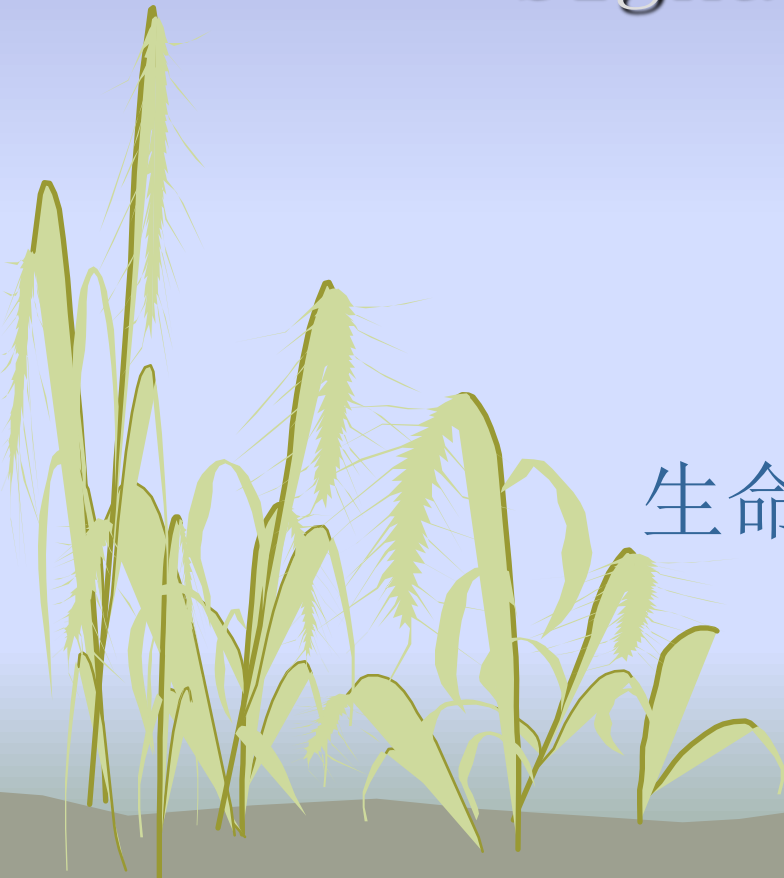


*Pathway connectivity and  
signaling coordination in  
the yeast stress-activated  
signaling network*

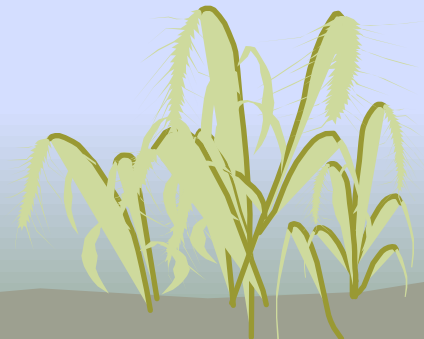
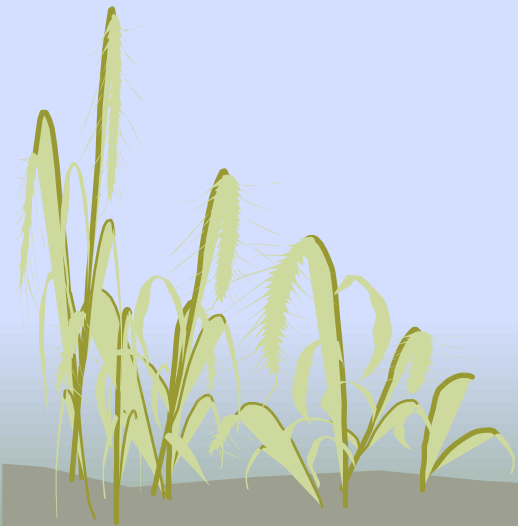
李凯峰

生命科学技术学院



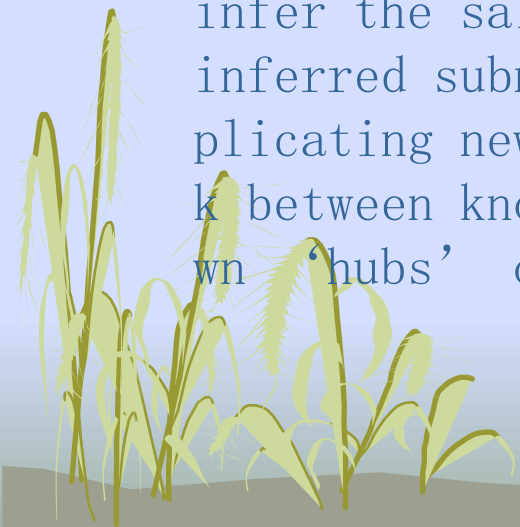
# *content*

- Background
- Material and Methods
- Results
- Discussion



# *Backgrounds*

Stressed cells coordinate a multi-faceted response spanning many levels of physiology. Yet knowledge of the complete stress activated regulatory network as well as design principles for signal integration remains incomplete. We developed an experimental and computational approach to integrate available protein interaction data with gene fitness contributions, mutant transcriptome profiles, and phospho-proteome changes in cells responding to salt stress, to infer the salt-responsive signaling network in yeast. The inferred subnetwork presented many novel predictions by implicating new regulators, uncovering unrecognized crosstalk between known pathways, and pointing to previously unknown ‘hubs’ of signal integration.



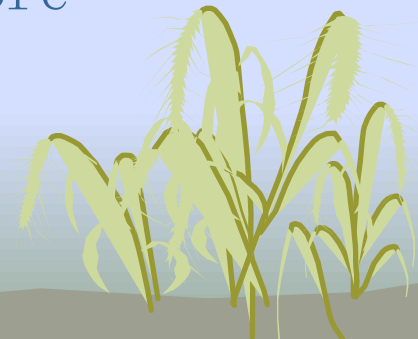
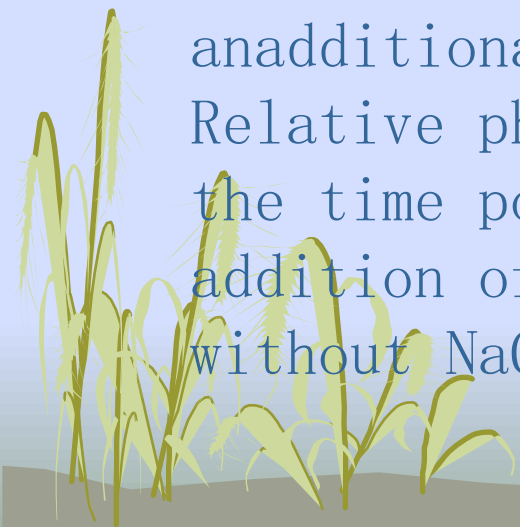
# Material and Methods

Mutant <sup>a</sup>	Defective <sup>b</sup>	Amplified <sup>b</sup>
Source regulators		
<i>hog1Δ</i> (3)	1378	565
<i>pde2Δ</i> (3)	517	59
<i>mck1Δ</i> (3)	794	101
<i>msn2Δ</i> (3)	184	26
<i>rim101Δ</i> (3)	75	227
<i>gpb2Δ</i> (2)	202	37
<i>rim15Δ</i> (2)	438	106
<i>npr2Δ</i> (2)	75	69
<i>npr3Δ</i> (2)	184	89
<i>swc3Δ</i> (2)	108	257
<i>swc5Δ</i> (2)	84	55
<i>whi2Δ</i> (2)	118	201
<i>pph3Δ</i> (2)	235	21
<i>sub1Δ</i> (2)	431	97
<i>tpk1Δ</i> (2)	35	96
<i>ygr122wΔ</i> (2)	106	502

