into wheat, the functionality of individual components could be validated with 650 cloned Avr effectors. The atlas will also provide a unique opportunity to study the population 651 genetic factors involved in the evolution and spread of disease resistance, such as the effects of 652 polyploidisation, domestication and intensive breeding.

653

654 This mass-cloning and characterisation project will also create knowledge about the structure-655 function relationships of R gene recognition specificity. This can be exploited to expand R gene 656 recognition through single amino acid changes, as in the case of R2a, which was engineered to 657 recognise both variants of Avr3a in the potato late blight oomycete Phytophthora infestans 658 (Segretin et al., 2014), and PikP, which was engineered to recognise multiple variants of AvrPik 659 from the rice blast fungus Magnaporthe oryzae (De La Concepcion et al., 2019). R gene activation 660 can also be manipulated to enhance the speed of response for more effective resistance (Harris et 661 al., 2013). These strategies could be deployed through gene editing; thus, gene stacks of the future 662 could consist of major, minor and synthetic R genes.

663

664 Currently, the designation of new R genes requires genetic proof that the gene is in a novel location and/or has a novel specificity. This is complicated by the need to send seed for verification, often 665 666 across international borders, which can present difficulties for some countries due to strict 667 quarantine requirements. Lengthy genetic testing involving several generations of crossing can add 668 further years to the process. Because of these barriers, there is a backlog of genes that have been 669 given temporary designations. With cloned genes, high-quality assemblies, and knowledge of the 670 particular Avrs recognised by the R gene, the science of gene designation will become easier, more 671 precise and potentially faster. The need to send seed across international borders could be 672 circumvented by simply sharing DNA sequences. It would also allow the community to integrate 673 the historic cataloguing of genes based on genetics with sequence data and physical genome 674 location. 675

- 676 Climate change is likely to exacerbate the current losses caused by crop pathogens (Caubel *et al.*, 677 2012). By the middle of the 21st century, many countries with high crop production could become 678 fully saturated with pests (Bebber, Holmes and Gurr, 2014) as the ranges of pests and pathogens 679 expand (Roos *et al.*, 2011) and climate and weather changes have unexpected effects on pathogen 680 lifecycles (Shaw et al. 2018). At the same time, population expansion is increasing the demand on food production and its environmental impact (Foley et al., 2011), and although changes in diet 681 682 could allow more calories to be produced with less land (Poore and Nemecek, 2018), such large-683 scale cultural shifts are slow and perhaps unrealistic. This presses a continually growing demand 684 on scientists and breeders to find faster and more efficient means of introducing novel genetic 685 disease resistance into the field.
- 686

687 In Europe, many pesticides and fungicides have lost their efficacy, while many of the remaining 688 effective compounds are heavily regulated or have been banned (Hillocks, 2012). Robust genetic 689 resistance is therefore also important for reducing disease pressures to prolong the life of chemical 690 controls, making it the most important tool for combating disease in the long term. If the perception 691 of GM is tackled in Europe, there could be increased implementation in other countries that depend 692 on trade with the European Union, such as nations in Africa and Asia, which more urgently need 693 to use new technologies to ensure their food security (Zaidi et al., 2019). There have been exciting 694 developments already; in Bangladesh, Bt brinjal (aubergine, Solanum melongena) and late blight-695 resistant potato have been developed, while researchers at the Commonwealth Scientific and 696 Industrial Research Organisation (CSIRO), Australia, and the 2Blades Foundation, USA, have 697 field-trialled a five-gene stem rust resistance gene stack (Luo *et al.*, 2021). It is unsustainable to 698 continue feeding 20% of our wheat production to pathogens (**Fig. 1**). Epidemics are unpredictable, 699 so we must strive for immunity across our cultivated lands. Also of importance is the need to ensure 700 new resistances are deployed ethically and can benefit as many countries as possible. This could be 701 achieved through public–private partnership and infrastructure building to create hubs in more 702 advanced developing countries for the innovation and dissemination of improved crops to nearby 703 less-developed countries (Zaidi *et al.*, 2019).

Treating diversity panels as libraries of R genes means scientists and breeders have the necessary genetic resources at hand to work together to achieve the R gene machine: a scenario where bioinformatics pipelines facilitate a swift movement from phenotype to full-length candidate gene, followed by the gene's synthesis, testing and deployment in an appropriate stack (determined by the atlas algorithm). The ultimate goal would be to one day turn wheat into a non-host for its major pathogens.

711 712

704

713 Acknowledgements

714 The authors wish to thank the support of the UK Biotechnology and Biological Sciences Research 715 Council (BBSRC) through the cross-institute strategic programme Designing Future Wheat 716 (BB/P016855/1); the 2Blades Foundation, USA; a UKRI-BBSRC Norwich Research Park 717 Biosciences Doctoral Training Partnership fellowship to ANH; a BBSRC/RAGT Industrial-718 Collaborative Award in Science and Engineering fellowship to DG; and a Monsanto's Beachell-719 Borlaug International Scholars Program fellowship (06-400258-12580) and John Innes Centre 720 International Scholarship Scheme award to SG. We are grateful to Michiel van Slageren (Royal 721 Botanic Garden, Kew, UK) for help with taxonomic classifications, Tobin Florio 722 (http://www.flozbox.com/illu_sci.htm) for the artwork, Mark Luterbacher (John Innes Centre, UK) 723 for help with budgeting the wheat R gene atlas, Simon Aspland (John Innes Centre) for help with 724 R gene patent searches, Simon Krattinger for feedback on an earlier draft of the manuscript, and the 725 following colleagues for discussions on R gene stewardship: Brian Steffenson (University of 726 Minnesota, USA), Caixia Lan (Huazhong Agricultural University, China), Filippo Bassi (ICARDA, 727 Morocco), Hannah Robinson (Intergrain, Australia), Moisés Burachik and Francisco Ayala 728 (Bioceres, Argentina), Richard Summers and Ruth Bryant (RAGT, UK), Pierre Hucl (University 729 of Saskatchewan, Canada), Roger Freedman (2Blades Foundation, USA), Ruth Wanyera (KALRO, 730 Kenya), Simon Berry (Limagrain, UK), Sridhar Bhavani (CIMMYT, Mexico), Viktor Korzun 731 (KWS, Germany), Nick Bird (KWS, UK), Willem Boshoff and Zakkie Pretorius (University of the 732 Free State, South Africa), and Xiue Wang (Nanjing Agricultural University, China).

