

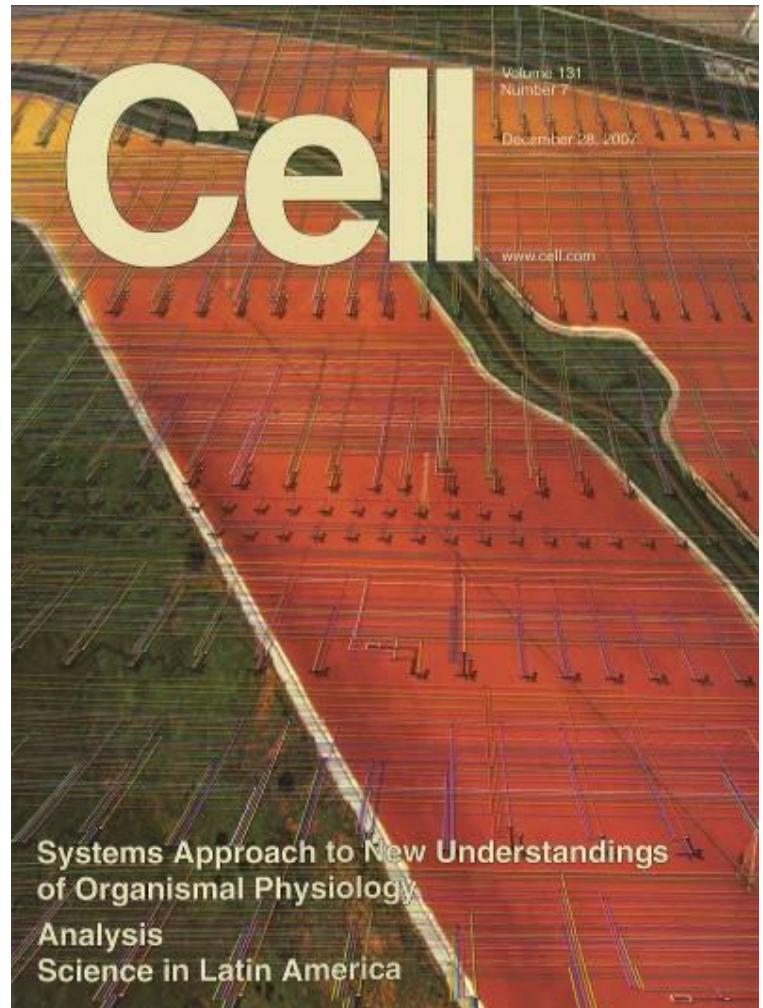
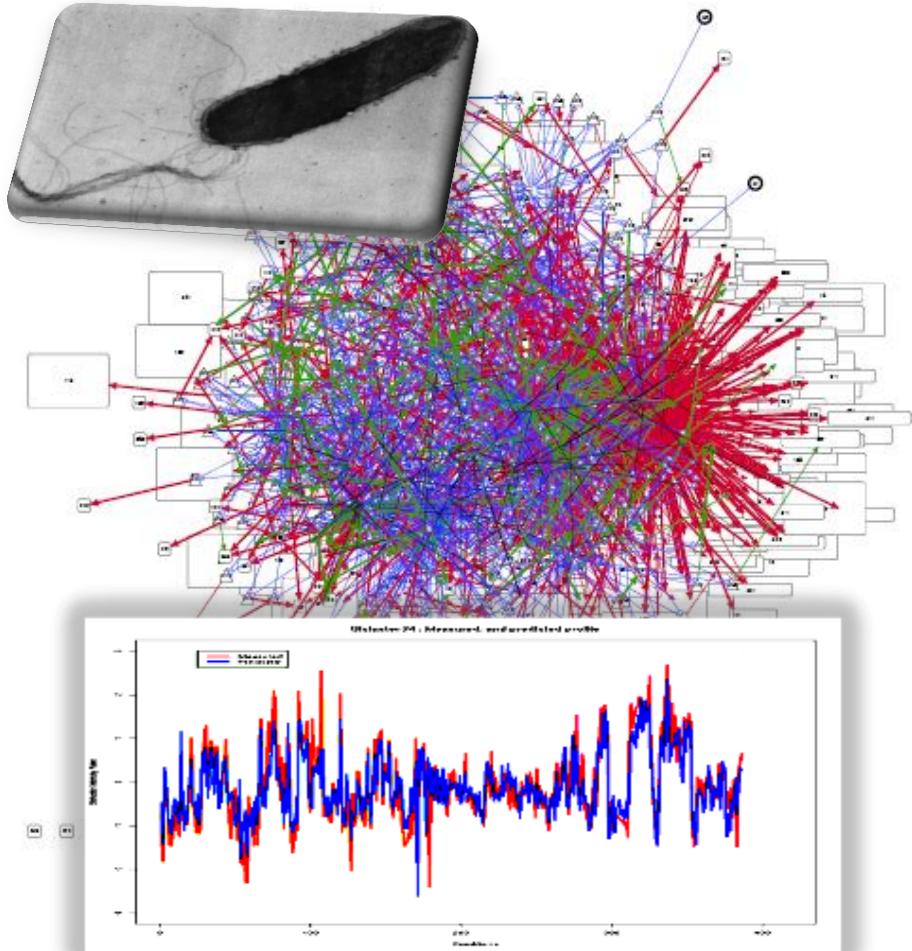
Регуляция гомеостаза ионов меди у  
*Halobacterium salinarum*: компьютерное  
моделирование и экспериментальный анализ