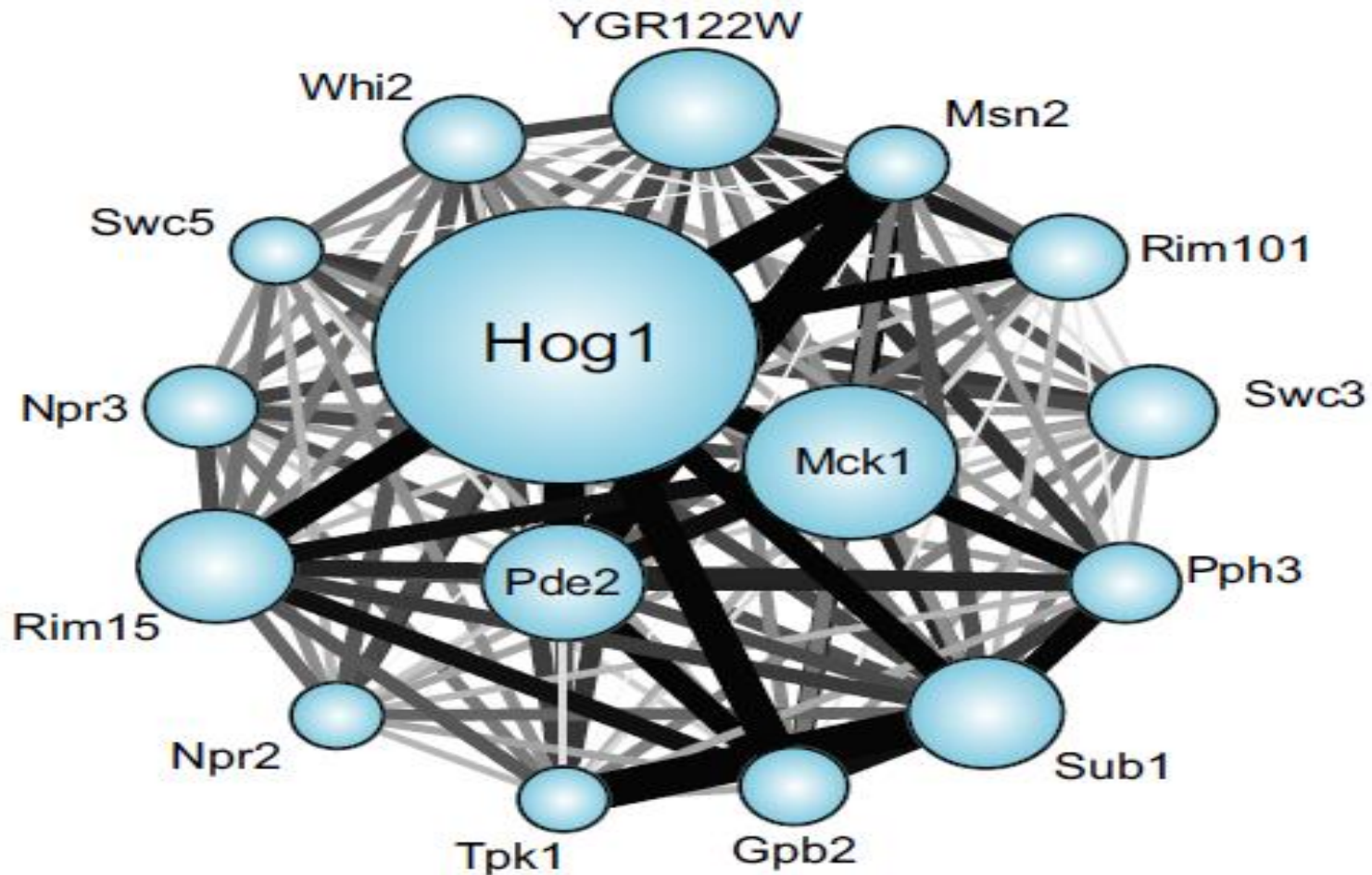
1. aMutant and number of replicates in parentheses.

2. bNumber of genes with smaller (defective) or larger (amplified) expression changes compared to the wild-type strain. Note, this table includes noncoding RNAs that were excluded from the inference. The table lists the number of targets identified from the originally interrogated 'source' regulators and validation mutants

Unless otherwise noted, cells were grown to log phase in batch YPD cultures at 30° C for at least seven generations before addition of a final concentration of 0.7 M NaCl, after which cells were grown for 30 min. *cdc14-3* and isogenic wild-type cells were grown at 25° C, shifted to the non-permissive temperature of 35° C for 90 min, and then treated with a final concentration of 0.7 M NaCl at 35° C for an additional 30 min before sample collection. Relative physiological changes were compared to the time point collected immediately before addition of NaCl (i.e., 35° C for 90 min without NaCl).



# *Microarray analysis*



# *Phospho-proteomic analysis*

we next measured changes to the phospho-proteome before and at 5 and 15 min after NaCl treatment, using chemical isobaric tags for phosphopeptide quantification (see Materials and Methods). Nearly 600 of 1,937 identified phospho-sites (mapping to 973 proteins) showed a  $\geq 2$ -fold change in phosphorylation, roughly split between sites with increased and decreased modification. Over 10% of the altered phospho-proteins represented kinases and phosphatases (including regulators of cell cycle progression, actin organization, and signal transduction) as well as transcriptional regulators (such as activators Hot1, Sko1, and Sub1 and repressors Mot2, Dot6, and Dig1). Proteins affected at the later time point were involved in cytokinesis, bud-site selection, and actin reorganization implying downstream physiological effects on these processes



## Gene Fitness Contributions

Yeast gene-deletion library pretreated with NaCl and challenged with severe stress  
(from Berry *et al.* 2011)



List of 225 genes important for acquired stress resistance after NaCl pretreatment

## Downstream Targets

DNA microarray profiling of 16 'source' mutants responding to NaCl  
(Table 1, Figure 1)



Matrix of 3,300 gene targets of at least one of 16 'source' regulators

## Phospho-proteomic changes

Isobaric tagging of phospho peptides before and 5, 15 min after NaCl treatment  
(Figure S3)



List of 553 phospho-sites on 173 proteins that change  $\geq 2X$  after NaCl treatment

## Subnetwork Inference

Connect 16 'source' regulators to downstream targets, via implicated TF/RBPs

Minimize total number of nodes while maximizing inclusion of proteins with fitness contributions and phospho-changes

Background network of 5,130 proteins and 29,936 edges

**Protein-Protein/Kinase-Substrate interactions**

(see text for references)

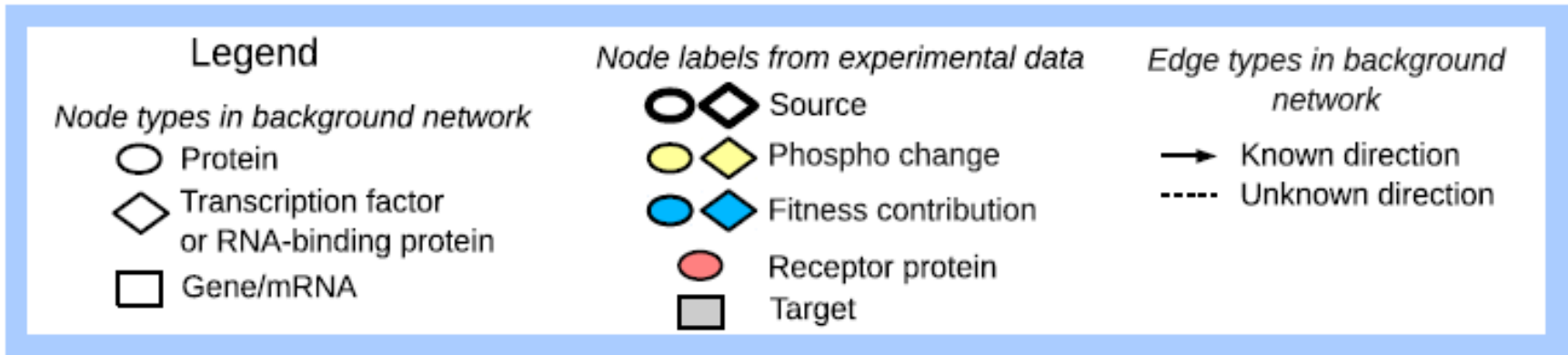
101 TFs / RBPs whose targets overlap specific source-targets

