Linking the International Wheat Genome Sequencing Consortium 1

bread wheat reference genome sequence to wheat genetic and 2

phenomic data 3

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| 21 | |
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25

26 Abstract

The Wheat@URGI portal (https://wheat-urgi.versailles.inra.fr) has been developed to provide 27 28 the international community of researchers and breeders with access to the bread wheat 29 reference genome sequence produced by the International Wheat Genome Sequencing 30 Consortium. Genome browsers, BLAST, and InterMine tools have been established for in depth exploration of the genome sequence together with additional linked datasets including 31 physical maps, sequence variations, gene expression, and genetic and phenomic data from 32 other international collaborative projects already stored in the GnpIS information system. The 33 portal provides enhanced search and browser features that will facilitate the deployment of 34 the latest genomics resources in wheat improvement. 35

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38 Background

The International Wheat Genome Sequencing Consortium (IWGSC) [1] is an international 39 collaborative group of growers, academic scientists, and public and private breeders that was 40 established to generate a high quality reference genome sequence of the hexaploid bread 41 wheat, and to provide breeders with state-of-the-art tools for wheat improvement. The vision 42 of the consortium is that the high quality, annotated ordered genome sequence integrated 43 with physical maps will serve as a foundation for the accelerated development of improved 44 varieties and will empower all aspects of basic and applied wheat science to address the 45 important challenge of food security. A first analysis of the reference sequence produced by 46 the consortium (IWGSC RefSeq v1.0) was recently published [2]. 47

To ensure that wheat breeding and research programs can make the most of this extensive 48 genomic resource, the IWGSC endorsed the establishment of a data repository at URGI (Unité 49 de Recherche Génomique Info / research unit in genomics and bioinformatics) from INRA 50 (Institut National de la Recherche Agronomique / French national institute for agricultural 51 research) to develop databases and browsers with relevant links to public data available 52 worldwide. The IWGSC data repository is thus hosted by URGI to support public and private 53 parties in data management as well as analysis and usage of the sequence data. Wheat 54 functional genomics (expression, methylation, etc.), genetic, and phenomic data has increased 55 concurrently, requiring the development of additional tools and resources to integrate 56 different data for biologists and breeders. To manage this escalation of data, URGI have built 57 this data repository for the wheat community with the following specific aims: (i) store 58 resources for which no public archive exists (e.g. physical maps, phenotype information); (ii) 59 enable pre-publication access to specific datasets (e.g. sequence assemblies and annotations, 60 physical maps, markers); and (iii) rapid release of integrated resources upon publication. The 61 62 repository has been designed in accordance with the "FAIR" principles [3] to ensure that the data are Findable, Accessible, Interoperable and Reusable. To address the challenge of 63 64 integrating diverse data types from multiple sources, URGI employs solutions that provide enhanced features for data exploration, mining and visualisation using the GnpIS information 65 system [4] combined with a high level of data interoperability. 66

Here we describe the data and tools currently available through the Wheat@URGI portal [5], the primary resource for the reference sequence of the bread wheat genome (IWGSC RefSeq v1.0) and other IWGSC wheat genomic data. The links to functional genomics, genetic and phenomic data from many other large wheat projects are also described.

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73 A large wealth of data is available throughout the Wheat@URGI

74 portal

The data hosted by the Wheat@URGI portal are available through flat files stored in the IWGSC data repository and through the GnpIS information system [4]. GnpIS encompasses a set of integrated databases to manage genomic data using well-known tools such as BLAST, JBrowse, GBrowse and InterMine, and an in-house database called GnpIS-coreDB developed by URGI to manage genetic and phenomic data.

80

81 IWGSC data

Through its concerted efforts to achieve a high quality, functionally annotated reference wheat genome sequence, the IWGSC has developed a variety of resources for the bread wheat (*Triticum aestivum L.*) accession Chinese Spring. The IWGSC data hosted in the Wheat@URGI portal within the IWGSC data repository are shown in Table 1. They fall into four broad categories: (i) physical maps, (ii) sequence assemblies and annotations, (iii) gene expression, and (iv) variation data.