Regulation of Cu homeostasis in *H. salinarum*:  
computational modeling and experimental analysis

Александр Ратушный  
*Alexander Ratushny*

# Model Organism

*Halobacterium salinarum*

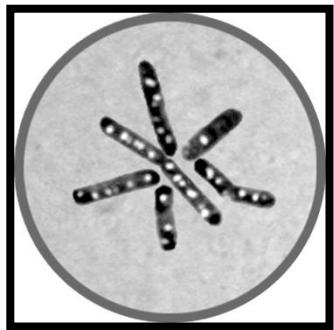


Bonneau *et.al.* *Cell* (2007); Baliga NS *Science* (2008)

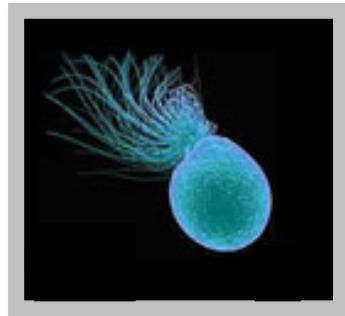
# Archaea

**Archaea** are one of three distinct domains of life on Earth. They are adapted to almost all extreme environments from Methanogens in swamps, to Halophilic Archaea in Salt lakes, and to Thermophilic Archaea in deep ocean thermal vents or hot springs.

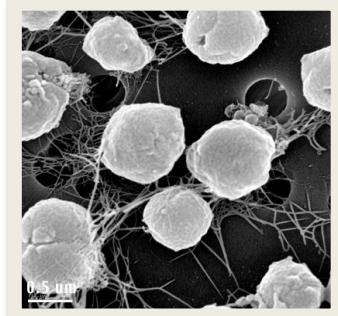
*Halobacterium salinarum*



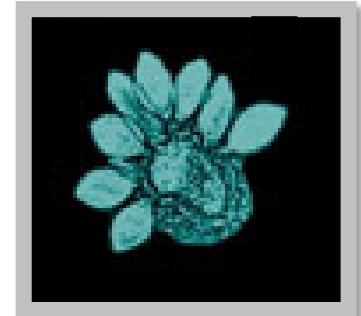
*Pyrococcus furiosis*



*Methanococcus maripaludis*



*Sulfolobus solfataricus*



# Archaea



20% of the  
total biomass



Global Oceans  
 $1.3 \times 10^{28}$

Archaea

$3.1 \times 10^{28}$

Bacteria

(Karner et al. 2001)

