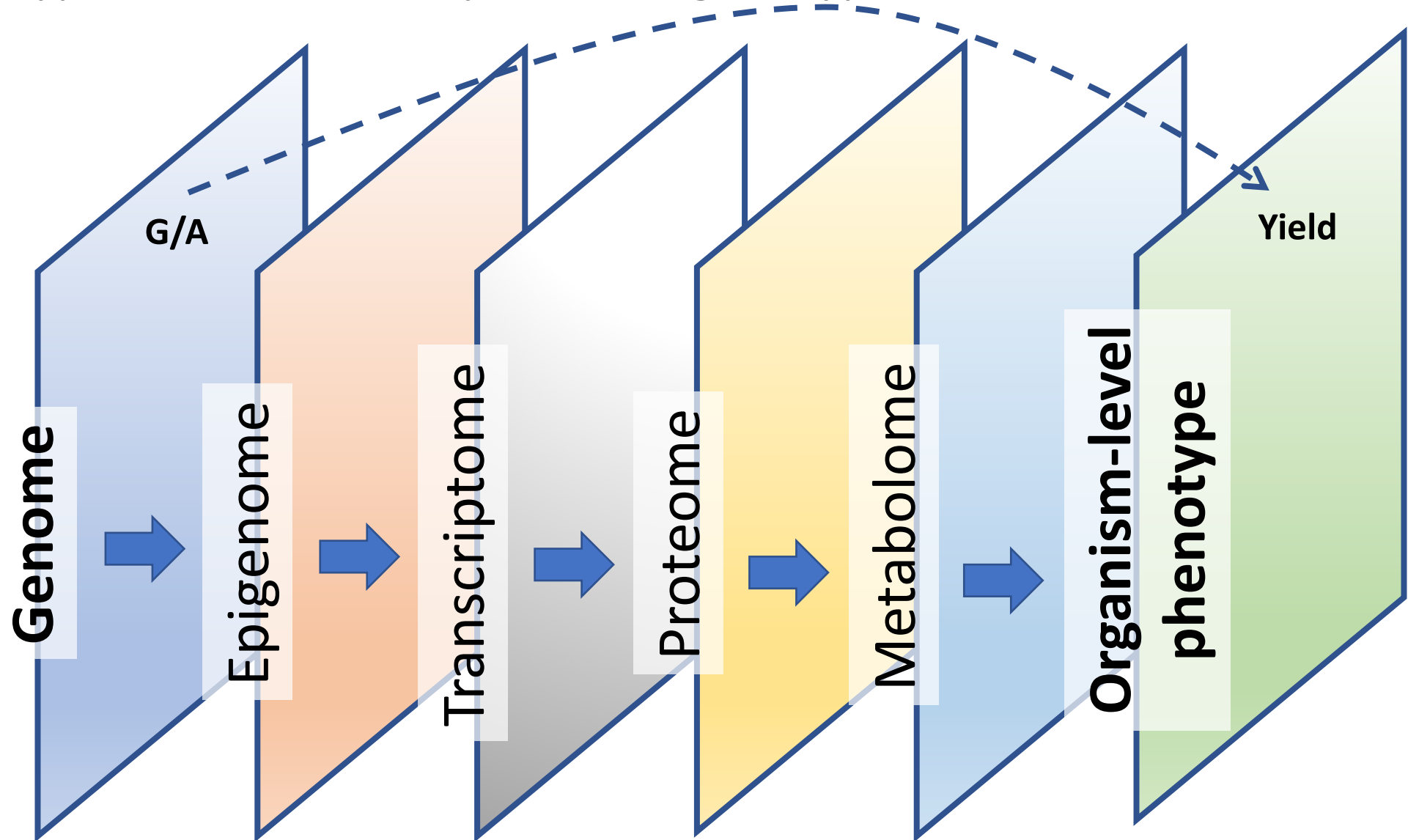


# Differential chromatin accessibility map as a new resource for studying wheat genome function and genotype-to-trait relationships

Eduard Akhunov

Throckmorton Plant Sciences Center  
Department of Plant Sciences  
Kansas State University

Constructing genome-to-phenome maps is critical for predicting phenotypic outcomes of a particular genotype



# Reference genomes and diverse populations of re-sequenced and phenotyped wheat accessions provide a powerful resource for connecting genomic and phenotypic variation

## Reference genomes

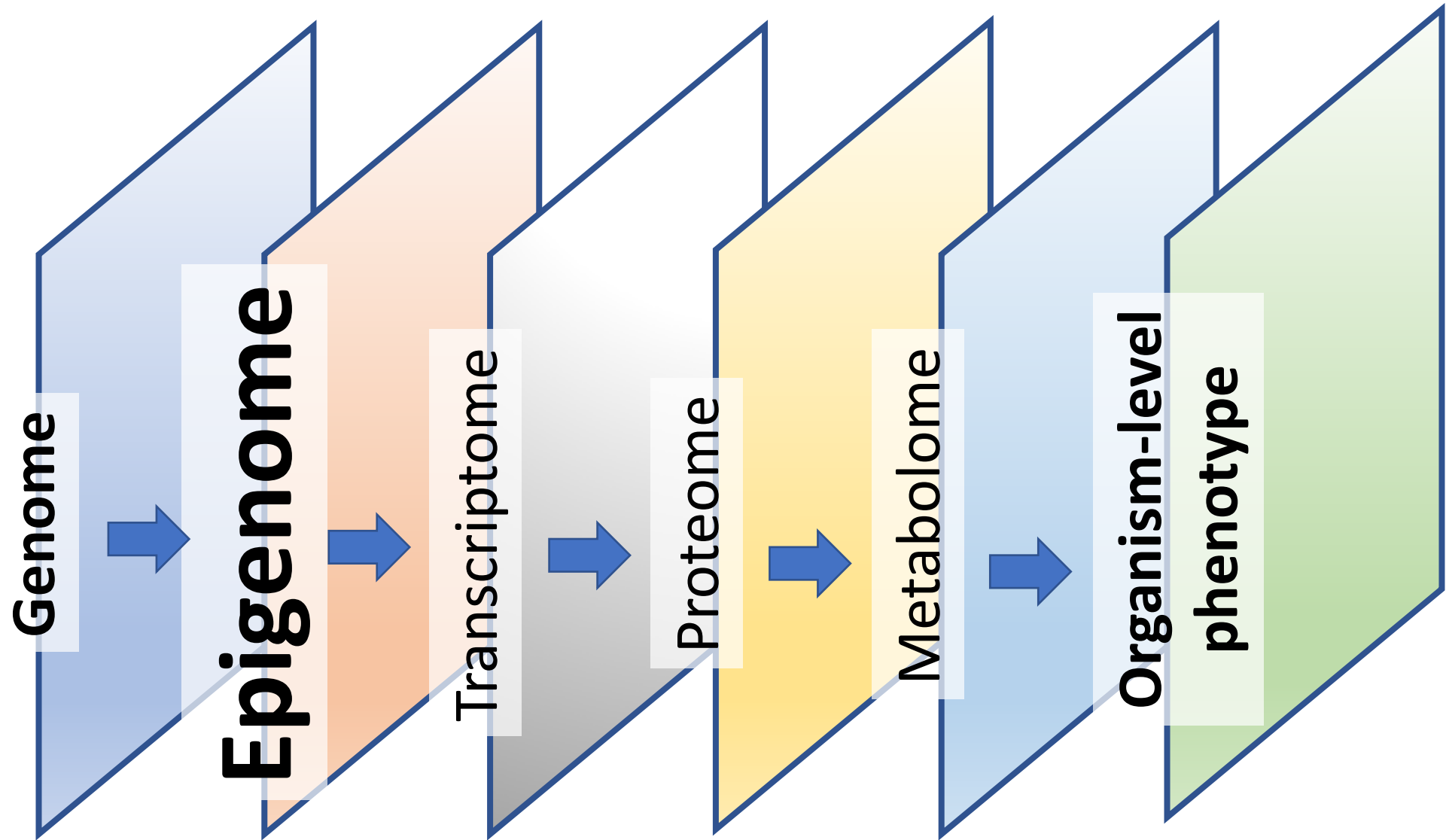
- Bread wheat cv. Chinese Spring (IWGSC, 2018)
- Wild emmer wheat (Avni et al., 2017)
- *Aegilops tauschii* (Luo et al., 2017)
- Durum wheat (Maccaferri et al., 2019)
- Wheat Pangenome (10+ Wheat Genome Project)

## Densely genotyped diversity panels

- 1,000 wheat lines (whole exome capture) (He et al., 2019)
- 2100 RILs from NAM population (whole exome capture + GBS + 90K iSelect) (Jordan et al., 2018)
- 44K wheat breeding lines (GBS) (Juliana et al., 2019)

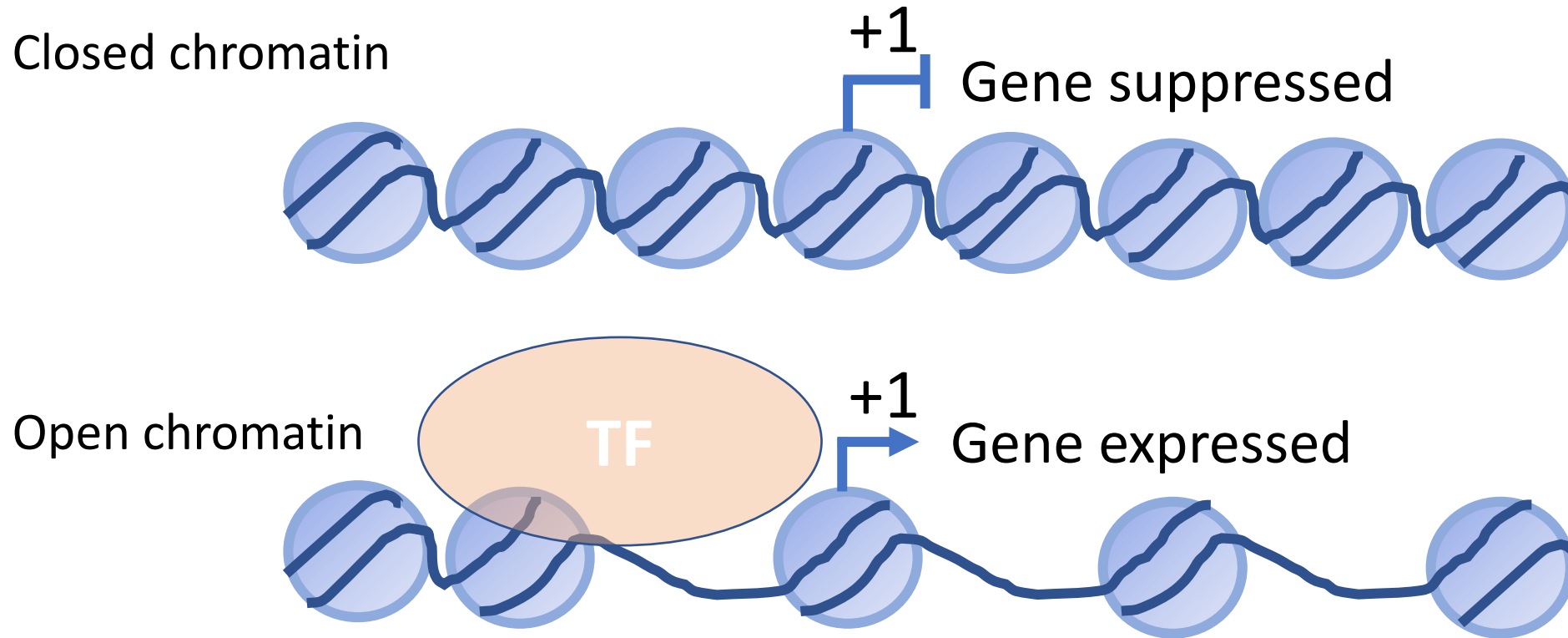
Mechanistic understanding of the genetic effects of individual mutations requires integration of other types of genomics data

# Genome-to-phenome map – epigenome dimension

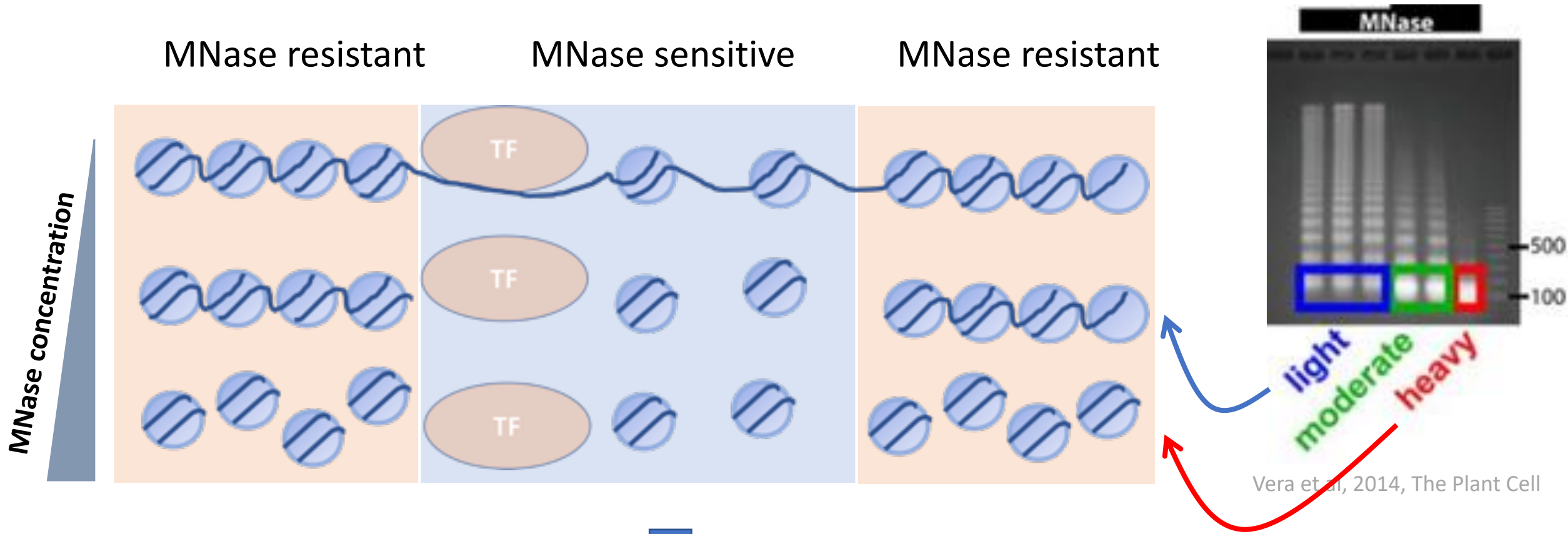




Chromatin accessibility assays are critical for detecting epigenetically modified regions of genome involved in regulation of gene expression