Physical maps: physical maps assembled by IWGSC scientists for the 21 bread wheat 88 chromosomes, based on high information content fluorescence fingerprinting (HICF) [6] or 89 whole genome profiling (WGPTM) [7] of flow-sorted chromosome or chromosome-arm specific 90 91 BAC libraries, are stored and displayed. The positions of individual BAC clones, markers, and deletion bins are mapped onto physical contigs. The database maintains all released versions 92 of each physical map with the software used to produce the BAC clone assemblies (FPC [8] or 93 94 LTC [9]), information from the group that produced the map and a link to order the BAC clones from the French plant genomic resource centre [10]. 95

Sequence assemblies and annotations: the IWGSC wheat genome sequence assemblies 96 available for download, BLAST [11], and display in genome browsers include the draft survey 97 sequence assemblies released in 2014 (IWGSC Chromosome Survey Sequence (CSS) v1) and 98 two improved versions (CSS v2 and v3) [12], and the chromosome 3B reference sequence (the 99 first reference quality chromosome sequence obtained by the consortium) [13]. Associated 100 101 with these assemblies are the virtual gene order map generated for the CSS (Genome Zipper), 102 the POPSEQ data used to order sequence contigs on chromosomes [14] and mapped marker sets. The reference sequence of the bread wheat genome (IWGSC RefSeg v1.0, 14.5 Gb 103 assembly with super scaffold N50 of 22.8Mb) was obtained by integrating whole genome 104 shotgun Illumina short reads assembled with NRGene's DeNovoMAGIC[™] software with the 105 wealth of IWGSC map and sequence resources [2]. The IWGSC RefSeq v1.0 is available for 106 107 download, BLAST, and browser display. Users can access the whole genome, pseudomolecules 108 of individual chromosomes or chromosome arms, and scaffolds with the structural and functional annotation of genes, transposable elements, and non-coding RNAs generated by 109 110 the IWGSC. In addition, mapped markers as well as alignments of nucleic acid and protein evidence supporting the annotation are available. Updated versions of the annotation for 111 genes belonging to specific gene families or regions of specific chromosomes that have been 112 113 manually annotated (ca. 3685 genes) can be found in the IWGSC RefSeq v1.1 annotation. 114 In addition to the bread wheat sequence, the IWGSC also assembled seven diploid and

tetraploid wheat related species: *Triticum durum* cv. Cappelli, *Triticum durum* cv. Strongfield,
 Triticum durum cv Svevo, *Triticum monococcum*, *Triticum urartu*, *Aegilops speltoides*, *Aegilops sharonensis* [12]. Download and BLAST is available for these data.

Expression data: RNA-Seq expression data are available as reads counts and transcripts per
 kilobase million (TPM) for the IWGSC RefSeq v1.1 annotation. It is a transcriptome atlas

- developed from 850 RNA-Seq datasets representing a diverse range of tissues, development
- 121 stages and environmental condition [15].
- 122 *Variation data*: These data consists of downloadable VCF files from genotyping by sequencing
- and whole exome capture experiments of 62 diverse wheat lines [16] and of the IWGSC
- 124 **3,289,847** inter-varietal SNPs [17].
- 125 <u>Table 1</u>

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- 126 IWGSC data summary in open access hosted in the IWGSC Data Repository of the
- 127 Wheat@URGI portal in March 2018.

| Data | Details | Tools | Contacts |
|-------------------------------------|---|-----------------------------|---|
| IWGSC RefSeq v1.0 assembly | scaffolds, superscaffolfs, pseudomolecules | Download, BLAST and browser | IWGSC |
| IWGSC RefSeq v1.0 annotation | genes, transposable elements, ncRNAs, markers, functional annotation, RNA-seq | Download and browser | IWGSC |
| IWGSC WGA v0.4 | scaffolds, superscaffolfs, pseudomolecules | Download and BLAST | IWGSC |
| IWGSC Survey sequence v2 assembly | contigs, gene models, Genome Zipper, POPSEQ | Download and BLAST | IWGSC, Mihaela Martis, Manuel Spannagl, Klaus Mayer, Nils Stein |
| IWGSC Survey sequence v2 annotation | genes, markers, physical contigs | Browser | IWGSC, Curtis Pozniak, Eduard Akhunov |
| IWGSC Survey sequence v3 assembly | scaffolds | Dowload and browser | Andy Sharpe, David Konkin, Curtis Pozniak |
| IWGSC SNPs | intervarietal SNPs | Download | Etienne Paux |
| 3B reference sequence assembly | contig, scaffolds, pseudomolecule | Download and BLAST | Frédéric Choulet, Etienne Paux |
| 3B reference sequence annotation | genes, transposable elements, RNAs, markers | Browser | Frédéric Choulet, Etienne Paux |
| Other wheat species WGS assemblies | Triticum durum cv. Cappelli, Triticum durum cv. Strongfield, Triticum monococcum, Aegilops speltoides, Aegilops Sharonensis, Triticum urartu, Aegilops tauschii | Download and BLAST | Jon Wright, Mario Caccamo |
| Transcriptome | Deep transcriptome sequencing | Download | Lise Pingault, Etienne Paux |
| | Triticum urartu and Triticum turgidum (Graingenes) | Download | Jorge Dubcovsky |
| Variations | GBS and WEC | Download | Eduard Akhunov |
| Physical maps | 1AS v1 and v2 | Download and browser | James Breen, Thomas Wicker, Beat Keller |
| | 1AL v1 and v2 | Download and browser | Stuart Lucas, Hikmet Budak |
| | 2AS | Download and browser | Kuldeep Singh |
| | 2AL | Download and browser | Kuldeep Singh |

