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# Understanding sorghum cell wall deposition using comparative genomics and gene coexpression network

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12èmes journées du Réseau Français des Parois



Supervisors: Nancy Terrier, David Pot, Delphine Luquet, Hervé Etienne

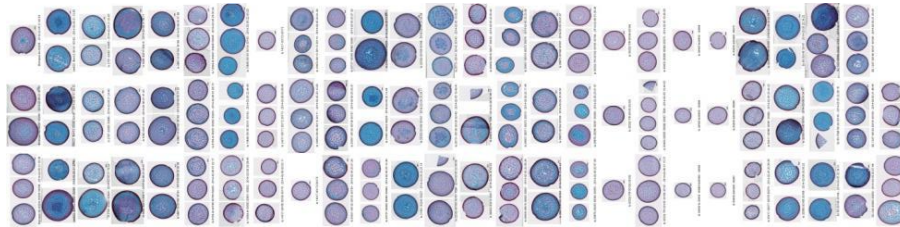
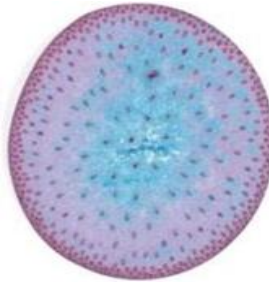


# Secondary Cell Walls are target for breeding new sorghum lines

## Sorghum stem

Secondary cell wall (SCW)

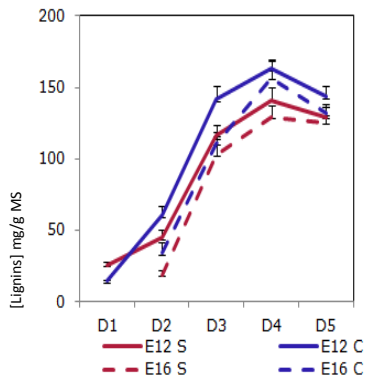
- Cellulose
- Xylan
- Lignin



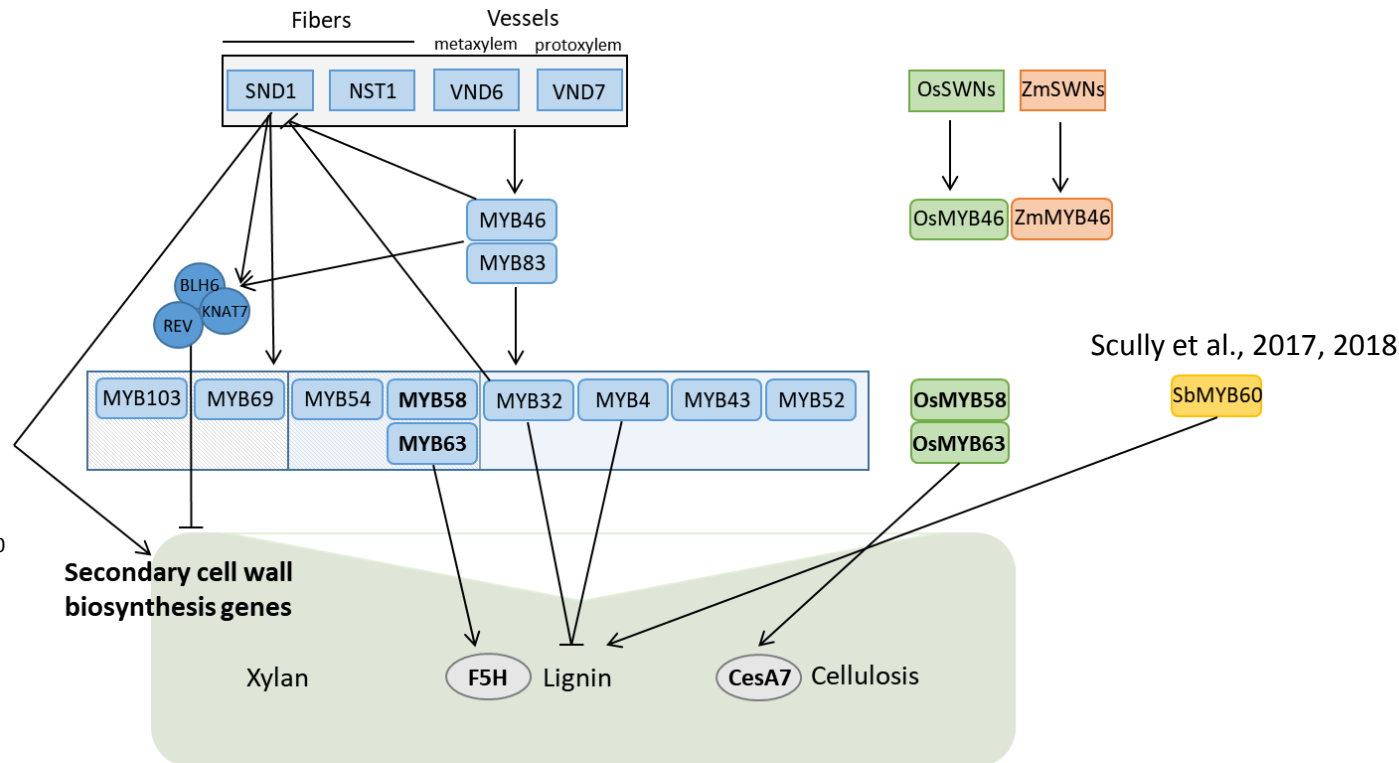
**Biomass  
Tolerance  
Stiffness**

**Human and animal nutrition  
Agromaterials**

# Secondary Cell Walls are target for breeding new sorghum lines



- Accumulation pattern in sorghum
- Biosynthesis enzymes well listed in sorghum Rai et al., 2016  
McKinley et al., 2016
- Transcription factors mostly known in Arabidopsis



D'après

McCarty et al. 2009  
Zhong et al. 2007, 2008, 2010  
Ko et al. 2009  
Yamaguchi et al. 2011  
Soyano et al. 2008  
Fornale et al. 2006  
Sonbol et al. 2009  
Yoshida et al. 2013  
Kubo et al. 2005  
Mitsuda et al. 2005