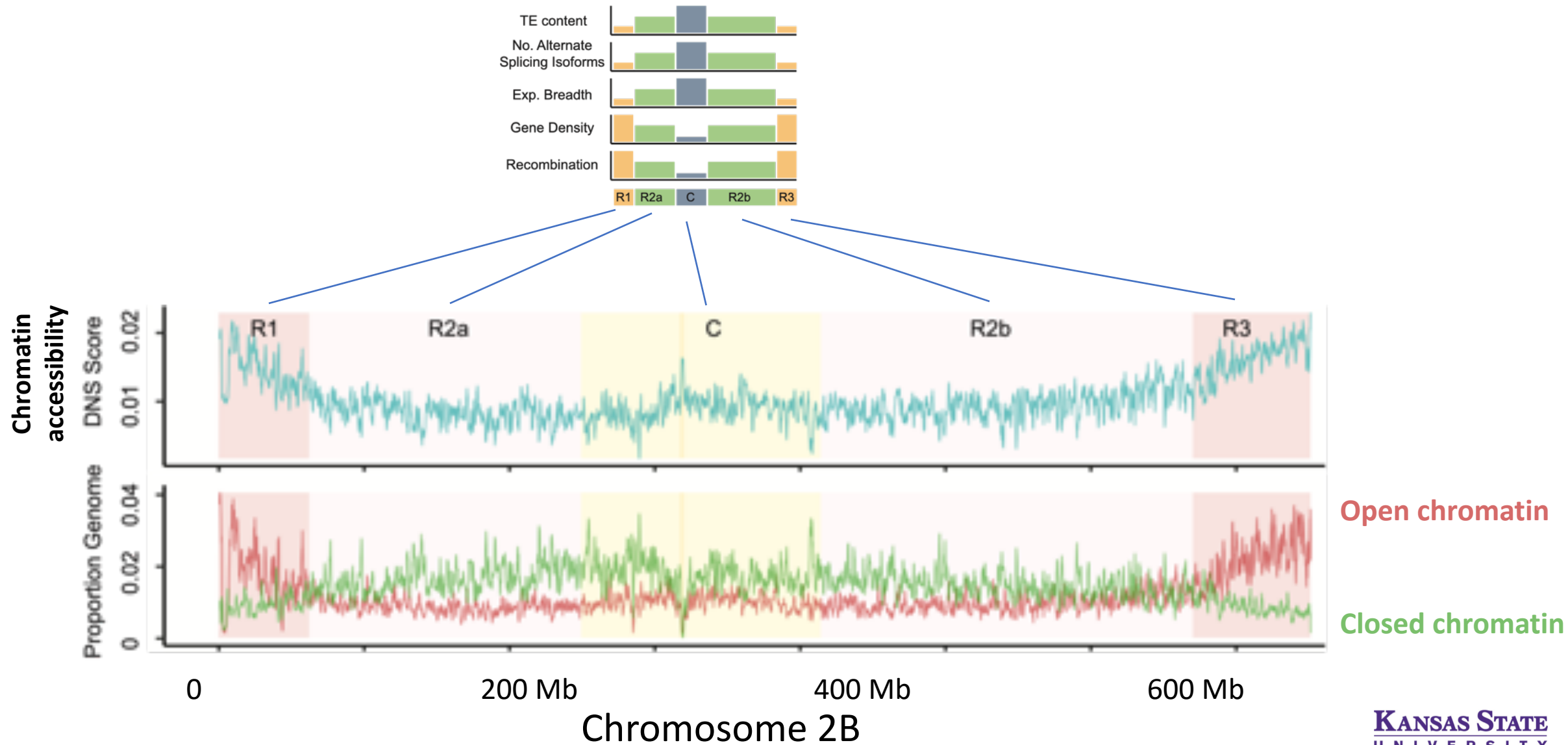


Difference in the NGS read coverage between MNase-sensitive and MNase-resistant treatments reflects open or closed chromatin states

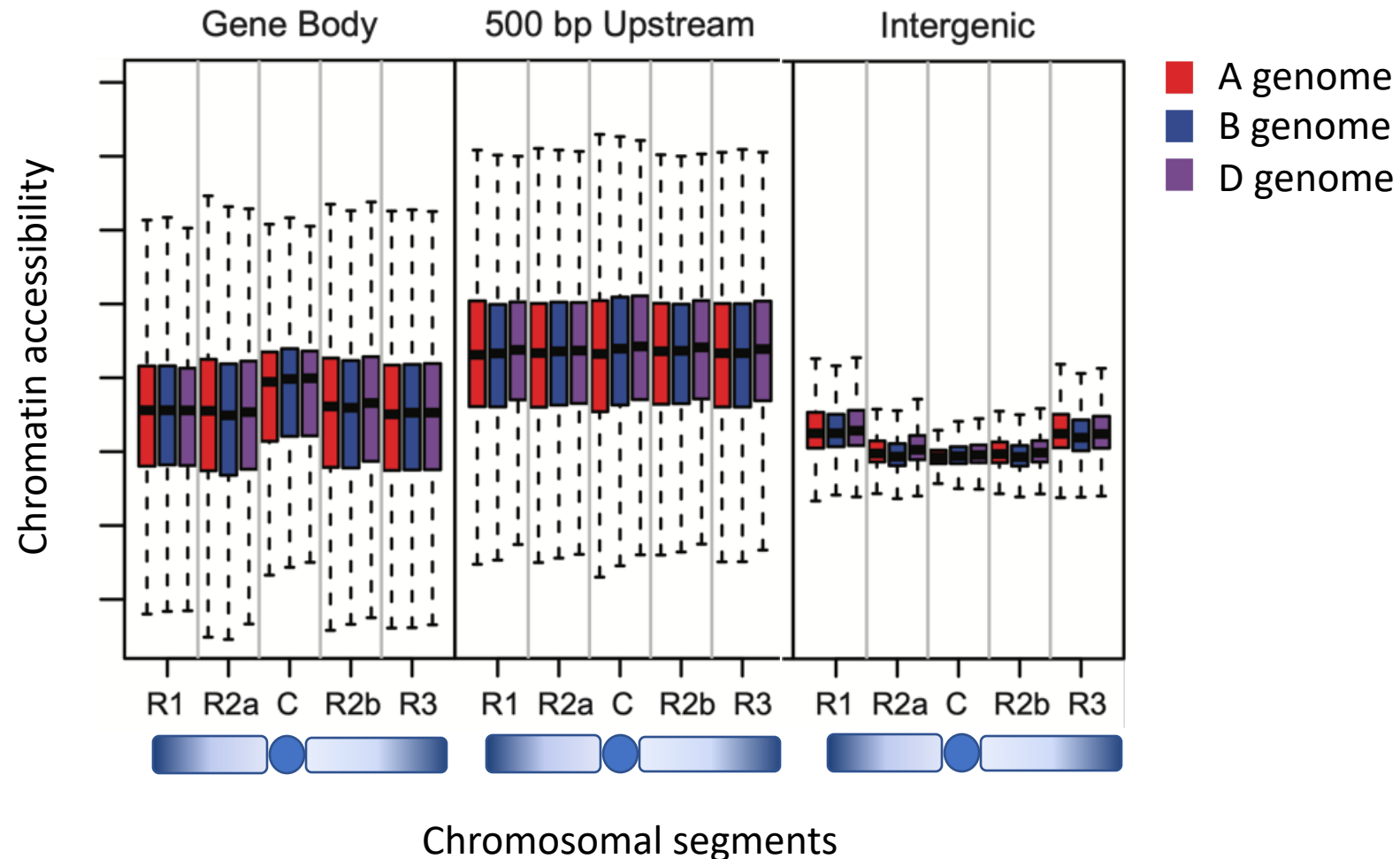


NGS with Illumina and mapping reads to the wheat reference genome

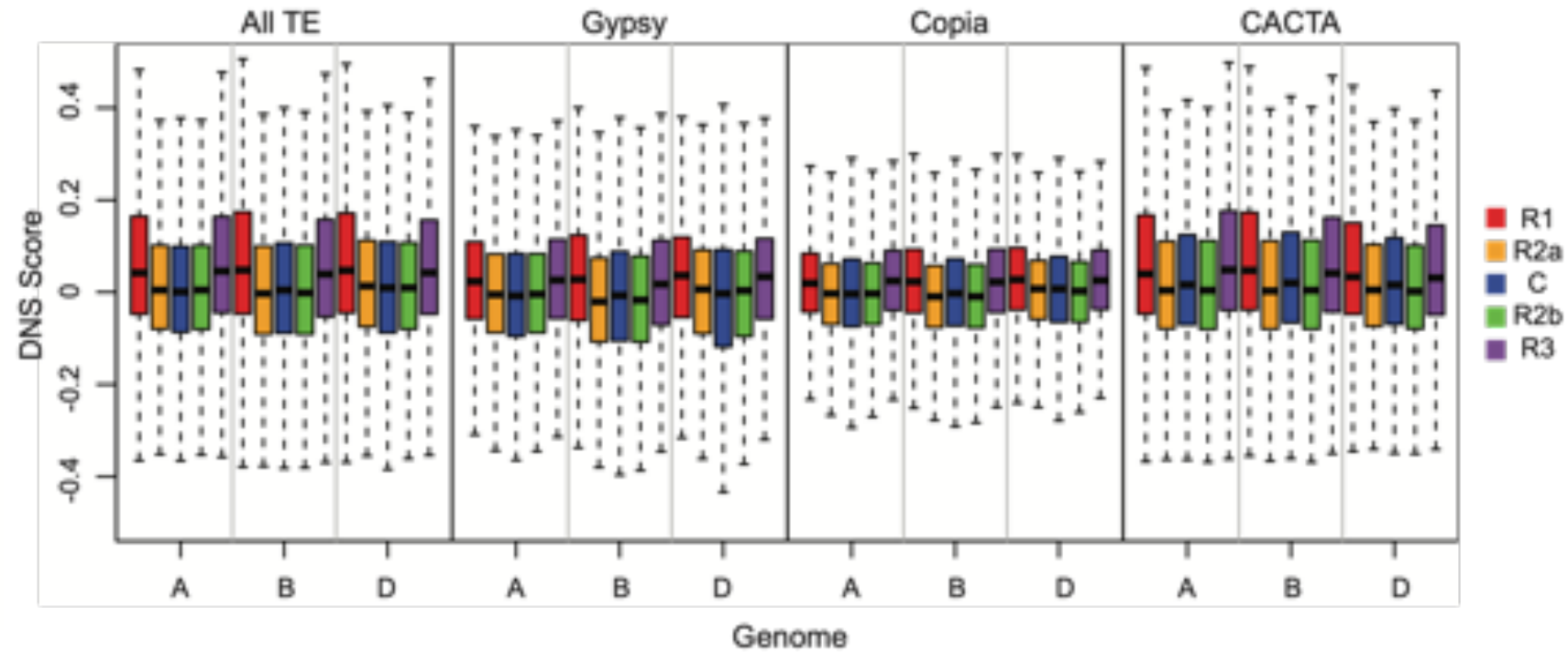
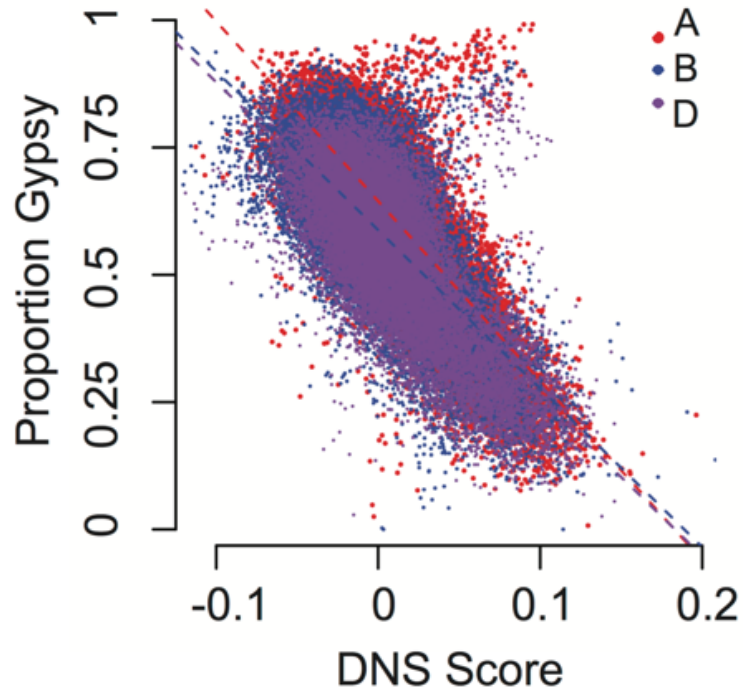
Chromosome-level chromatin accessibility follows the patterns of gene density, gene expression, recombination, and genetic diversity



