

Genome-wide association study for resistance to stripe rust in Central European winter wheat

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'WheatSustain'

Stripe rust disease in wheat

- Stripe rust or yellow rust (Yr) is a fungal and one of the most destructive diseases of wheat (*Triticum aestivum* L.)
- *Puccinia striiformis* (*Pst*) is causing stripe rust in wheat
- It leads to a significant economic damage to the production of wheat, with losses up to 70-80% of total yields in epidemic conditions; annual estimated losses are 5.47 million tonnes of wheat worth US\$979 million
- Sustainable management of wheat stripe rust is only possible by identifying and introducing rust resistant genes into the wheat elite cultivars



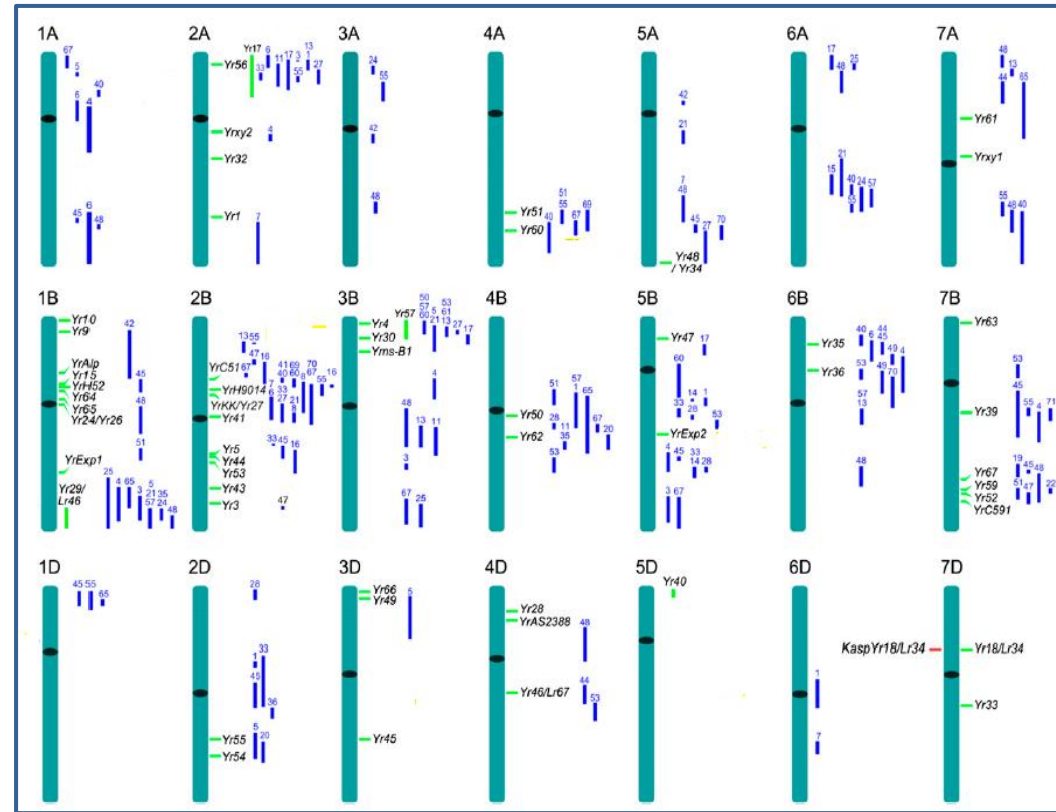
<https://striperust.wsu.edu/>

Genetics of resistance to rust diseases

- Resistance to rust diseases is classified into two main groups:
 - i. all stage resistance (ASR); resistance genes are effective against avirulent pathotypes throughout all growth stages of the plant (race specific, qualitatively inherited, and can be overcome by new races)
 - ii. adult plant resistance (APR); whereas APR genes express resistance only at the post-seedling stages (race non-specific, quantitatively inherited, and more likely durable)
- A single effective ASR gene can protect a wheat variety from stripe rust; however, it places selection pressure on the pathogen to acquire virulence for the singly deployed gene
- Therefore, the deployment of known APR genes in combination with effective ASR genes present in modern wheat cultivars are needed to deliver commercially acceptable levels of resistance

Chromosomal locations of stripe rust resistance genes in wheat

- Chromosomal locations of several stripe rust resistance genes were determined using:
 - monosomic analysis
 - bulk segregant analysis (BSA)
 - selective genotyping (SG)
 - whole genome scanning using the high throughput molecular technologies (such as the Illumina iSelect 90 K Infinium SNP-genotyping array and DArTseq technology)
- The 2013 Catalogue of Gene Symbols for Wheat includes 67 officially named Yr genes (Yr1-Yr67) and 42 with temporary Yr designations



Maccaferri et al., 2015

Objectives

- To evaluate the diversity for seedling and adult-plant resistance to Warrior Pst pathotypes in bread wheat cultivars and breeding lines
- To conduct GWAS analysis for identifying the sources of effective resistance genes and associated QTL for utilization in future breeding programs
- To compare the Pst resistance loci identified in this study with previously identified Yr genes and QTL
- To apply significant associated markers in genomic prediction of resistance to stripe rust in breeding programs

Training and Validation Population

- **Training Population:**

A collection of 230 wheat cultivars and breeding lines from the Central European countries (Norway, Sweden, Austria, Germany, Poland, Denmark and Switzerland), evaluated in five environments (2020-2021)

- **Validation population:**

- Two different sets of nearly 1000 breeding lines belonging to German breeding companies (WheatSustain), evaluated in Lemgo, Germany