# Using gene co-expression network to identify candidate genes

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**Transcriptomics data sampled  
during development**



## **Building a gene coexpression network**

- Build a gene-gene similarity network
- Divide network into groups with similar expression
- Identify drivers genes and groups



**1**

Analysis of co expressed  
gene groups

- Enrichment
- Top genes



**2**

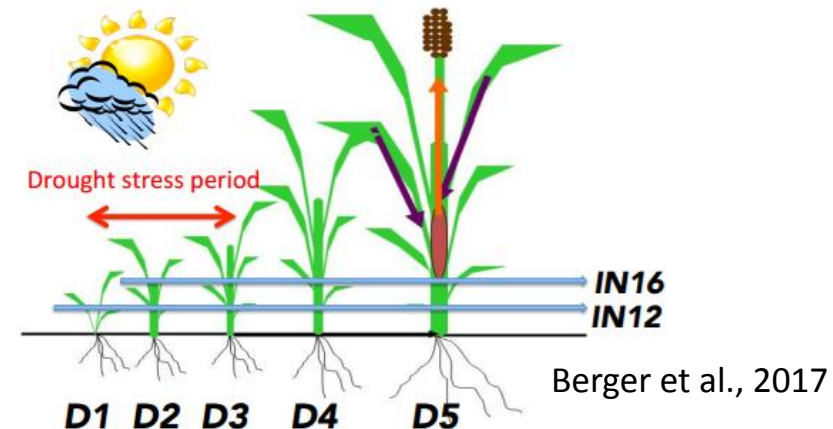
Use of bait genes  
known for their role in  
SCW

## 20.000 genes expressed throughout the development

- Sampled during 3 years of experiment in field

- From the 1st month to maturity
- 2, 3 and 5 dates
- 2 to 4 internode ages
- 200 samples x2 tech rep
- Water stress and control conditions

2013 set-up



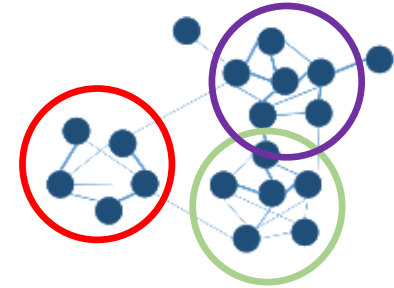
- 34000 genes with around 20000 genes expressed

- Different set-ups usable with co-expression network approach

## 12.000 genes gathered in 30 co-expressed genes groups

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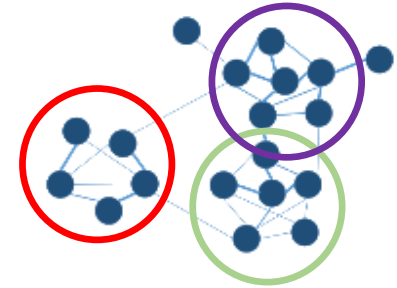
- WGCNA R package = Weighted Gene Coexpression Network Analysis
- Use of only the strongest links = 12.000 genes
- 30 modules or groups of co-expressed genes
  - Named by color
  - Containing from a few genes to 1500+ genes



Langfelder P and Horvath S, 2008

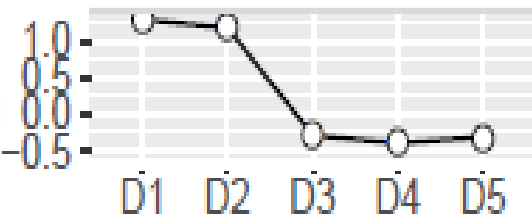
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- Representative expression patterns

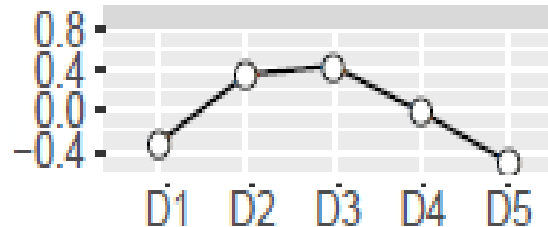


Langfelder P and Horvath S, 2008

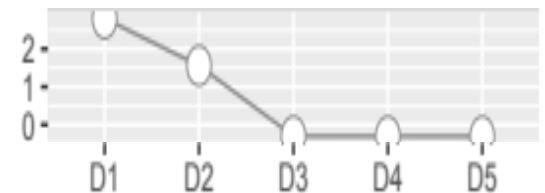
Blue



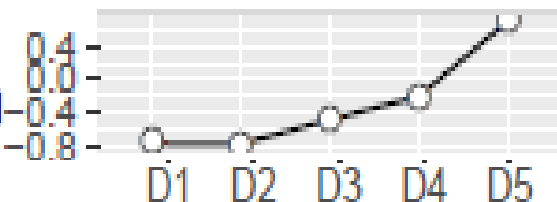
Yellow



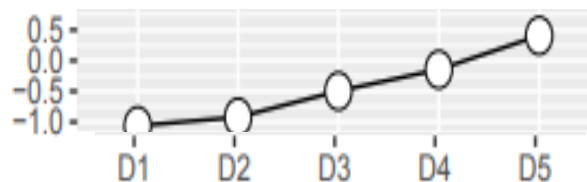
Turquoise



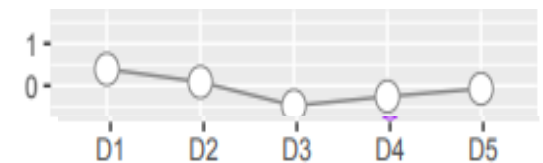
Brown



Black



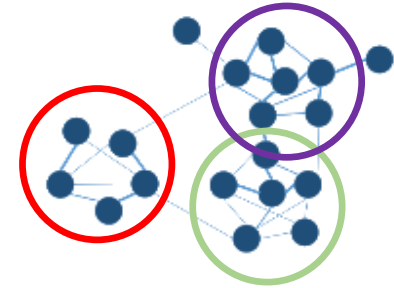
Purple





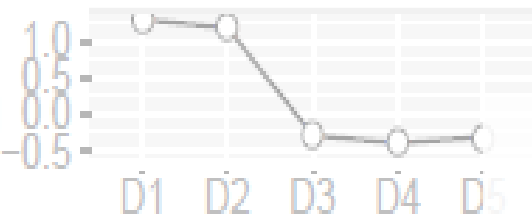
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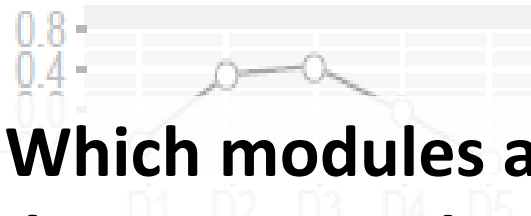