733

734 **References**

- Acevedo-Garcia, J. *et al.* (2017) 'mlo-based powdery mildew resistance in hexaploid bread
 wheat generated by a non-transgenic TILLING approach', *Plant Biotechnology Journal*,
 15(3), pp. 367–378. doi: 10.1111/pbi.12631.
- Aggarwal, R. *et al.* (2014) 'Avirulence effector discovery in a plant galling and plant parasitic
 arthropod, the Hessian fly (Mayetiola destructor)', *PLoS ONE*. Edited by P. CastagnoneSereno. Public Library of Science, 9(6), p. e100958. doi: 10.1371/journal.pone.0100958.
- Allen-Sader, C. *et al.* (2019) 'An early warning system to predict and mitigate wheat rust
 diseases in Ethiopia', *Environmental Research Letters*. IOP Publishing, 14(11). doi:
 10.1088/1748-9326/ab4034.
- Alonge, M. *et al.* (2020) 'Major Impacts of Widespread Structural Variation on Gene Expression
 and Crop Improvement in Tomato', *Cell.* Cell Press, 182(1), pp. 145-161.e23. doi:
 10.1016/j.cell.2020.05.021.
- Annaluru, N. *et al.* (2014) 'Total synthesis of a functional designer eukaryotic chromosome', *Science.* American Association for the Advancement of Science, 344(6179), pp. 55–58. doi:
 10.1126/science.1249252.

- Arora, S. *et al.* (2017) 'Genome-Wide Association Study of Grain Architecture in Wild Wheat *Aegilops tauschii*', *Frontiers in Plant Science*, 8(May), pp. 1–13. doi:
 10.3389/fpls.2017.00886.
- Arora, S. *et al.* (2019) 'Resistance gene cloning from a wild crop relative by sequence capture
 and association genetics', *Nature Biotechnology*, pp. 139–143. doi: 10.1038/s41587-0180007-9.
- Arraiano, L. S., Brading, P. A. and Brown, J. K. M. (2001) 'A detached seedling leaf technique to study resistance to *Mycosphaerella graminicola* (anamorph *Septoria tritici*) in wheat', *Plant Pathology*, 50(3), pp. 339–346. doi: 10.1046/j.1365-3059.2001.00570.x.
- Arranz-Otaegui, A. *et al.* (2018) 'Archaeobotanical evidence reveals the origins of bread 14,400
 years ago in northeastern Jordan', *Proceedings of the National Academy of Sciences*.
 National Academy of Sciences, 115(31), pp. 7925–7930. doi: 10.1073/pnas.1801071115.
- Audano, P. A., Ravishankar, S. and Vannberg, F. O. (2018) 'Mapping-free variant calling using
 haplotype reconstruction from k-mer frequencies', *Bioinformatics*. Oxford University Press,
 34(10), pp. 1659–1665. doi: 10.1093/bioinformatics/btx753.
- Aylward, J. *et al.* (2017) 'A plant pathology perspective of fungal genome sequencing', *IMA Fungus.* International Mycological Association, 8(1), pp. 1–15. doi:
 10.5598/imafungus.2017.08.01.01.
- Bai, D. and Knott, D. R. (1992) 'Suppression of rust resistance in bread wheat (*Triticum aestivum* L.) by D-genome chromosomes', *Genome*. NRC Research Press Ottawa, Canada , 35(2), pp. 276–282. doi: 10.1139/g92-043.
- Balfourier, F. *et al.* (2019) 'Worldwide phylogeography and history of wheat genetic diversity',
 Science Advances, 5(5). doi: 10.1126/sciadv.aav0536.
- Bartoli, C. and Roux, F. (2017) 'Genome-Wide Association Studies In Plant Pathosystems:
 Toward an Ecological Genomics Approach', *Frontiers in Plant Science*. Frontiers, 8, p. 763.
 doi: 10.3389/fpls.2017.00763.
- Bhavani, S. *et al.* (2019) 'Progress in breeding for resistance to Ug99 and other races of the stem
 rust fungus in CIMMYT wheat germplasm', *Frontiers of Agricultural Science and Engineering*, 6(3), pp. 210–224. doi: 10.15302/J-FASE-2019268.
- Bomblies, K. and Weigel, D. (2007) 'Hybrid necrosis: Autoimmunity as a potential gene-flow
 barrier in plant species', *Nature Reviews Genetics*, pp. 382–393. doi: 10.1038/nrg2082.
- Bonman, J. M. *et al.* (2015) 'Genetic Diversity among Wheat Accessions from the USDA
 National Small Grains Collection', *Crop Science*. Crop Science Society of America, 55(3),
 pp. 1243–1253. doi: 10.2135/cropsci2014.09.0621.
- Bouton, C. *et al.* (2018) 'Foxtail mosaic virus: A Viral Vector for Protein Expression in Cereals
 1[CC-BY] the original idea', *Plant Physiology* ®, 177, pp. 1352–1367. doi:
 10.1104/pp.17.01679.
- Brun, H. *et al.* (2010) 'Quantitative resistance increases the durability of qualitative resistance to
 Leptosphaeria maculans in Brassica napus', *New Phytologist*, 185(1), pp. 285–299. doi:
 10.1111/j.1469-8137.2009.03049.x.
- Bueno-Sancho, V. *et al.* (2017) 'Field Pathogenomics: An Advanced Tool for Wheat Rust
 Surveillance', in *Methods in molecular biology (Clifton, N.J.)*, pp. 13–28. doi: 10.1007/9781-4939-7249-4_2.
- Bueno-Sancho, V. et al. (2019) K-PIE: using K-means algorithm for Percentage Infection
 symptoms Estimation.
- Carvajal-Yepes, M. *et al.* (2019) 'A global surveillance system for crop diseases: Global
 preparedness minimizes the risk to food supplies', *Science*. American Association for the
 Advancement of Science, 364(6447), pp. 1237–1239. doi: 10.1126/science.aaw1572.
- Chen, W., Liu, T. and Gao, L. (2013) 'Suppression of stripe rust and leaf rust resistances in
 interspecific crosses of wheat', *Euphytica*, 192(3), pp. 339–346. doi: 10.1007/s10681-0120854-2.
- 801 Cook, D. E. *et al.* (2012) 'Copy number variation of multiple genes at Rhg1 mediates nematode
 802 resistance in soybean', *Science*. doi: 10.1126/science.1228746.
- 803 Cook, D. E., Mesarich, C. H. and Thomma, B. P. H. J. (2015) 'Understanding Plant Immunity as
 804 a Surveillance System to Detect Invasion', *Annual Review of Phytopathology*. Annual