- 175 breeding lines belonging to LfL, evaluated in Lenglern, Germany

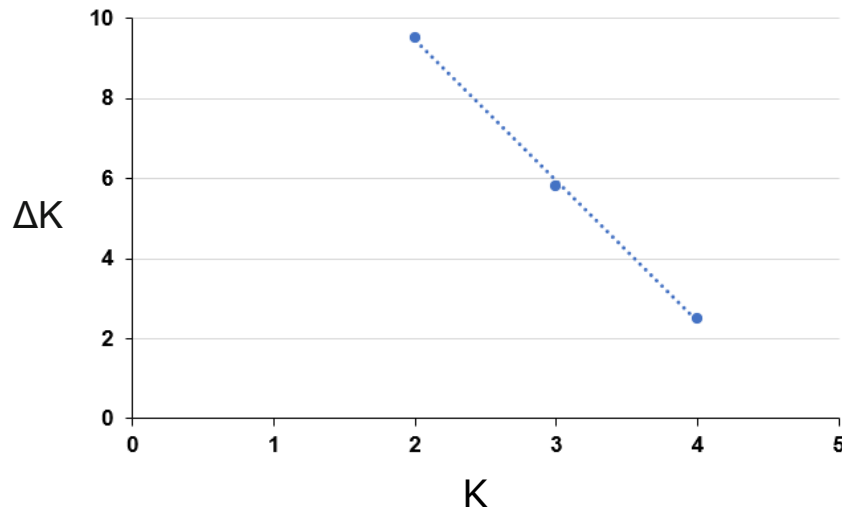
- **Genotyping platform:**

Wheat Illumina 25K Infinium SNP array



Population structure analysis

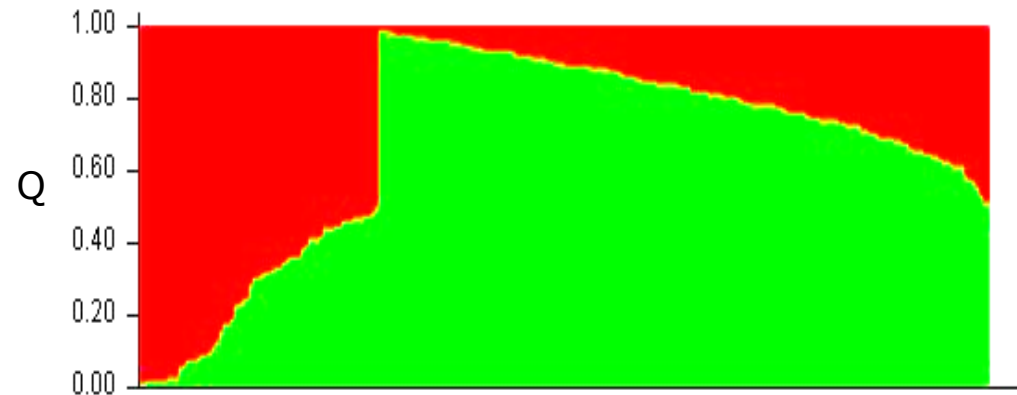
- Training set (No. of loci: 8900 ; No. of ind.: 230)



Determination of the number of subpopulations via the ad hoc statistic ΔK

■ Subpopulation 1 (N=92, Austrian lines)

■ Subpopulation 2 (N=138, German & other lines)



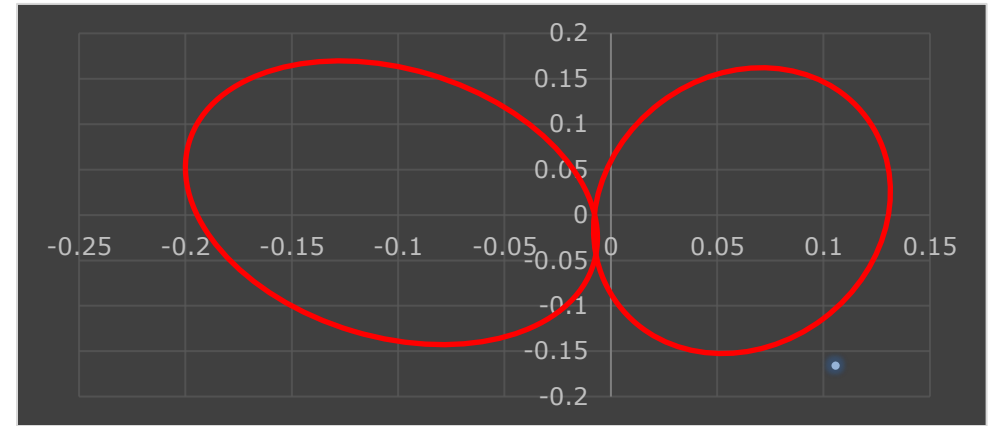
Fast structure analysis showing 2 subpopulations at $K=2$
y axis: membership coefficient (Q) of individuals