Langfelder P and Horvath S, 2008

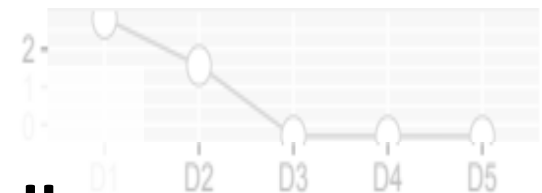
Blue



Yellow

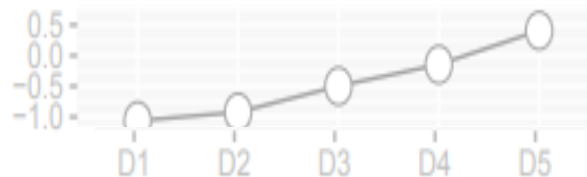
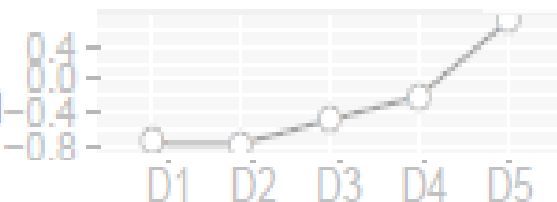


Turquoise

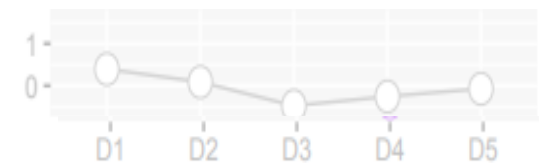


**Which modules are gathering secondary cell wall genes ?**

Brown

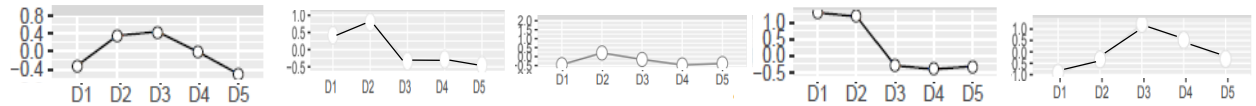


Purple





# S/PCW GO terms are overrepresented in 5 modules

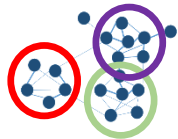


Nb of GO terms and strenght of the p-value



	Yellow	Lightsteelblue	Steelblue	Blue	Pink
SCW					
Xylan					
Lignin					
Suberin					
Shikimate					
Flavonoid					
Cellulose					
Phenylprop					
CW					
Pectin					
Xylem					
GO terms with p-value<5%	92	8	29	100+	75

# S/PCW GO terms are overrepresented in 5 modules



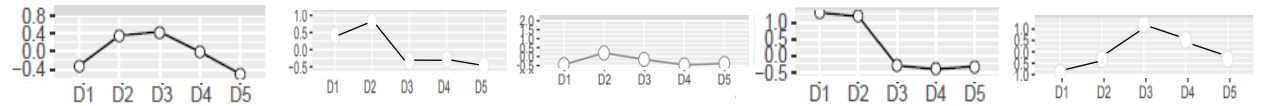
Nb of GO terms and strenght of the p-value



	Yellow	Lightsteelblue	Steelblue	Blue	Pink
SCW					
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Lignin					
Suberin					
Shikimate					
Flavonoid					
Cellulose					
Phenylprop					
CW	Enrichment in custom list with enzymes involved in CW biosynthesis				
Pectin					
Xylem					
GO terms with p-value<5%	92	8	29	100+	75
p-value for custom list enrichment	2.07*10-34	1.59*10-5	6.01*10-5	8.72*10-5	0.0093

Rai et al.,2016  
McKinley et al., 2016

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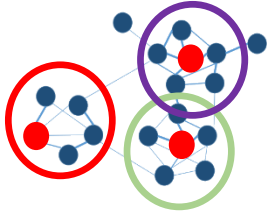
Nb of GO terms and strenght of the p-value

5 modules containing secondary and primary cell wall involved genes<sub>1</sub>

## Hub genes of pink module include KNAT7

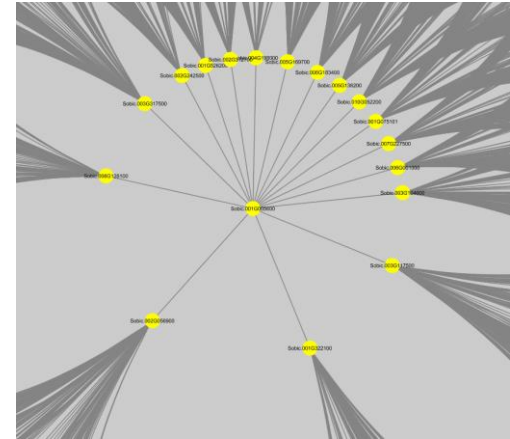
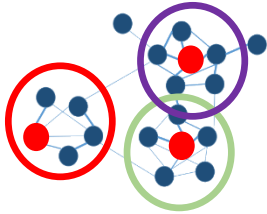
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- Finding hub genes by calculating centrality scores