**TF / RBP gene / transcript targets**

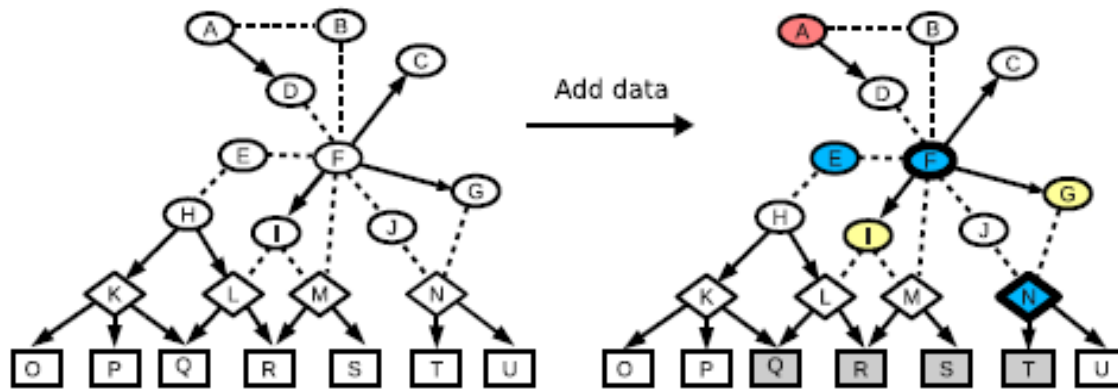
(see text for references)



# Integer linear programming-based (IP) approach



## A Combine background network and experimental data



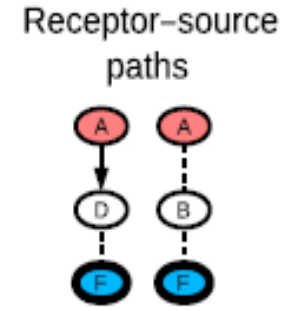
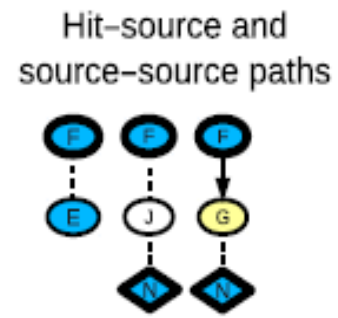
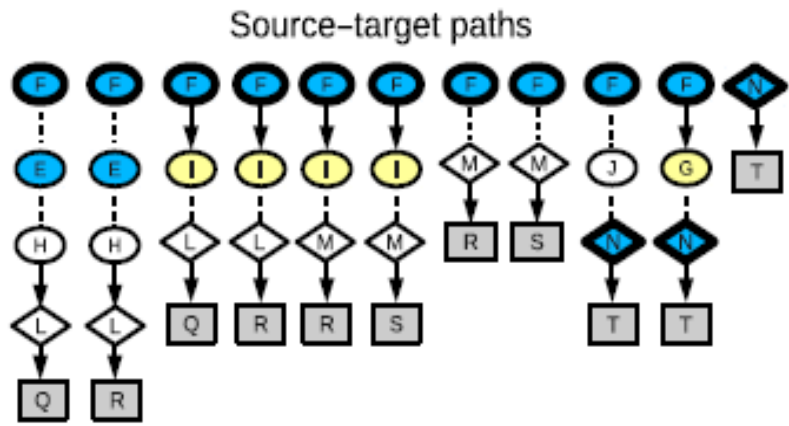
### Source-target pairs with candidate TFs/RBPs

Source to Target(s) via TF/RBP		
(○)	(□)	(◇)
F	Q,R	L
F	R,S	M
F	T	N
N	T	N

### Upstream relationships

Receptor to Source	
(●)	(○)
A	F

## B Enumerate candidate paths



C Solve IP to infer ensemble of subnetworks

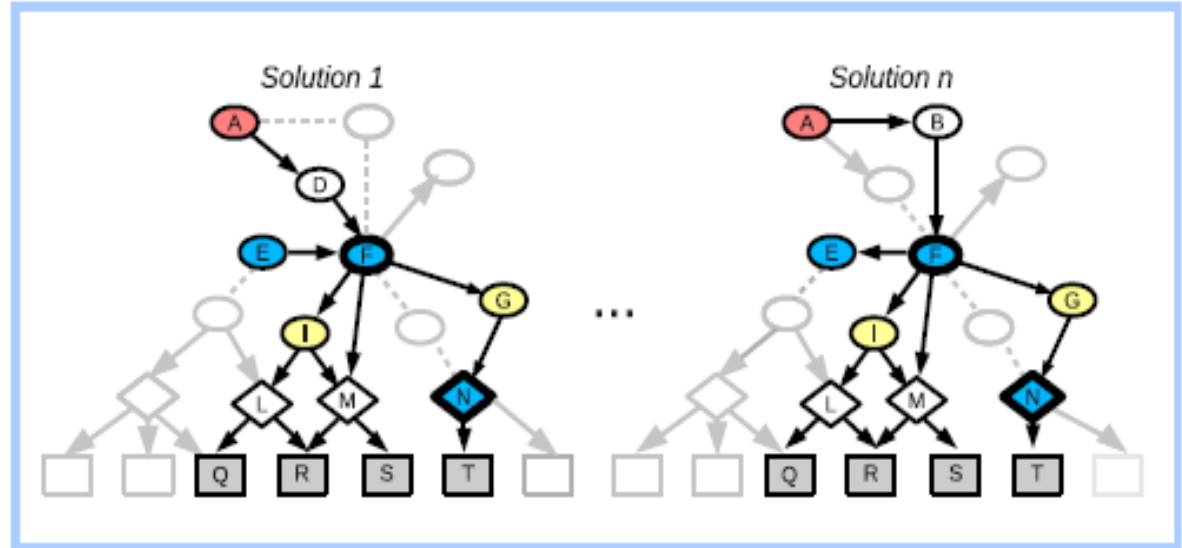
IP constraints:

- Connect source-target pairs, hit-source pairs, and receptor-source pairs
- Assign a direction to each undirected edge

IP objectives:

