# Assessing the Cold Shock Response of AHAP4 and Wild-type Transcription Factor

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### **Outline**

- Background on the cold shock experimental design
- Significant expression levels in various genes were found by doing statistical analysis of microarray data
- YEASTRACT results yielded 12 significant gene profiles
- Profile 45 gene ontology terms indicate a strong effect on tRNA processes
  - Deletions of HAP4 and SWI5 led to changes in production rates, threshold b parameters, and weight parameters of transcription factors
  - Deletions of HAP4 and SWI5 led to changes in expression of MSN2 and SOK2
- Profile 9 gene ontology terms indicate a strong effect on cytoplasm and its components
  - Deletions of GLN3 and SPT23 led to changes in production rates, weight parameters, and threshold b parameters of transcription factors
  - GLN3 and SPT23 are important in regulating the cold shock response
- Tai et al. (2007) and up/down-regulation of transcription factors

## Understanding How Cells Respond to Cold Shock

- Cold Shock is the response to a sudden decrease in temperature and it has not been well studied in the past.
- DNA microarray analysis was performed on data for ΔHAP4 that was generated in the Dahlquist Lab.
  - Red spots represent an increase in expression and green spots represent a decrease in expression.
- The experiment was conducted at 13°C for a total of 60 minutes followed by a recovery at 30°C.
- The experiment was run using ANOVA, STEM, YEASTRACT, GRNsight, and GRNmap

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## According to the ANOVA Results of ΔHAP4, the Amount of Significant Genes Ranges from 75 to 2,479

ANOVA	dHAP4
p < 0.05	2479 genes
	40.05%
p < 0.01	1583 genes
	25.58%
p < 0.001	739 genes
	11.94%
p < 0.0001	280 genes
	4.52%
B & H p < 0.05	1735 genes
	28.03%
Bonferroni p < 0.05	75 genes
	1.21%

## There are More Significant Genes at t30 than Any Other Time Point

	Cold Shock			Recovery	
t test	t <sub>15</sub>	t <sub>30</sub>	t <sub>60</sub>	t <sub>90</sub>	t <sub>120</sub>
Average Log Fold Change > 0.25 and p < 0.05	1182 genes	1242 genes	1207 genes	918 genes	894 genes
	19.10%	20.07%	19.50%	14.83%	14.44%
Average Log Fold Change < -0.25 and p < 0.05	1048 genes	1067 genes	1057 genes	852 genes	1011 genes
	16.93%	17.24%	17.08%	13.77%	16.34%
Total	2479 genes				
p < 0.05	40.05%	40.05%	40.05%	40.05%	40.05%
Total B & H	1735 genes				
p < 0.05	28.03%	28.03%	28.03%	28.03%	28.03%
Total Bonferroni p < 0.05	75 genes 1.21%				

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Profile #9 and #45 Were Chosen for the Analysis of Significant Transcription Factors

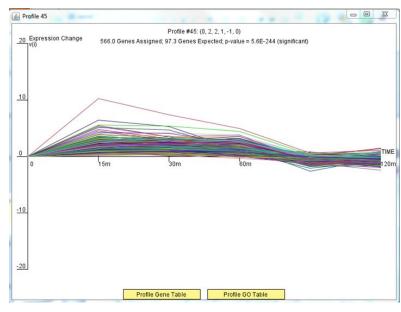


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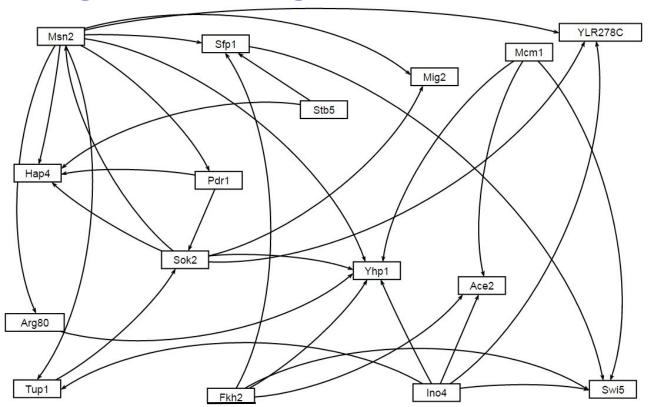
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## Gene Ontology Terms of Profile 45 Demonstrate Strong Effect on tRNA Processes