805	Reviews, 53(1), pp. 541–563. doi: 10.1146/annurev-phyto-080614-120114.
806	Debernardi, J. M. et al. (2020) 'A chimera including a GROWTH-REGULATING FACTOR
807	(GRF) and its cofactor GRF', bioRxiv. Cold Spring Harbor Laboratory, p.
808	2020.08.23.263905. doi: 10.1101/2020.08.23.263905.
809	Ellis, J. G. et al. (2014) 'The past, present and future of breeding rust resistant wheat', Frontiers
810	<i>in Plant Science</i> . Frontiers, 5, p. 641. doi: 10.3389/fpls.2014.00641.
811	Elshire, R. J. et al. (2011) 'A robust, simple genotyping-by-sequencing (GBS) approach for high
812	diversity species', <i>PLoS ONE</i> . doi: 10.1371/journal.pone.0019379.
813	Eom, J. S. <i>et al.</i> (2019) 'Diagnostic kit for rice blight resistance', <i>Nature Biotechnology</i> . Nature
814	Publishing Group, 37(11), pp. 1372–1379. doi: 10.1038/s41587-019-0268-y.
815	Erickson, A. W. (1945) <i>McFadden's Hope: Fighting plant breeders win battle for bread.</i>
816	Minneapolis, Minnesota, USA: Field Notes Crop Reporting Service.
817	Feuillet, C., Langridge, P. and Waugh, R. (2008) 'Cereal breeding takes a walk on the wild
818	side', <i>Trends in Genetics</i> . doi: 10.1016/j.tig.2007.11.001.
819	Flor, H. H. (1971) 'Current Status of the Gene-For-Gene Concept', Annual Review of
820	<i>Phytopathology</i> . Annual Reviews, 9(1), pp. 275–296. doi:
821	10.1146/annurev.py.09.090171.001423.
822	Foley, J. A. <i>et al.</i> (2011) 'Solutions for a cultivated planet', <i>Nature</i> , 478(7369), pp. 337–342.
823	doi: 10.1038/nature10452.
824	Friebe, B. et al. (1994) 'Compensation indices of radiation-induced wheat-Agropyron elongatum
825	translocations conferring resistance to leaf rust and stem rust', <i>Crop Science</i> . doi:
826	10.2135/cropsci1994.0011183X003400020018x.
827	Fu, D. <i>et al.</i> (2009) 'A kinase-START gene confers temperature-dependent resistance to wheat
828	stripe rust', <i>Science</i> . American Association for the Advancement of Science, 323(5919), pp.
829	1357–1360. doi: 10.1126/science.1166289.
830	Gao, Y. <i>et al.</i> (2016) 'Validation of Genome-Wide Association Studies as a Tool to Identify
831	Virulence Factors in <i>Parastagonospora nodorum</i> ', <i>Phytopathology</i> , 106(10), pp. 1177–1185.
832	doi: 10.1094/PHYTO-02-16-0113-FI.
833	Gardiner, L. J. <i>et al.</i> (2015) 'A genome-wide survey of DNA methylation in hexaploid wheat',
834	<i>Genome Biology</i> . Genome Biology, 16(1), pp. 1–15. doi: 10.1186/s13059-015-0838-3.
835	Ghislain, M. <i>et al.</i> (2019) 'Stacking three late blight resistance genes from wild species directly
836	into African highland potato varieties confers complete field resistance to local blight races',
837	<i>Plant Biotechnology Journal</i> . Blackwell Publishing Ltd, 17(6), pp. 1119–1129. doi:
838	10.1111/pbi.13042.
839	Ghosh, S. <i>et al.</i> (2018) 'Speed breeding in growth chambers and glasshouses for crop breeding
840	and model plant research', <i>Nature Protocols</i> . doi: 10.1038/s41596-018-0072-z.
841	Gibson, D. G. <i>et al.</i> (2008) 'Complete chemical synthesis, assembly, and cloning of a
842	Mycoplasma genitalium genome', <i>Science</i> . American Association for the Advancement of
843	Science, 319(5867), pp. 1215–1220. doi: 10.1126/science.1151721.
844	Gilly, A. <i>et al.</i> (2019) 'Very low-depth whole-genome sequencing in complex trait association
845	studies', <i>Bioinformatics</i> . doi: 10.1093/bioinformatics/bty1032.
846	Guttieri, M. J. (2020) ' <i>Ms3</i> dominant genetic male sterility for wheat improvement with
847	molecular breeding', <i>Crop Science</i> . doi: 10.1002/csc2.20091.
848	Harlan, J R and de Wet, J M J (1971) 'Toward a Rational Classification of Cultivated
849	Plants', <i>Taxon</i> , 20(4), pp. 509–517.
850	Harper, A. L. <i>et al.</i> (2012) 'Associative transcriptomics of traits in the polyploid crop species
851	Brassica napus', <i>Nature Biotechnology</i> , 30(8), pp. 798–802. doi: 10.1038/nbt.2302.
852	Harris, C. J. <i>et al.</i> (2013) 'Stepwise artificial evolution of a plant disease resistance gene',
853	Proceedings of the National Academy of Sciences of the United States of America, 110(52),
855	pp. 21189–21194. doi: 10.1073/pnas.1311134110.
855	Hatta, M. A. M. <i>et al.</i> (2020) 'Extensive genetic variation at the sr22 wheat stem rust resistance
856	gene locus in the grasses revealed through evolutionary genomics and functional analyses',
857	<i>Molecular Plant-Microbe Interactions</i> , 33(11), pp. 1286–1298. doi: 10.1094/MPMI-01-20-
858	0018-R.
859	Hayta, S. <i>et al.</i> (2019) 'An efficient and reproducible Agrobacterium-mediated transformation
557	ing a, e, a, (2017) in enterent und reproductore rigioad contain-inculated transformation