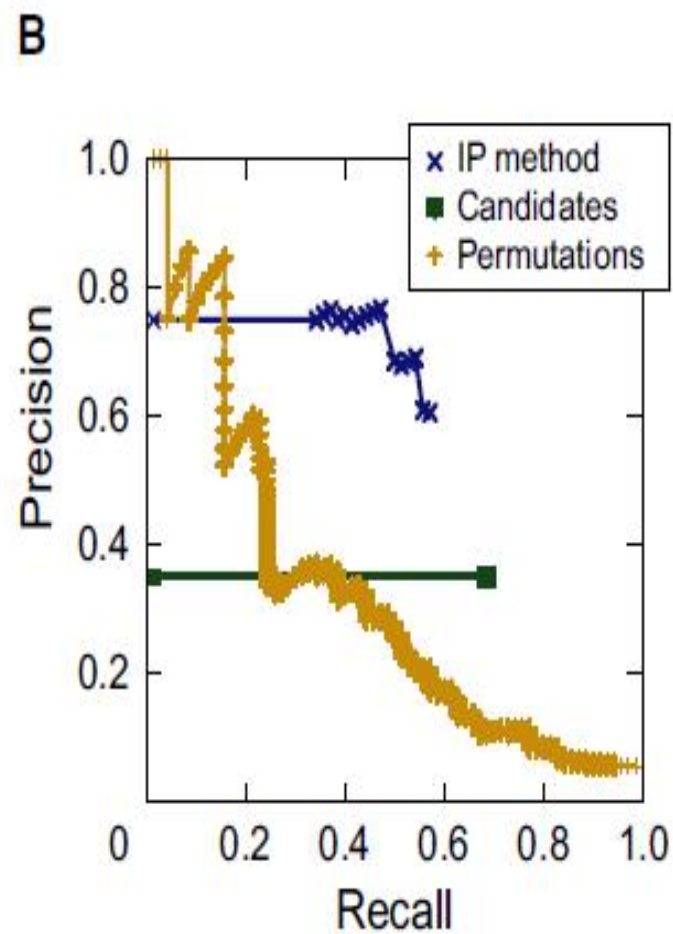
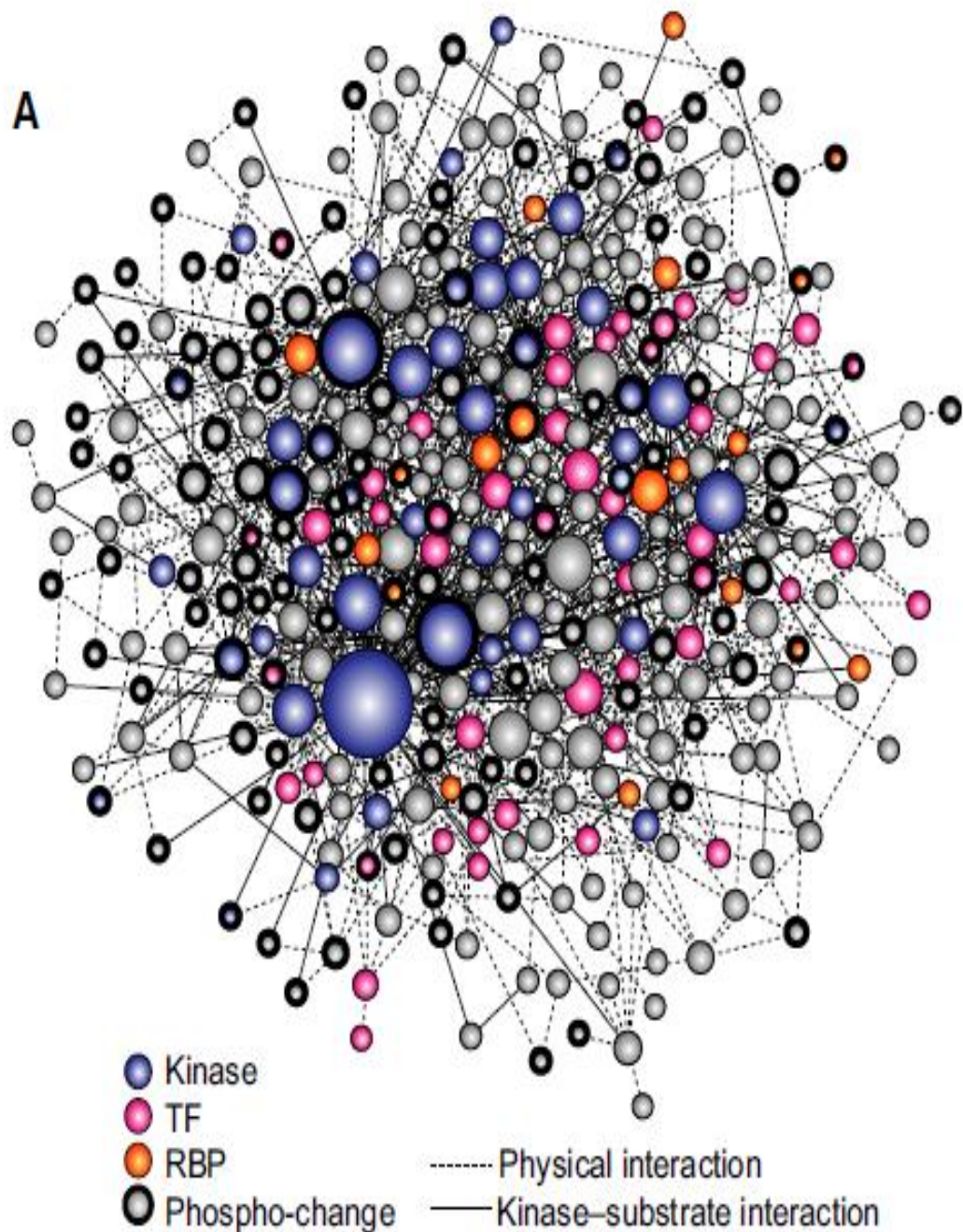
- Favor proteins with
  - Phospho changes (yellow circle)
  - Fitness contributions (blue circle)
- Sparingly include proteins without evidence of relevance

Subnetwork ensemble:



## *Validation analysis to verify*

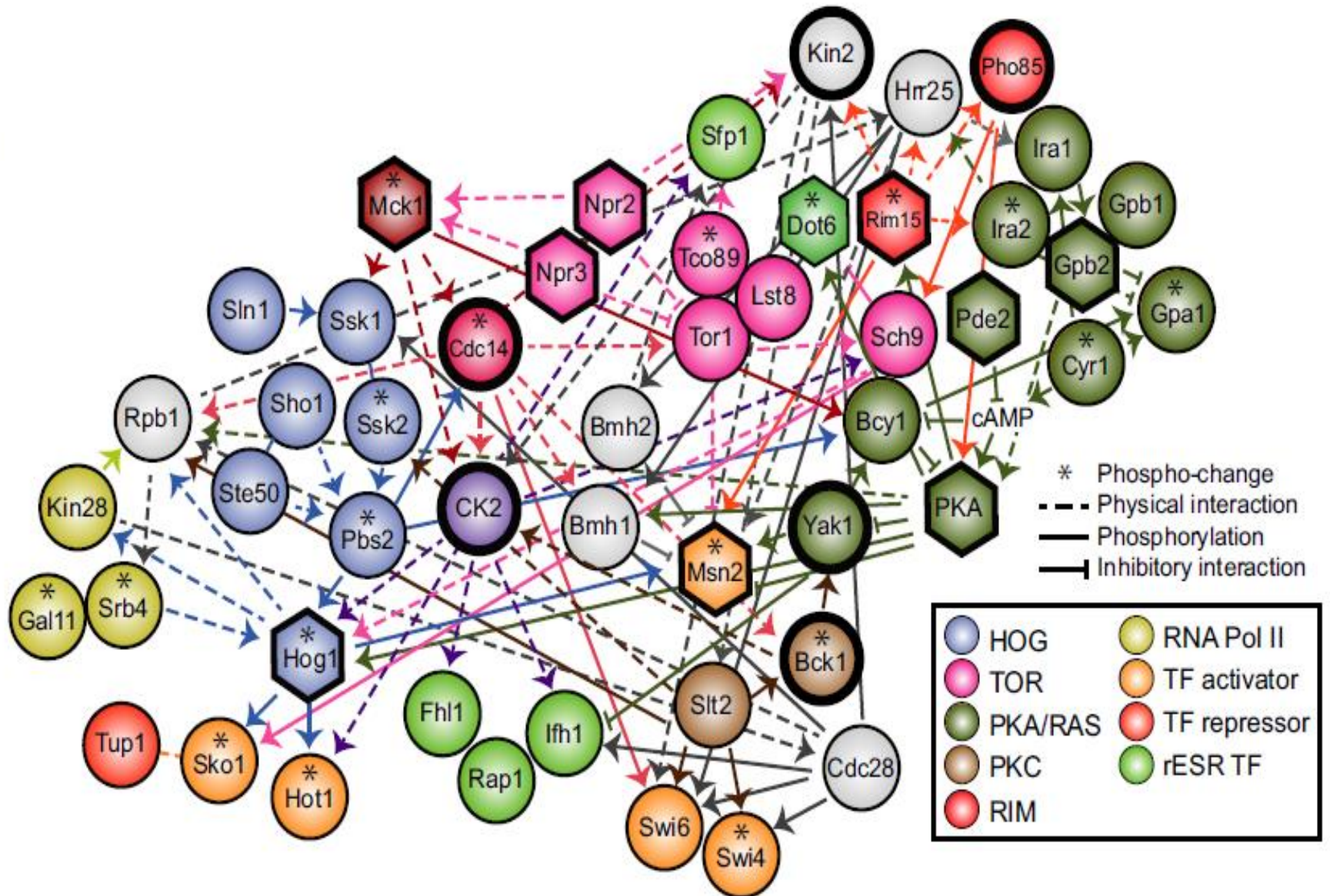
Validation mutants		
<i>cdc14-3</i> (3) <sup>c</sup>	929	346
<i>nnk1Δ</i> (1)	94	278
<i>bck1Δ</i> (1)	107	169
<i>yak1Δ</i> (1)	226	248
<i>kin2Δ</i> (1)	52	266
<i>pho85Δ</i> (1)	614	342
<i>cka2Δ</i> (2)	155	63
<i>cka1Δ</i> (2)	58	133
<i>ckb1Δ ckb12Δ</i> (2)	129	176
<i>arf3Δ</i> (2)	466	331
<i>scd6Δ</i> (2)	0	0