CO number	Catagory Nama	#Conos Assigned	Corrected a value
GO number	Category Name	#Genes Assigned	Corrected p-value
GO:0006400	tRNA modification	22	0.002
GO:0030488	tRNA methylation	11	0.002
GO:0008033	tRNA processing	29	0.004
GO:0008175	tRNA methyltransferase activity	10	0.004
GO:0006399	tRNA metabolic process	41	0.001



## Unweighted Transcription Factor Network of 16 Significant Edges and 32 Nodes



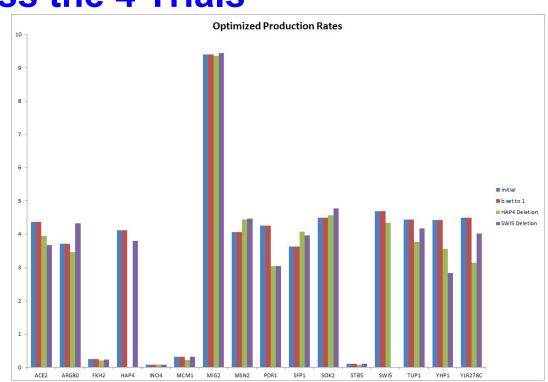
## 20 Significant Transcription Factors Found in YEASTRACT

- In total, 20 transcription factors were significant.
- Initially deleted all transcription factors that had no regulators or only 1 input.

Transcription Factor	p-value from YEASTRACT	Transcription Factor	p-value from YEASTRACT
MSN2	1.78E-08	ARG80	8.58E-06
НАР4	0.998	TUP1	9.1E-13
SFP1	0	PDR1	1.69E-05
SOK2	1.1E-05	FKH2	7.36E10
STB5	1.2E-12	YHP1	0
MIG2	1.85E-07	INO4	4.86E-05
ACE2	5E-15	MCM1	1.88E-05
YLR278C	2.18E-06	SWI5	4.03E-09

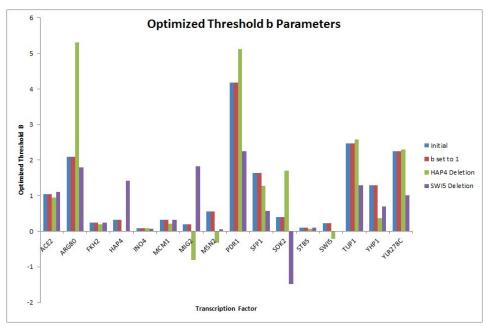
## Minor Changes in Optimized Production Rate Across the 4 Trials

- MIG2 had the highest production rate in all 4 trials.
- INO4 had the lowest production rate in all 4 trials.
- The initial trial and trial where b was set to 1 have the same value for all genes.
- Deletions of HAP4 and SWI5 caused the production rates to change in all genes.



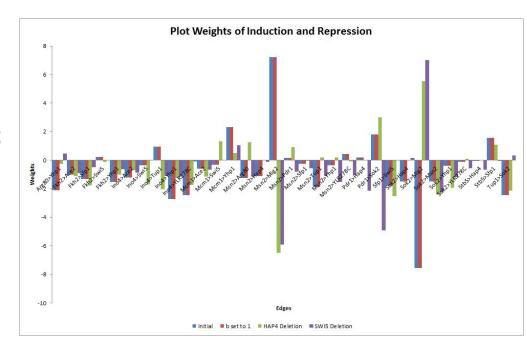
### Deletions of HAP4 and SWI5 Affected the Optimized Threshold b Parameters

- The initial trial and trial where b was set to 1 have the same value for all genes.
- Large difference between initial trial and HAP4 and SWI5 deletion for 11 different transcription factors.
- INO4 had the lowest optimized threshold b parameters for all trials.

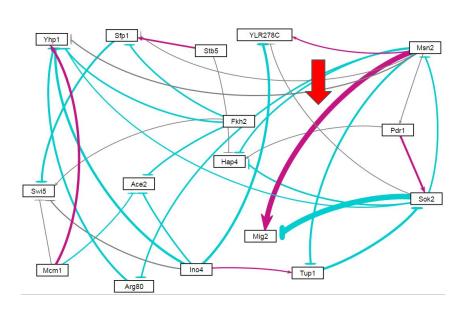


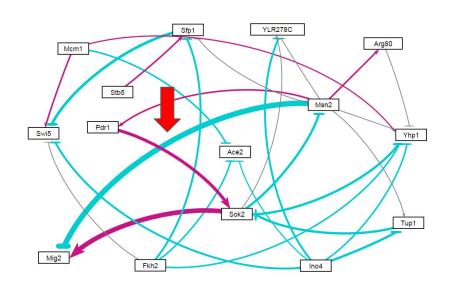
## Comparison of Plot Weights Shows Contrasting Values for Multiple Gene Pathways