860 method for hexaploid wheat (Triticum aestivum L.)', Plant Methods. BioMed Central Ltd., 861 15(1). doi: 10.1186/s13007-019-0503-z. 862 He, X. et al. (2020) 'Disease resistance evaluation of elite CIMMYT wheat lines containing the 863 coupled Fhb1 and Sr2 genes', Plant Disease. Scientific Societies. doi: 10.1094/pdis-02-20-864 0369-re. 865 Hickey, L. T. et al. (2019) 'Breeding crops to feed 10 billion', Nature Biotechnology. doi: 866 10.1038/s41587-019-0152-9. 867 Hiebert, C. W. et al. (2020) 'Stem rust resistance in wheat is suppressed by a subunit of the 868 mediator complex', Nature Communications. Nature Research, 11(1), pp. 1-10. doi: 869 10.1038/s41467-020-14937-2. 870 Hillocks, R. J. (2012) 'Farming with fewer pesticides: EU pesticide review and resulting 871 challenges for UK agriculture', Crop Protection. Elsevier Ltd, 31(1), pp. 85-93. doi: 872 10.1016/j.cropro.2011.08.008. 873 Hovmøller, M. S., Walter, S. and Justesen, A. F. (2010) 'Escalating threat of wheat rusts.', 874 Science (New York, N.Y.). American Association for the Advancement of Science, 875 329(5990), p. 369. doi: 10.1126/science.1194925. 876 Huang, X. et al. (2009) 'High-throughput genotyping by whole-genome resequencing', Genome 877 Research, 19(6), pp. 1068–1076. doi: 10.1101/gr.089516.108. 878 Hubbard, A. et al. (2015) 'Field pathogenomics reveals the emergence of a diverse wheat yellow 879 rust population', Genome Biology, 16(1), p. 23. doi: 10.1186/s13059-015-0590-8. 880 Hurni, S. et al. (2014) 'The powdery mildew resistance gene Pm8 derived from rye is 881 suppressed by its wheat ortholog Pm3', Plant Journal, 79(6), pp. 904-913. doi: 882 10.1111/tpj.12593. 883 Innes, R. L. and Kerber, E. R. (1994) 'Resistance to wheat leaf rust and stem rust in Triticum 884 tauschii and inheritance in hexaploid wheat of resistance transferred from T. tauschii', 885 Genome. Canadian Science Publishing, 37(5), pp. 813–822. doi: 10.1139/g94-116. 886 International Wheat Genome Sequencing Consortium (IWGSC), T. I. W. G. S. C. et al. (2018) 887 'Shifting the limits in wheat research and breeding using a fully annotated reference 888 genome.', Science (New York, N.Y.). American Association for the Advancement of Science, 889 361(6403), p. eaar7191, doi: 10.1126/science.aar7191. 890 Islam, M. T. et al. (2016) 'Emergence of wheat blast in Bangladesh was caused by a South 891 American lineage of Magnaporthe oryzae.', BMC biology, 14(1), p. 84. doi: 10.1186/s12915-892 016-0309-7. 893 Jones, J. D. G. and Dangl, J. L. (2006) 'The plant immune system', Nature. Nature Publishing 894 Group, pp. 323–329. doi: 10.1038/nature05286. 895 Jupe, F. et al. (2013) 'Resistance gene enrichment sequencing (RenSeq) enables reannotation of 896 the NB-LRR gene family from sequenced plant genomes and rapid mapping of resistance loci 897 in segregating populations', *Plant Journal*, 76(3), pp. 530–544. doi: 10.1111/tpj.12307. 898 Kangara, N. et al. (2020) 'Mutagenesis of Puccinia graminis f. sp. tritici and Selection of Gain-899 of-Virulence Mutants', Frontiers in Plant Science. Frontiers, 11, p. 1. doi: 900 10.3389/fpls.2020.570180. 901 Kawakatsu, T. et al. (2016) 'Epigenomic Diversity in a Global Collection of Arabidopsis 902 thaliana Accessions', Cell. Cell Press, 166(2), pp. 492–505. doi: 10.1016/j.cell.2016.06.044. 903 Khan, A. W. et al. (2020) 'Super-Pangenome by Integrating the Wild Side of a Species for 904 Accelerated Crop Improvement', Trends in Plant Science. Elsevier Inc., 25(2), pp. 148-158. 905 doi: 10.1016/j.tplants.2019.10.012. 906 Kourelis, J. and Van Der Hoorn, R. A. L. (2018) 'Defended to the nines: 25 years of resistance 907 gene cloning identifies nine mechanisms for R protein function', Plant Cell. American 908 Society of Plant Biologists, pp. 285–299. doi: 10.1105/tpc.17.00579. 909 Krattinger, S. G. et al. (2009) 'A putative ABC transporter confers durable resistance to multiple 910 fungal pathogens in wheat', Science. American Association for the Advancement of Science, 911 323(5919), pp. 1360–1363. doi: 10.1126/science.1166453. 912 Kuang, H. et al. (2004) 'Multiple genetic processes result in heterogeneous rates of evolution 913 within the major cluster disease resistance genes in lettuce', Plant Cell. doi: 914 10.1105/tpc.104.025502.

917 Journal. Plant J, 47(1), pp. 38–48. doi: 10.1111/j.1365-313X.2006.02755.x. 918 De La Concepcion, J. C. et al. (2019) 'Protein engineering expands the effector recognition 919 profile of a rice NLR immune receptor', eLife, 8. doi: 10.7554/eLife.47713. 920 Liu, Y. et al. (2020) 'Pan-Genome of Wild and Cultivated Soybeans', Cell. Elsevier Inc., 182(1), 921 pp. 162-176.e13. doi: 10.1016/j.cell.2020.05.023. 922 Liu, Z. et al. (2012) 'The cysteine rich necrotrophic effector SnTox1 produced by Stagonospora 923 nodorum triggers susceptibility of wheat lines harboring Snn1', PLoS Pathogens. Edited by 924 B. Tyler. Public Library of Science, 8(1), p. e1002467. doi: 10.1371/journal.ppat.1002467. 925 Louwaars, N. P. (2018) 'Plant breeding and diversity: A troubled relationship?', Euphytica. 926 Springer Netherlands, p. 114. doi: 10.1007/s10681-018-2192-5. 927 Lowe, K. et al. (2016) 'Morphogenic regulators Baby boom and Wuschel improve monocot 928 transformation', Plant Cell. American Society of Plant Biologists, 28(9), pp. 1998-2015. doi: 929 10.1105/tpc.16.00124. 930 Lukaszewski, A. J. (2000) 'Manipulation of the 1RS.1BL translocation in wheat by induced 931 homoeologous recombination', Crop Science. doi: 10.2135/cropsci2000.401216x. 932 Luo, M. et al. (2021) 'A five-transgene cassette confers broad-spectrum resistance to a fungal 933 rust pathogen in wheat', Nature Biotechnology. doi: 10.1038/s41587-020-00770-x. 934 Ben M'Barek, S. et al. (2015) 'FPLC and liquid-chromatography mass spectrometry identify 935 candidate necrosis-inducing proteins from culture filtrates of the fungal wheat pathogen 936 Zymoseptoria tritici', Fungal Genetics and Biology. Elsevier Inc., 79, pp. 54-62. doi: 937 10.1016/j.fgb.2015.03.015. 938 Ben M'Barek, S. et al. (2020) 'Improved control of septoria tritici blotch in durum wheat using 939 cultivar mixtures', Plant Pathology. Blackwell Publishing Ltd, p. ppa.13247. doi: 940 10.1111/ppa.13247. 941 Marchal, C. et al. (2018) 'BED-domain containing immune receptors confer diverse resistance 942 spectra to yellow rust', Nature Plants. doi: 10.1101/299651. 943 McDonald, B. A. (2014) 'Using dynamic diversity to achieve durable disease resistance in 944 agricultural ecosystems', Tropical Plant Pathology, 39(3), pp. 191-196. doi: 10.1590/S1982-945 56762014000300001. 946 McDonald, B. A. and Linde, C. (2002) 'Pathogen Population Genetics, Evolutionary Potential, 947 and Durable Resistance', Annual Review of Phytopathology, 40(1), pp. 349-379. doi: 948 10.1146/annurev.phyto.40.120501.101443. 949 McIntosh, R. A. et al. (2011) 'Rye-derived powdery mildew resistance gene Pm8 in wheat is 950 suppressed by the Pm3 locus', Theoretical and Applied Genetics. Springer Verlag, 123(3), 951 pp. 359-367. doi: 10.1007/s00122-011-1589-5. 952 Mizuno, N. et al. (2010) 'Hypersensitive Response-Like Reaction Is Associated with Hybrid 953 Necrosis in Interspecific Crosses between Tetraploid Wheat and Aegilops tauschii Coss', 954 PLoS ONE. Edited by E. Newbigin. Public Library of Science, 5(6), p. e11326. doi: 955 10.1371/journal.pone.0011326. 956 Moore, J. W. et al. (2015) 'A recently evolved hexose transporter variant confers resistance to 957 multiple pathogens in wheat', Nature Genetics. Nature Publishing Group, 47(12), pp. 1494– 958 1498. doi: 10.1038/ng.3439. 959 Niu, Z. et al. (2014) 'Development and characterization of wheat lines carrying stem rust 960 resistance gene Sr43 derived from Thinopyrum ponticum', Theoretical and Applied Genetics. 961 Springer Verlag, 127(4), pp. 969–980. doi: 10.1007/s00122-014-2272-4. 962 Olson, E. L. et al. (2010) 'Development of wheat lines having a small introgressed segment 963 carrying stem rust resistance gene Sr22', Crop Science, 50(5), pp. 1823-1830. doi: 964 10.2135/cropsci2009.11.0652. 965 Omrane, S. et al. (2017) 'Plasticity of the MFS1 Promoter Leads to Multidrug Resistance in the 966 Wheat Pathogen Zymoseptoria tritici', *mSphere*. Edited by A. P. Mitchell. American Society for Microbiology Journals, 2(5), pp. e00393-17. doi: 10.1128/mSphere.00393-17. 967 968 Pan, C. L. (1940) ' A Genetic Study of Mature Plant Resistance in Spring Wheat to Black Stem 969 Rust, Puccinia Graminis Tritici, and Reaction to Black Chaff, Bacterium Translucens, Var.