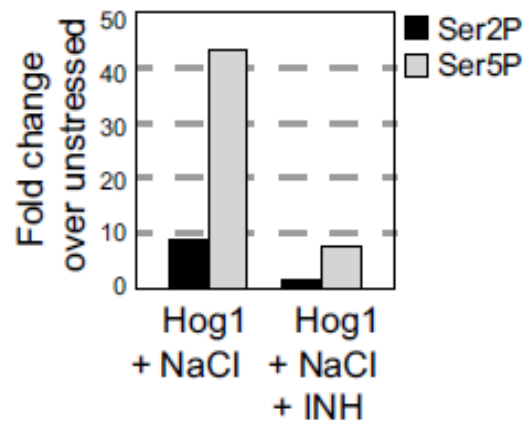
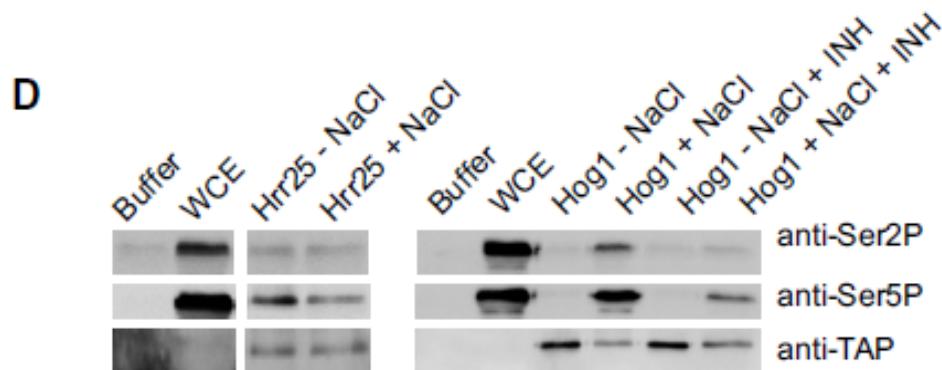
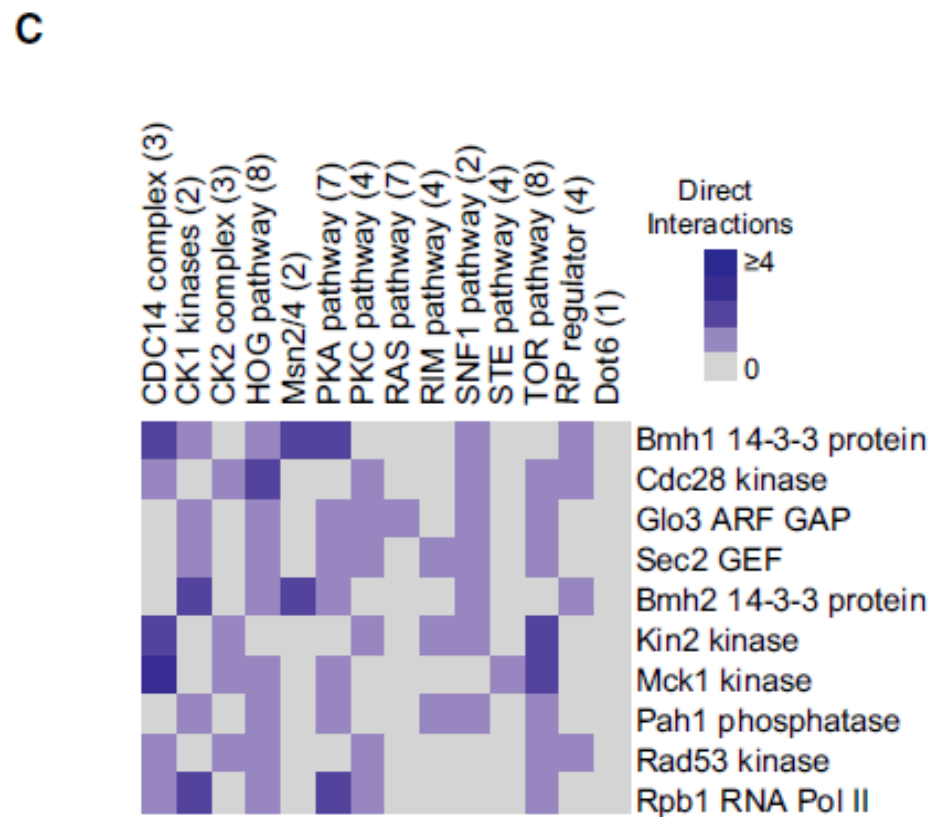
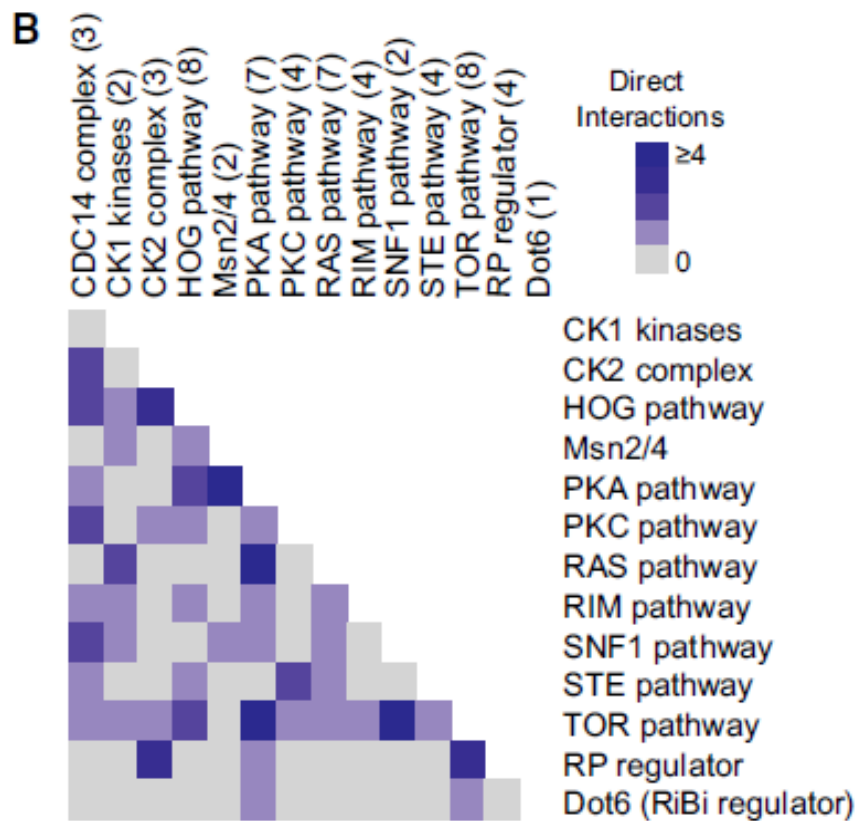