- The initial trial and trial where b was set to 1 have the same value for all genes.
- Two biggest pathways that stand out on the graph are MSN2→MIG2 and SOK2→MIG2.
- MSN2→MIG2 changed from induction to repression when HAP4 and SWI5 were deleted.
- SOK2→ MIG2 changed from repression to induction when HAP4 and SWI5 were deleted.

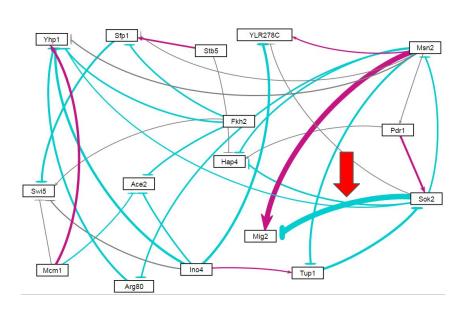


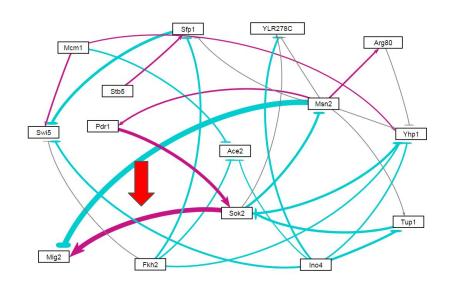
## MSN2→MIG2 Plot Weight Changed from 7.202137 to -6.47552 when HAP4 was Deleted



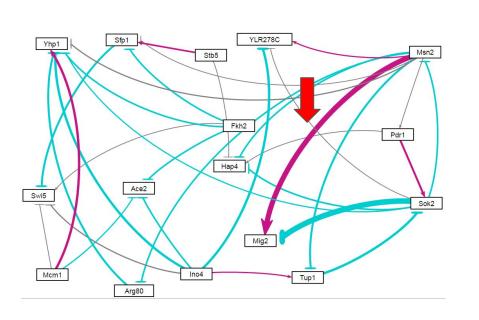


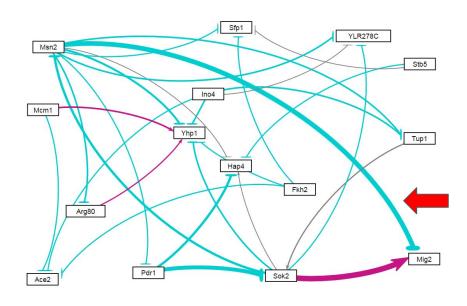
## SOK2→MIG2 Plot Weight Changed from -7.55775 to 5.522197 when HAP4 was Deleted



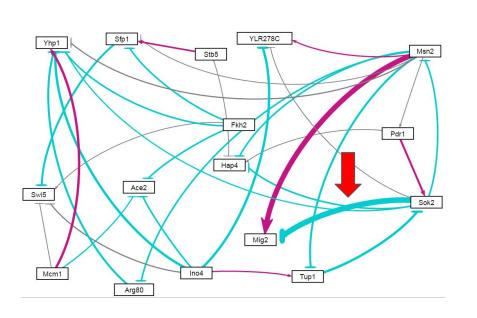


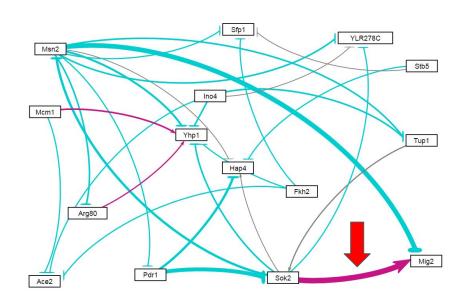
## MSN2→MIG2 Plot Weight Changed from 7.202137 to -5.89503 when SWI5 was Deleted





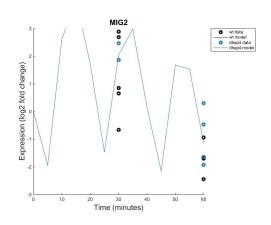
## SOK2→MIG2 Plot Weight Changed from -7.55775 to 7.002023 when SWI5 was Deleted