| 3AS v1 | Download and browser | Sunish Sehgal, Bikram Gill |
|-----------------------|----------------------|--|
| 3AS v2 | Download and browser | Sunish Sehgal, Bikram Gill |
| 3AL | Download and browser | Vijay Kumar Tiwari |
| 4AS | Download and browser | Miroslav Valarik, Jaroslav Dolezel |
| 4AL v1 and v2 | Download and browser | Miroslav Valarik, Jaroslav Dolezel |
| 5AS | Download and browser | Simone Scalabrin |
| 5AL | Download and browser | Simone Scalabrin |
| 6AS | Download and browser | Naser Poursarebani |
| 6AL | Download and browser | Naser Poursarebani |
| 7AS | Download and browser | Gabriel Keeble-Gagnere |
| 7AL | Download and browser | Gabriel Keeble-Gagnere |
| 1BS v1, v2, v3 and v5 | Download and browser | Dina Raats, Zeev Frenkel, Abraham Korol |
| 1BL v1 and v2 | Download and browser | Etienne Paux |
| 2BS | Download and browser | John Jacobs |
| 2BL | Download and browser | John Jacobs |
| 3B | Download and browser | Etienne Paux |
| 4BS | Download and browser | John Jacobs |
| 4BL | Download and browser | John Jacobs |
| 5BS | Download and browser | Elena Salina |
| 5BL | Download and browser | John Jacobs |
| 6BS v1 and v2 | Download and browser | Fuminori Kobayashi, Hirokazu Handa |
| 6BL v1 and v2 | Download and browser | Fuminori Kobayashi, Hirokazu Handa |
| 7BS | Download and browser | Tatiana Belova, Odd-Arne Olsen |
| 7BL | Download and browser | Tatiana Belova, Odd-Arne Olsen |
| 1D | Download and browser | Bikram Gill, Sunish Sehgal Vijay Kumar Tiwari |
| 2DS | Download and browser | John Jacobs |
| 2DL | Download and browser | John Jacobs |
| 3DS v1 and v2 | Download and browser | Jan Bartos, Jaroslav Dolez |
| 3DL | Download and browser | Jon Wright, Mario Caccan Mike Bevan |
| 4D | Download and browser | Bikram Gill, Sunish Sehgal Vijay Kumar Tiwari |
| 5DS | Download and browser | Hikmet Budak, Bala Ani Akpinar |
| 5DL | Download and browser | John Jacobs |
| 6D | Download and browser | Bikram Gill, Sunish Sehgal Vijay Kumar Tiwari |
| 7DS | Download and browser | Hana Simkova, Jaroslav Dolezel |
| 7DL | Download and | Song Weining, Wang Le |

128 Enquiries about these data should be addressed to <u>communications@wheatgenome.org</u> and

- 129 <u>urgi-contact@inra.fr</u>.
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132 Wheat gene pool

As well as IWGSC resources, URGI also hosts other open access wheat sequence data to facilitate research into the wheat gene pool. Sequence assemblies available for download and BLAST include the bread wheat whole genome sequence assembly *Triticum aestivum* TGACv1 [18] and the diploid progenitor of *Aegilops tauschii* [19].

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138 Genetic and phenomic data

In addition to sequence data, the Wheat@URGI portal hosts, within GnpIS-coreDB, several sets of genetic and phenomic wheat data [20] that have been produced from French, European, and international projects since 2000 [21]. A significant amount of these data is available without restriction. However, access to restricted data can be obtained through a material transfer or intellectual property agreement. Table 2 presents the types and number of genetic and phenomic data hosted in the GnpIS-coreDB database.