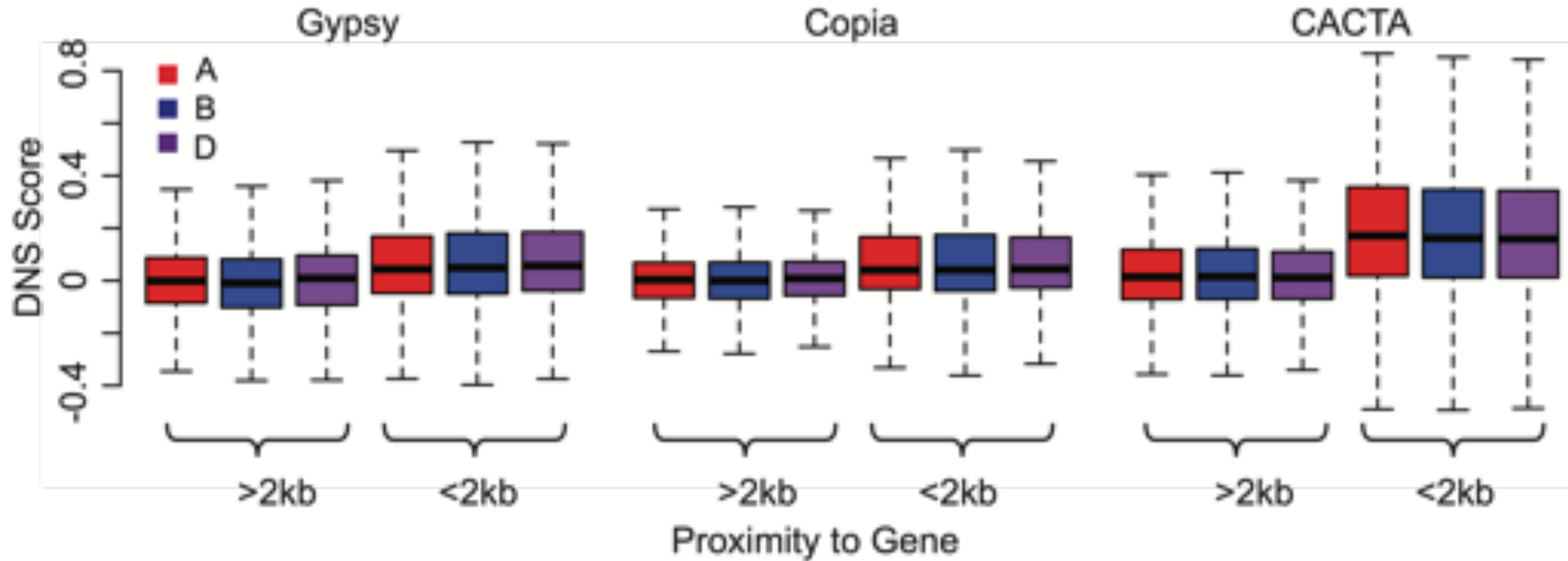
While chromatin states in **intergenic regions change** from open to more closed from telomere to centromere, chromatin states in **genic regions remain mostly uniform** along the chromosomes



Even though chromatin accessibility of a region depended on %TEs, TEs in centromeric regions still showed lower chromatin accessibility than TEs in the pericentromeric regions

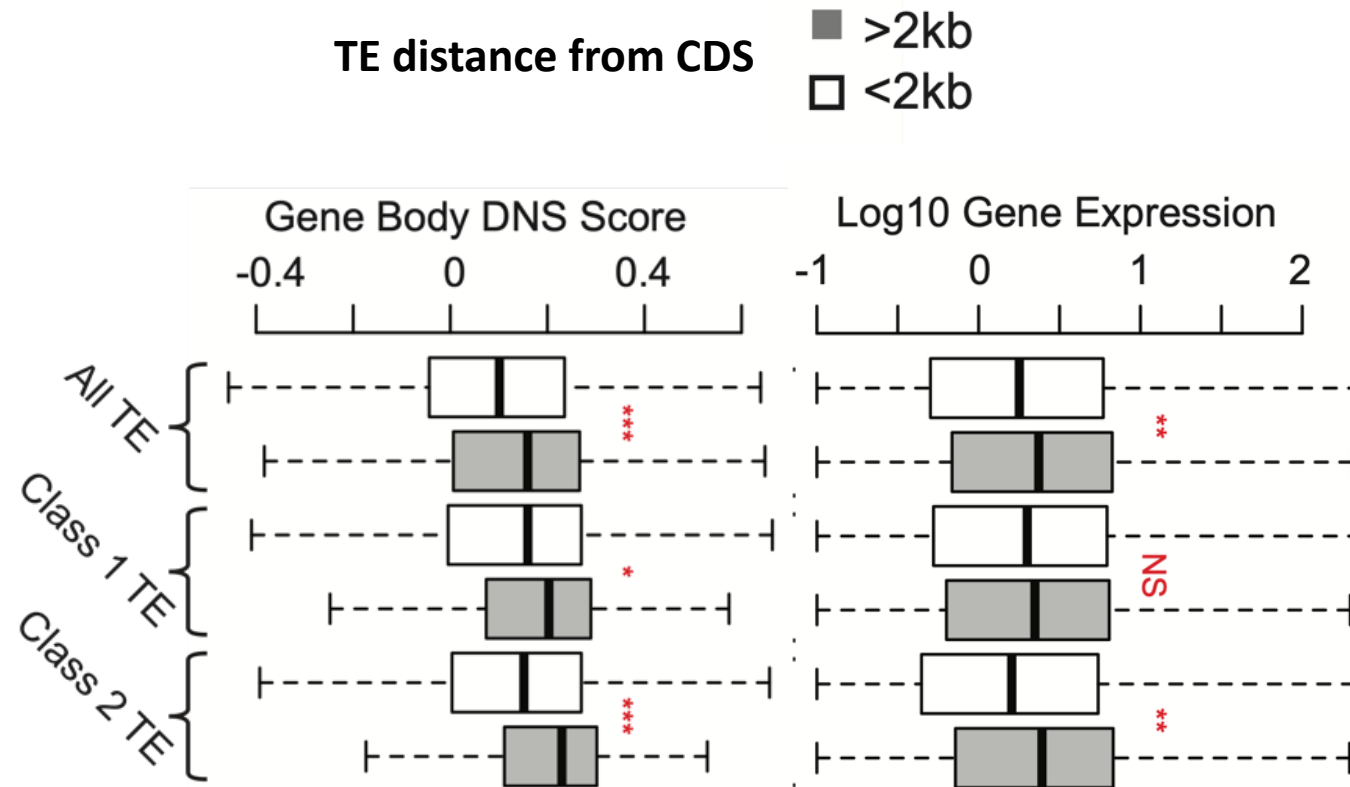


Chromatin accessibility of TEs, independent of TE type was associated with their proximity to genes



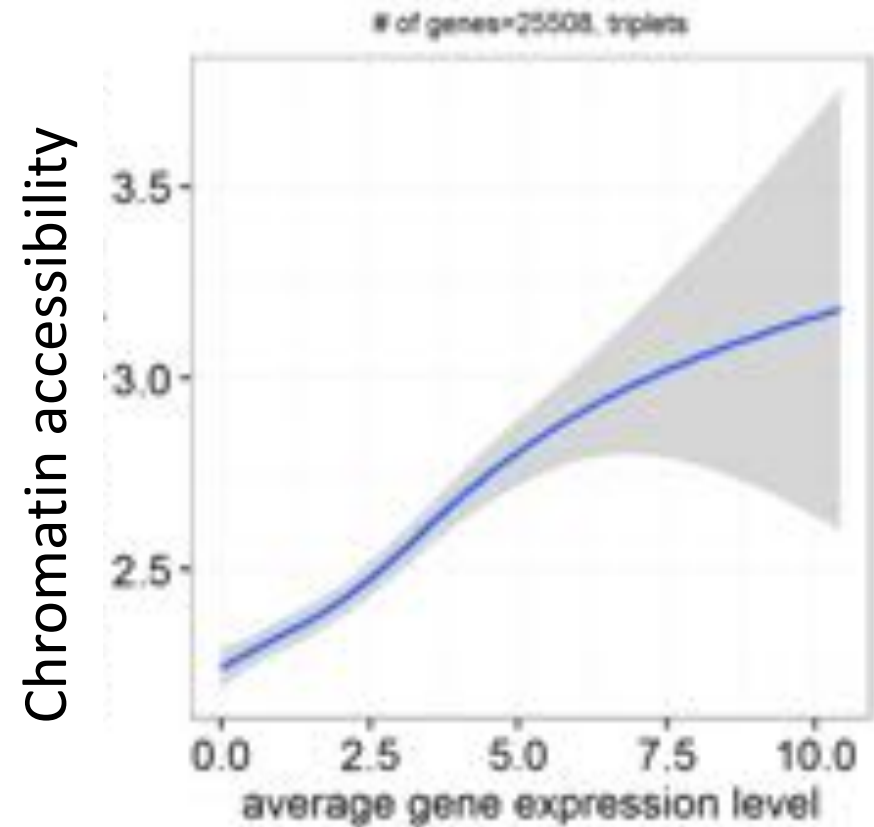
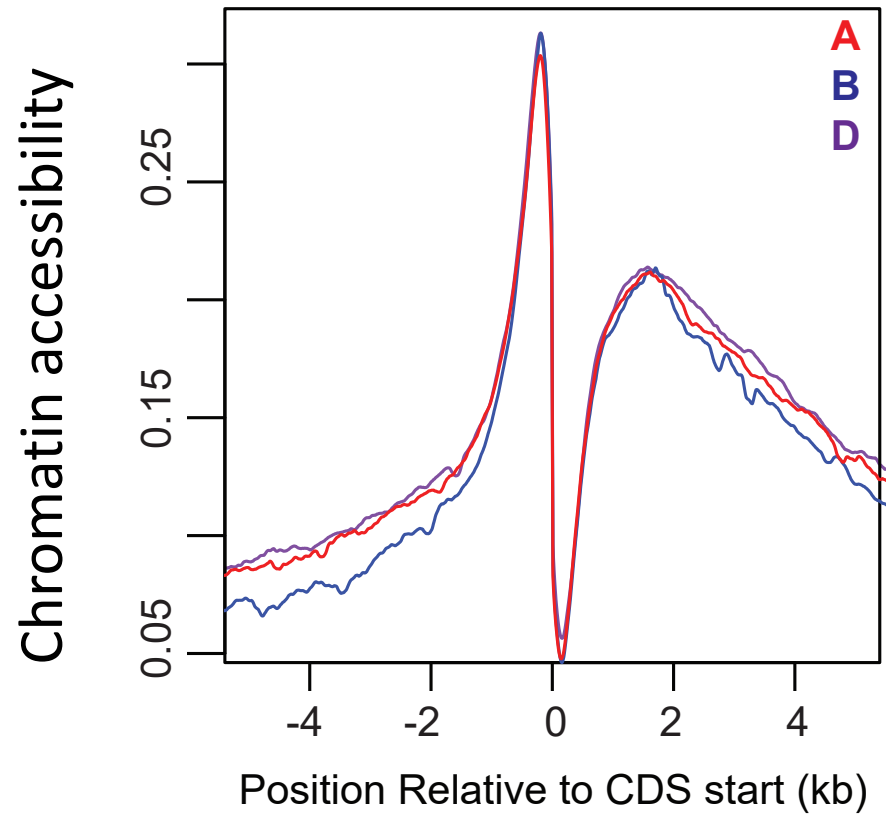


Chromatin accessibility of genes and their expression levels were associated with the presence of TEs in the promoter regions, suggesting that TEs might affect gene function by modifying chromatin states of regulatory regions



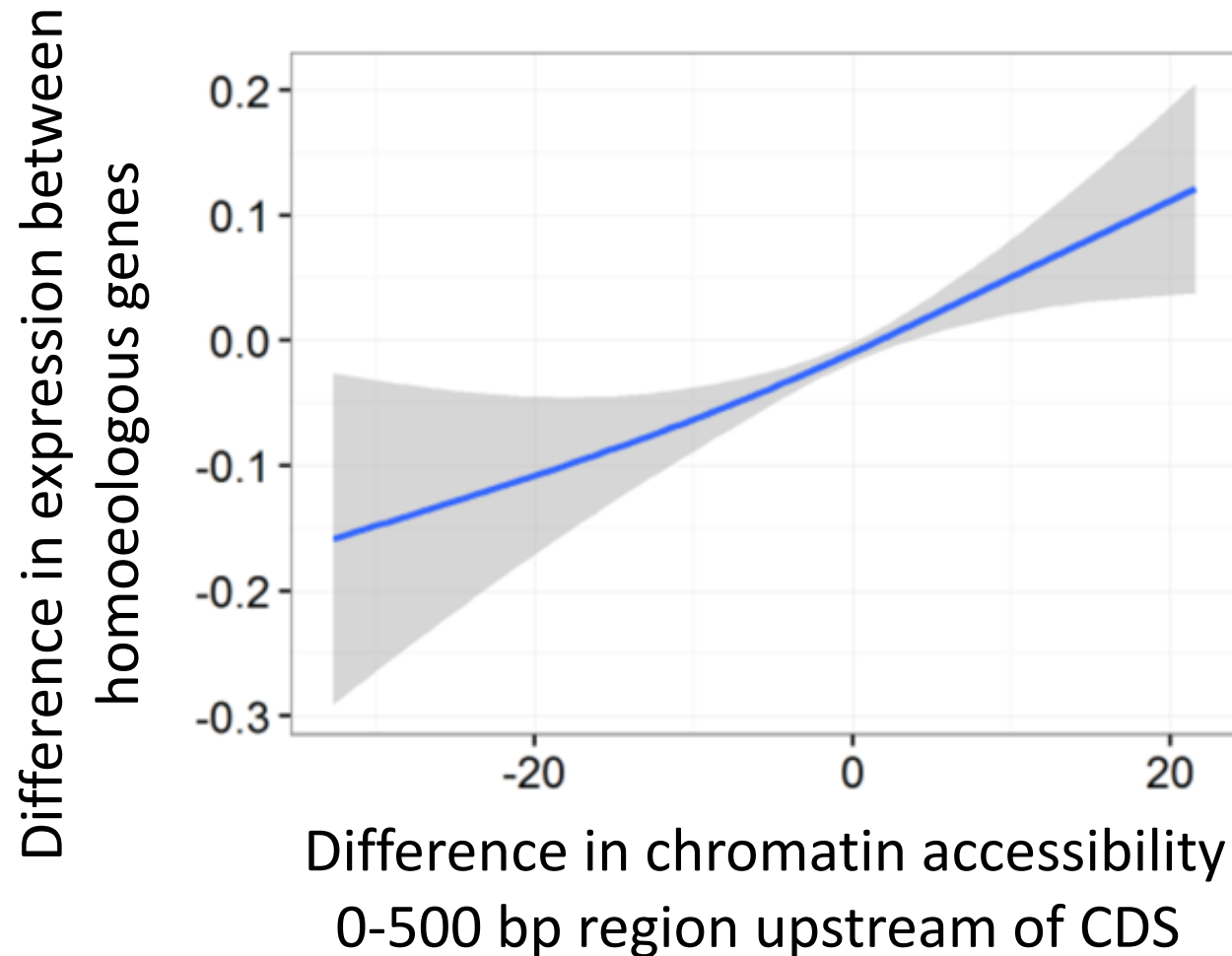
Gene expression data from  
Ramirez-Gonzalez, et. al. 2018

Promoter regions showed highest levels of chromatin accessibility, which correlates positively with gene expression levels