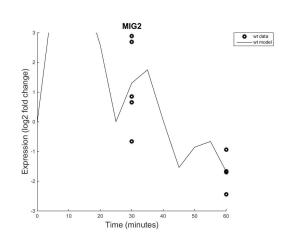


## Line of Best Fit Changes from Repression to Induction Multiple Times for MIG2 in All Trials

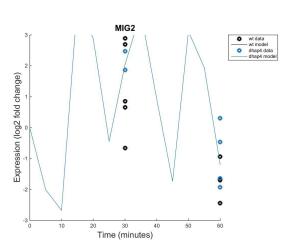
#### Initial



### **HAP4** Deletion

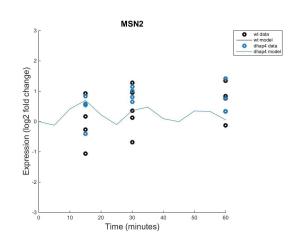


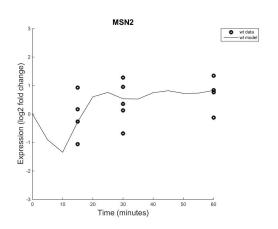
#### **SWI5 Deletion**

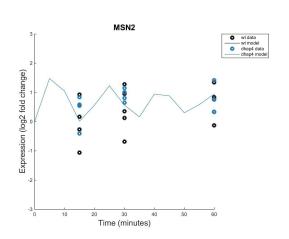


## The Expression of MSN2 is Very Similar for the Initial and SWI5 Deletion

Initial HAP4 Deletion SWI5 Deletion

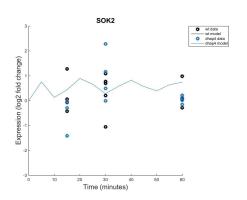


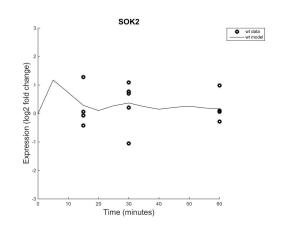


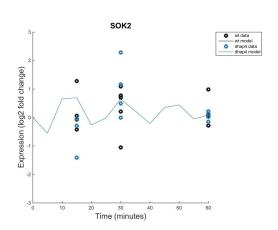


## The Expression of SOK2 is Relatively Similar for the Three Trials

Initial HAP4 Deletion SWI5 Deletion







## From the Visualized GRN, There are Two Major Regulators in the Network for Profile 45

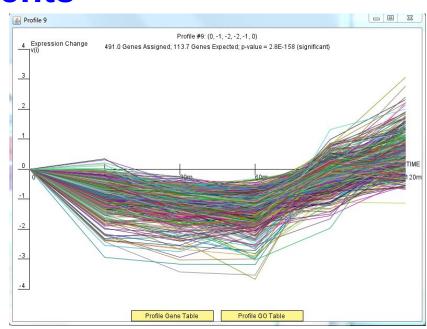
- The two major regulators are MSN2 and SOK2 and both of these regulators directly regulate MIG2.
- The regulation of MSN2 and SOK2 may be due to the presence of HAP4 and SWI5 in the model.
- Future Studies:
  - Determine why deleting HAP4 and SWI5 causes the regulation of MSN2 and SOK2 to MIG2 to switch to the opposite of its original expression value.
  - Look at the effect of eliminating the transcription factors that have gray arrows from the constructed GRN.

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## Gene Ontology Terms from Profile 9 Suggest Strong Effect on the Cytoplasm and its Components

Category ID	Category Name	#Genes Assigned	Corrected p-value
GO:0005737	cytoplasm	393	0.001
GO:0044444	cytoplasmic part	310	0.001
GO:0022626	cytosolic ribosome	36	0.001
GO:0002181	cytoplasmic translation	35	0.002
GO:0044445	cytosolic part	42	0.002
GO:0005829	cytosol	104	0.006



