SNP Identification to Breed for Biomass Production in Sorghum: an alternative

to non-renewable resources in tropical and temperate regions

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1. Introduction: Sorghum biomass as a Carbon Source

- To substitute to non-renewable fossile carbon sources through biorefinery approach
 - To produce energy: bioethanol, methane, electricity
 - To make biocomposites (matrix + natural fiber) and biomaterials for building
 - To support the green-chemistry value chain
- To feed animal

These goals can be achieved focusing on various traits relative to biomass composition and production:

Dry matter production (plant height, dry matter content, principal stem dry matter weight)

- Cell Wall composition (lignin, cellulose, hemicellulose content)
- Animal nutrition (organic fiber digestibility, dry matter digestibility, solubility, nitrogen and mineral content)
- Sugar content and juice production (Brix, Brix at 30% moisture and juice weight in principal stem)

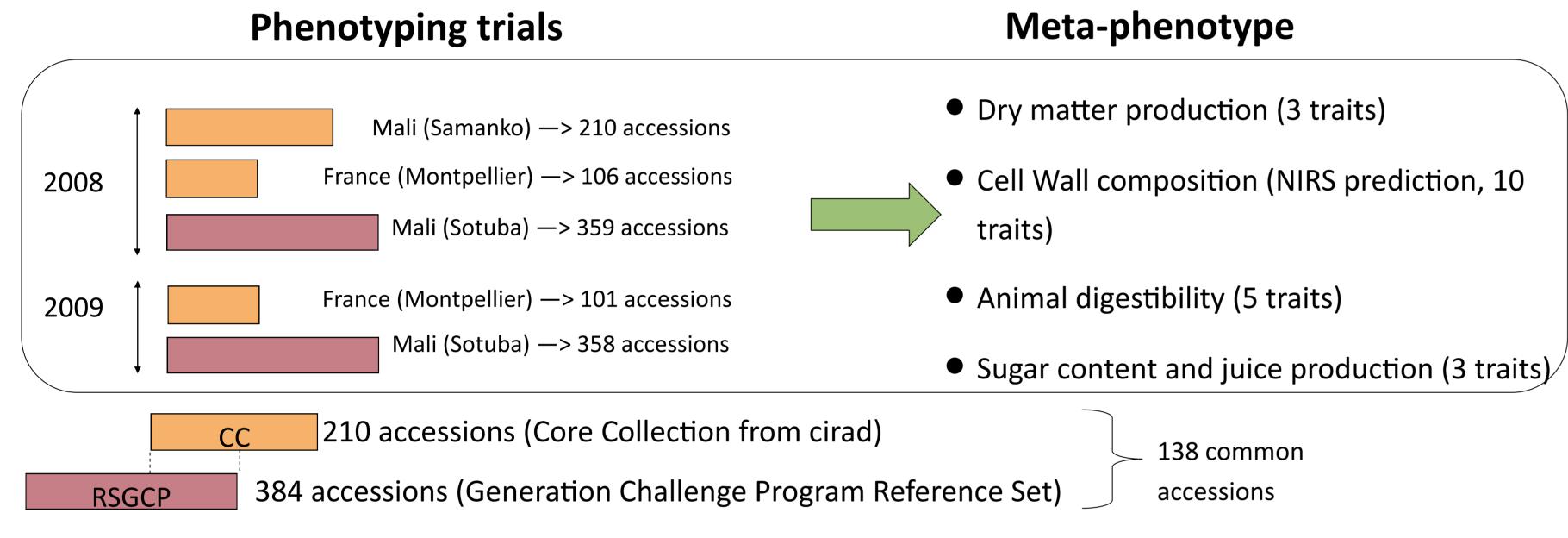
Analysis of genetic determinism is of key importance to:

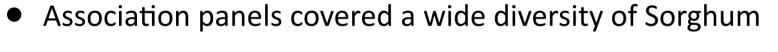
i. Identify genome areas involved in trait variation

ii. Support and optimise breeding strategies adapted to the different industrial processes using knowledge from i.