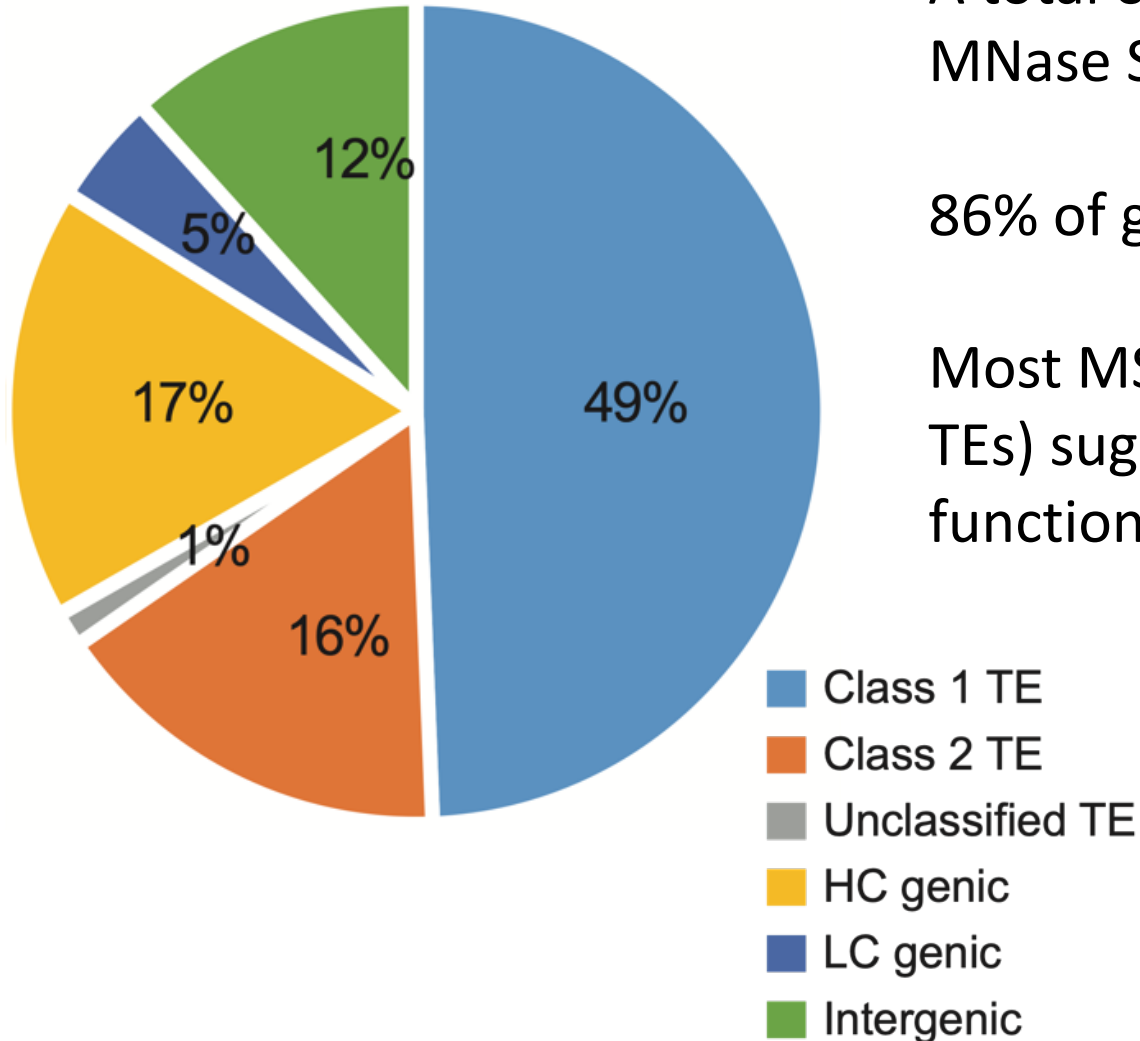


Gene expression bias between homoeologous genes from the wheat genomes is associated with differences in chromatin states of their promoter regions



Though MNase Sensitive Footprints (MSF - outliers of chromatin accessibility) are enriched around genes, majority are found within TEs.

### MSF distribution



A total of 177 Mb (1.26%) of the genome were classified as MNase Sensitive Footprints (MSF)

86% of genes were located within 2 kb of at least one MSF

Most MSF are located in the intergenic regions (67% within TEs) suggesting importance of TEs in regulation of gene function

To assess functional relevance of chromatin accessibility data we partitioning genetic variation for agronomic traits using phenotyping and genotyping data from the 1000 wheat exome project



<http://wheatgenomics.plantpath.ksu.edu/1000EC/>

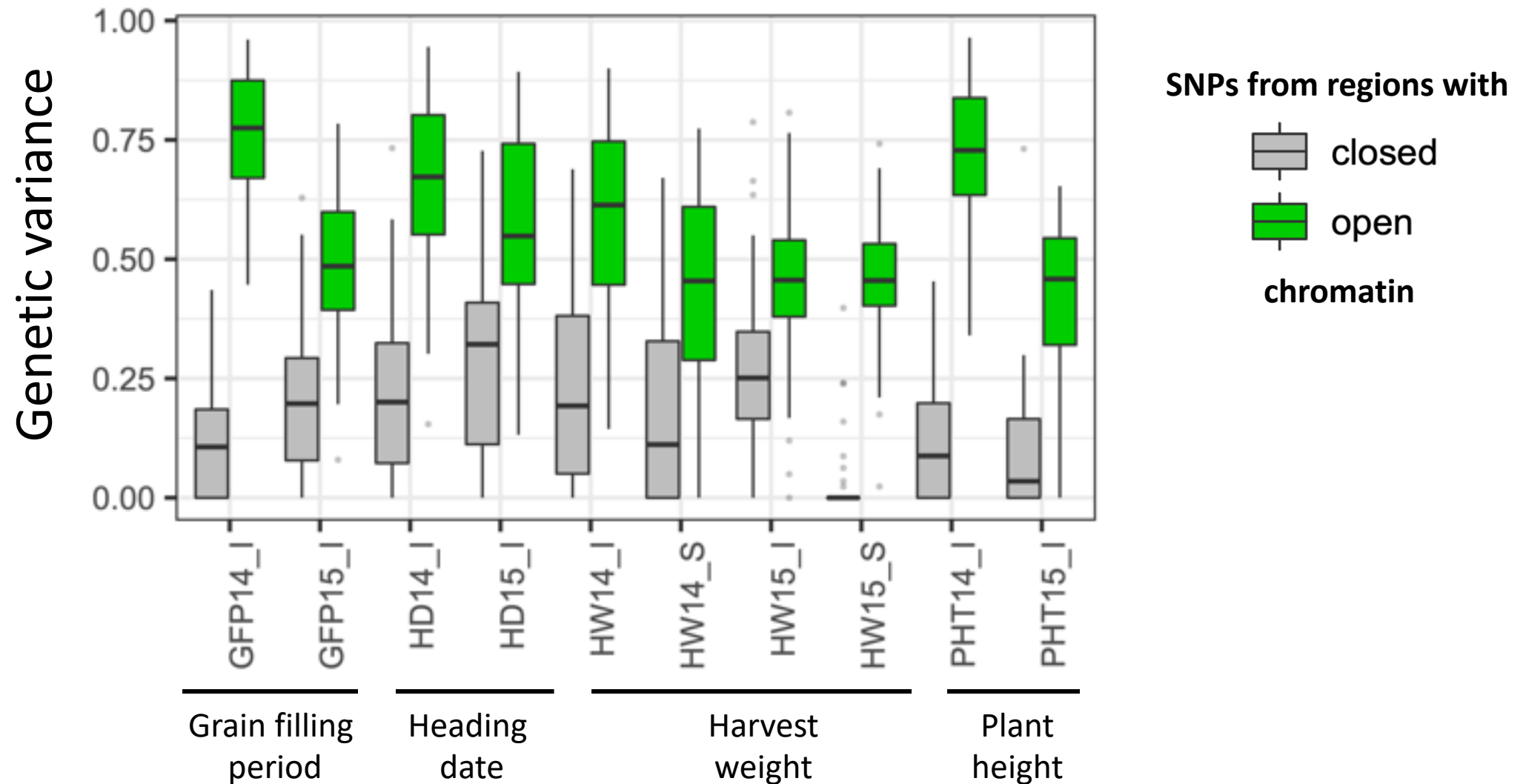
He et al., 2019

1,000 genetically and geographically diverse wheat accessions were re-sequenced using exome capture resulting in discovery > 7 million SNPs

Phenotyping was performed for a number of agronomic traits

Partitioning genetic variation (GCTA-GREML)

# Increase in chromatin accessibility was associated with an increase in the proportion of phenotypic variation explained



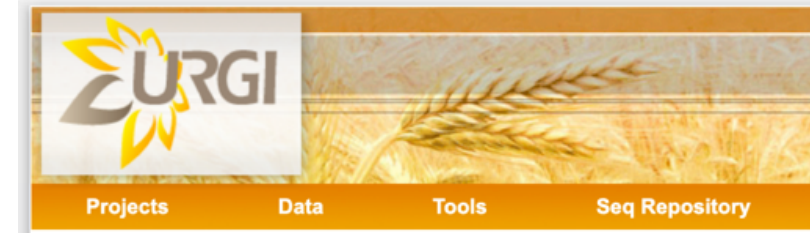
Chromatin accessibility is a good predictor of the effect of SNP variation on phenotype

Developed map of chromatin states across the wheat genome could be useful for prioritizing SNPs in genomic selection or detecting causal SNPs in gene mapping studies or GWAS

# Differential chromatin accessibility resources and tools

## Chromatin accessibility data

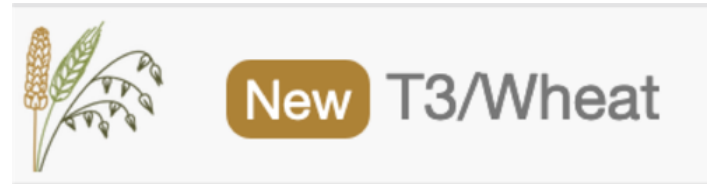
<https://wheat-urgi.versailles.inra.fr/Seq-Repository/Chromatin-accessibility>



## Filtering SNPs using differential chromatin accessibility profiles:

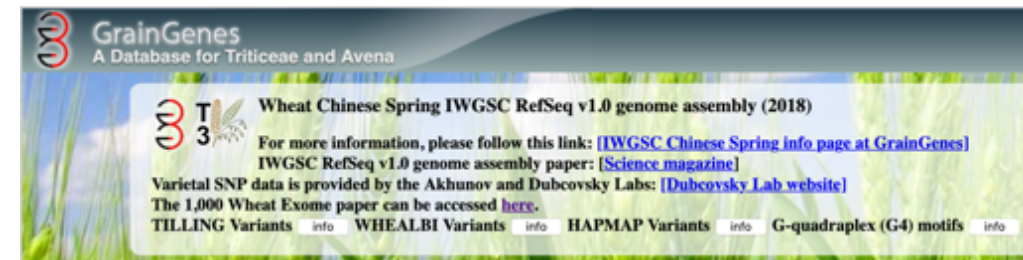
*T3 database (C. Birkett, J. Jannink)*

<https://wheat.triticeaetoolbox.org/genome/mnase.pl>



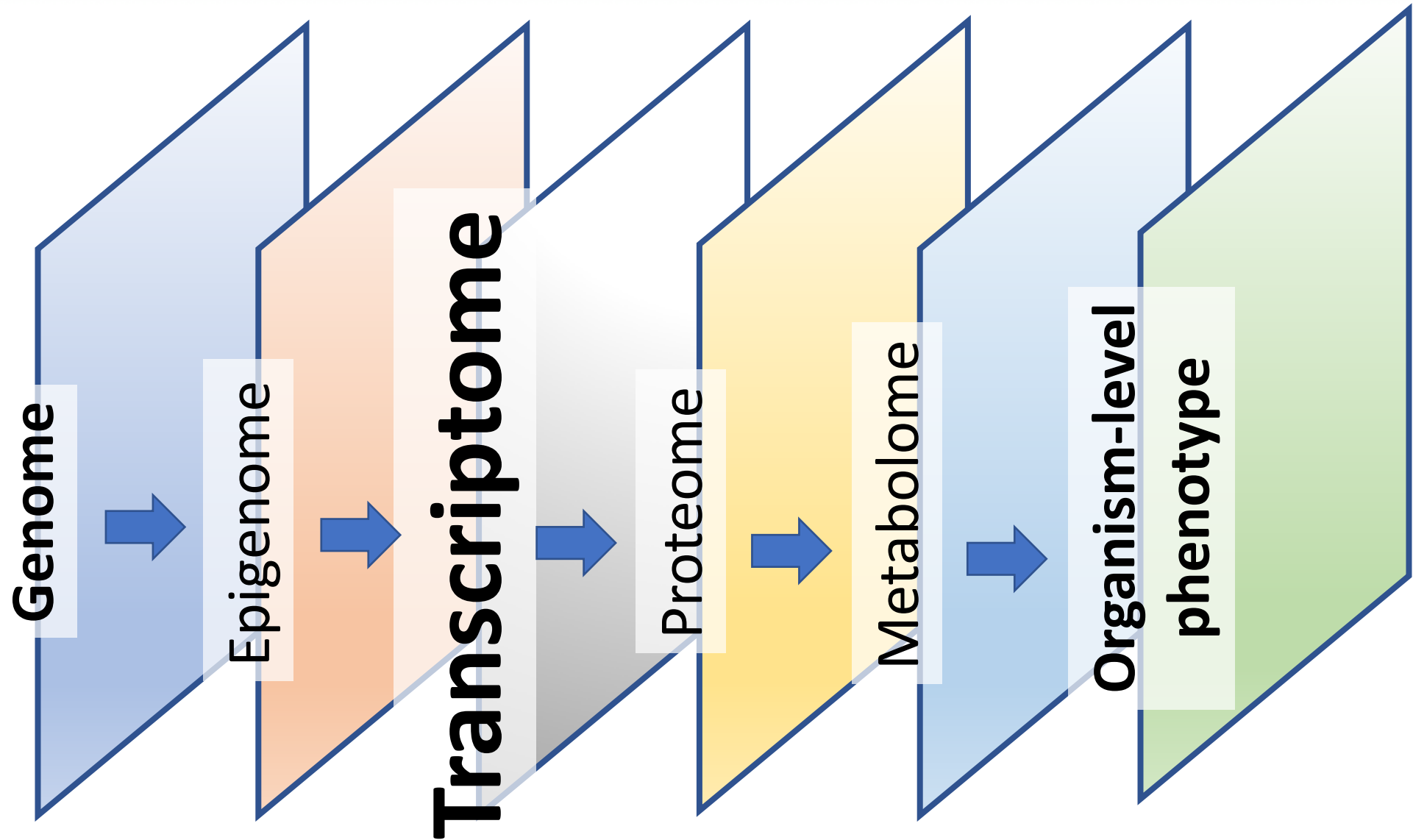
*GrainGenes (T. Sen)*

<https://wheat.pw.usda.gov/GG3/content/september-2020-mnase-chromatin-states-tracks-iwpsc-chinese-spring-genome-browser>