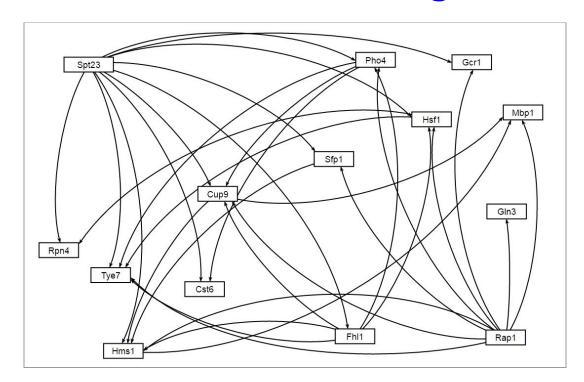
## 33 Significant Transcription Factors Found in YEASTRACT

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- Initially deleted all transcription factors that had no regulators or only one input

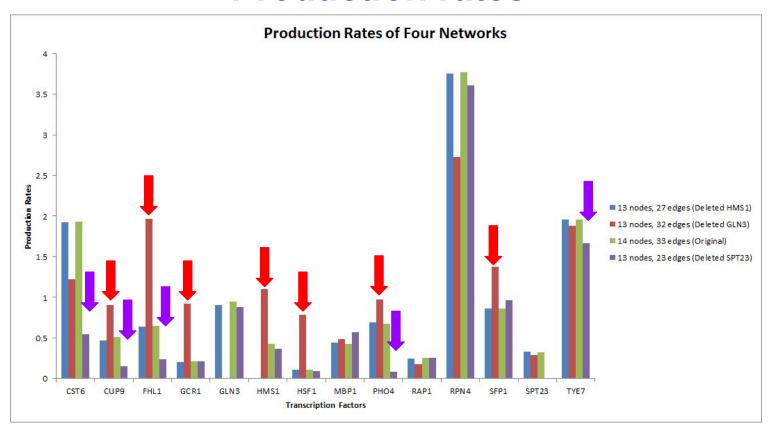
Transcription Factor	p-value from YEASTRACT	Transcription Factor	p-value from YEASTRACT
CST6	2.56441E-05	MBP1	1.20671E-06
CUP9	1.27643E-06	PHO4	1.12068E-05
FHL1	1.23921E-05	RAP1	2.81392E-05
GCR1	1.63413E-05	RPN4	1.96342E-05
GLN3	0.009729	SFP1	4.21512E-05
HMS1	1.84972E-06	SPT23	1.6982E-05
HSF1	2.45662E-05	TYE7	1.02978E-05

### **Initial Network Has 14 Nodes and 33 Edges**

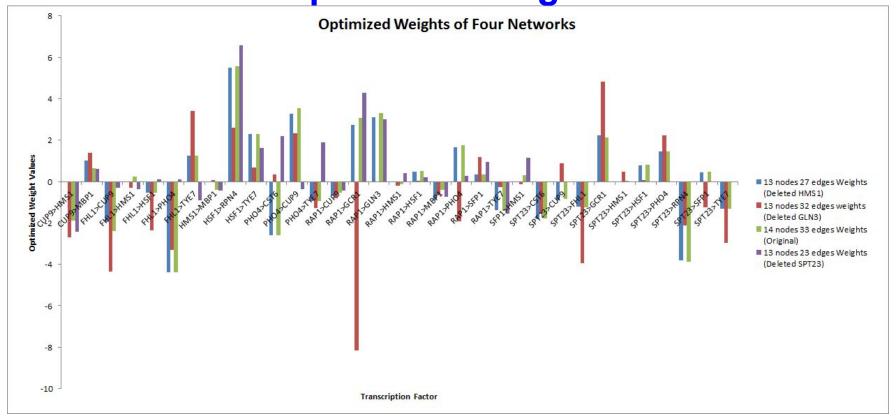
- This network was used as the starting point for future experimental deletions
- 3 additional deletions: GLN3, SPT23, and HMS1



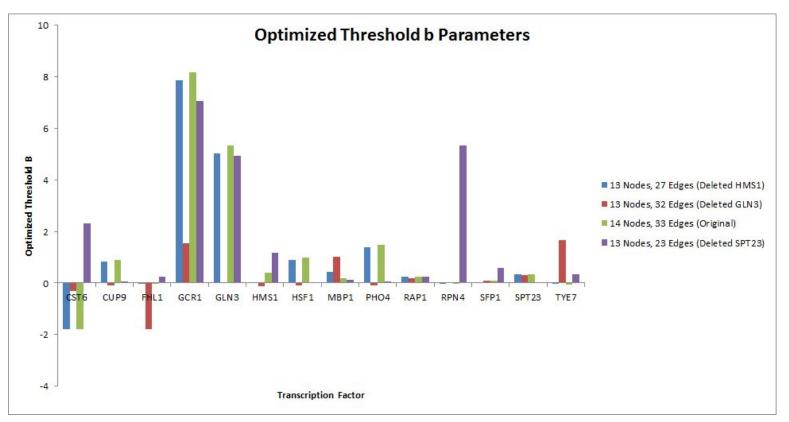
### Deletion of GLN3 and SPT23 has Effects on Production rates