Genetic information corresponds to genetically mapped markers, quantitative trait loci (QTLs), genetic resources (germplasms), and genetic studies (genome wide association studies -GWAS). Genomic information consists of variation from SNP discovery experiments, genotyping, comparative genomics (synteny) and expression data (microarray, RNA-Seq). Phenomic data are available as whole trials including phenotypic and environmental observations recorded using ontologies controlled variables with MIAPPE [22] compliant metadata.

Germplasm data were mainly provided by the French small grain cereals genebank maintained by INRA at Clermont-Ferrand [23] but also by partners of several EU projects. They were linked together with related genotyping or phenotyping characterization data. Generally, genetic and phenomic data have been produced by INRA and its partners in large collaborative projects.

157 <u>Table 2</u>

158 Genetic and phenomic wheat data summary hosted in the GnpIS-coreDB database of the

159 Wheat@URGI portal in March 2018.

| Data type | Object | #Total | #Open access | #Restricted access to projects |
|------------------------------|--------------------|------------|-----------------|--------------------------------------|
| Genetic Resources | Taxon | 56 | 56 | 0 |
| Genetic Resources | Accession | 12839 | 10016 | 2823 |
| | Мар | 30 | 29 | 1 |
| Genetic Maps | Marker | 704822 | 34164 | 670658 |
| | QTL | 749 | 465 | 284 |
| SND discovery | Sequence Variation | 4189312581 | 90 | 4189312491 |
| SNP discovery | SNP, indel | 724132 | 95 | 724037 |
| | Experiment | 23 | 2 | 21 |
| Genotyping (high throughput) | Sample | 8885 | 47 | 8872 |
| | Marker | 668540 | 0 | 668540 |
| | Trial | 850 | 821 | 29 |
| Dhanaturing | Plot | 3660 | 2985 | 901 |
| Phenotyping | Variable | 282 | 89 | 195 |
| | Observation | 1171172 | 527981 | 643191 |
| | Analysis | 1555 | 43 | 1512 |
| | Sample | 2365 | 1839 | 526 |
| GWAS | Variable | 359 | 37 | 322 |
| | Marker | 123866 | 4109 | 119757 |
| | Association | 824217 | 48596 | 775621 |

160 Questions about these data can be addressed to <u>urgi-contact@inra.fr</u>.

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163 Browsing and searching a large variety of integrated data

Data can be easily accessed through the Wheat@URGI portal [5] using (i) tabs at the top of the pages allowing access in one click to the data, tools, and projects descriptions as well as the IWGSC data repository, (ii) direct links on the home page to the different data types (e.g. clicking on "Physical maps" opens the physical maps browser), and (iii) data discovery and InterMine [24] tools on the home page.

169 The IWGSC data repository [25] allows accessing consortium data by (i) clicking on a

170 chromosome to open a pop-up menu with all related data (*e.g.* 3A, 3B, etc.), (ii) using the tabs

| 171 | on the left to access the data by type (e.g. Assemblies, Annotations, etc.), or useful links to the |
|-----|---|
| 172 | news, the BLAST tool, the FAQ, the access status of the data (e.g. open access), etc. |

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174 Physical maps browser

A GBrowse [26] displays the physical maps generated by the IWGSC members [27]. A clickable image on the top of the browser gives access to all versions of the physical map for each chromosome. The browser displays physical contigs, BACs, deletions bins, and markers. From the BACs track, it is possible to order BAC clones directly at the INRA French plant genomic resource centre [10]. From the BACs and markers tracks, one can go directly to the corresponding region in the IWGSC RefSeq v1.0 browser.

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182 Genome browser and BLAST

183 The IWGSC RefSeq v1.0 is displayed in a dedicated JBrowse [28], [29]. The "markers track" provides links to additional genetic information stored in GnpIS-coreDB which includes access 184 185 to the position of the marker in cM on genetic maps and to the overlapping QTLs. The most popular tool of the IWGSC data repository is the BLAST search tool (476,000 BLAST searches 186 launched in 2017). All of the wheat sequences available on the Wheat@URGI portal are 187 188 indexed for BLAST search (see [30] for the complete list). A set of databanks can be selected: 189 e.g. IWGSC RefSeq v1.0 and IWGSC CSS v3 for a given chromosome. The result is presented in a classical tabular format with (i) links to download the data (matching contigs and high scoring 190 pairs - HSP), (ii) links on the genome browsers directly zooming in on the matching region and 191 (iii) external links to EnsemblPlants [31]. 192