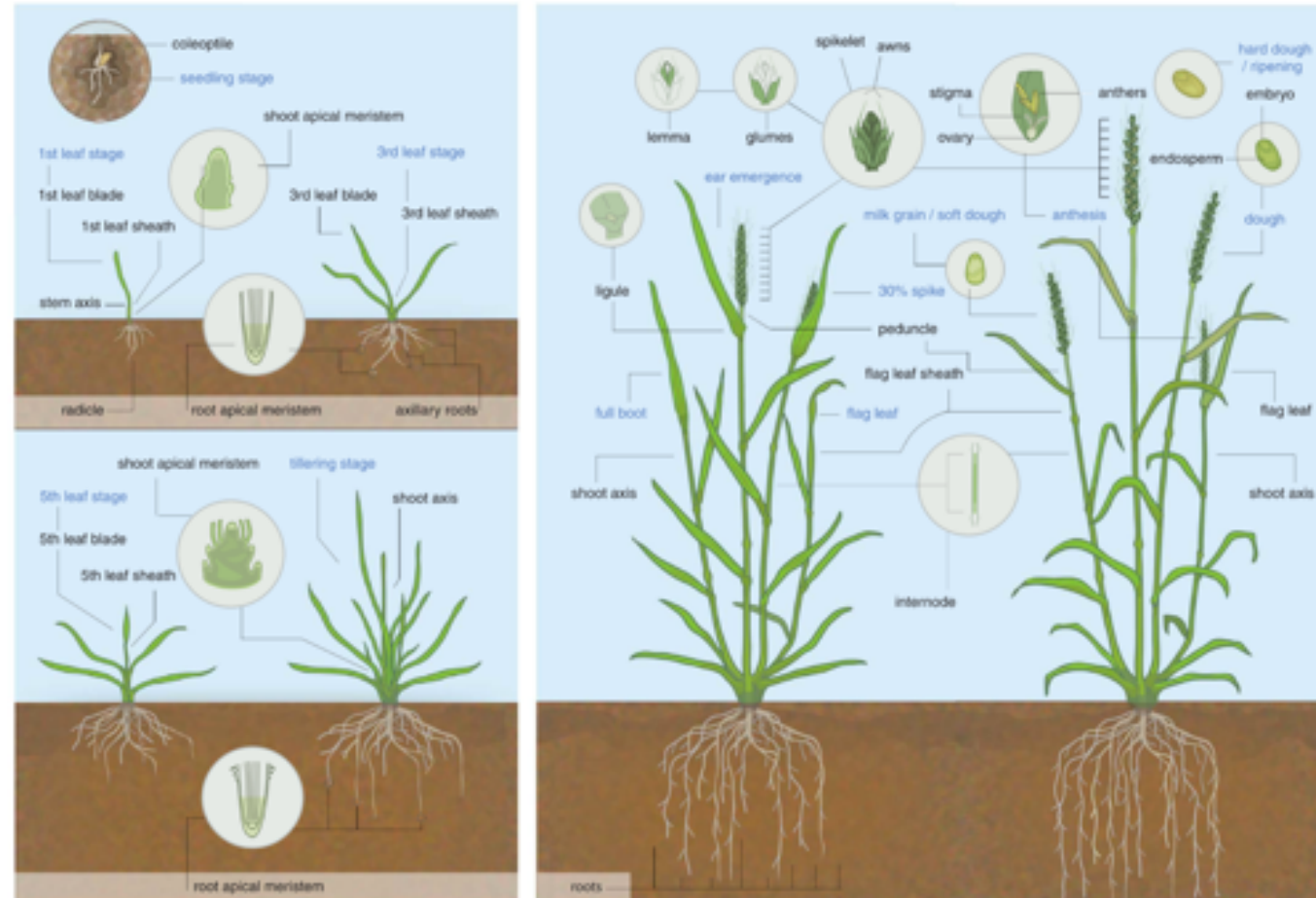




# Genome-to-phenome map – transcriptome dimension



Transcriptional atlas of wheat provides description of gene expression changes across tissues at differential stages, yet we still need to understand genetic control of expression in wheat

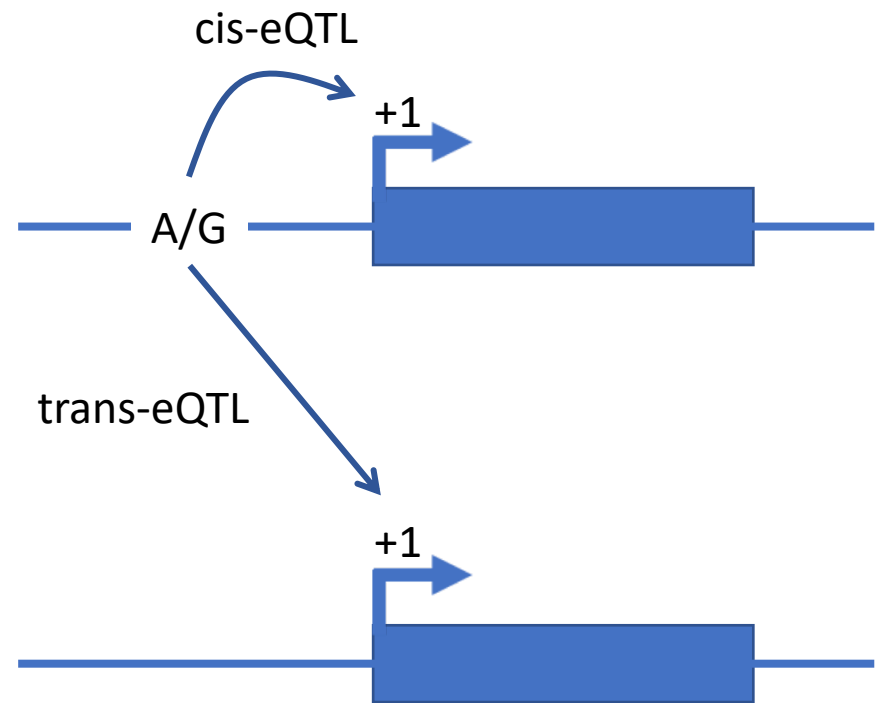
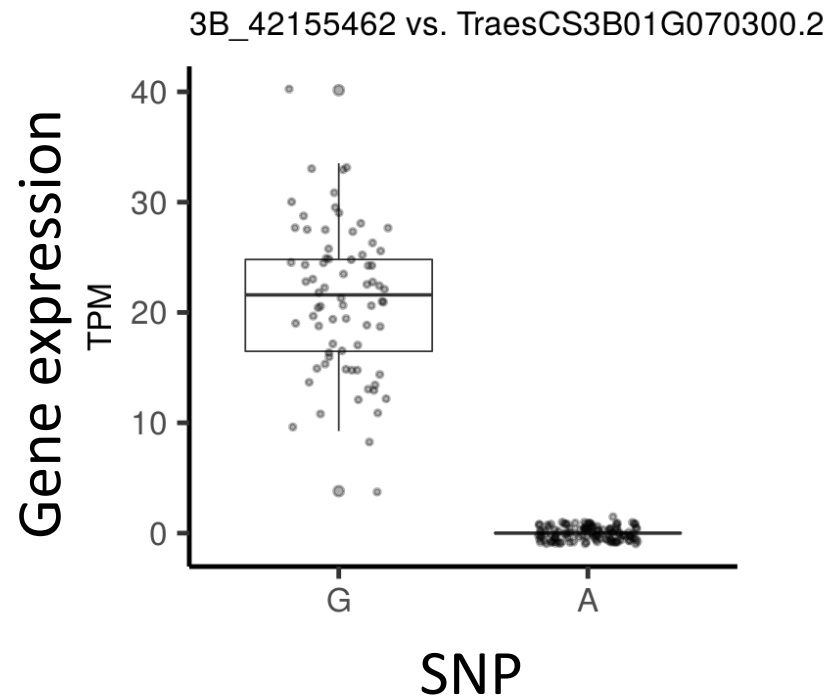


Ramírez-González et al.  
Science. 2018;361:eaar6089

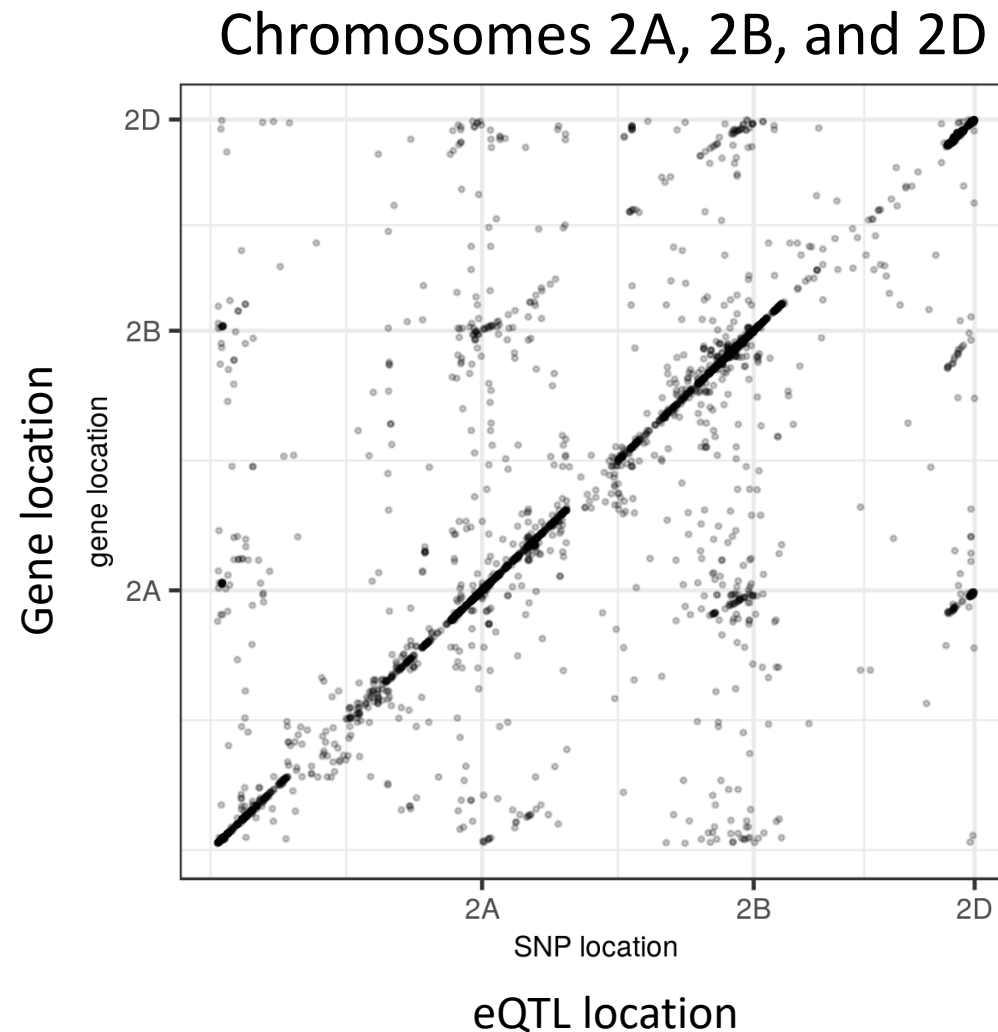


# Understanding the genetic control of gene expression variation (eQTL) can improve our ability to detect causal genes and pathways