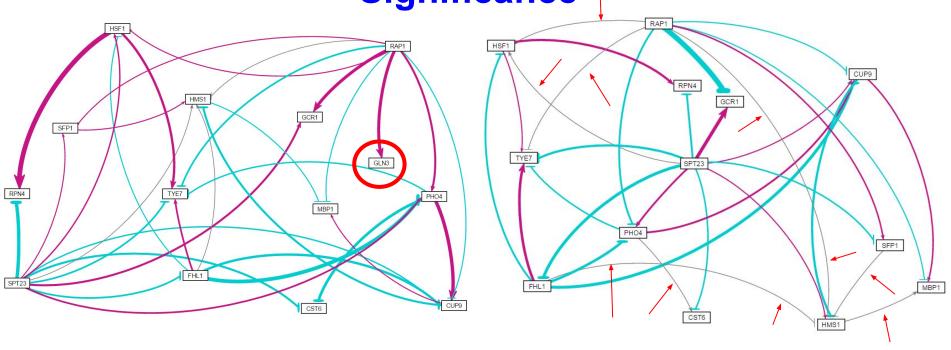
## Deletion of GLN3 and SPT23 has Effects on Optimized Weights



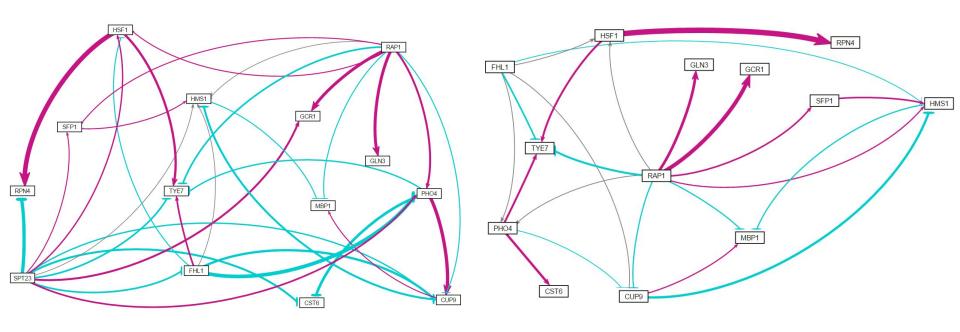
### Deletions of GLN3 and SPT23 Affected the Optimized Threshold b Parameters



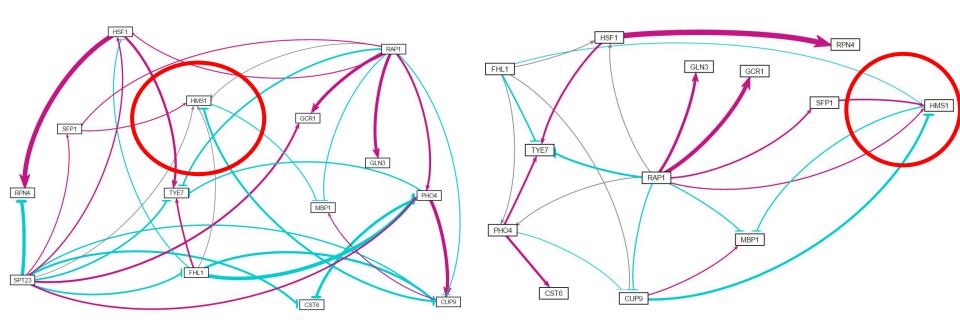
Deletion of GLN3 Changed the Network Significance