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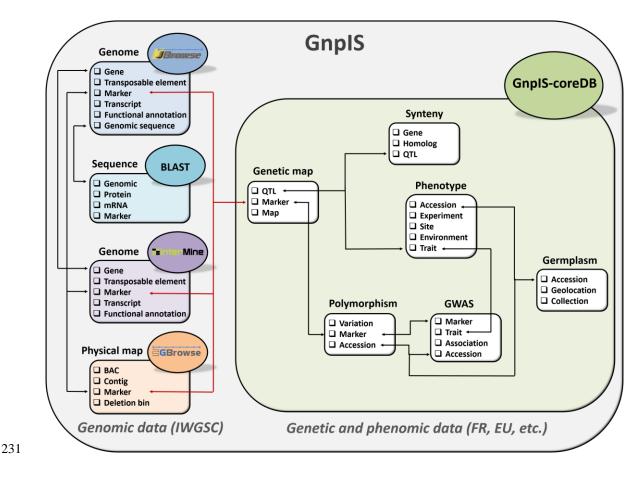
194 Genetic and phenomic data in GnplS-coreDB

The IWGSC sequence data are linked to genetic and phenomic data within the GnpIS 195 information system [4]. This integration is organized around key data, also called "pivot data" 196 as they are pivotal objects which allow integration between data types. The key objects used 197 to link genomic resources to genetic data are markers and QTLs. Markers are mapped on the 198 genome sequences and provides information on neighbour genes and their function. They 199 also have links to GnpIS-coreDB genetic maps, QTLs, genotyping and GWAS data. Additional 200 information on the marker itself can be found regarding the marker type (e.g. SSR, DArT), the 201 primers sequence for PCR amplification, and SNP details (including the flanking sequences) 202 when relevant. QTLs link the genetic data to the phenomic data in GnpIS-coreDB and to 203 synteny data displayed by the PlantSyntenyViewer tool [32], [33]. 204

The accession (i.e. germplasm) and the variables (i.e. observed trait) described with dedicated 205 ontologies are another important key data for genetic studies as they allow linking phenotype 206 207 data to genetic associations or QTLs through traits and to genotype diversity data. The genetic resources stored in GnpIS-coreDB displays the unambiguous identification of the accession 208 209 used (with digital object identifier - DOI) and a rich set of associated data following the MCPD (multi-crop passport descriptors, [34]) standard: a picture, synonyms, descriptors, geolocation 210 211 of the sites (origin, collecting and evaluation), the collections or panels it belongs to, the 212 holding stock centre with a link to order the accession when possible. The phenotype data 213 includes traceability on trials with timing, like year and temporal series, location, and environment including soil and cultural practices. The phenotype and environment variables 214 follow the crop ontologies format [35] that includes unique identifiers for each variable which 215 are composed of a trait description (e.g. grain yield, plant height top, spike per area), a unit 216 and a method. All these data are displayed in the GnpIS-coreDB web interface and can be 217 218 downloaded in different file formats, all compliant with the MIAPPE standard [22].

220 Mining and data discovery tools

- To complete this already rich integrated datasets, a gene centric data warehouse, the 221 WheatMine, has been set-up using the well-established InterMine tool [24]. The gene card 222 displays gene function, gene ontology terms, and overlapping genomic features. WheatMine 223 [36] provides access to IWGSC RefSeq v1.0 annotation data (genes, mRNA, polypeptides, 224 transposable elements), polymorphisms (markers) and, through pivotal objects, to genetic 225 data (QTL, metaQTL). It is also possible to navigate from a gene card to its position on the 226 227 wheat genome browser or to relevant marker details in GnpIS-coreDB. Figure 1 presents the concept and the tools to navigate through the key data in GnpIS. 228
- 229 Figure 1
- 230 Conceptual view of wheat data links in GnpIS



Finally, to facilitate data search and access to this wealth of data, we developed a data discovery tool, which, similar to a google search, allows the user to enter keywords or terms to find all the matching information in the various data warehouses. The results are presented in a table with details on the matches (database source, type, species, description) and a direct link to the feature (e.g. a gene in a browser, a marker page in GnpIS-coreDB, etc.). A practical use case describing how to use the Wheat@URGI portal to go from a gene sequence to find the genetic studies related is detailed in the Supplementary data.