Kuang, H. et al. (2006) 'The disease resistance gene Dm3 is infrequent in natural populations of

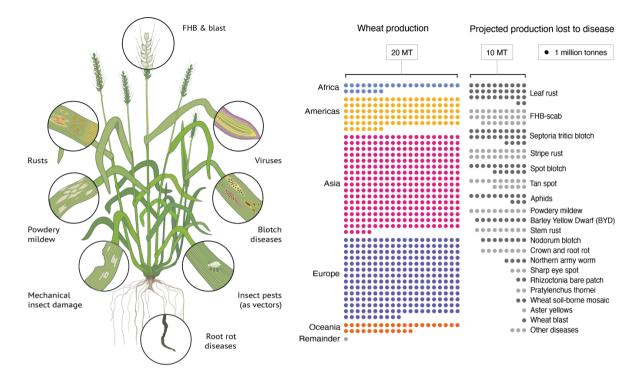
Lactuca serriola due to deletions and frequent gene conversions at the RGC2 locus', Plant

915

970	Undulosum 1', Agronomy Journal. doi: 10.2134/agronj1940.00021962003200020003x.
971	Periyannan, S. et al. (2017) 'An overview of genetic rust resistance: From broad to specific
972	mechanisms', PLoS Pathogens, 13(7), pp. 1-6. doi: 10.1371/journal.ppat.1006380.
973	Petersen, L. K. and Stowers, R. S. (2011) 'A Gateway Multisite recombination cloning toolkit',
974	<i>PLoS ONE</i> . PLoS One, 6(9). doi: 10.1371/journal.pone.0024531.
975	Pont, C. et al. (2019) 'Tracing the ancestry of modern bread wheats', Nature Genetics. Springer
976	US, 51, pp. 905–911. doi: 10.1038/s41588-019-0393-z.
977	Poore, J. and Nemecek, T. (2018) 'Reducing food 's environmental impacts through producers
978	and consumers', 992(June), pp. 987–992.
979	Praz, C. R. et al. (2017) 'AvrPm2 encodes an RNase-like avirulence effector which is conserved
980	in the two different specialized forms of wheat and rye powdery mildew fungus', New
981	<i>Phytologist</i> . Blackwell Publishing Ltd, 213(3), pp. 1301–1314. doi: 10.1111/nph.14372.
982	Radhakrishnan, G. V. et al. (2019) 'MARPLE, a point-of-care, strain-level disease diagnostics
983	and surveillance tool for complex fungal pathogens', BMC Biology. BioMed Central Ltd.,
984	17(1), pp. 65–65. doi: 10.1186/s12915-019-0684-y.
985	Rahman, A. <i>et al.</i> (2018) 'Association mapping from sequencing reads using k-mers', <i>eLife</i> , 7.
986	doi: 10.7554/eLife.32920.
987	Randhawa, M. S. et al. (2018) 'Interactions among genes Sr2/Yr30, Lr34/Yr18/Sr57 and Lr68
988	confer enhanced adult plant resistance to rust diseases in common wheat (<i>Triticum aestivum</i>
989	L.) line "Arula", Australian Journal of Crop Science, 12(06), pp. 1023–1033. doi:
990	10.21475/ajcs.18.12.06.PNE1305.
991	Richardson, T. <i>et al.</i> (2014) 'Efficient Agrobacterium transformation of elite wheat germplasm
992	without selection', <i>Plant Cell, Tissue and Organ Culture</i> . Kluwer Academic Publishers,
993 994	119(3), pp. 647–659. doi: 10.1007/s11240-014-0564-7.
994 995	Saari, E. E. and Wilcoxson, R. D. (1974) 'Plant Disease Situation of High-Yielding Dwarf
993 996	Wheats in Asia and Africa', <i>Annual Review of Phytopathology</i> , (12), pp. 49–68.
990 997	Saintenac, C. <i>et al.</i> (2018) 'Wheat receptor-kinase-like protein Stb6 controls gene-for-gene
997 998	resistance to fungal pathogen Zymoseptoria tritici', Nature Genetics. Nature Publishing
998 999	Group, 50(3), pp. 368–374. doi: 10.1038/s41588-018-0051-x. Salcedo, A. <i>et al.</i> (2017) 'Variation in the <i>AvrSr35</i> gene determines <i>Sr35</i> resistance against
1000	wheat stem rust race Ug99', <i>Science</i> , 358(6370), pp. 1604–1606. doi:
1000	10.1126/science.aao7294.
1001	Sánchez-Vallet, A. <i>et al.</i> (2018) 'Nature's genetic screens: Using genome-wide association
1002	studies for effector discovery', <i>Molecular Plant Pathology</i> , 19(1), pp. 3–6. doi:
1003	10.1111/mpp.12592.
1005	Saur, I. M. L. <i>et al.</i> (2019) 'A cell death assay in barley and wheat protoplasts for identification
1005	and validation of matching pathogen AVR effector and plant NLR immune receptors', <i>Plant</i>
1007	Methods. BioMed Central Ltd., 15(1), p. 118. doi: 10.1186/s13007-019-0502-0.
1008	Savary, S. <i>et al.</i> (2019) 'The global burden of pathogens and pests on major food crops', <i>Nature</i>
1009	<i>Ecology and Evolution</i> , 3(3), pp. 430–439. doi: 10.1038/s41559-018-0793-y.
1010	Segretin, M. E. <i>et al.</i> (2014) 'Single amino acid mutations in the potato immune receptor R3a
1011	expand response to Phytophthora effectors', Molecular Plant-Microbe Interactions. doi:
1012	10.1094/MPMI-02-14-0040-R.
1013	Seifbarghi, S. et al. (2009) 'Studies on the host range of Septoria species on cereals and some
1014	wild grasses in Iran', Phytopathologia Mediterranea, 48(3), pp. 422–429. doi:
1015	10.14601/PHYTOPATHOL MEDITERR-2940.
1016	Song, W. Y. et al. (1995) 'A receptor kinase-like protein encoded by the rice disease resistance
1017	gene, Xa21', Science, 270(5243), p. 1804. doi: 10.1126/science.270.5243.1804.
1018	Stam, R. and McDonald, B. A. (2018) 'When resistance gene pyramids are not durable-the role
1019	of pathogen diversity', Molecular Plant Pathology, 19(3), pp. 521-524. doi:
1020	10.1111/mpp.12636.
1021	Steuernagel, B. et al. (2016) 'Rapid cloning of disease-resistance genes in plants using
1022	mutagenesis and sequence capture', Nature Biotechnology. Nature Publishing Group, 34(6),
1023	pp. 652–655. doi: 10.1038/nbt.3543.
1024	Stewart, E. L. et al. (2016) 'An improved method for measuring quantitative resistance to the