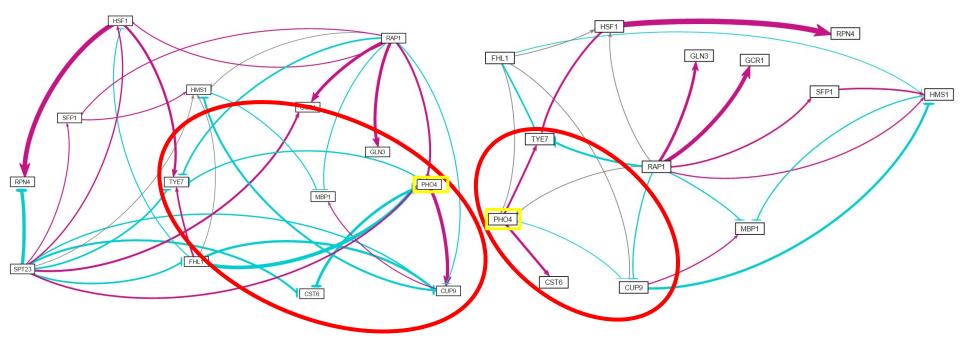
## Deletion of SPT23 Led To Various Changes in the Network



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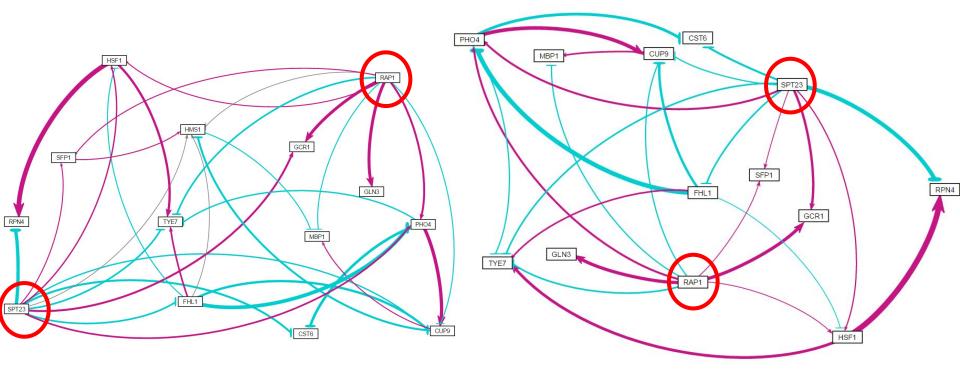
## Deletion of SPT23 Led To Various Changes in the Network



14 nodes, 33 edges

13 nodes 23 edges

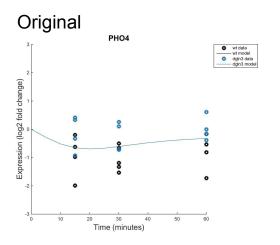
### **Deleting HMS1 Did Not Affect Network**



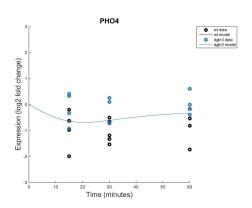
14 nodes 33 edges

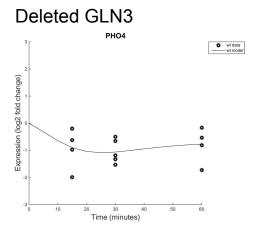
13 nodes 27 edges

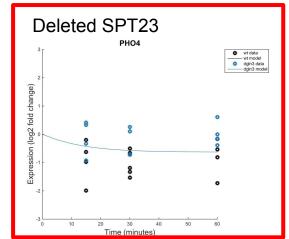
### **PHO4 Expression and the SPT23 Deletion**