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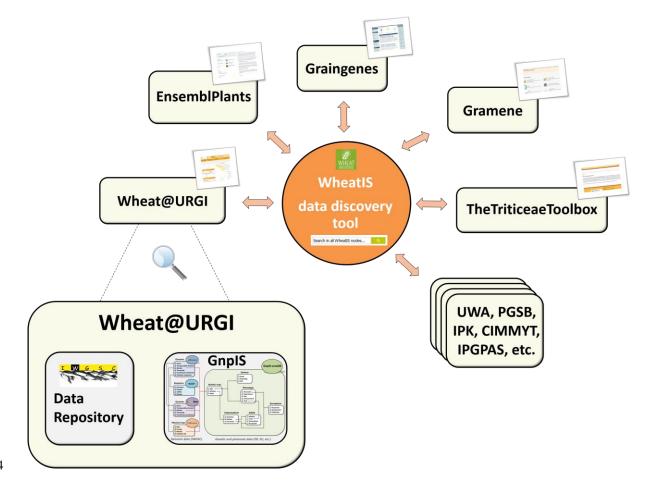
242 **Conclusion and future directions**

The Wheat@URGI portal hosts and gives access to essential, high quality wheat data from the IWGSC, European, and international projects. Furthermore, its added value is that it integrates different data type altogether (genomics, genetics and phenomics) and provides dedicated tools to explore them.

As new wheat resources such as GWAS, genomic selection, and pan-genome data are generated in the frame of ongoing projects, GnpIS will allow their management and integration with other data already available in the information system, linking new upcoming data to this central IWGSC genomic resource.

At a wider scale, an expert working group (EWG) of the international Wheat Initiative build an international wheat information system, called WheatIS, with the aim of providing a singleaccess web-based system to all available wheat data resources and bioinformatics tools [37]. The Wheat@URGI portal is a major node of the WheatIS federation that expose genomic, genetic and phenomic integrated data to the community. The WheatIS data discovery tool allows a one-stop search in GnpIS [4] (including IWGSC browsers, InterMine and GnpIS-

- coreDB; URGI), EnsemblPlants (EMBL-EBI) [31], CrowsNest [38] (PGSB), CR-EST [39], GBIS [40]
- and MetaCrop [41] (IPK), The Triticeae Toolbox (Triticeae CAP), CIMMYT DSpace and
- 259 Dataverse (CIMMYT), Gramene [42] (CSH, OSU, EMBL-EBI), Cropnet (IPGPAS), WheatPan [43]
- 260 (UWA) and GrainGenes [44] (USDA).
- 261 The Figure 2 presents the WheatIS ecosystem.
- 262 Figure 2
- 263 The Wheat@URGI portal node in the WheatIS ecosystem



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Data integration is fundamental for researchers and breeders that want to use genomic information to improve wheat varieties. However, the diversity of data type and the concomitant lack of data harmonisation and standards hamper cross-referencing and metaanalysis. A joint action between the WheatIS EWG and a group of linked data scientists created the Wheat Data Interoperability Working Group under the Research Data Alliance (RDA) 14

- umbrella [45] to help tackle this difficult issue [46]. The Wheat@URGI portal continuously
- evolves its repository to follow the standard recommendations [47].
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- 274

275 Abbreviations

- 276 IWGSC: international wheat genome sequencing consortium
- 277 INRA: institut national de la recherche agronomique / French national institute for agricultural
- 278 research
- 279 URGI: unité de recherche génomique info / research unit in genomics and bioinformatics
- 280 FAIR: findable, accessible, interoperable, reusable
- 281 BLAST: basic local alignment search tool
- 282 HICF: high-information-content fingerprinting
- 283 WGPTM: whole genome profiling
- 284 BAC: bacterial artificial chromosome
- 285 **FPC:** fingerprinted contig
- 286 LTC: linear topological contig
- 287 **CSS:** chromosome survey sequence
- 288 **POPSEQ:** population sequencing
- 289 **RNA:** ribonucleic acid
- 290 TPM: transcripts per kilobase million
- 291 VCF: variant call format
- 292 SSR: simple sequence repeats
- 293 SNP: single nucleotide polymorphism
- 294 **DArT:** diversity arrays technology

- **QTL:** quantitative trait loci
- **GWAS:** genome-wide association study
- **cM:** centimorgan
- HSP: high scoring pairs
- **PCR:** polymerase chain reaction
- 300 DOI: digital object identifier
- 301 MCPD: multi-crop passport descriptors
- 302 MIAPPE: minimum information about a plant phenotyping experiment
- **EWG:** expert working group
- **EMBL-EBI:** European bioinformatics institute
- **PGSB:** plant genome and systems biology group
- **IPK:** Leibniz institute of plant genetics and crop plant research
- **CIMMYT:** international maize and wheat improvement center
- **CSH:** Cold Spring Harbor laboratory
- **OSU:** Ohio State University
- **IPGPAS:** institute of plant genetics of the Polish academy of science
- 311 UWA: University of Western Australia
- 312 USDA: U.S. department of agriculture
- **EWG:** expert working group
- **RDA:** research data alliance