1025	wheat pathogen Zymoseptoria tritici using high throughput automated image analysis',
1026	Phytopathology, 106, pp. 782–788. doi: 10.1094/PHYTO-01-16-0018-R.
1027	Stewart, E. L. and McDonald, B. A. (2014) 'Measuring Quantitative Virulence in the Wheat
1028	Pathogen Zymoseptoria tritici Using High-Throughput Automated Image Analysis',
1029	Phytopathology, 104(9), pp. 985–992. doi: 10.1094/PHYTO-11-13-0328-R.
1030	Stotz, H. U. et al. (2014) 'Effector-triggered defence against apoplastic fungal pathogens',
1031	Trends in Plant Science. Elsevier Current Trends, pp. 491-500. doi:
1032	10.1016/j.tplants.2014.04.009.
1033	Talas, F. et al. (2016) 'Genome-Wide Association Study Identifies Novel Candidate Genes for
1034	Aggressiveness, Deoxynivalenol Production, and Azole Sensitivity in Natural Field
1035	Populations of Fusarium graminearum', Molecular Plant-Microbe Interactions. Molecular
1036	Plant-Microbe Interactions, 29(5), pp. 417–430. doi: 10.1094/MPMI-09-15-0218-R.
1037	Togninalli, M. et al. (2018) 'The AraGWAS Catalog: A curated and standardized Arabidopsis
1038	thaliana GWAS catalog', Nucleic Acids Research. Oxford University Press, 46(D1), pp.
1039	D1150–D1156. doi: 10.1093/nar/gkx954.
1040	Uauy, C., Wulff, B. B. H. and Dubcovsky, J. (2017) 'Combining Traditional Mutagenesis with
1041	New High-Throughput Sequencing and Genome Editing to Reveal Hidden Variation in
1042	Polyploid Wheat', Annual Review of Genetics. doi: 10.1146/annurev-genet-120116-024533.
1043	Voichek, Y. and Weigel, D. (2020) 'Identifying genetic variants underlying phenotypic variation
1044	in plants without complete genomes', Nature Genetics. Springer US, 52(5), pp. 534-540. doi:
1045	10.1038/s41588-020-0612-7.
1046	Wang, Y. et al. (2014) 'Simultaneous editing of three homoeoalleles in hexaploid bread wheat
1047	confers heritable resistance to powdery mildew', Nature Biotechnology. Nature Publishing
1048	Group, 32(9), pp. 947–951. doi: 10.1038/nbt.2969.
1049	Watson, A. et al. (2018) 'Speed breeding is a powerful tool to accelerate crop research and
1050	breeding', Nature Plants. Nature Publishing Group, 4(1), pp. 23-29. doi: 10.1038/s41477-
1051	017-0083-8.
1052	Weber, E. et al. (2011) 'A Modular Cloning System for Standardized Assembly of Multigene
1053	Constructs', PLoS ONE. Edited by J. Peccoud. Public Library of Science, 6(2), p. e16765.
1054	doi: 10.1371/journal.pone.0016765.
1055	Wellings, C. R. et al. (2009) 'The development and application of near-isogenic lines for
1056	monitoring cereal rust pathogens', in R., M. (ed.) Proceedings of Oral Papers and Posters,
1057	2009 Technical Workshop, Cd. Obregón, Sonora, Mexico: BGRI, p. pp 77-87.
1058	Van de Weyer, A. L. et al. (2019) 'A Species-Wide Inventory of NLR Genes and Alleles in
1059	Arabidopsis thaliana', Cell. Cell Press, 178(5), pp. 1260-1272.e14. doi:
1060	10.1016/j.cell.2019.07.038.
1061	Wingen, L. U. et al. (2014) 'Establishing the A. E. Watkins landrace cultivar collection as a
1062	resource for systematic gene discovery in bread wheat', Theor Appl Genet, 127, pp. 1831-
1063	1842. doi: 10.1007/s00122-014-2344-5.
1064	Wolfe, M. S. et al. (1992) 'Barley mildew in Europe: population biology and host resistance',
1065	Euphytica, 63(1-2), pp. 125-139. doi: 10.1007/BF00023918.
1066	Wu, J. Q. et al. (2017) 'Comparative Genomics Integrated with Association Analysis Identifies
1067	Candidate Effector Genes Corresponding to Lr20 in Phenotype-Paired Puccinia triticina
1068	Isolates from Australia', Frontiers in Plant Science. Frontiers, 8, p. 148. doi:
1069	10.3389/fpls.2017.00148.
1070	Wulft, B. B. H. and Moscou, M. J. (2014) 'Strategies for transferring resistance into wheat:
1071	From wide crosses to GM cassettes', Frontiers in Plant Science. Frontiers Media SA, p. 692.
1072	doi: 10.3389/fpls.2014.00692.
1073	Xing, L. et al. (2018) 'Pm21 from Haynaldia villosa Encodes a CC-NBS-LRR Protein
1074	Conferring Powdery Mildew Resistance in Wheat', Molecular Plant. Cell Press, pp. 874-
1075	878. doi: 10.1016/j.molp.2018.02.013.
1076	Xu, P. et al. (2017) 'Automatic Wheat Leaf Rust Detection and Grading Diagnosis via
1077	Embedded Image Processing System', in Procedia Computer Science. doi:
1078	10.1016/j.procs.2017.03.177.
1079	Yates, S. et al. (2019) 'Precision Phenotyping Reveals Novel Loci for Quantitative Resistance to