Population structure analysis

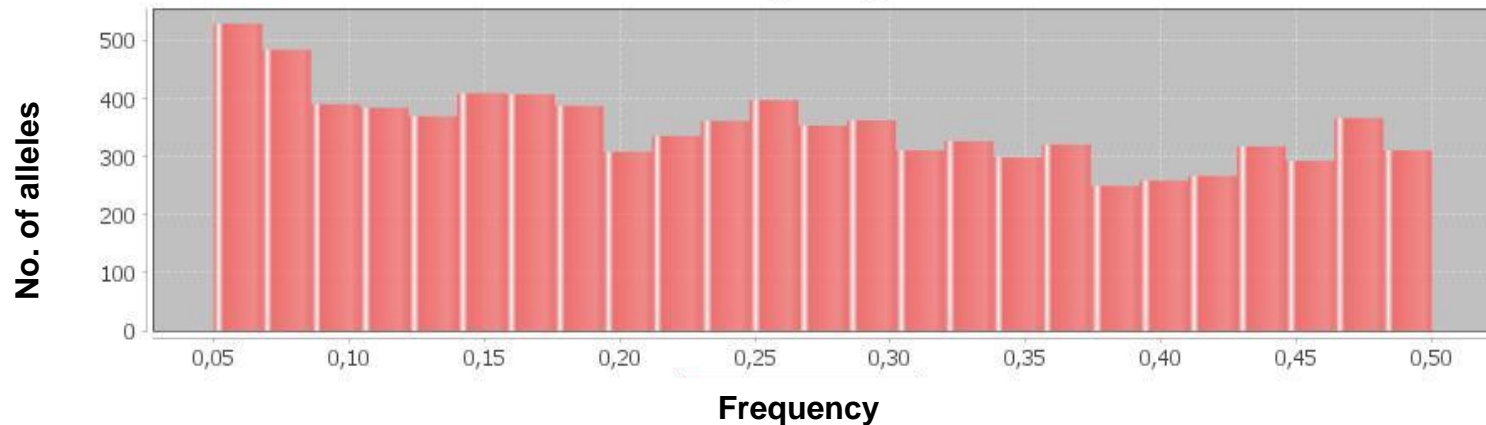
- Training set (No. of loci: 8900 ; No. of ind.: 230)

Principal component analysis of distance matrix using SNP genotyping data

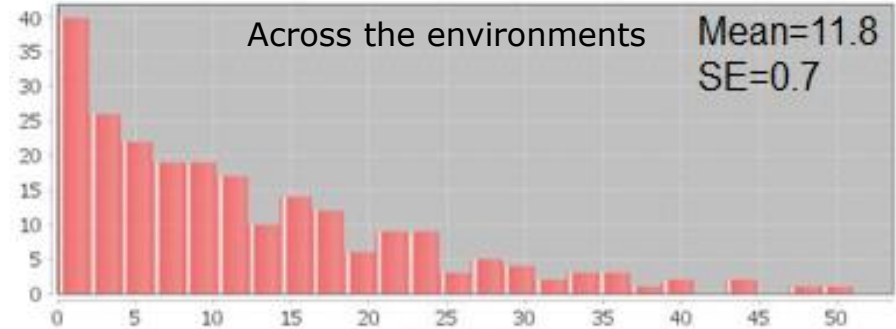
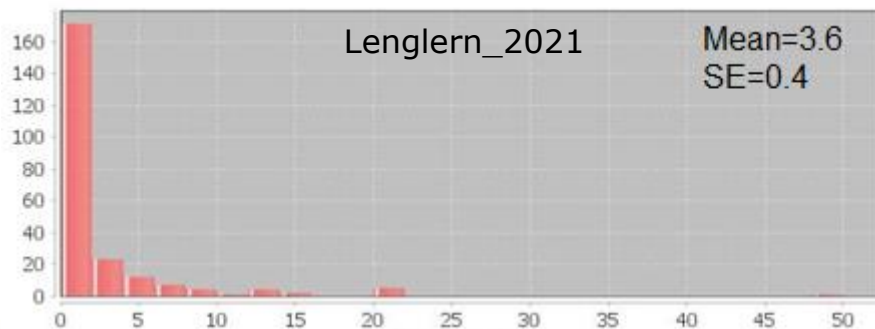
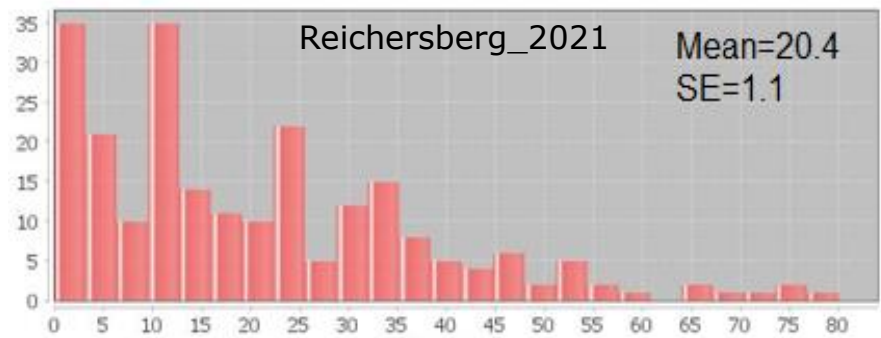
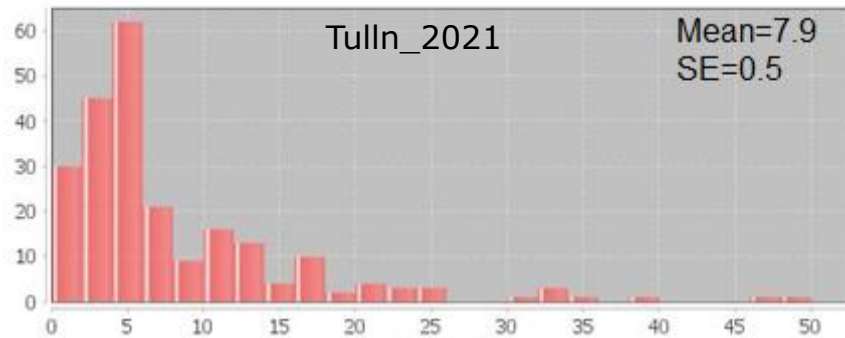
PC1 vs. PC2