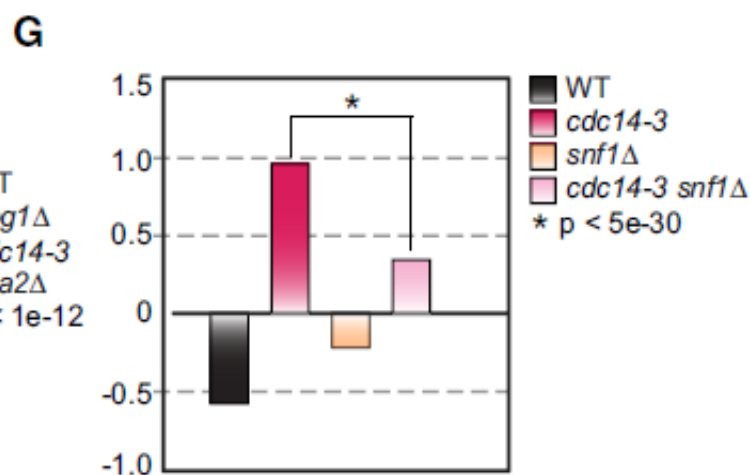
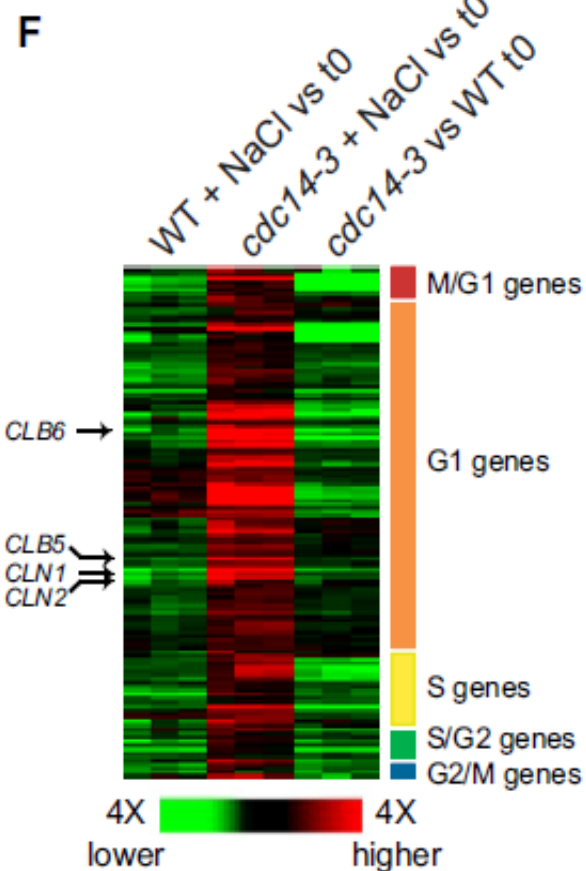
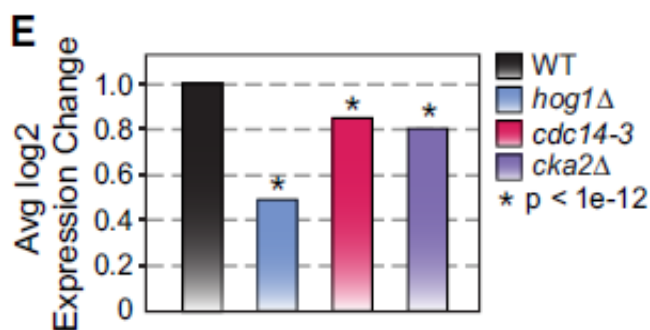
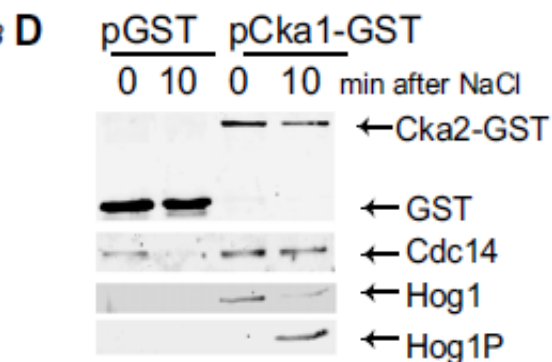
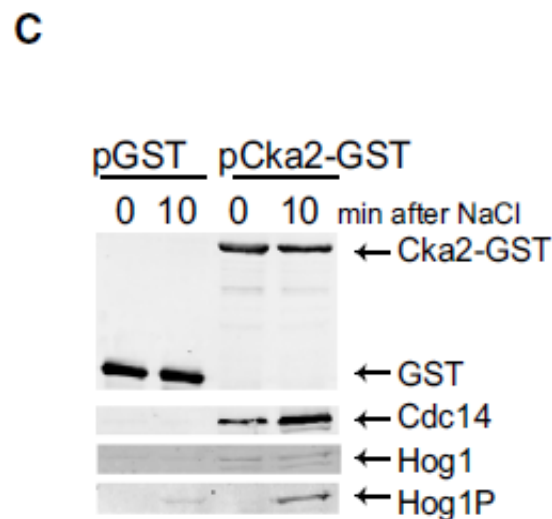
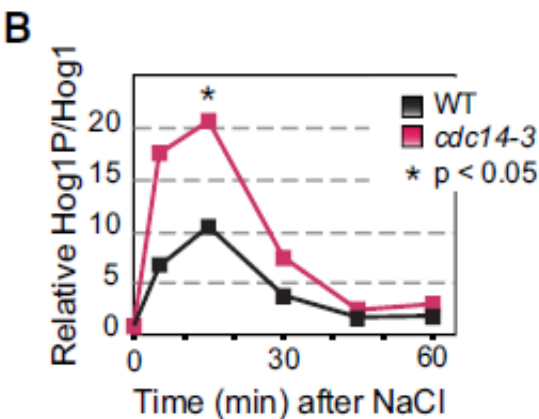
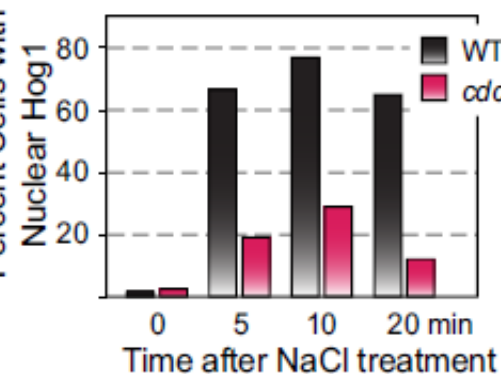
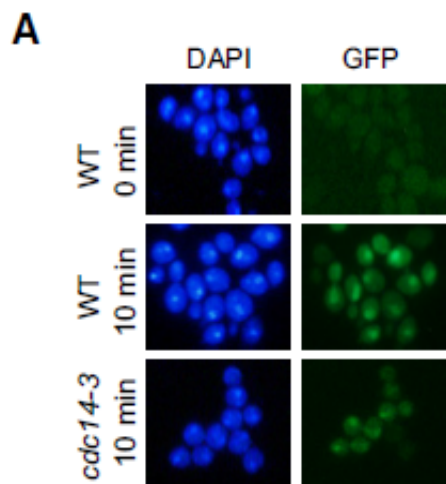
# *New insights into stress signaling*