Main objective: Highlight SNP to be used in a breeding process for biomass production

2. GWAS through Mixed-Model to detect associations between biomass characteristics and genotypes



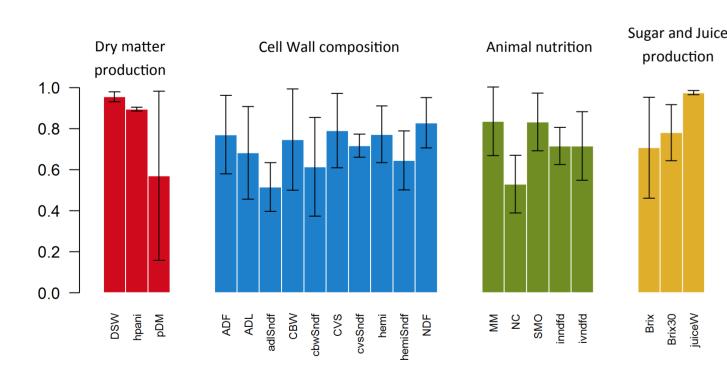


- 21 phenotypes were obtained corresponding to the 4 meta-phenotypes.
- Mixed-models were used to test association between SNP and phenotypes using GEMMA (Zhou and Stephens, 2012) and choosing LMM model. The model used was in the form: $y = \mu + Qv + SNP + Zu + e$ (Yu et al., 2006) and considered both Structure and Kinship.
- Bbmh (best blast mutual hit) algorithm for orthology analysis was used to identify candidate sequences for cell wall proteins

Genotype analysis Genotyping-by-DNA Complete Genotype matrix without mis-Sequencing CC **RSGCP Imputation** Linkage Population Disequili-Analysis brium analy-(subset of 11 sis 547 SNP) Margaritiferum race Kinship pairwise scores (K matrix ex 13 sub-population pressed as identity groups (Q matrix) by State)

3. Association results match with some candidate sequences obtained from orthology analysis with other species

3.1. Heritabilitiy values were calculated using REML variances estimated from a mixed-model without SNP in Asreml-R (Butler, et al., 2009) for each variables in each trial.



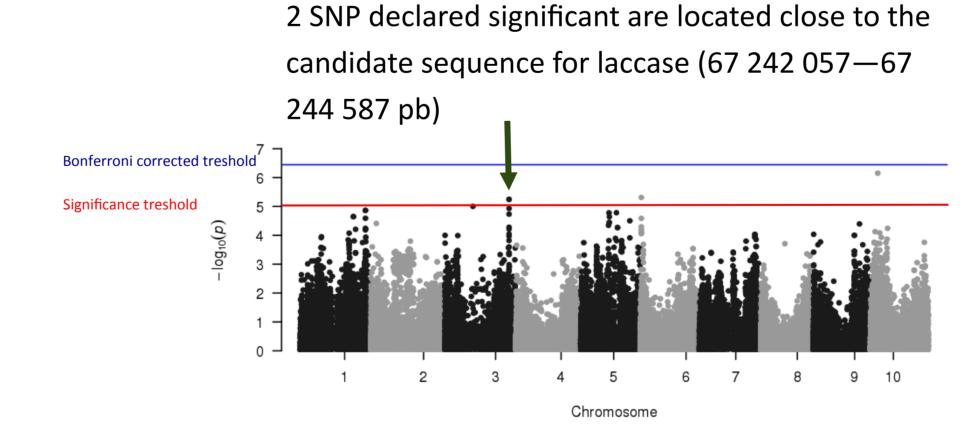
3.2. Significant SNP were identified if their $-\log_{10}$ (pvalue) was superior to 5 (average threshold value for 5% FDR correction on every trials-phenotype combination) and allowed to:

- Define genome areas containing at least 1 significant SNP
- Check for matching with candidate sequences from bbmh analysis

Meta-phenotype	genome areas associated	areas matching with candidate sequences (distance < 100 kb)	SNP inside or close to (< 5 kb) candidate sequences
Dry matter pro- duction	18	8	1
Cell Wall composi- tion	85	43	26
Animal digestibili- ty	50	19	6
Sugar and juice production	18	8	1

Number of genome areas associated with phenotypes variation and SNP directly linked to candidate sequences for cell wall proteins

3.3. A focus on the variable adlSndf (lignin/total fiber) observed in France in 2008 shows interesting candidate ortholog sequence for a laccase previously identified on Arabidopsis as implied in lignin polymerization (Zhao et al., 2013) and in maize as impacting biomass quality (Dhugga et al., 2011, patent US 2011/0239329 A1).



Conclusion:

- Population analysis highlights 13 sub-population groups showing a genetic continuum except for one isolated group composed of acccesions from the margaritiferum race. Linkage disequilibrium decreased rapidly for distances superior to 1 kb and confirms the high number of SNP necessary to cover the entire Sorghum genome in association panels (Bouchet et al., 2012).
- GWAS analysis allowed to identify promising SNP to breed for biomass production, some being close or inside candidate sequences obtained from an orthology analysis with maize, rice and Arabidopsis. Because of the wide genetic diversity covered by association panels chosen, those results could serve in a breeding program using genitors from the cultivated pool of Sorghum.

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