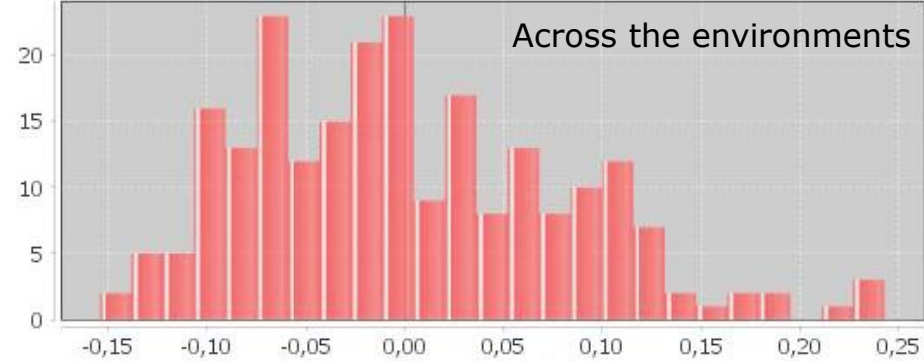
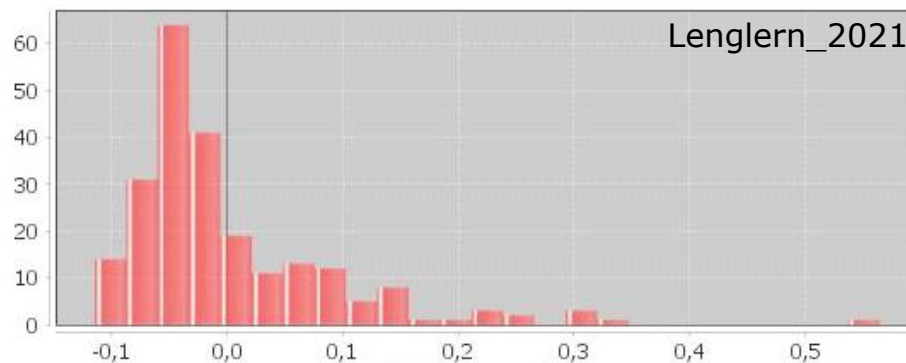
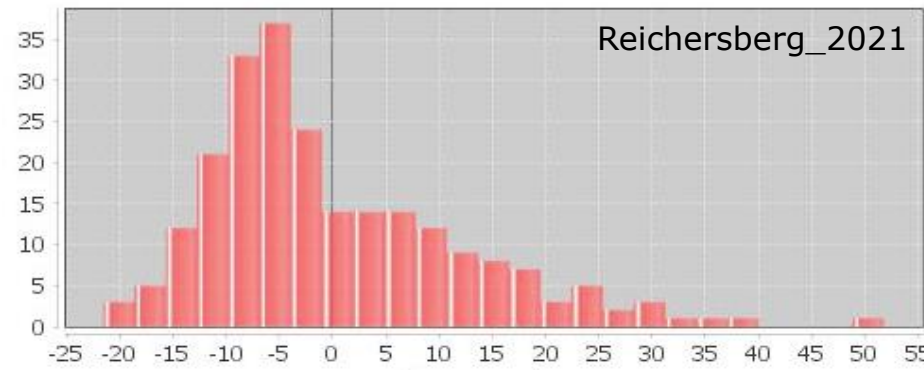
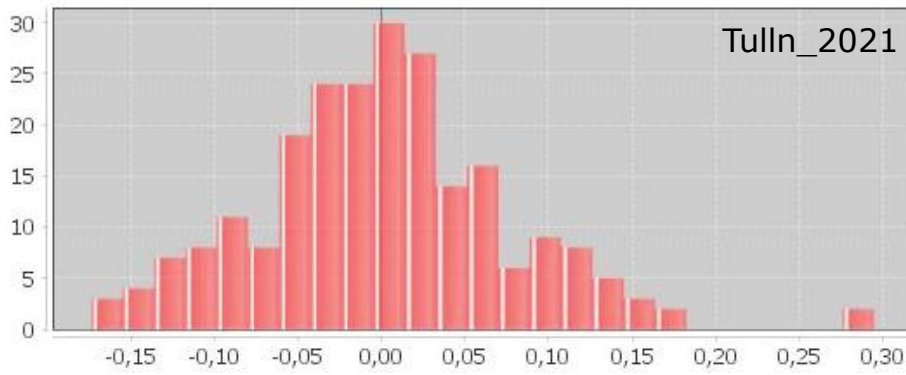
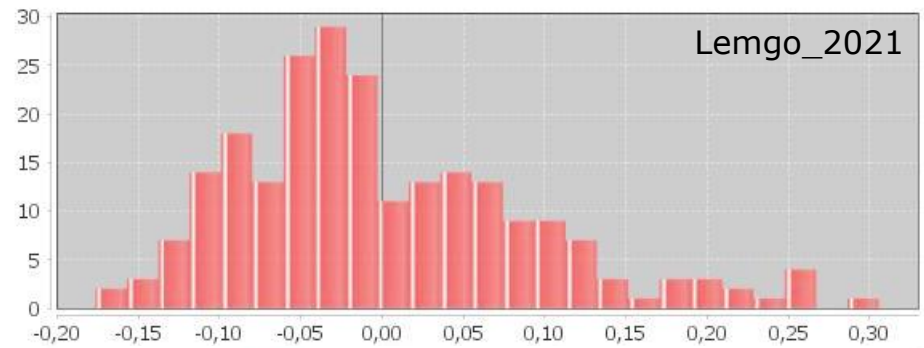
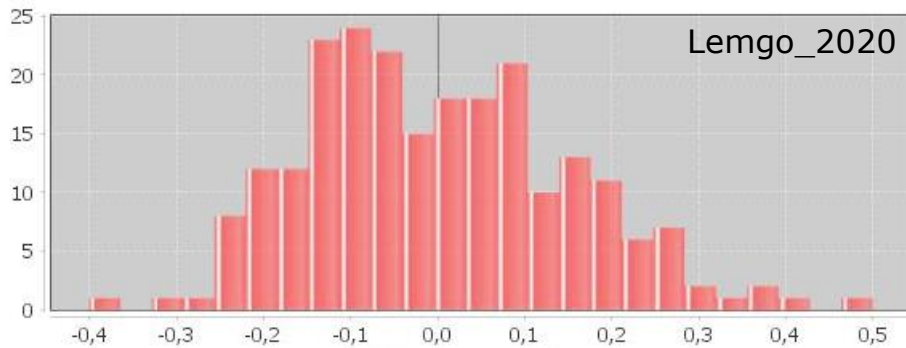
Minor Allele Frequency Distribution