# Hub genes of pink module include KNAT7

- Finding hub genes by calculating centrality scores



Sobic.001G075101	KNAT1 KNOTTED-like from Arabidopsis thaliana
Sobic.001G131400	
Sobic.001G322100	
Sobic.001G526200	KNAT7 KNOTTED-like homeobox of Arabidopsis thaliana
Sobic.002G056900	
Sobic.002G242500	WRKY2 WRKY DNA-binding protein
Sobic.002G296600	
Sobic.002G312700	
Sobic.003G104600	NmrA-like negative transcriptional regulator family protein
Sobic.003G117500	RALFL9 - Rapid Alkalization Factor RALF family protein precursor
Sobic.003G317500	
Sobic.005G136200	Chalcone and stilbene synthase family protein
Sobic.005G169700	
Sobic.006G001000	Cytochrome p450
Sobic.006G128100	
Sobic.006G183400	RBL1 HOMBOID-like
Sobic.007G227500	
Sobic.010G052200	

## Hub genes in favorites modules

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- 5 modules containing hub genes important for further analysis
- List in the *to be published* paper

# Using gene co-expression network to identify candidate genes

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Transcriptomics data sampled  
during development



## Building a gene coexpression network

- Build a gene-gene similarity network
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1

Analysis of co expressed  
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- Enrichment
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Use of bait genes  
known for their role in  
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**TRANSCRIPTION  
FACTORS**

## Synthesising MYB and NAC in sorghum

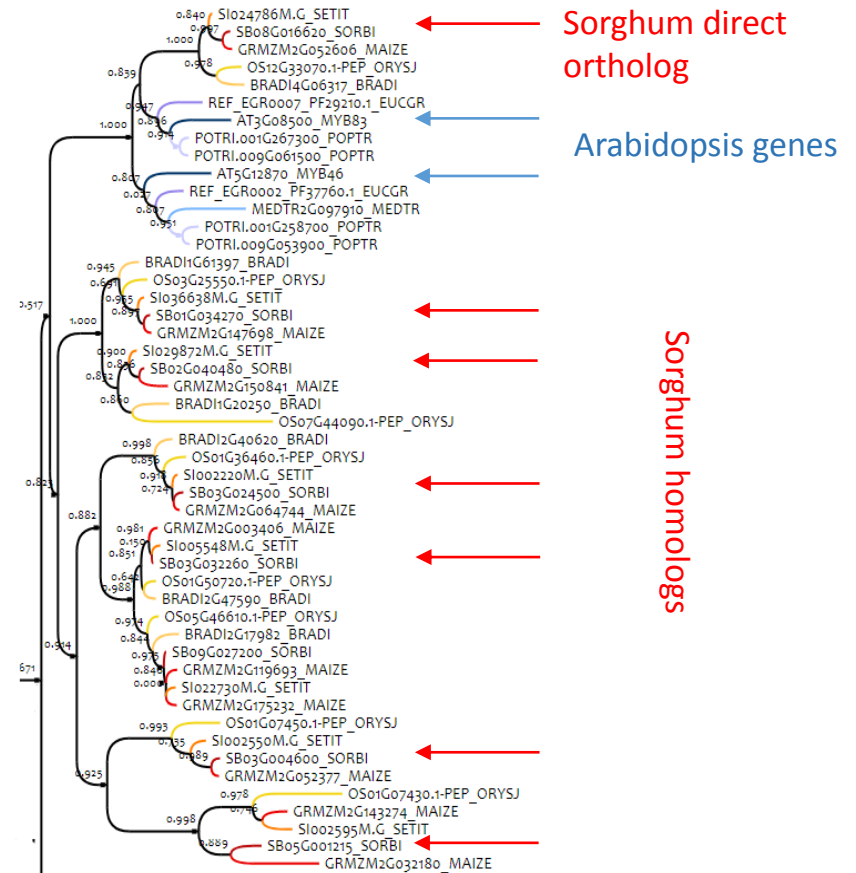
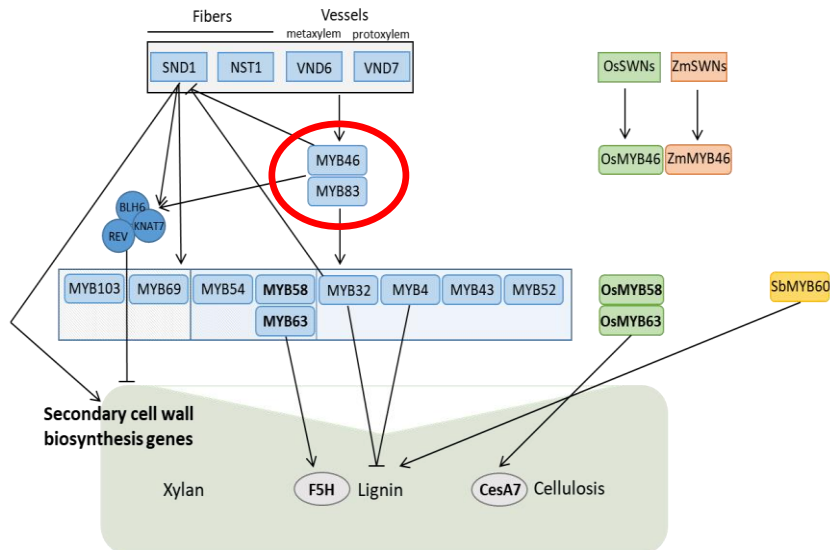
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- Phylogenetic trees including 9 species
  - Arabidopsis, eucalyptus, poplar, medicago, brachypodium, setaria, maize, rice, sorghum
- MYB = 1700+ proteins and 150 in sorghum
- NAC = 900+ proteins and 90 in sorghum