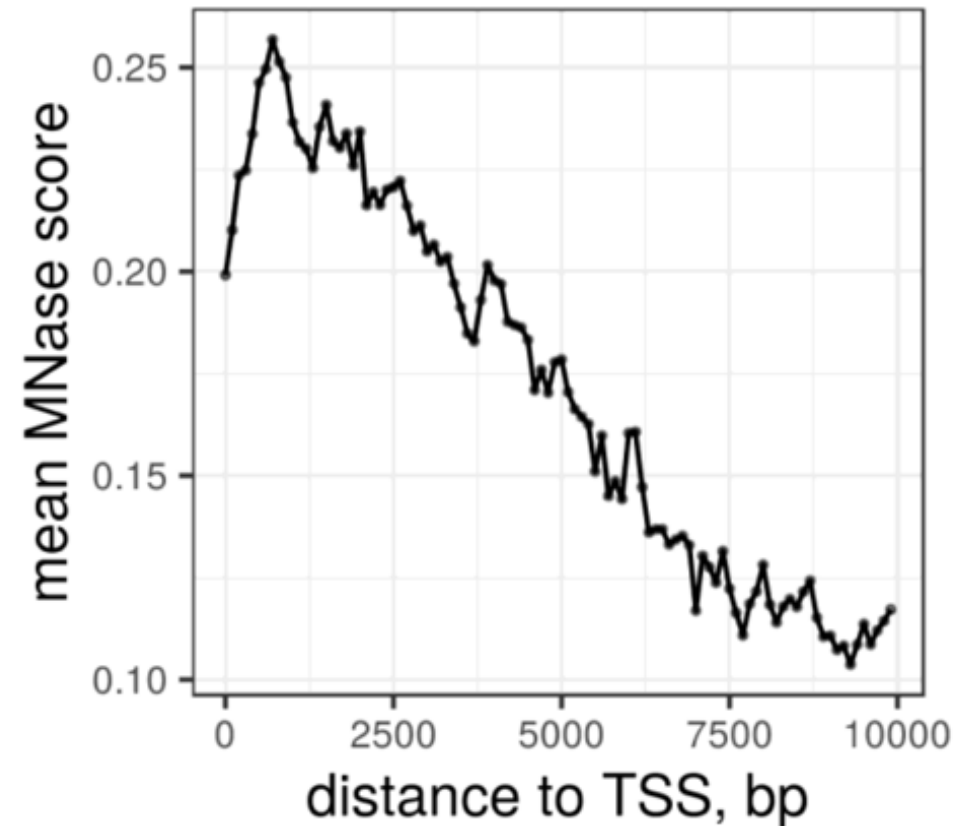
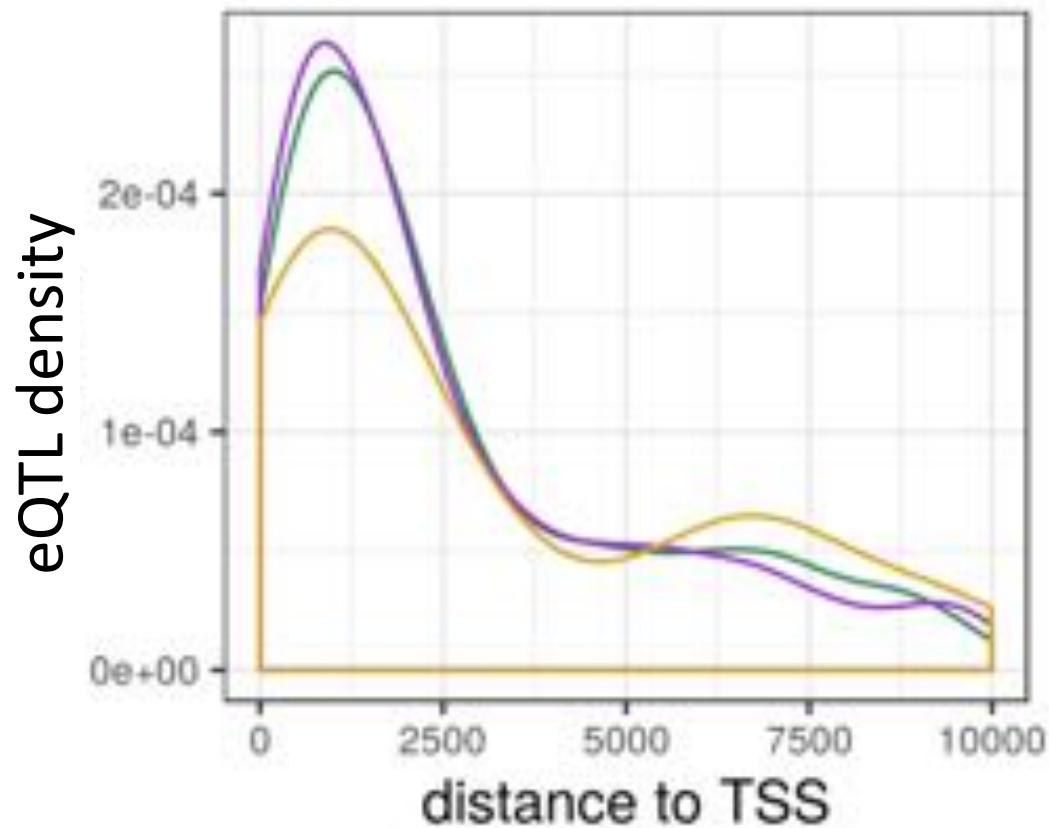
RNA-seq data from diverse panel of wheat accessions  
GWAS of gene expression traits



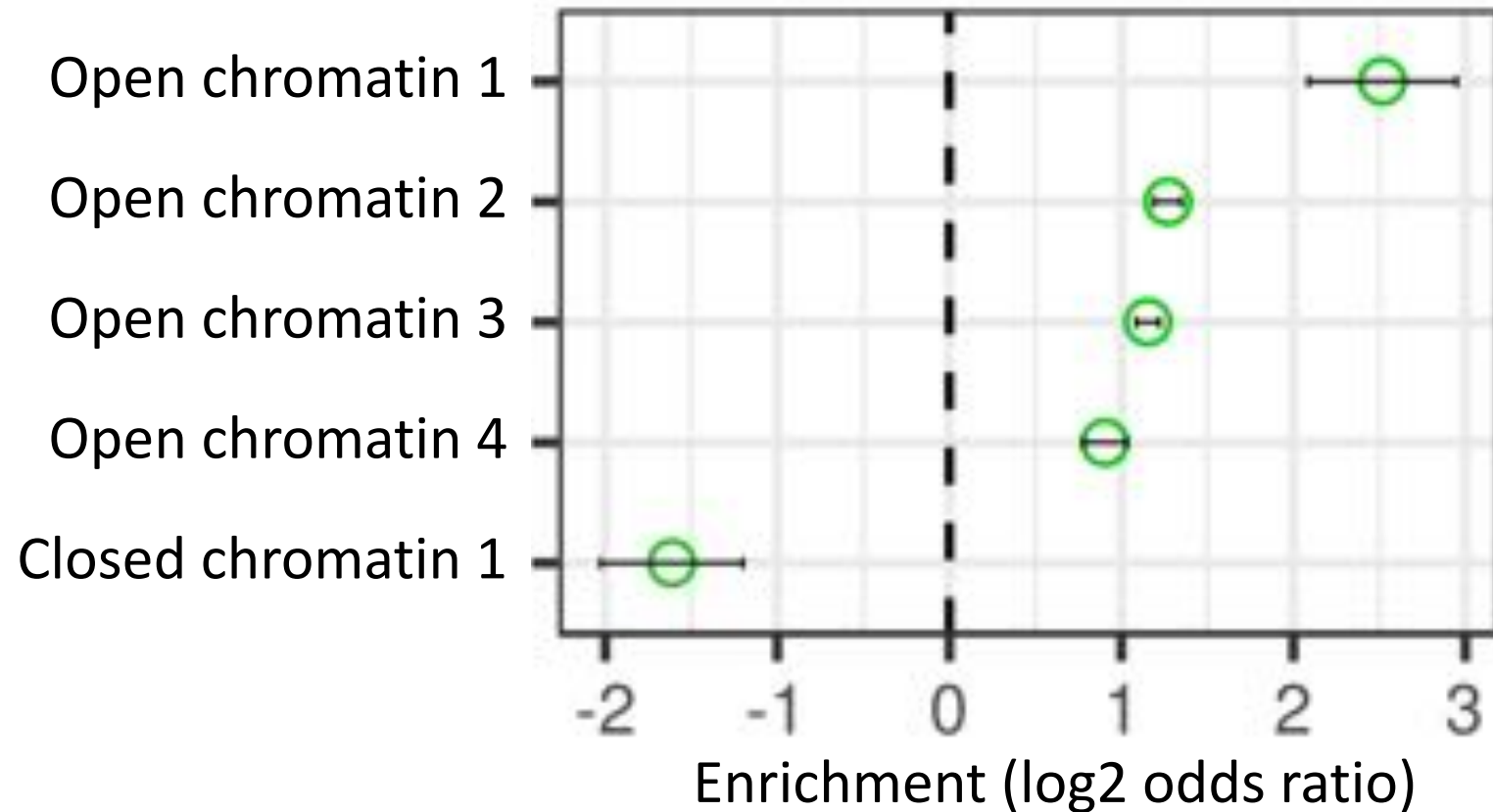
GWAS identified ~37,000 eQTL regulating expression of ~8,000 genes



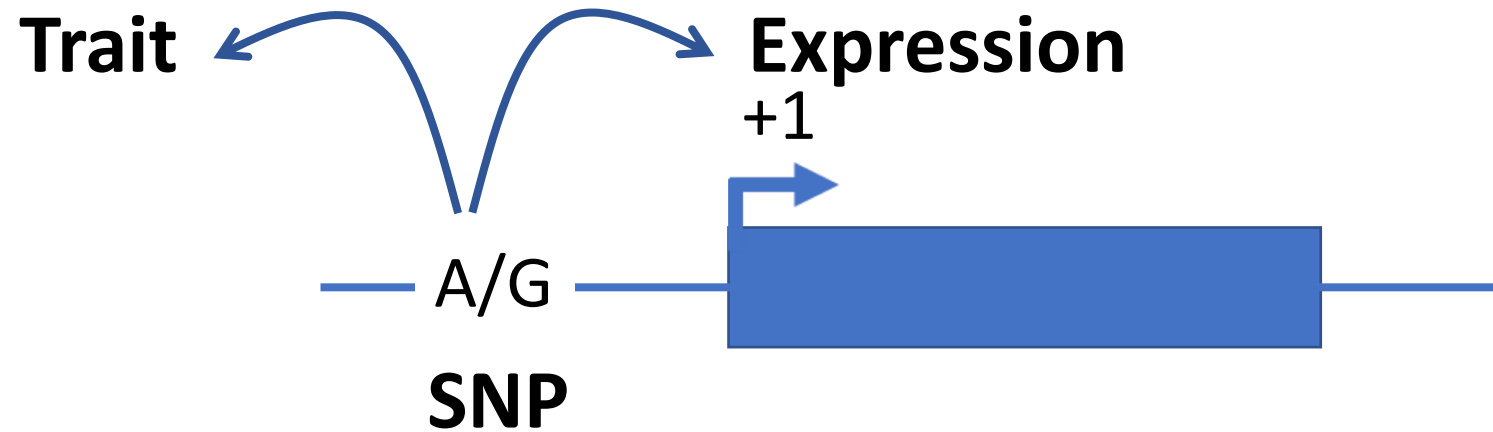
cis-eQTL density was highest in 2 kb regions upstream of genes in all three wheat genomes mirroring the patterns of chromatin accessibility



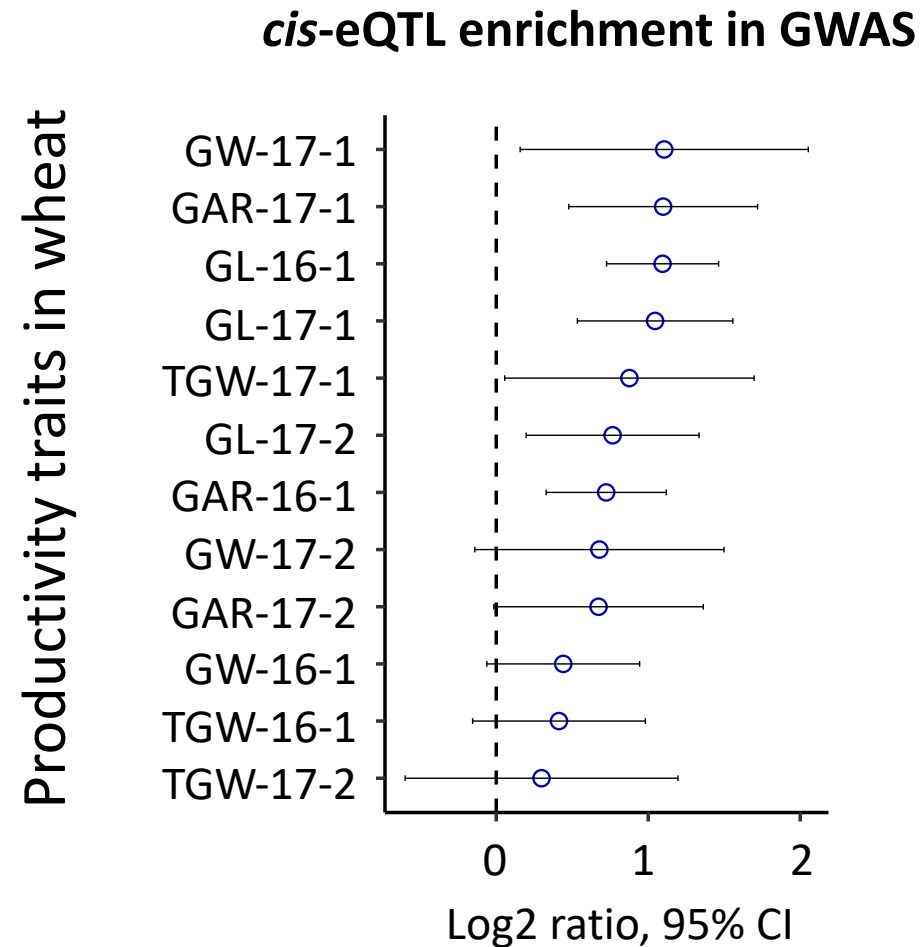
eQTL are enriched in the regions of open chromatin defined using different approaches including regions located distantly from genes



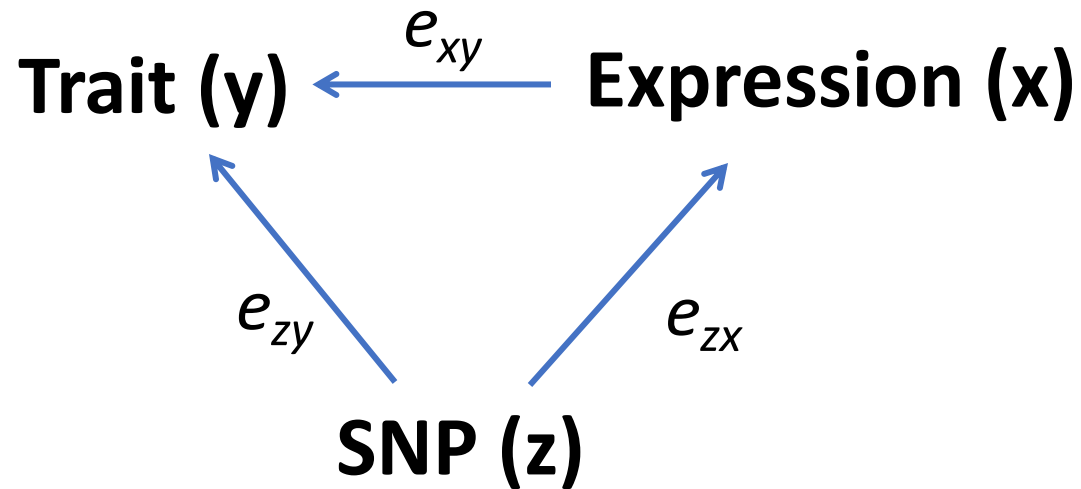
Joint analysis of eQTL and trait-associated SNPs provides opportunity to identify genes that are part of pathways controlling trait variation