Frequency distribution of disease severity (%)



ArcSinSqrt transformed disease severity of stripe rust- Residual Distribution



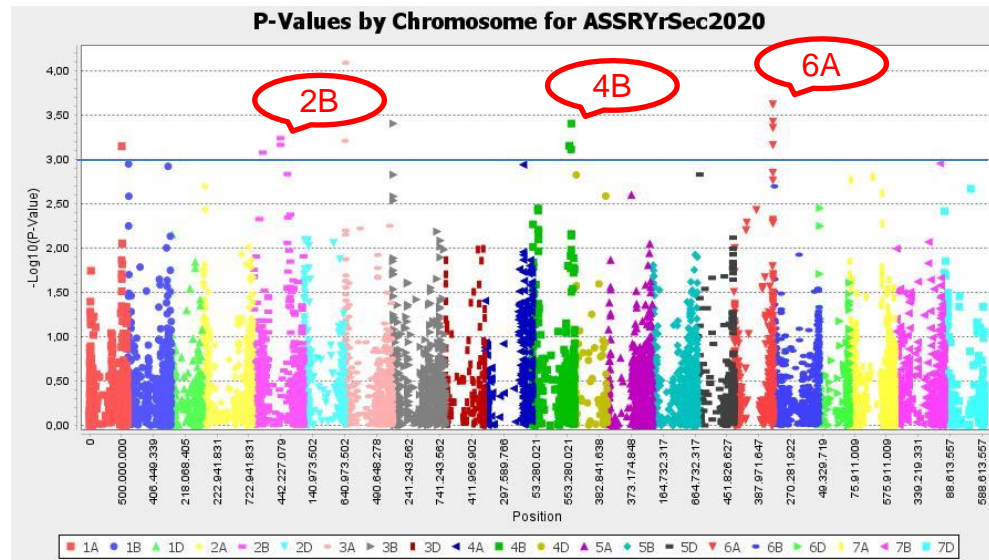
SNPs significantly associated with disease severity

GWAS was performed using the pairwise kinship matrix and mixed linear model (MLM)

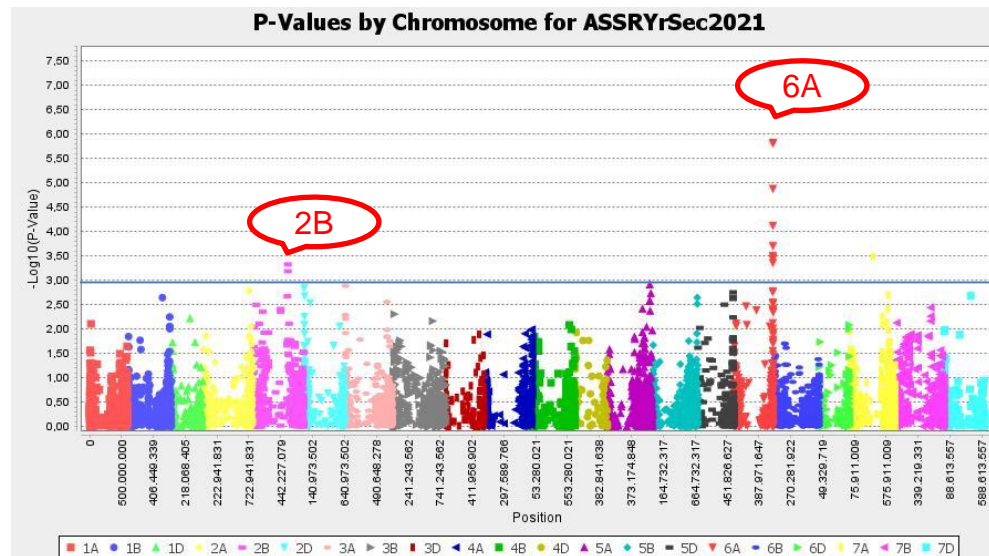
Environment	No. SNPs	Chromosome	R2 (%)
Lemgo_Germany 2020	14	1A, 2B, 3A, 3B, 4B, 6A	5-7
Lemgo_Germany 2021	13	2B, 6A, 7A	6-11
Lenglern_Germany 2021	23	2A, 2B, 7A, 7B, 7D	6-7
Tulln_Austria_2021	10	1A, 4B, 5B, 5D, 7A, 7B	5-6
Reichersberg_Austria_2021	6	2B, 4B, 5A, 7A	5-7
Across the environments	12	2B, 4B, 6A, 7A, 7B, 7D	5-7