Sanjari et al., 2019

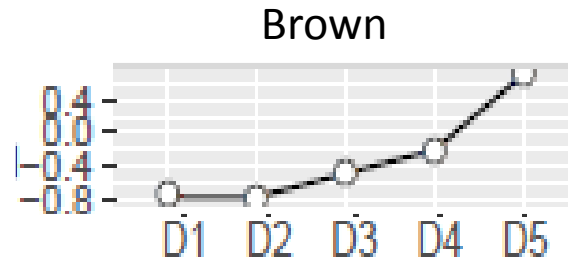
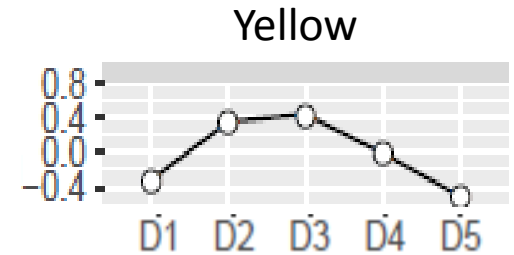
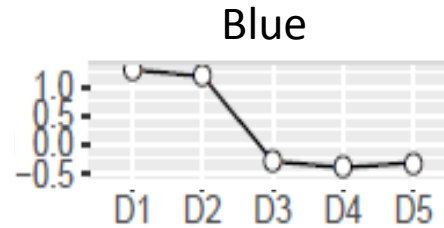
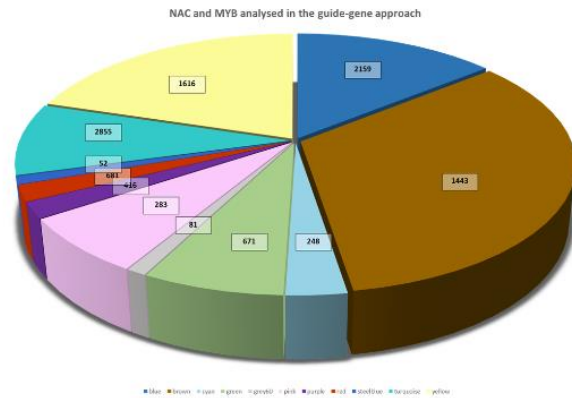
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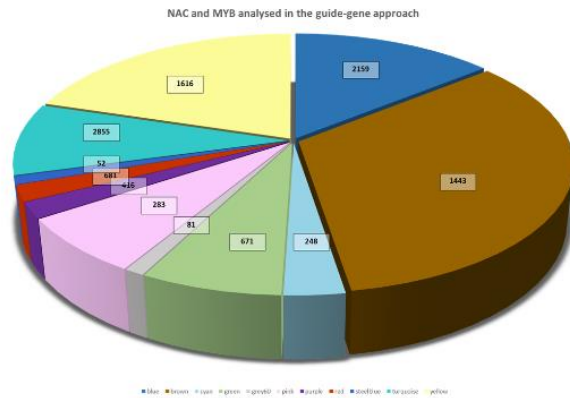
# Half of NAC and MYB tested are in favorite modules

- 100 NAC and MYB bait genes used

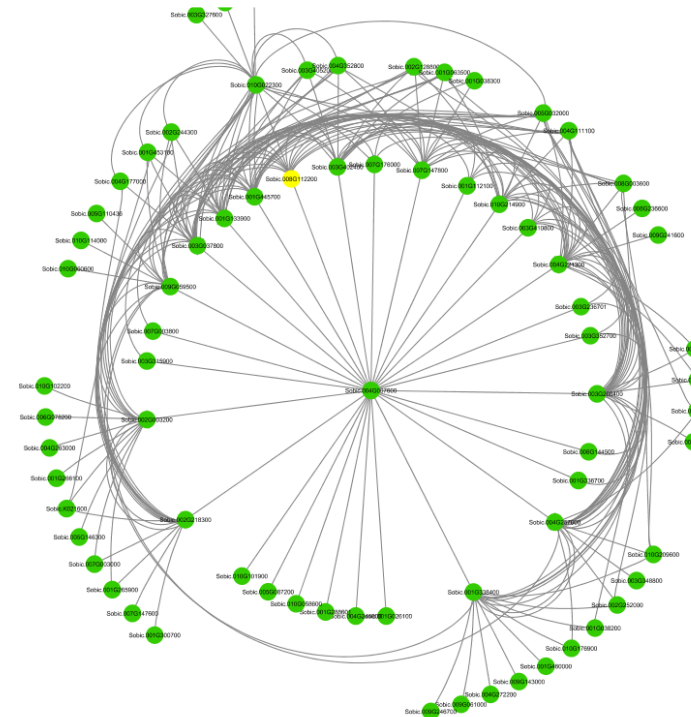
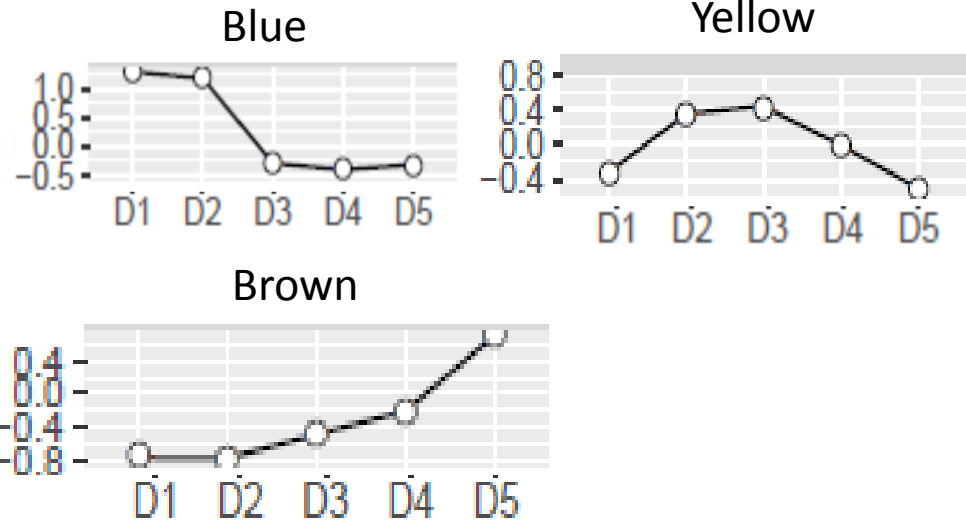


# Half of NAC and MYB tested are in favorite modules

- 100 NAC and MYB bait genes used



- MYB46 *top15'stop15* co-expressed genes
  - Capture the strongest links
  - 15x15 genes