- 1080Septoria Tritici Blotch', *Plant Phenomics*. American Association for the Advancement of1081Science (AAAS), 2019, pp. 1–11. doi: 10.34133/2019/3285904.
- Yoshida, K. *et al.* (2009) 'Association Genetics Reveals Three Novel Avirulence Genes from the
 Rice Blast Fungal Pathogen *Magnaporthe oryzae*', *The Plant Cell*, 21, pp. 1573–1591. doi:
 1084 10.1105/tpc.109.066324.
- 1085 Zaidi, S. S.-A. *et al.* (2019) 'New plant breeding technologies for food security', *Science*. doi: 10.1126/science.aav6316.
- 1087 Zhang, D. *et al.* (2019) 'Wheat powdery mildew resistance gene *Pm64* derived from wild emmer (*Triticum turgidum* var. *dicoccoides*) is tightly linked in repulsion with stripe rust resistance gene *Yr5*', *Crop Journal.* Crop Science Society of China/ Institute of Crop Sciences, 7(6), pp. 1090 761–770. doi: 10.1016/j.cj.2019.03.003.
- 1091 Zhang, J. *et al.* (2020) 'How Target-Sequence Enrichment and Sequencing (TEnSeq) Pipelines
 1092 Have Catalyzed Resistance Gene Cloning in the Wheat-Rust Pathosystem', *Frontiers in* 1093 *Plant Science*, 11(May), pp. 1–13. doi: 10.3389/fpls.2020.00678.
- 1094 Zhang, X. *et al.* (2016) 'Development and verification of wheat germplasm containing both Sr2
 1095 and Fhb1', *Molecular Breeding*. Springer Netherlands, 36(7), pp. 1–14. doi: 10.1007/s110321096 016-0502-y.
- 1097Zhang, Z. et al. (2010) 'Mixed linear model approach adapted for genome-wide association1098studies', Nature Genetics, 42(4), pp. 355–360. doi: 10.1038/ng.546.
- 1099 Zhong, Z. *et al.* (2017) 'A small secreted protein in *Zymoseptoria tritici* is responsible for
 avirulence on wheat cultivars carrying the *Stb6* resistance gene', *New Phytologist*, 214(2), pp.
 1101 619–631. doi: 10.1111/nph.14434.
- 1102Zhou, Y. et al. (2020) 'Convergence within divergence : insights of wheat adaptation from1103Triticum population sequencing'.
- Zurayk, R. and Khalidi, R. (2011) *Food, farming, and freedom : sowing the Arab spring*. Just
 World Books.
- 1106
- 1107
- 1108 **Table S1.** The 534 native and introgressed *R* genes designated in wheat.
- 1109 **Table S2**. Cloned *R* genes from wheat and wild wheat progenitors.
- 1110 **Table S3.** Cloned effectors corresponding to cloned wheat *R* genes.
- 1111 **Table S4.** Estimated budget for *R* gene atlas.
- 1112 **Table S5.** Details of patents associated with cloned *R* genes.
- 1113



1116Figure 1: Major wheat diseases and their global impacts on wheat production. Wheat production1117statistics were taken from FAO (http://www.fao.org/faostat/en/#data/QC; 2017 data). Estimates of1118yield loss to pathogens were adapted from an expert-based assessment of crop health (Savary *et al.*,11192019).

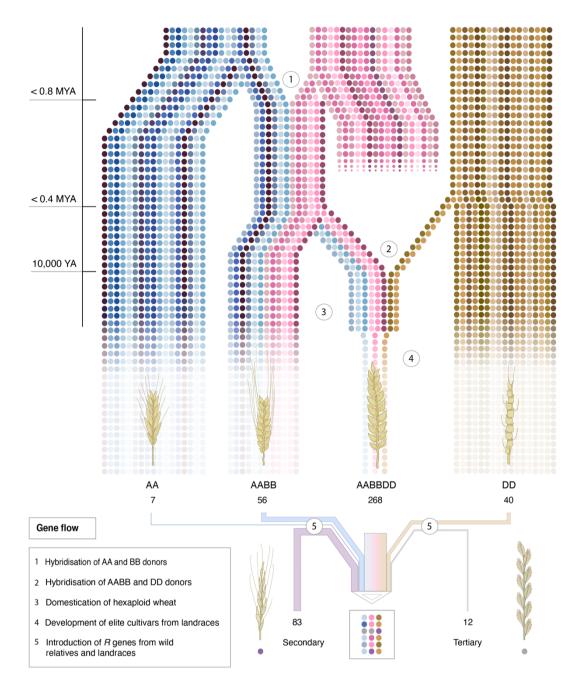


Figure 2. The diversity of R genes in hexaploid bread wheat has been influenced by genetic 1126 bottlenecks during its speciation and domestication, and through controlled inter-species crossing. 1127 (1) Hybridisation of *Triticum urartu* (AA) with a close relative of *Aegilops speltoides* (BB) to form 1128 allotetraploid emmer wheat, Triticum turgidum ssp. diccocoides (AABB) 0.8 million years ago 1129 (MYA). (2) Hybridisation of emmer wheat with Aegilops tauschii (DD) to produce hexaploid wheat 1130 (AABBDD), between 0.4 MYA (genetic evidence) and 10,000 years ago (archaeological evidence). 1131 (3) Domestication likely imposed a bottleneck, but there are no wild hexaploid wheat species so it 1132 is not possible to measure how much diversity was lost between bottlenecks 2 and 3. (4) Genetic 1133 bottleneck due to wheat breeding. Pangenome diversity is represented by coloured dots 1134 proportionate to the gene flow estimated by Zhou et al. (2020). The scope of this figure is the last 1135 ~ 1 million years of wheat's phylogenetic history. (5) In the last 100 years, inter-species crosses 1136 with the primary, secondary and tertiary gene pools have enriched the known native wheat 1137 resistance gene pool of 306 genes with 228 exogenous R genes (Table S1). The secondary gene 1138 pool defined here excludes Aegilops tauschii. 1139