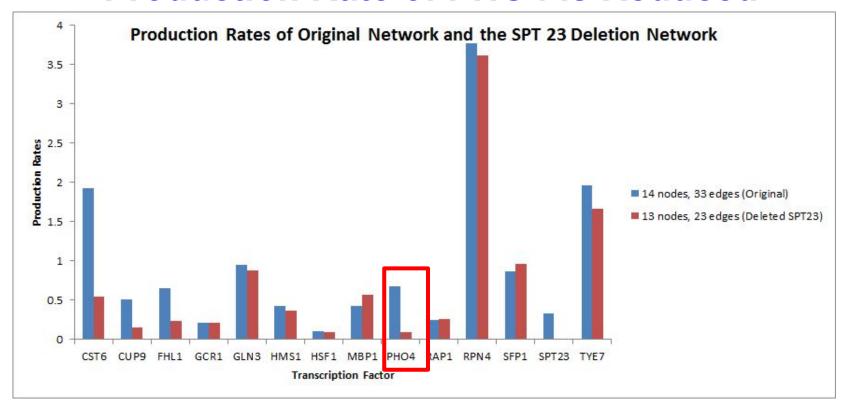
### Deleted HMS1







### **Production Rate of PHO4 is Reduced**

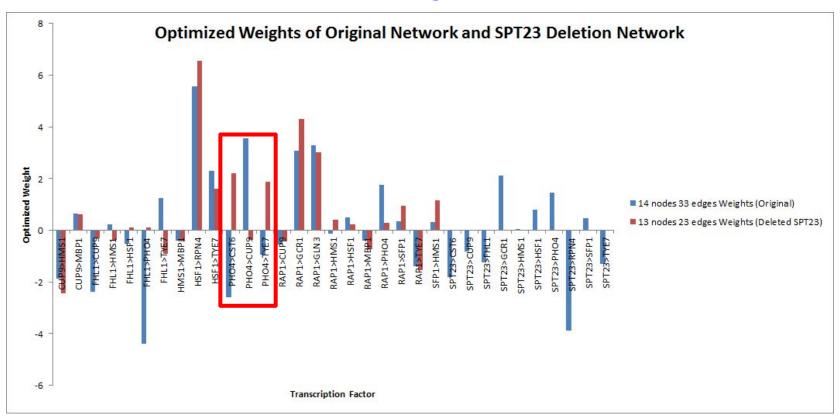


Original Rate: 0.676131091

Rate with SPT23 Deletion: 0.08752916

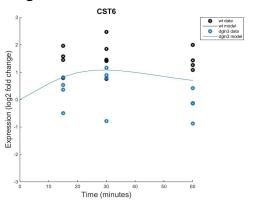


## Weights Display the Change of Regulation of PHO4

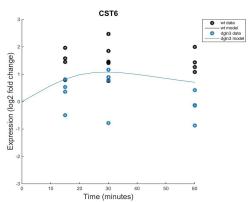


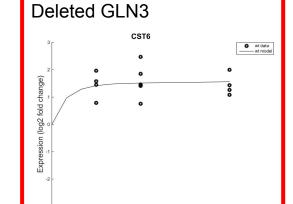
### **CST6 Affected By GLN3 Deletion**





### **Deleted HMS1**

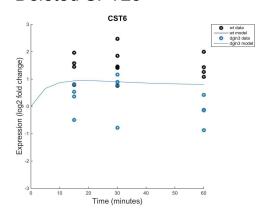




Time (minutes)

50

### Deleted SPT23



## SPT23 and GLN3 Appear to be Important in Regulating Cold Shock Response

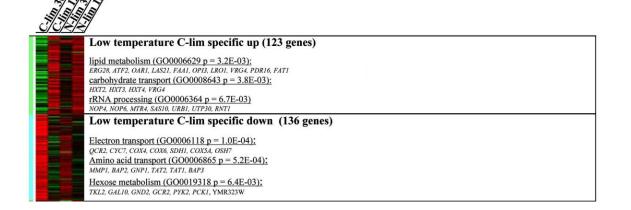
- While GLN3 was not significant according to YEASTRACT, the production rates/optimized weights bar charts and the GRNsight visualizations indicate that removing GLN3 changes the network.
- SPT23 consistently regulated many of the transcription factors and was a central part of the GRNsight visualization
  - The deletion of SPT23 changed various things about the network
- Future studies would include why GLN3 appears to have an effect despite the insignificant p-value from YEASTRACT and continuing to manipulate the model to see if other transcription factors play an important role in cold shock response

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### **Connection to Tai et al. (2007)**

- Both Tai et al. (2007) and this project looked at how transcription factors related to specific gene ontology terms react to cold shock.
  - No overlap in transcription factors or GO terms
- Heat maps are another way to visualize the up-regulation and down-regulation that is seen in the GRNsight networks.
- Tai et al. (2007) did not include deletions of transcription factors.



### **Acknowledgments**

Dr. Kam Dahlquist

Dr. Ben Fitzpatrick

LMU Department of Biology

LMU Department of Mathematics



### References

- Dahlquist, Kam D. (2017) BIOL398-05/S17:Week 14/15. Retrieved from
  - http://www.openwetware.org/wiki/BIOL398-05/S17:Week\_14/5 on 3 May 2017.
- Tai, S. L., Daran-Lapujade, P., Walsh, M. C., Pronk, J. T., & Daran, J. M. (2007). Acclimation of Saccharomyces cerevisiae to low temperature: a chemostat-based transcriptome analysis.
   Molecular biology of the cell, 18(12), 5100-5112.