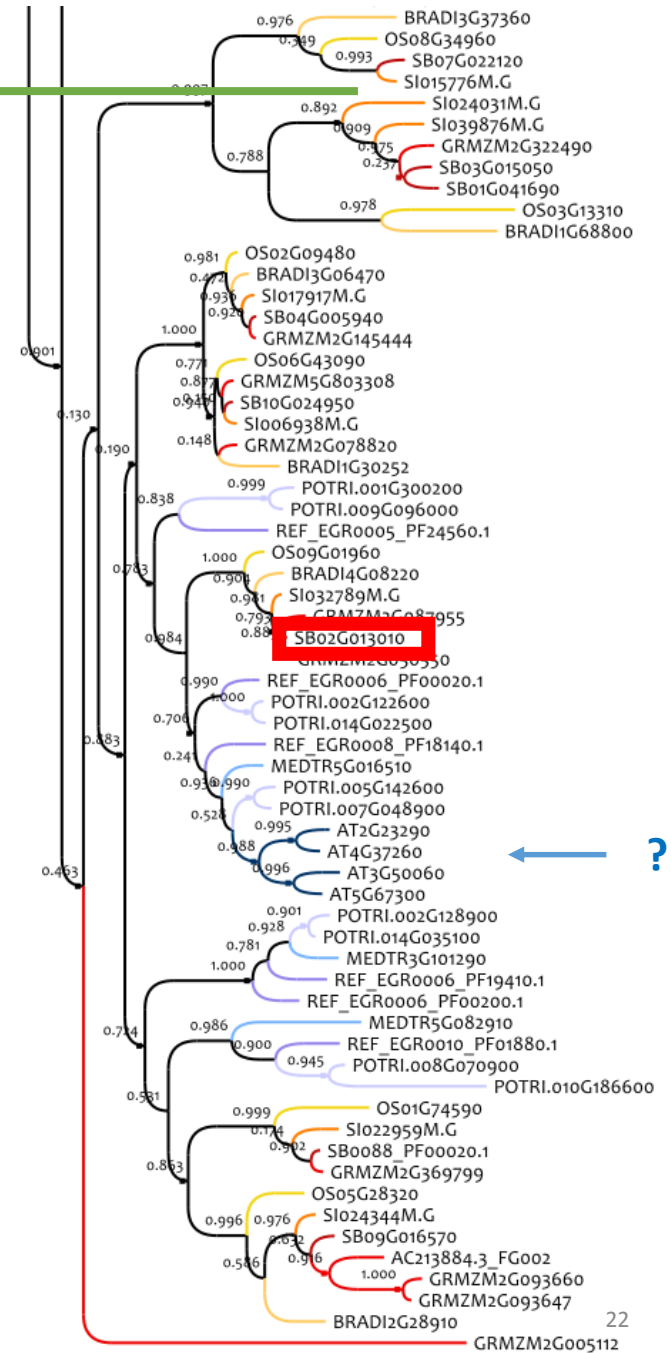
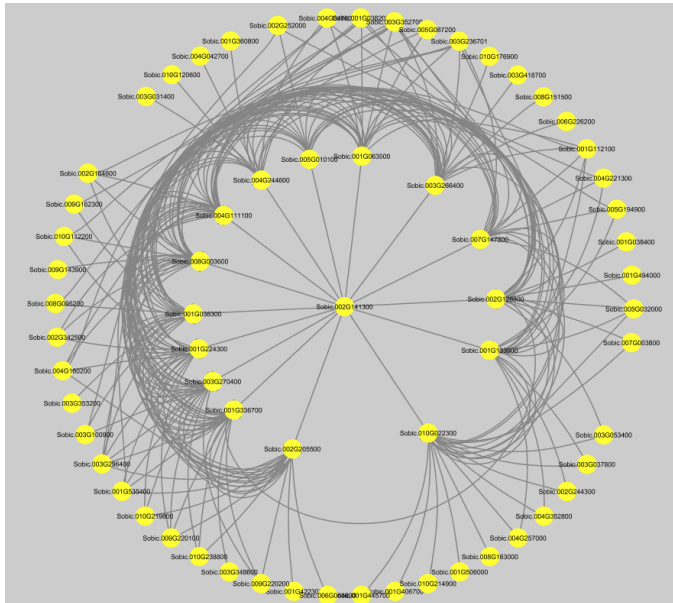
# Major SCW regulating MYB and NAC genes are enriched in SWC GO terms

- NAC and MYB favorite candidates:

Ortholog	NST1b	NST1a	MYB46	SND3	SND2	VND7	VND4/5/6	VND4/5/6
SCW								
Lignin								
Xylan								
Pectin								
CW								
Cellulose								
Phloem loading								
Wax								
Stem vascular tissue pattern formation								
Arabinan								
Polyphenols								
Nb signific GO terms	32	34	31	34	32	15	13	56

# Unknown MYB identified as a good candidate

	Sobic.002G141300
Ortholog	MYB not annotated
SCW	
Lignin	
Xylan	
Pectin	
CW	
Cellulose	
Phloem loading	
Nb signific GO terms	35