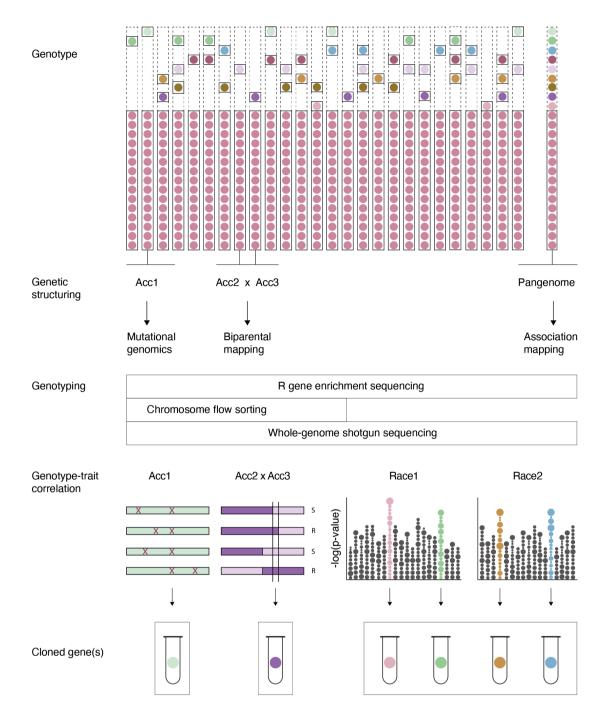
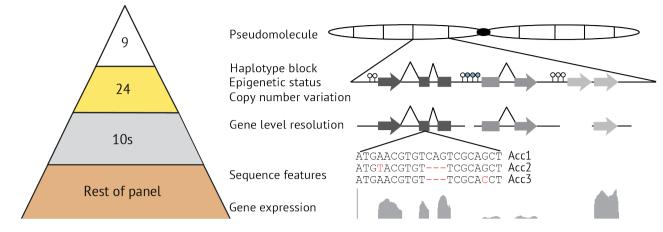
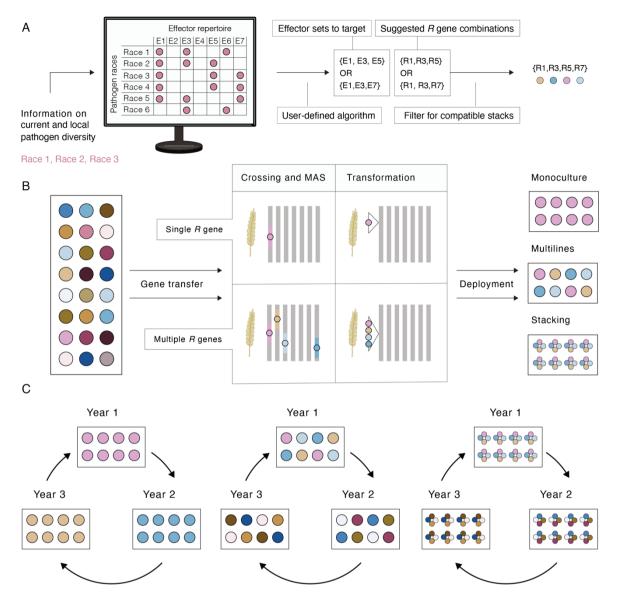


Figure 3. Map-based cloning and mutational genomics can be used to interrogate a narrow genetic base - that of the parent of the mutant population, or of two parents in a biparental mapping population. Association genetics, on the other hand, inspects a wide genetic base through the use of the pangenome variation available in a diversity panel. R gene enrichment or whole-genome shotgun sequencing are suitable genotyping approaches for all three types of genetically structured populations, but chromosome flow sorting may not be cost effective across diversity panels. In all three methods, correlations between the genotype and the trait are examined to identify candidate genes; however, only association mapping offers the possibility of cloning multiple genes from one structured population.



1155 Figure 4. A tiered sequencing approach can be implemented to cost-effectively capture genetic 1156 diversity in panels. The tiers are gold+, gold, silver and bronze (top to bottom). Gold+-level 1157 assemblies are chromosome-scale pseudomolecules, providing the physical context of genes for 1158 key population sub-groups (nine in wheat; Wingen et al., 2014). Gold-level assemblies should 1159 consist of scaffolds 100 kb to several Mb long, and can be used to define haplotype blocks in the 1160 genome. Silver-level assemblies require a scaffold size of only 5 to 15 kb to provide genes with 1161 their regulatory elements for a larger number of accessions. Finally, bronze-level assemblies can be 1162 generated from 5- to 10-fold Illumina reads and can enable the identification of SNPs and micro-1163 indels across the majority of the diversity panel. The variation across these genotyping categories 1164 can be captured through mapping reads to higher-tier assemblies or by generating k-mers. Capturing 1165 the epigenetic variation (methylation of cytosines indicated by blue stalked circles, unmethylated 1166 sites by white stalked circles) of gold-level accessions along with RNA-seq data for the rest of the 1167 panel would provide insight into gene expression that could aid the identification of candidate genes 1168 underlying traits of interest.

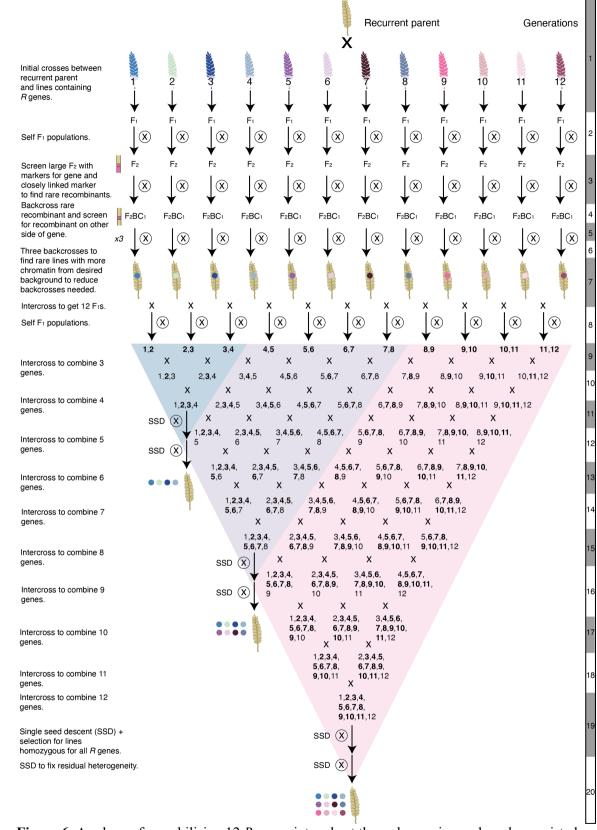


 $1170 \\ 1171$

Dynamic diversity in monoculture Dynamic diversity in multilines

Dynamic diversity in stacking

1172 Figure 5. Using the R gene atlas and pathogen diversity information to determine appropriate 1173 stacks. (A) Information on current local pathogen diversity could be added to a database of races 1174 and their effector repertoires. A user-defined algorithm could then be used to calculate the largest 1175 number of effectors that could be targeted by the least number of R genes which maintain sufficient 1176 redundancy to maximise durable resistance; these R genes would be the best candidates for stacking. 1177 In the example shown, the suggested R gene stack targets 2-3 effectors per pathogen race. (B) Both 1178 traditional methods (crossing and marker-assisted selection (MAS)) and transformation can be 1179 employed to transfer single R genes or R-gene stacks from wild species or landraces into elite 1180 cultivars. Transformation has the advantage of speed, avoiding linkage drag and incorporating 1181 stacks at a single locus, while breeding can focus on combining R genes with partial resistance. 1182 Cultivars can then be deployed in monoculture or as multilines. (C) Whether cultivars are deployed 1183 with a single R gene or stack or as multilines, cultivars can be changed year on year to both combat 1184 the most destructive virulences in the pathogen and reduce the time that individual R genes are 1185 exposed to pathogens, reducing the chances of virulence to them evolving. This is a dynamic 1186 diversity approach (McDonald, 2014).



- 1190 Figure 6. A scheme for mobilising 12 R genes into wheat through crossing and marker-assisted
- 1191 selection. Generations are indicated by the bar on the right. The blue, lilac and pink triangles 1192
- indicate the crosses required to generate stacks of four, eight and 12 genes, respectively.
- 1193 Homozygous genes are emboldened. SSD = single seed descent.