SNPs significantly associated with disease severity in Germany

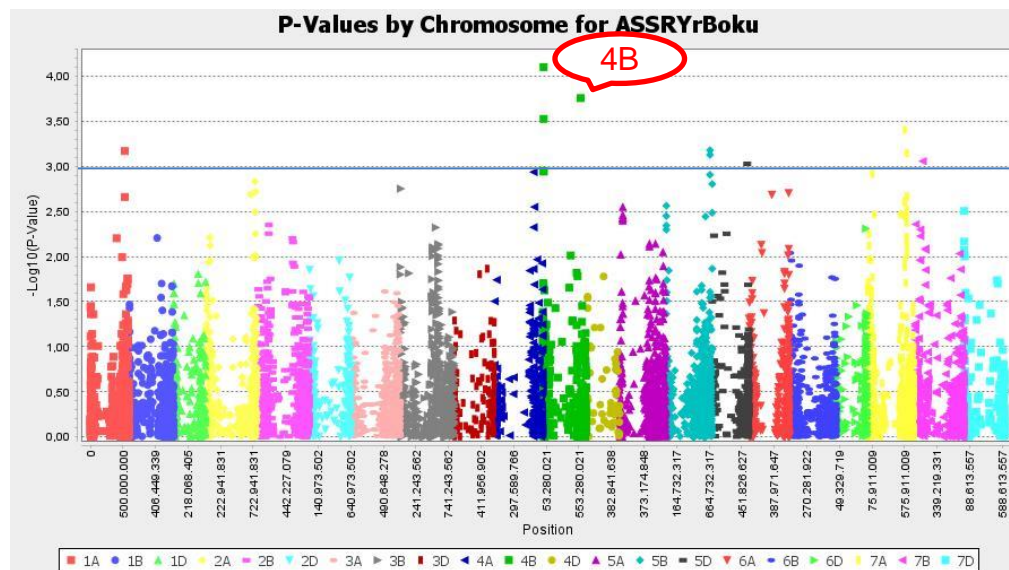
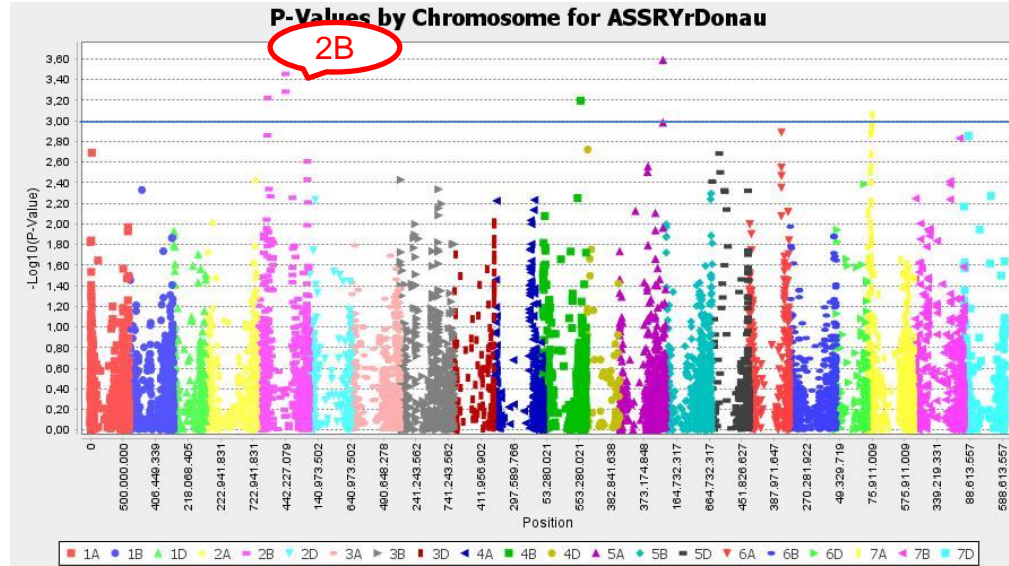
Lemgo_2020