A

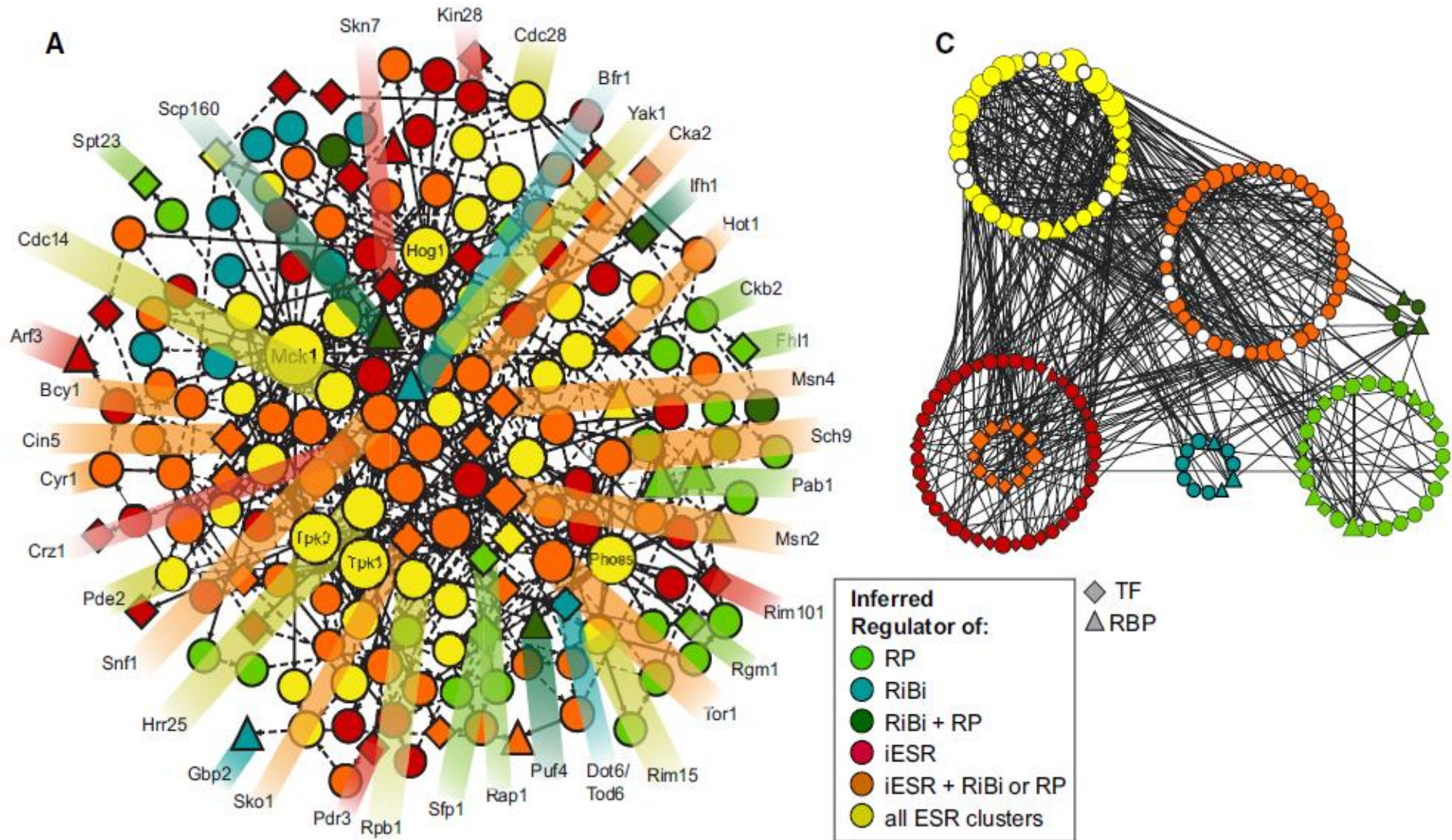


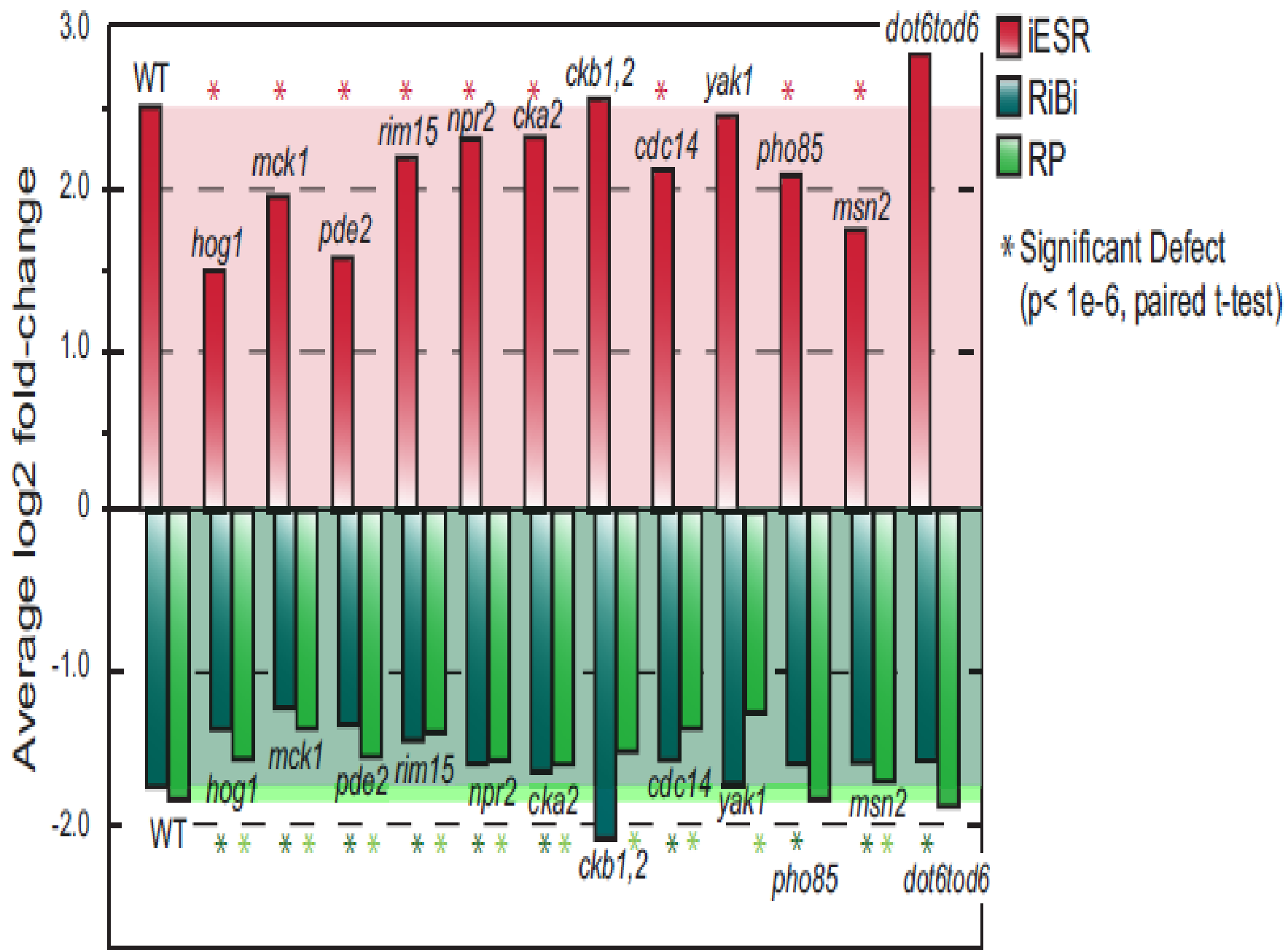


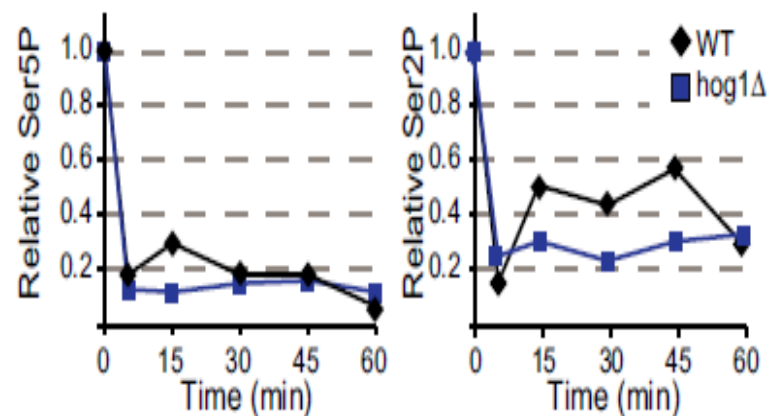
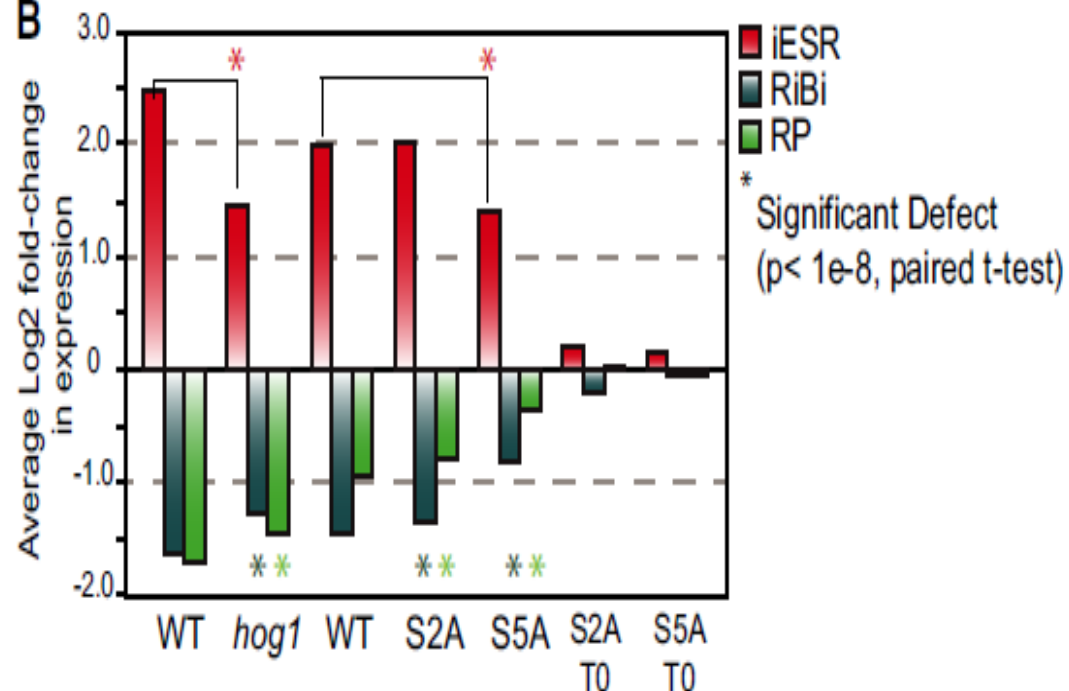
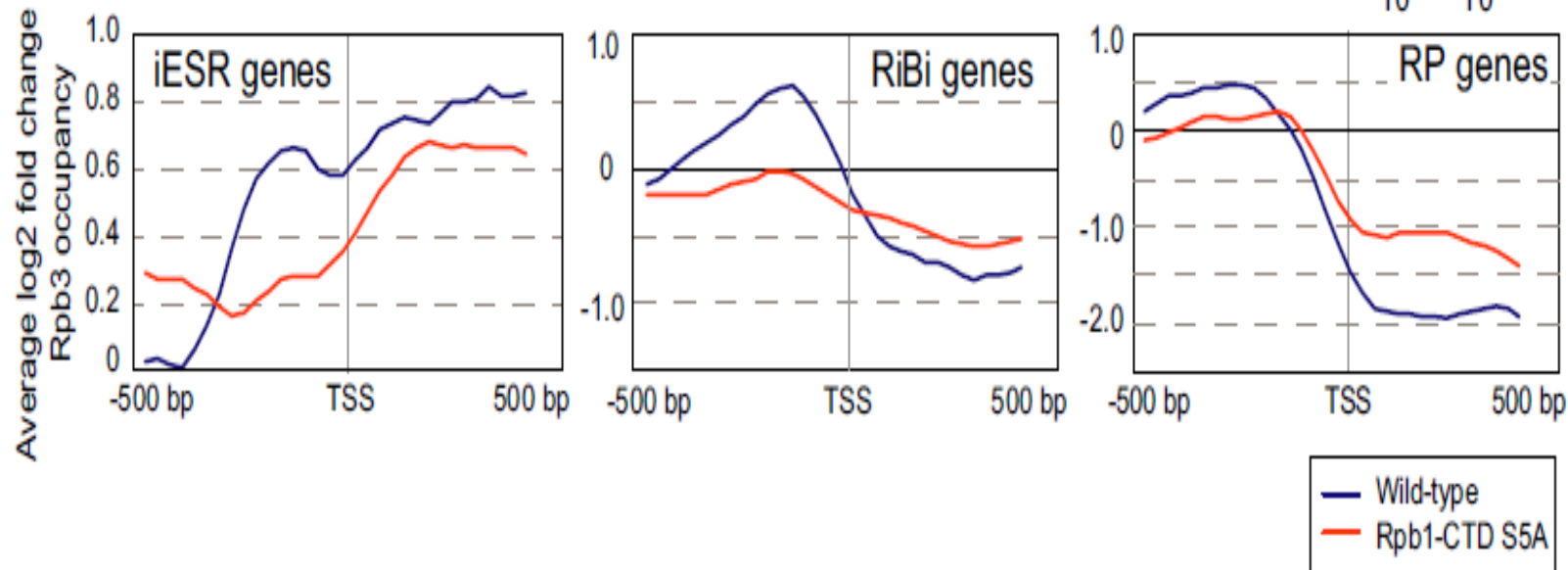




# *New insights into ESR regulation and coordination*



**B**

**A****B****C**



# *The orthologous mammalian networks are enriched for growthregulating and disease-causing genes*

Striking the correct balance between growth rate and stress defense is fundamental for proper cellular function, and improper balance is thought to be a critical driver in diseases such as cancer. We therefore interrogated the set of human genes orthologous to the yeast NaCl subnetwork. We found that this set is enriched for genes linked to cancer, mostly through somatic mutation, according to the COSMIC database: of the 35 human genes in the COSMIC dataset with yeast orthologs, 8 were orthologous to nodes in the consensus-node network, representing a 2.5-fold enrichment above chance. We also compared the yeast network to Mendelian disease genes in the OMIM database. We identified 25 additional yeast genes whose orthologs are linked to heritable disease, with weak enrichment for genes associated with prostate cancer. The network was also enriched for yeast proteins