Declarations

318 Ethics approval and consent to participate

- 319 Not applicable.
- 320
- 321 **Consent for publication**
- 322 Not applicable.
- 323

324 Availability of data and materials

- 325 The open access data (including all the IWGSC data) are available through the Wheat@URGI
- 326 portal: <u>https://wheat-urgi.versailles.inra.fr</u>.
- 327

328 Competiting interest

- 329 The authors declare that they have no competing interests.
- 330

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- 336

337 Authors' contributions

- 338 MA, JR, TL, FA, KE designed, developed and filled the IWGSC data repository.
- 339 MA, TL, RF, FA, CP, NM, SD, EK, CM, CG, MLo, MLa, DS, AFAB, HQ designed, developed and
- 340 filled the GnpIS information system.
- FC, HR, PL, NG, JS, CF, IWGSC, EP generated, submitted the data and give feedback on the
 tools.
- 343 MA, JR, EP, KE, AFAB, HQ draft the manuscript.
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- 357
- 358

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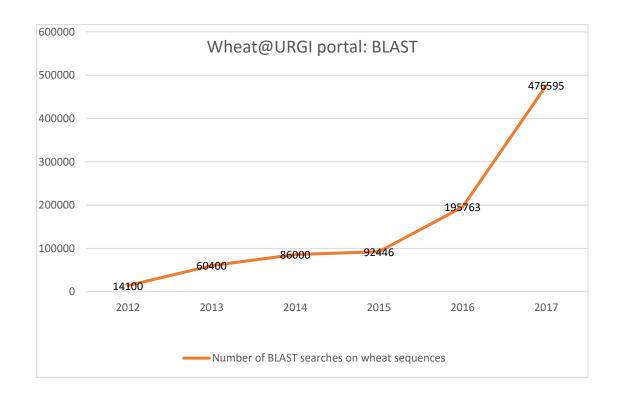
457 Supplementary data

458 Software technologies

- The Wheat@URGI portal website is based on eZ Publish v4 open source content management system (<u>https://ez.no/</u>) using the PHP language and a MySQL database (<u>https://www.mysql.com/</u>).
- 462 The genome browsers are based on the GMOD (<u>http://gmod.org/wiki/Main_Page</u>) GBrowse
- v2.33 [26] and JBrowse v1.11.5 [28] built with JavaScript and HTML5. We customized GBrowse
- to display the physical map data. The gff3 file is generated from the .fpc file obtained by the
- data producer using the FPC [8] or the LTC [9] tools.
- 466 The stand-alone BLAST web interface implemented at URGI is based on ViroBLAST [48],
- 467 customized to obtain a user-friendly grouping of searched databanks and visualization of the
- results. A robust file download system was also developed using a home-made php script to
 handle big data volume.
- GnpIS-coreDB is a URGI development using state of the art technologies; Java EE framework 470 (http://www.oracle.com/technetwork/java/javaee/overview/index.html), GWT (Google Web 471 472 Toolkit, http://www.gwtproject.org/), Spring boot v1.4 (https://projects.spring.io/springboot/), PostgreSQL relational database v9.6 (https://www.postgresql.org/) and Elasticsearch 473 NoSQL database v2.3.3 (https://www.elastic.co/). To set-up a GnpIS-coreDB dedicated to the 474 wheat community, a filter allowing to display only the wheat data (Triticum, Aegilops) and 475 barley data (Hordeum) was developed. This filter relies on a variable-length multidimensional 476 arrays field in the PostgreSQL database. It is completely transparent to the user and allows 477 him to navigate in GnpIS-coreDB through wheat data only. New versions of the GnpIS-coreDB 478 software are deposited in the APP, the European body for protecting authors and publishers 479 of digital works (http://www.app.asso.fr/en/welcome.html). 480