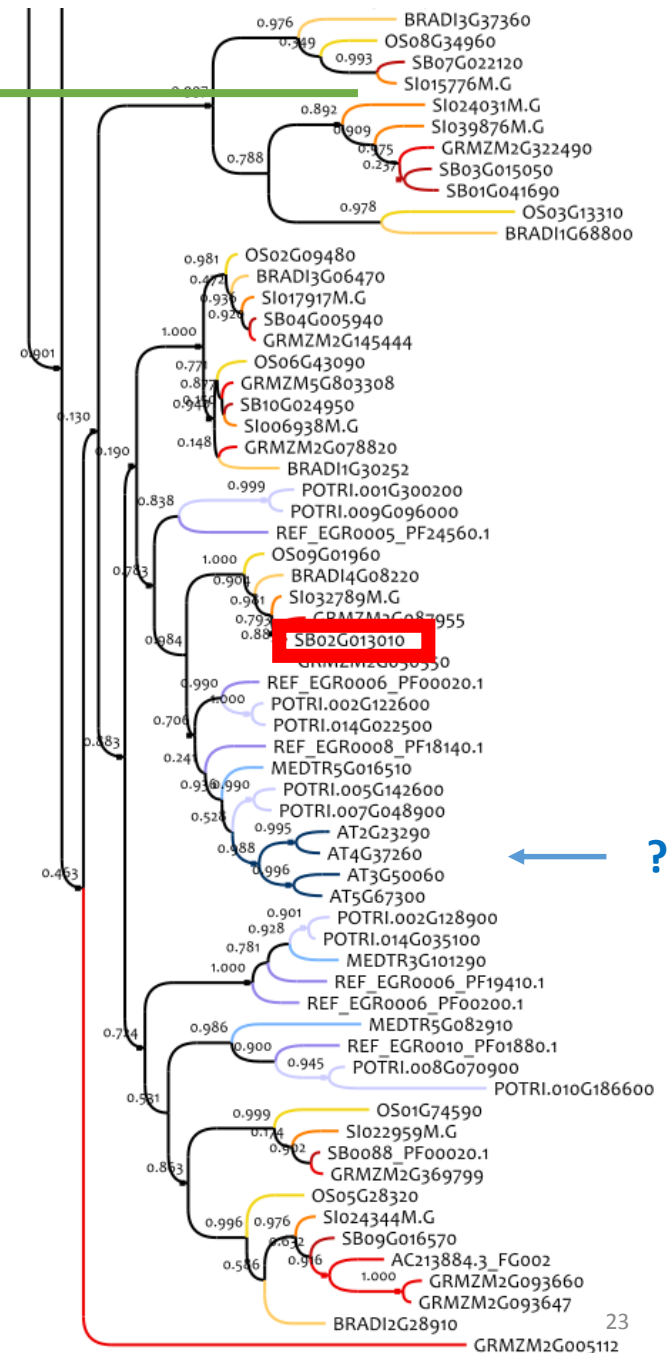


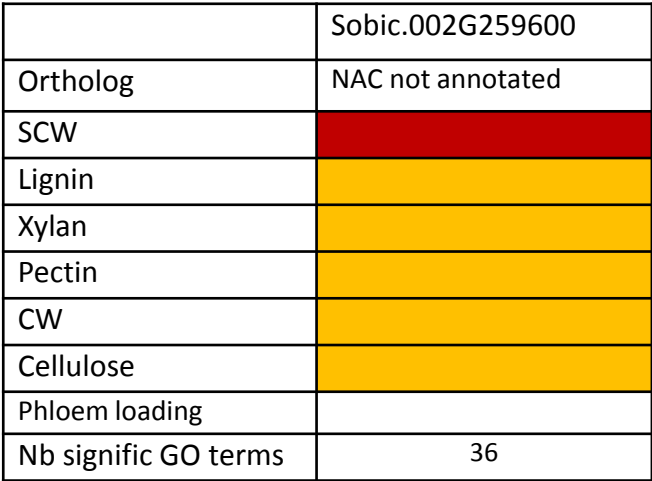


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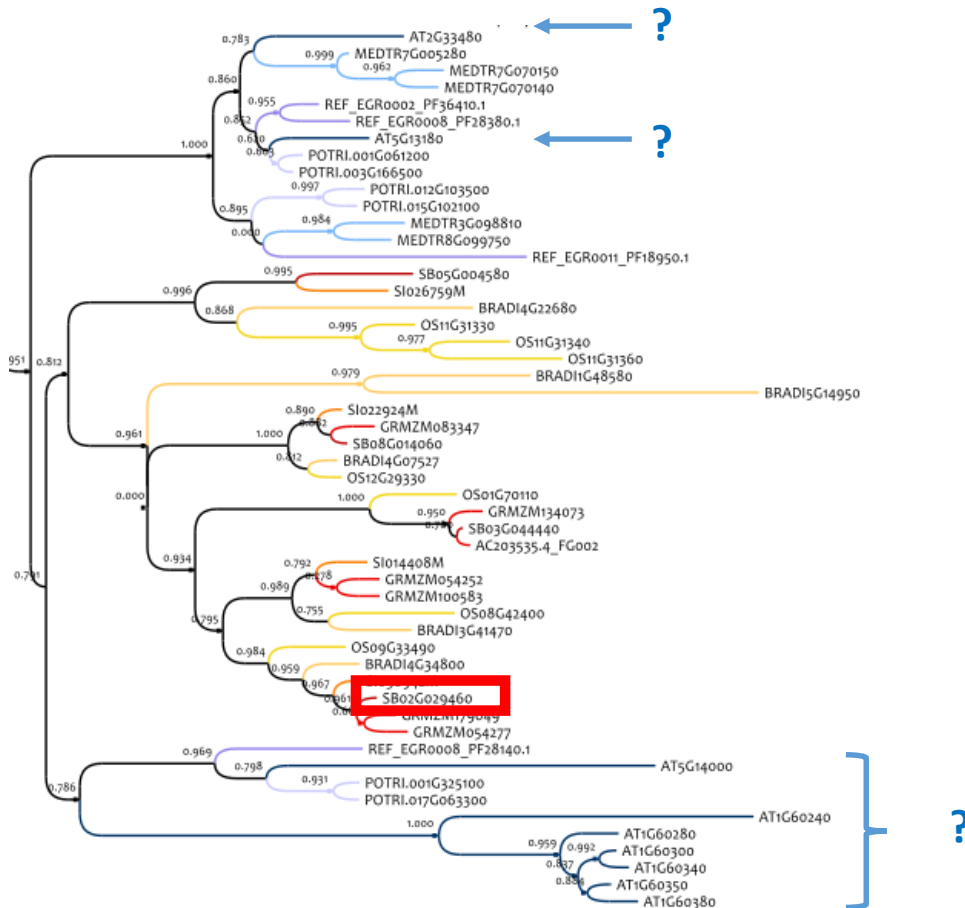
	Sobic.002G141300
Ortholog	MYB not annotated
SCW	
Lignin	
Xylan	
Pectin	
CW	
Cellulose	
Phloem loading	
Nb signific GO terms	35