Lemgo_2021

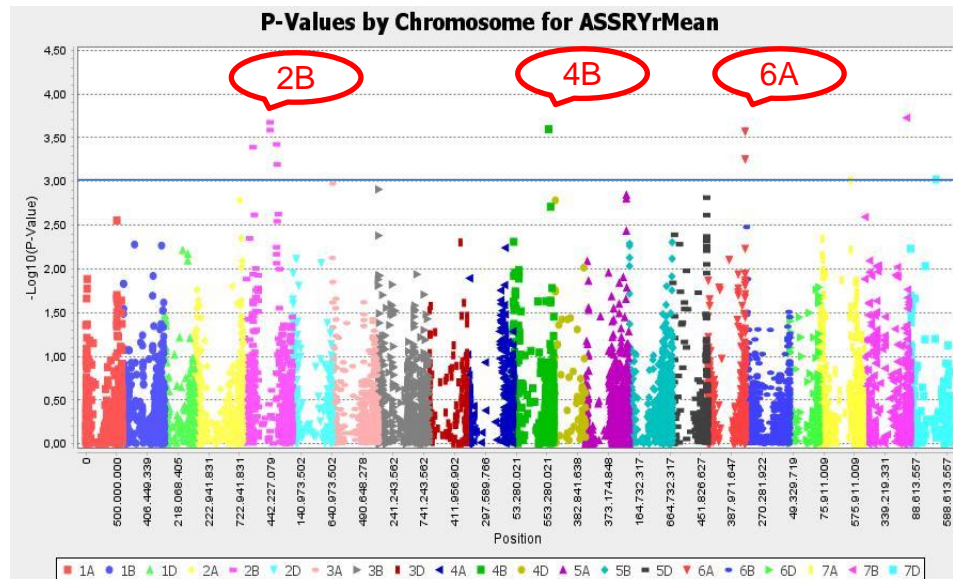
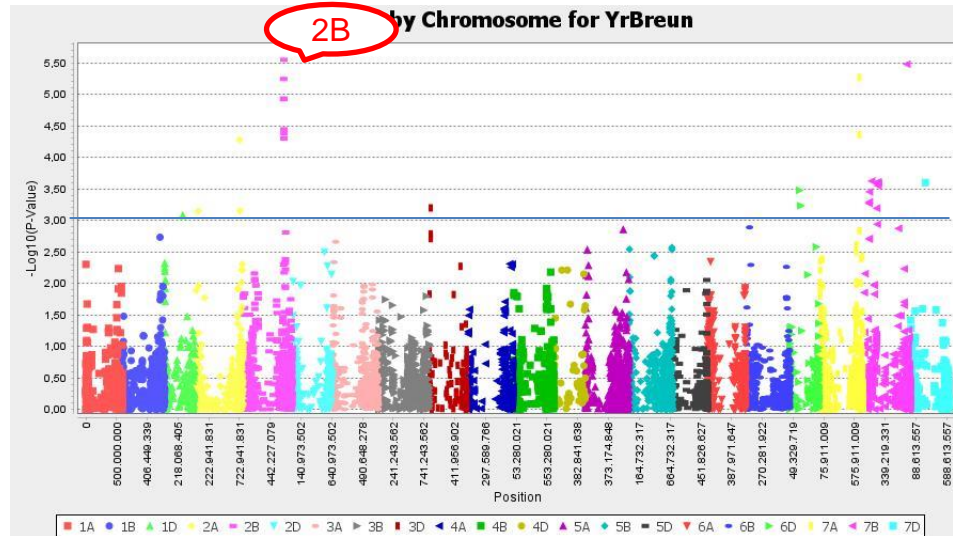


SNPs significantly associated with disease severity in Austria



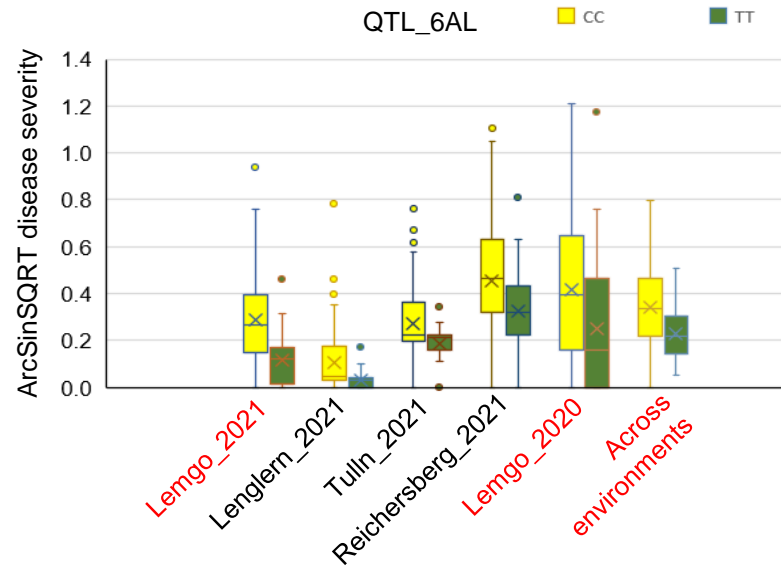
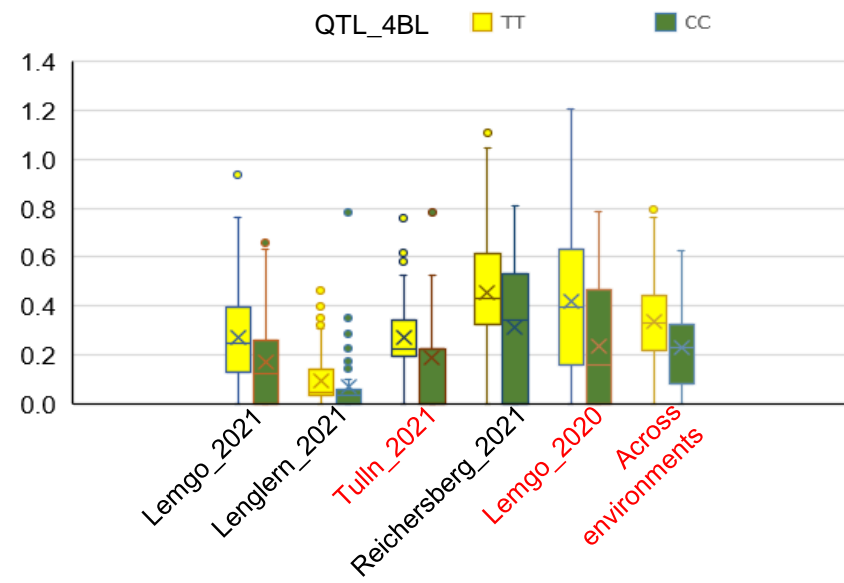
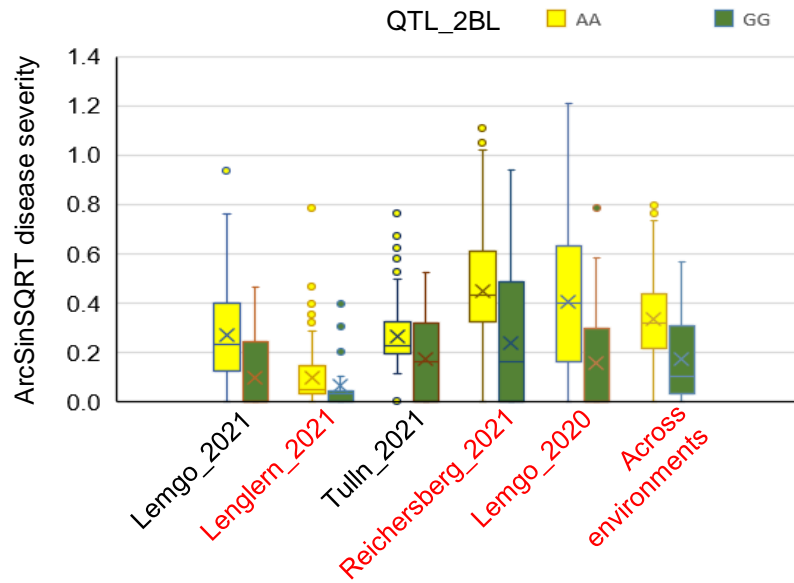
SNPs significantly associated with disease severity across the environments