- 481 WheatMine uses InterMine [24] v1.8.3 which provides a fast, flexible and user friendly access
- to integrated data by multiple ways: a browser, a query builder and a region search tool. Users
- 483 can filter their favorite features, save their own queries, and export results in many different
- 484 formats (GFF3, BED or XML). An On-line documentation and pre-computed queries are also
- 485 available.
- 486 The data discovery tool relies on the Solr full-text indexing technology v6.6.2
- 487 (http://lucene.apache.org/solr/). We used a restriction on the wheat and barley species to
- 488 search only the corresponding data in the indexed databases. The tool was packaged and is
- 489 downloadable (<u>https://wheat-urgi.versailles.inra.fr/Projects/Wheat-Information-</u>
- 490 <u>System/SolR-tool-package</u>).
- 491
- 492 Usage Statistics
- 493 Table S1. Usage statistics of genomics data in the Wheat@URGI portal (all numbers exclude
- 494 web-robots and internal IP).

| Number of | 2012 | 2013 | 2014 | 2015 | 2016 | 2017 |
|------------------------------|-------|-------|-------|-------|--------|--------|
| Visits on the IWGSC Sequence | | | | | | |
| Repository website | N/A | 11440 | 20754 | 27070 | 20841 | 28151 |
| Downloads of wheat sequence | | | | | | |
| data | 2253 | 4413 | 17783 | 19307 | 18724 | 22935 |
| Visits on the wheat browsers | 5869 | 9370 | 9130 | 22989 | 22373 | 18262 |
| Number of BLAST searches on | | | | | | |
| wheat sequences | 14100 | 60400 | 86000 | 92446 | 195763 | 476595 |
| Number of WheatIS data | | | | | 13010 | |
| discovery tool searches | N/A | N/A | N/A | N/A | 13010 | 26480 |



495

496 Use case example

A researcher in genomics works on his wheat favorite gene. He wants to explore all the genomic data in the vicinity of this gene and find out if there are genetic studies pointing to the genomic regions where the gene is located. He searches the gene name (e.g. TraesCS5A01G033100) in the data discovery tool (<u>https://wheat-urgi.versailles.inra.fr</u>, Fig S1.1A) or BLAST the sequence of the gene against the IWGSC RefSeq v1.0 (<u>https://urgi.versailles.inra.fr/blast_iwgsc/</u>, Fig S1.1B).

503 The results are displayed in a table (Fig S1.2A, Fig S1.2B) with links to the JBrowse directly

- 504 zooming on the gene
- 505 (https://urgi.versailles.inra.fr/jbrowseiwgsc/gmod_jbrowse/?data=myData%2FIWGSC_RefSe
- 506 <u>q v1.0&loc=chr5A%3A30211546..30218715&tracks=DNA%2CHighConfidenceGenesv1.0%2C</u>
- 507 LowConfidenceGenesv1.0%2CrepeatRegion%2CrepeatMasker%2CDART_PUBLIC_SUMMARY
- 508 <u>&highlight=chr5A%3A30214481..30215784%20(-%20strand)%20(TraesCS5A01G033100)</u>). He

| 509 | explores the reg | ion around th | e gene and | finds a mar | ker (e.g. wPt | -4131_PURr, | Fig S1.3). By |
|------------|---------------------------------------|------------------|--------------|----------------------------|----------------------------------|------------------------------------|-----------------------------|
| 510 | clicking on the | marker, he | obtains | additional i | nformation | stored in (| GnpIS-coreDB |
| 511 | (https://urgi.vers | ailles.inra.fr/ | GnpMap/ma | apping/id.do | ?action=MAR | RKER&id=403 | 93, Fig S1.4) |
| 512 | showing that | the r | narker | is used | in a | GWAS | experiments |
| 513 | (https://urgi.vers | ailles.inra.fr/a | association/ | association/ | viewer.do?re | sults/marker | <u>lds=40393</u> , |
| 514 | Fig S1.5A) | and is | linked | to a | QTL | (e.g. GY | _ml.8.Np_5A, |
| 515 | https://urgi.versa | ailles.inra.fr/G | npMap/ma | pping/id.do? | action=QTL8 | <u>kid=59588</u> , Fi | ig S1.5B). |
| | | | | | | | |
| 516 | From th | ie Tr | ait | description | of | this | QTL |
| 516 517 | From th (<u>https://urgi.vers</u> | | | · | | | |
| | | ailles.inra.fr/0 | | · | ?action=TRAI | I <u>T&id=255</u> , I | |
| 517 | (https://urgi.vers | the phe | GnpMap/ma | apping/id.do experiment | <u>?action=TRAI</u> t perform | I <u>T&id=255</u> , I ed on | Fig S1.6), he this trait |

- _____
- 521 Figure S1. Printscreens of the web interfaces.