# Enrichment of eQTL among trait-associated SNPs suggest their contribution to trait variation



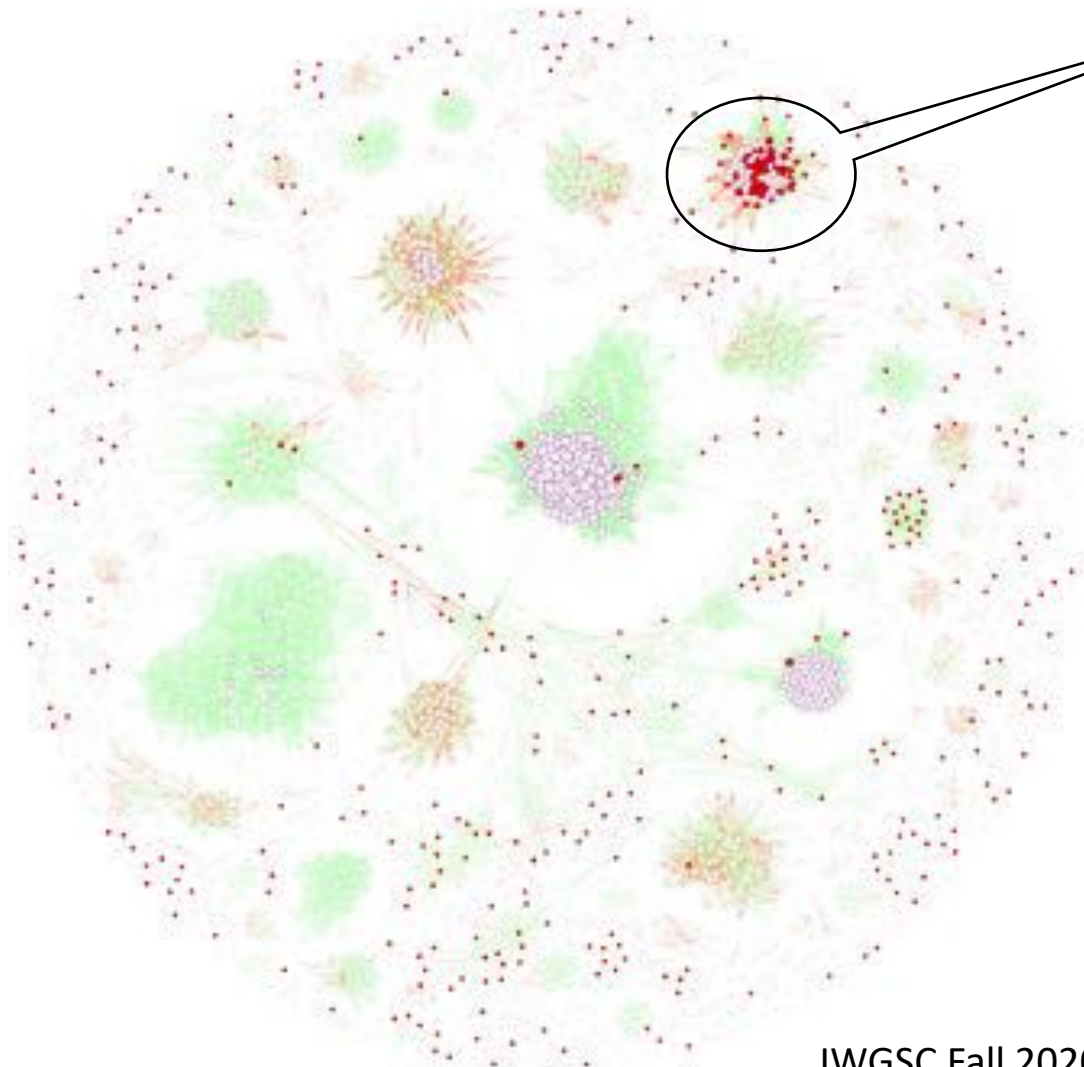
Joint modeling of eQTL and trait-associated SNPs provides opportunity to identify genes whose expression is associated with trait variation



$$e_{xy} = e_{zy} / e_{zx}$$

↑  
Effect of expression of  
gene expression **x** on trait **y**

By incorporating genes associated with agronomic traits and eQTL into the gene co-expression networks it is possible to identify pathways controlling processes underlying variation in a trait

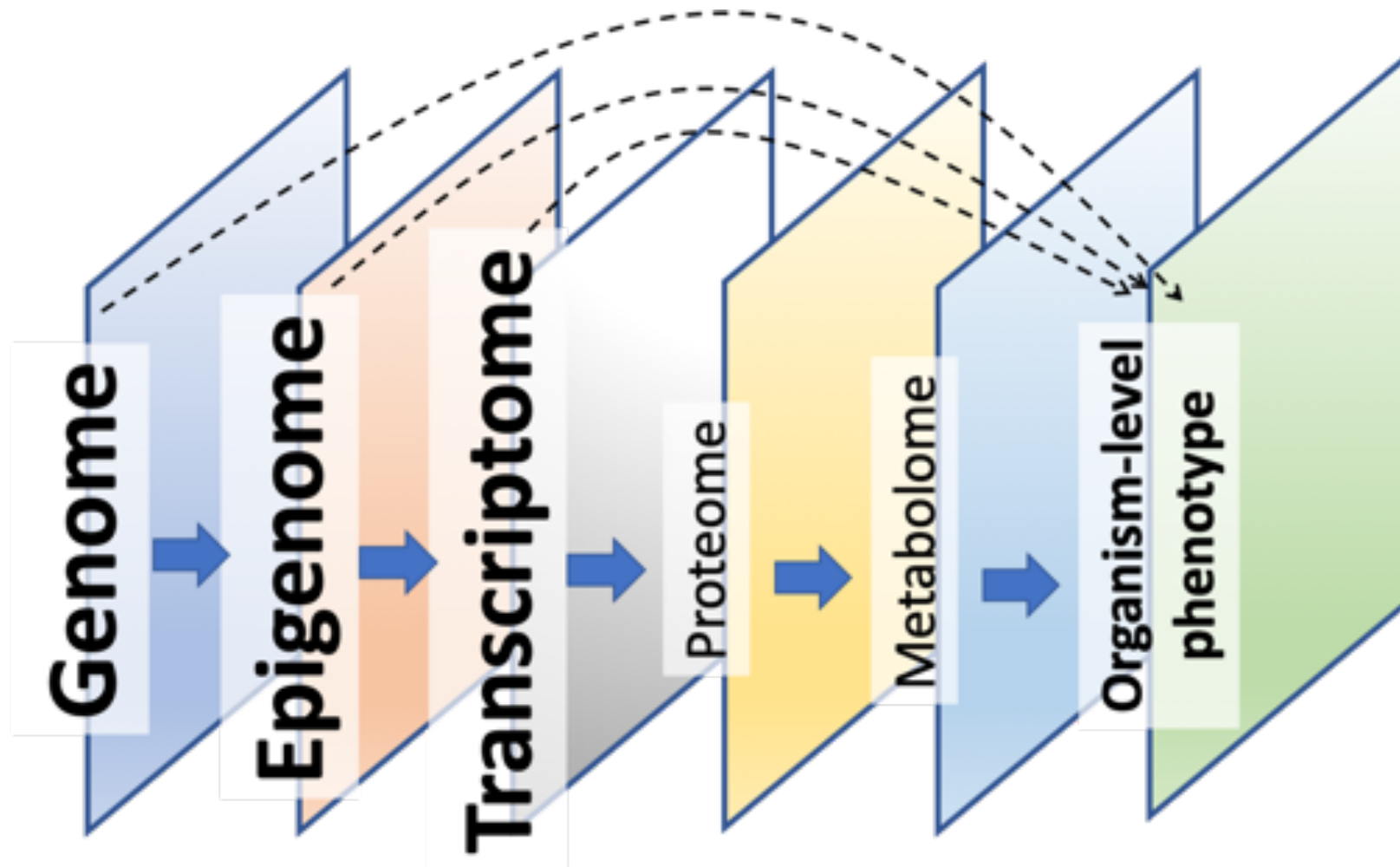


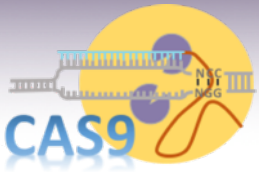
Genes involved in regulation of heading date and number of spikelets per spike (includes EARLY FLOWERING 3 - *Elf3*).

Co-expressed gene modules including genes associated with eQTL and trait ( ● red)



Integration of genomic data from multiple dimensions of G2P map could help to identify regulatory regions, genes and pathways underlying variation in traits





IWGSC RefSeq allows to connect identified genes and pathways associated with variation in traits with functional data from other crops and provide targets for modifying genome using genome editing.