Sobic.001G224300 CESA7 - cellulose synthase  
 Sobic.001G422300 laccase 17  
 Sobic.001G445700 O-Glycosyl hydrolases family 17  
 Sobic.001G535400 4-GALACTOSYLTRANSFERASE  
 Sobic.002G205500 CESA9 - cellulose synthase  
 Sobic.002G342500 alpha 14-glycosyltransferase  
 Sobic.003G296400 CESA4 - cellulose synthase  
 Sobic.003G352700 laccase 17  
 Sobic.003G353200 laccase 2  
 Sobic.004G042700 endoglucanase  
 Sobic.004G047600 Polysaccharide biosynthesis  
 Sobic.004G244600 endoglucanase  
 Sobic.005G032000 anthocyanin 5-O-glucosyltransferase  
 Sobic.005G032000 UDP-Glycosyltransferase super  
 Sobic.009G162300 laccase 17  
 Sobic.009G220100 Exostosin  
 Sobic.010G112200 Xylanase inhibitor N-terminal  
 Sobic.010G120600 UDP-glucosyl transferase domain  
 Sobic.010G214900 4-coumarate:CoA ligase 2  
 Sobic.010G238800 glycosyltransferase family 43





# Unknown NAC identified as a good candidate



	Sobic.002G259600
Ortholog	NAC not annotated
SCW	
Lignin	
Xylan	
Pectin	
CW	
Cellulose	
Phloem loading	
Nb signific GO terms	36

Sobic.001G224300 CESA7 - cellulose synthase  
Sobic.001G422300 laccase 17  
Sobic.002G205500 CESA9 - cellulose synthase  
Sobic.002G342500 alpha 1,4-glycosyltransferase  
Sobic.003G296400 CESA4 - cellulose synthase  
Sobic.003G352700 laccase 17  
Sobic.003G353200 laccase 2  
Sobic.004G047600 Polysaccharide biosynthesis  
Sobic.007G039100 myb domain protein 103  
Sobic.009G026101 glycosyltransferase family 43  
Sobic.009G162300 laccase 17  
Sobic.009G220100 Exostosin family protein  
Sobic.009G220200 Exostosin family protein  
Sobic.010G112200 Xylanase inhibitor N-terminal  
Sobic.010G134000 Phosphofructokinase family protein  
Sobic.010G238800 glycosyltransferase family 43

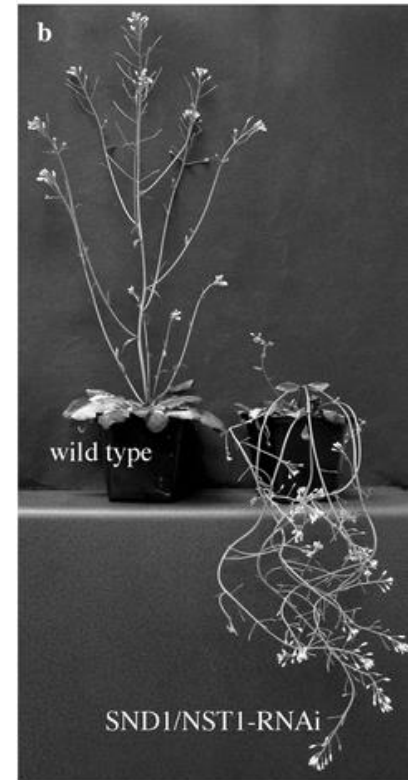
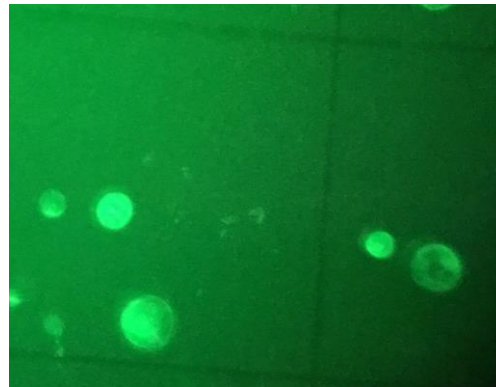
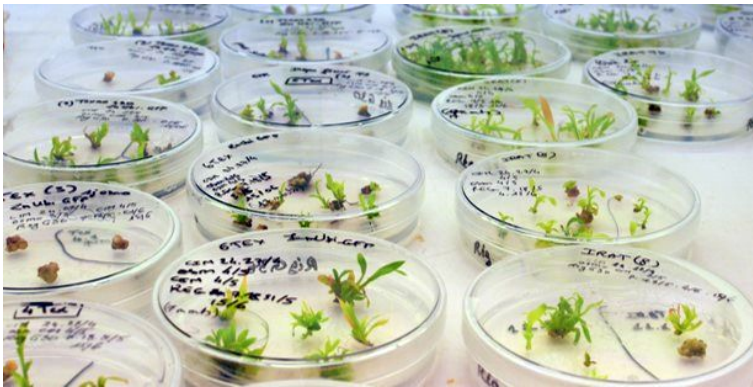
## Main NAC and MYB validated and new TF identified

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- 5 modules containing hub genes important for further analysis
- List in the *to be published* paper
- Major NAC and MYB sorghum ortholog validated
- Most undirect orthologs seem also involved in SCW and CW
- Not annotated NAC and MYB identified

## Conclusion

- 2 NAC and 2 MYB are being tested in transient and stable transformation AND transcriptomic



- Not annotated NAC and MYB to be tested
- Overlap between these lists and GWAS SNP
- Selection signature, allele diversity

Zong et al. 2007



# THANK YOU 😊

« *Sorghum team* »

Nancy Terrier

David Pot

Maëlle Rios

Frédérique Richaud

Angélique Berger

Delphine Luquet

*DAR team*

Christophe Perrin

Anne-Cécile Meunier



Marion Dupouy  
Aurélien Cottin



Ian Godwin  
Karen Massel