Lenglern_2021

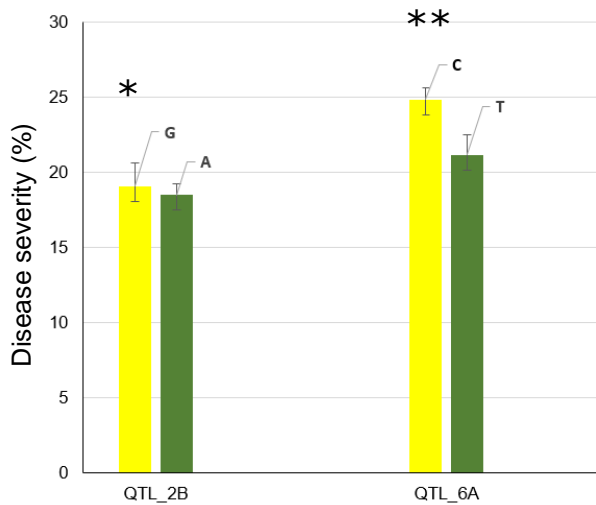


Across the environments

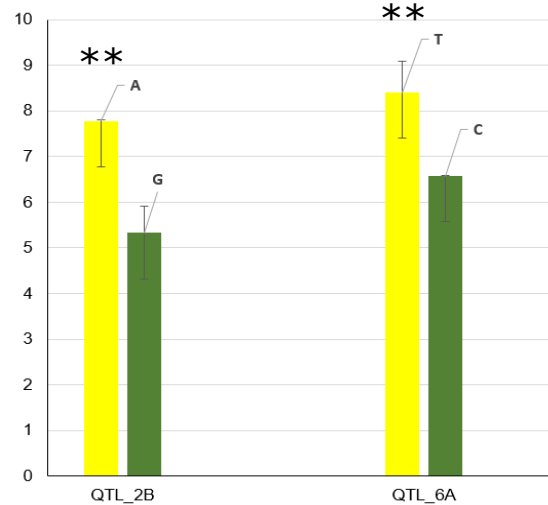
Allelic effect of common loci for stripe rust



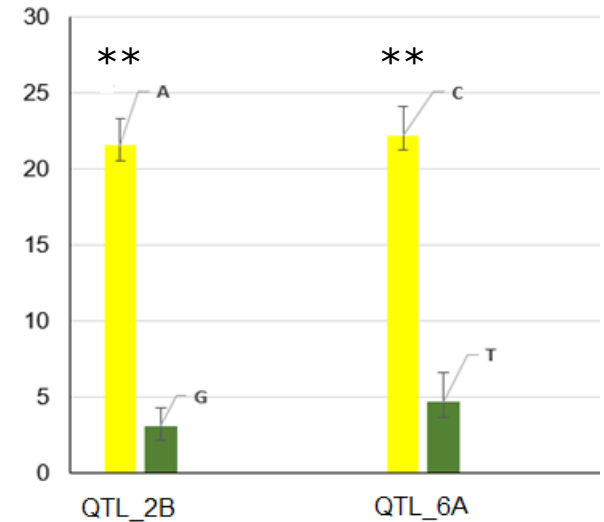
Validation of common loci in breeding materials



813 WheatSustain V.S.,
evaluated in Lemgo_Germany
(year 2020)



1230 WheatSustain V.S.,
evaluated in Lemgo_Germany
(year 2021)



175 independent breeding lines,
evaluated in Lengler_Germany
(year 2021)

Comparison with previously mapped resistance loci

QTL	Physical interval (bp)	Known genes or QTL *
QTL_2BL	439225308-665669936	<i>QYr.inra-2B.2_CampRemy</i>
		<i>QYr.caas-2BL_Naxos</i>
		<i>QYraq.cau-2AL_Aquileja</i>
		<i>QRyr2B.2_ICARDA</i>
		<i>Yr5</i>
		<i>Yr44</i>
QTL_4BL	581078314-612253980	<i>QYr.hbaas-4BL.1</i>
		<i>QYr.hbaas-4BL.2</i>
		<i>Qyr.wpg-4B.1</i>
		<i>Yr62</i>
QTL_6AL	609380034-611661202	present study

* <https://wheat.pw.usda.gov/cgi-bin/GG3/browse.cgi>

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