Genes from other crops



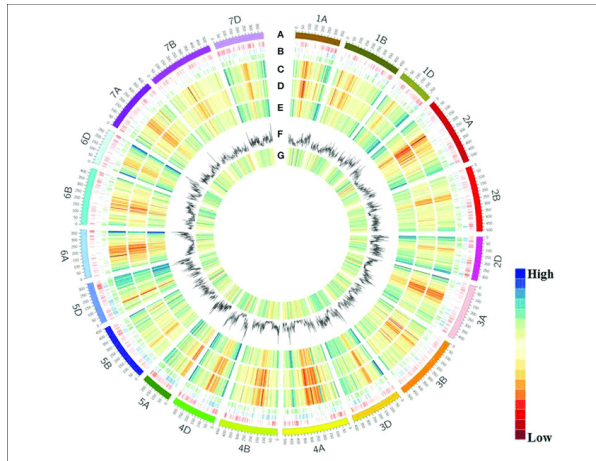
Multi-OMICs datasets



Gene mapping



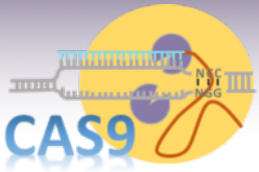
## IWGSC RefSeq



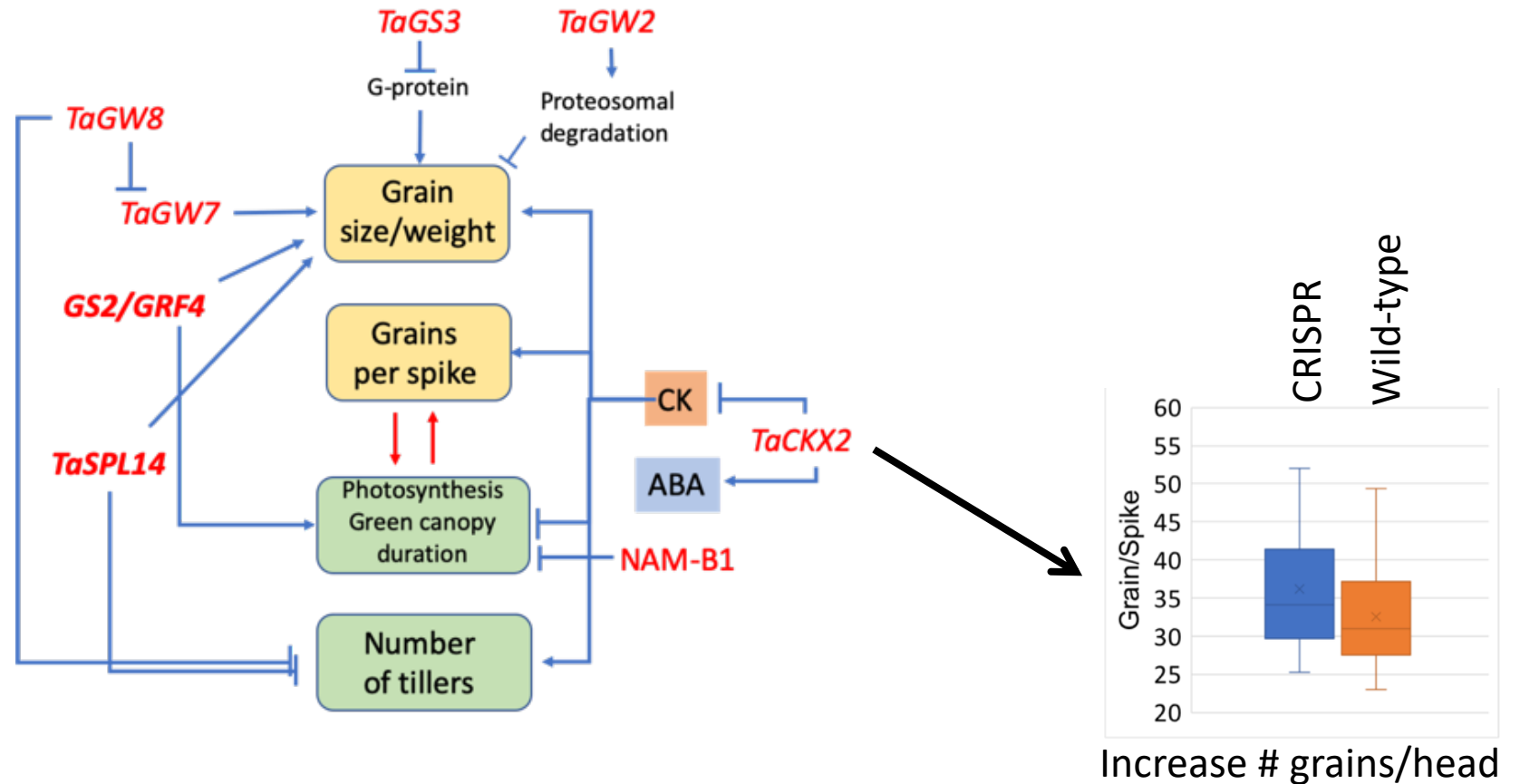
- Genes
- Regulatory regions
- Pathways

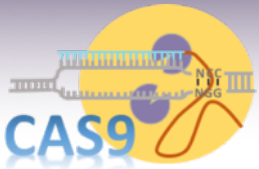


- Targeted CRISPR/Cas9-induced variation
- EMS mutagenesis

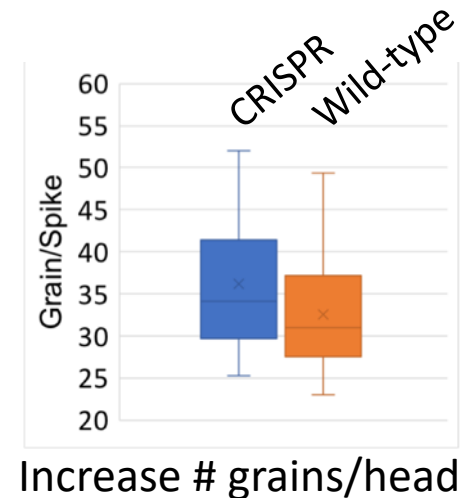
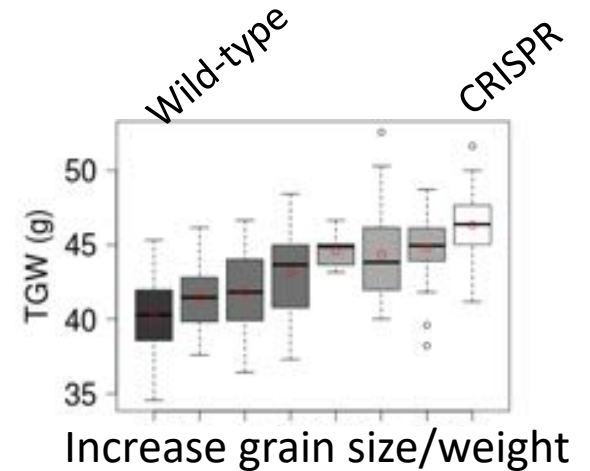
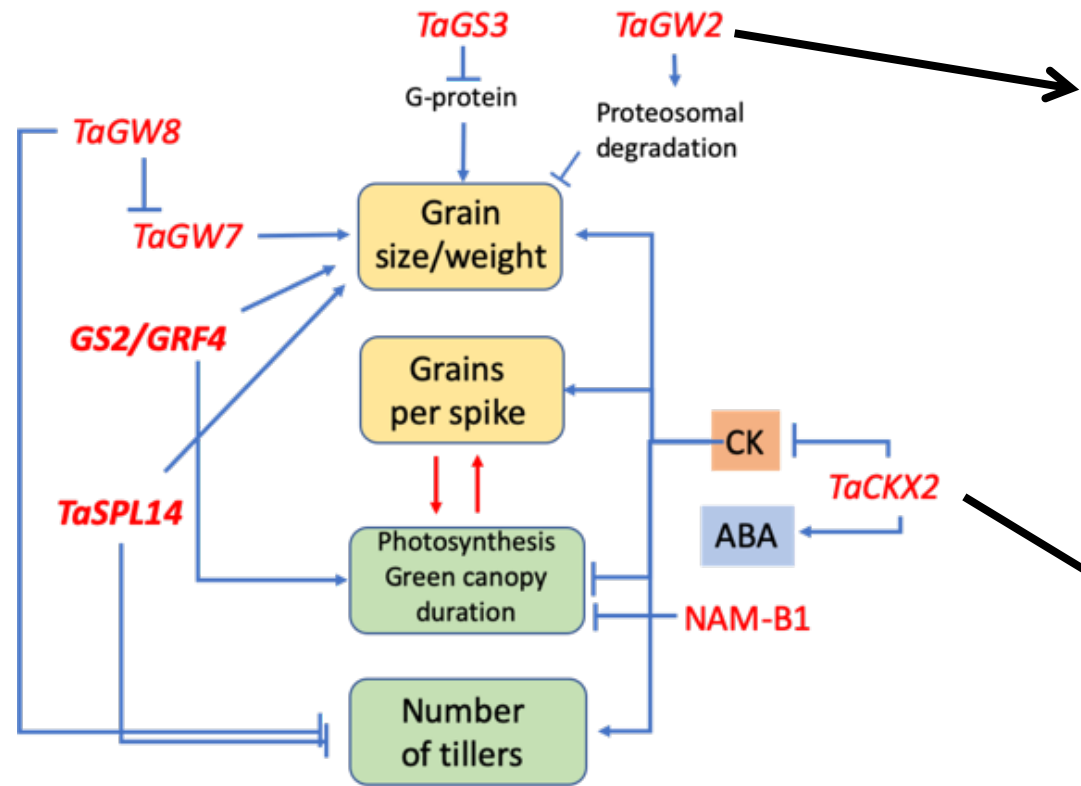


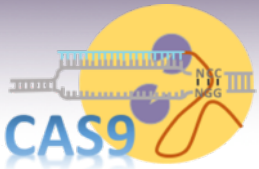
Knowledge of critical elements of biological pathways and their modes of interaction opens possibilities for engineering traits by CRISPR-based editing and creating alleles with specific effect on network



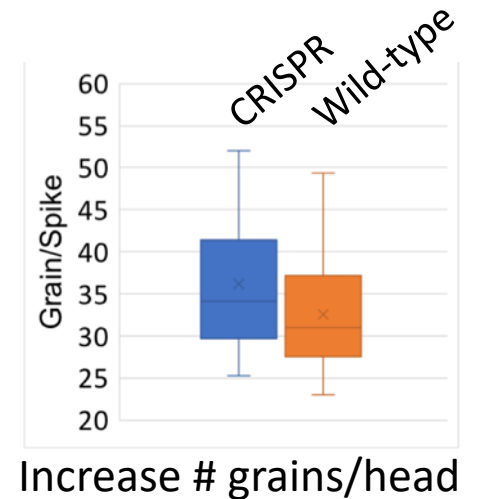
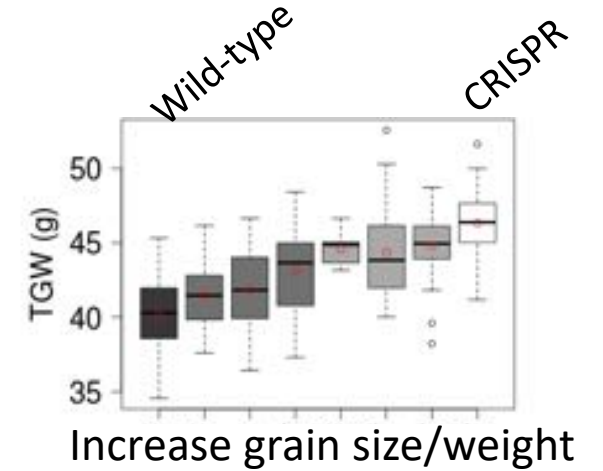
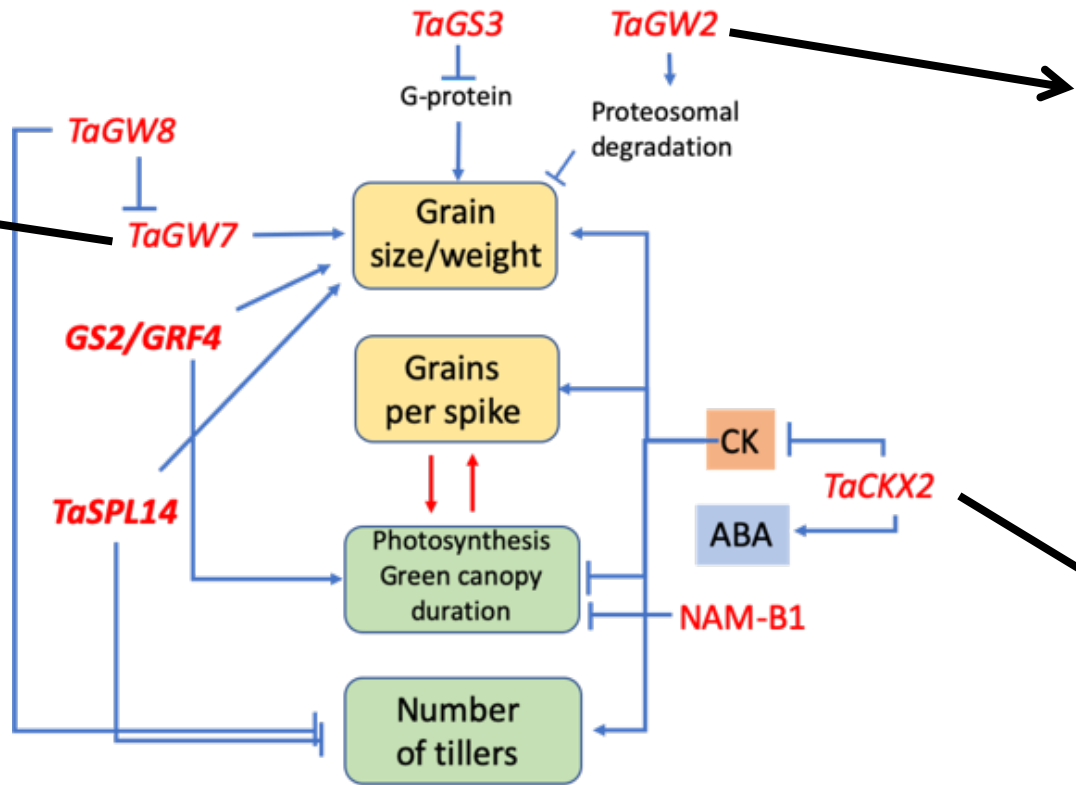
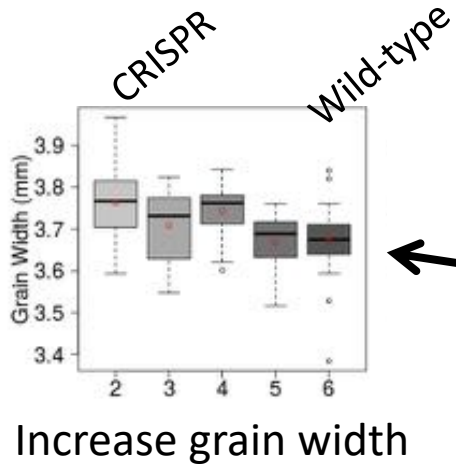


Knowledge of critical elements of biological pathways and their modes of interaction opens possibilities for engineering traits by CRISPR-based editing and creating alleles with specific effect on network





Knowledge of critical elements of biological pathways and their modes of interaction opens possibilities for engineering traits by CRISPR-based editing and creating alleles with specific effect on network



# Conclusions

Joint analysis of eQTL and chromatin accessibility data provides a powerful tool for detecting regulatory regions of the large wheat genome

Enrichment of trait-associated variants in the regions of open chromatin or eQTL indicates relevance of these genome-to-phenome map's dimensions for understanding the genetic basis of major agronomic traits

Integrating additional 'omics' datasets into phenotypic trait analysis could help to identify critical genes and pathways controlling biological processes underlying these traits

This information could improve our ability to predict phenotypic outcomes of any particular genome, and select genomic targets for engineering desired traits



# Acknowledgements

## **Akhunov Lab**

Katherine Jordan  
Fei He  
Wei Wang  
Andres Salcedo  
Will Rutter  
Shichen Wang  
Dwight Davidson  
Bliss Betzen  
Alyssa Dunnivan  
Zitong Yu  
Moses Nyine

## **KSU Beocat**

Dan Andresen

## **USDA CDL (MN)**

Matt Rouse  
Les Szabo  
Yu Jin

## **USDA (ND)**

Shiaoman Chao

## **University of Saskatchewan**

Curtis Pozniak  
Pierre Hucl  
Krystalee Wiebe

## **KSU IGF**

Alina Akhunova  
Monica Fernandez de Soto  
Jie Ren  
Yanni Lun

## **UC Davis**

Jorge Dubcovsky

## **Agriculture Victoria, and, La Trobe University**

Matthew Hayden  
Raj Pasam  
Fan Shi  
Surya Kant  
Gabriel Keeble-Gagnere  
Pippa Kay  
Kerrie Forrest  
German Spangenberg  
Ben Hayes  
Hans Daetwyler  
Josquin Tibbits



United States  
Department of  
Agriculture

National Institute  
of Food and  
Agriculture



# Resources

**Chromatin accessibility data:**

<https://wheat-urgi.versailles.inra.fr/Seq-Repository/Chromatin-accessibility>

**1000 exome project:** <http://wheatgenomics.plantpath.ksu.edu/>

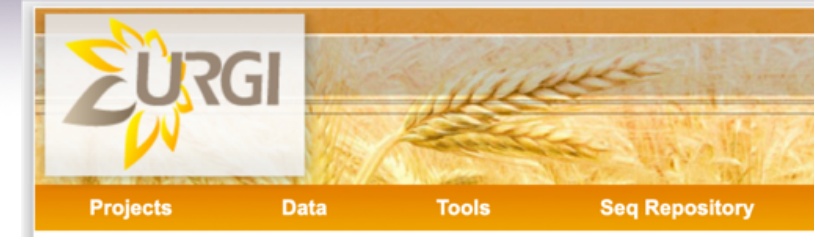
**Filtering SNPs using differential chromatin accessibility profiles:**

*T3 database (C. Birkett, J. Jannink)*

<https://wheat.triticeaetoolbox.org/genome/mnase.pl>

*GrainGenes (T. Sen)*

<https://wheat.pw.usda.gov/GG3/content/september-2020-mnase-chromatin-states-tracks-iwpsc-chinese-spring-genome-browser>



**Exome sequencing of a diverse collection of wheat landraces, cultivars and breeding lines**

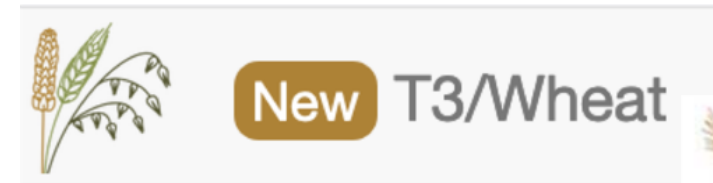
**About 1000 wheat exomes project**

Genome-level DNA sequence variation map is required to establish links between causal variants and phenotypes as well as to understand the role of environmental, demographic and human-driven factors in shaping the genomic diversity of modern wheat. Here, we used a reference wheat genome IWGSC RefSeq v1.0 to generate a haplotype map based on the targeted re-sequencing of more than 1,000 diverse wheat landraces and cultivars, and tetraploid wild and domesticated relatives.

Geographic distribution of the analyzed wheat lines

Num. accessions  
5 10 30 70 90

The poster features a world map with red circles of varying sizes indicating the geographic distribution of the analyzed wheat lines. A legend below the map shows four red circles of increasing size corresponding to the numbers 5, 10, 30, 70, and 90.



**GrainGenes**  
A Database for Triticeae and Avena

**Wheat Chinese Spring IWGSC RefSeq v1.0 genome assembly (2018)**

For more information, please follow this link: [\[IWGSC Chinese Spring info page at GrainGenes\]](#)  
IWGSC RefSeq v1.0 genome assembly paper: [\[Science magazine\]](#)

Varietal SNP data is provided by the Akhunov and Dubcovsky Labs: [\[Dubcovsky Lab website\]](#)  
The 1,000 Wheat Exome paper can be accessed [here](#).

[TILLING Variants](#) [info](#) [WHEALBI Variants](#) [info](#) [HAPMAP Variants](#) [info](#) [G-quadruplex \(G4\) motifs](#) [info](#)

The banner features a background image of green wheat stalks. The GrainGenes logo is in the top left corner. The main text is centered and includes several links for more information.