whose mouse orthologs are required for pre/perinatal viability, normal growth rate and body size, and male and female fertility. These results highlight that stress-responsive signaling is likely important for proper regulation of growth rate, and thus may provide insights into cancer biology.

# *conclusion*

We exploited these predictions to show that Cdc14 phosphatase is a central hub in the network and that modification of RNA polymerase II coordinates induction of stress defense genes with reduction of growth-related transcripts. We find that the orthologous human network is enriched for cancercausing genes, underscoring the importance of the subnetwork's predictions in understanding stress biology.





# *discussion*

## 1. 创新点

1. designed an integer linear programming (IP) approach to integrate and interpret our disparate datasets by inferring a signaling subnetwork. The novel facets of our computational approach include a means to integrate these varied data sources, using new types of input paths to the IP, and a multi-part objective function.

2. 运用所构造的网络对人体进行了预测，发现了人体中的这些途径许多致癌基因，突破了物种的跨度，具有启示意义。

## 2. 启发

由零到整再到零的实验思路，逻辑严谨，推理与验证还有运用一体化思想。

## 3. 改进的地方

提出了许多预测的交联途径，但是并没有进行验证，仅仅只是为了试验的正确性而选择性的验证了一些研究的已经很透彻的途径，或许可以对一些新颖的预测途径进行探讨，从而发现更多的规律。