Allers & Mevarech, 2005

# Reasons why *H. salinarum* NRC-1 is an ideal model organism for systems biology research

- a. It is non-pathogenic and easy-to-culture to very high cell densities ( $>10^8$  cells/ml).
- b. It has a relatively small genome (2.6Mbp) that is completely sequenced<sup>25</sup>
- c. Over 62% of all protein coding genes in *H. salinarum* NRC-1 have been characterized through extensive proteomic analysis<sup>26</sup>.
- d. Key genetic information processing and DNA repair mechanisms are eukaryotic-like<sup>27</sup>.
- e. It is easily lysed in low salt buffers facilitating high-throughput RNA and protein preparations<sup>20</sup>.
- f. It is biochemically, genetically and genomically tractable with a range of molecular biology, computational and high-throughput functional genomic tools<sup>19,28-34</sup>.
- g. A network with an exhaustive number of inferred interactions/associations among the *H. salinarum* NRC1 proteins and protein-DNA interactions for general transcription factors has been constructed through evolutionary comparisons and ChIP-chip experiments<sup>5</sup>. More importantly, all of this information has been processed along with gene expression profiling using machine learning algorithms<sup>29,30</sup> to infer a global predictive gene regulatory network<sup>24</sup>.
- h. Complete genome sequences of several closely related halophiles<sup>25,35-37</sup> will facilitate comparative genomics for extracting detailed information.

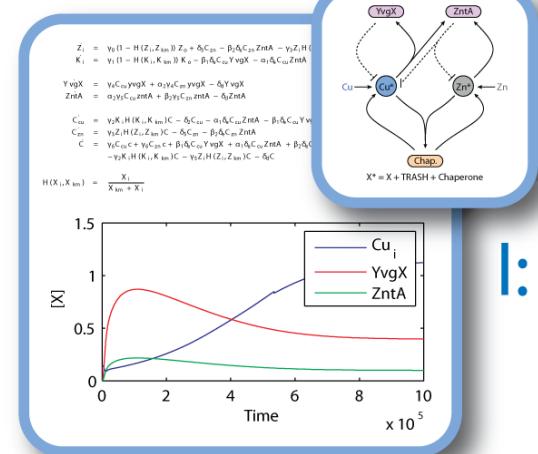
# Resources for systems analysis of *H. salinarum* NRC-1

We have crafted tools for comprehensive systems analysis of *Halobacterium salinarum* NRC-1 –from high-throughput experimental analysis, to network inference, visualization, and exploration of complex data.

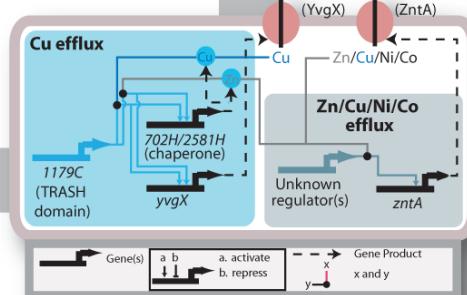
Several of these tools have been previously published and include

- classical genetics (gene knockouts<sup>20-23,34</sup>, overexpression and epitope tagging<sup>5</sup> etc.), microarrays<sup>19,21,23</sup>,
- quantitative proteomics (using ICAT<sup>19</sup> and iTRAQ<sup>20,22</sup>),
- protein surveys<sup>26</sup>,
- protein complex immunoprecipitation for determining protein-protein and protein-DNA interactions<sup>5</sup>,
- computational algorithms for localizing protein-DNA interactions<sup>38</sup> and regulatory network inference<sup>29,30</sup>
- and software for simultaneous exploration of diverse databases in a framework that enables software interoperability<sup>31,39</sup>

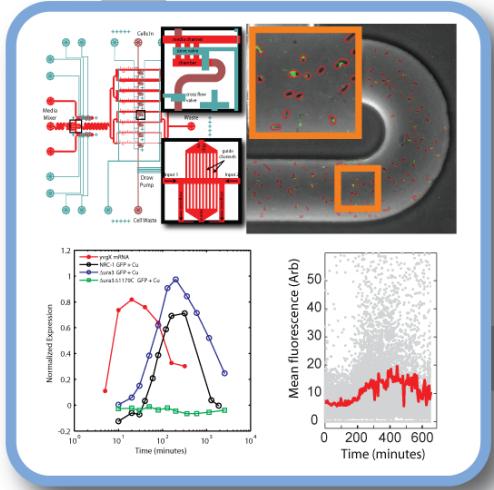
# Research Model



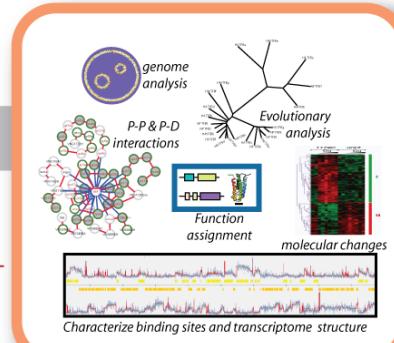
I: Define and simulate mass-action kinetics



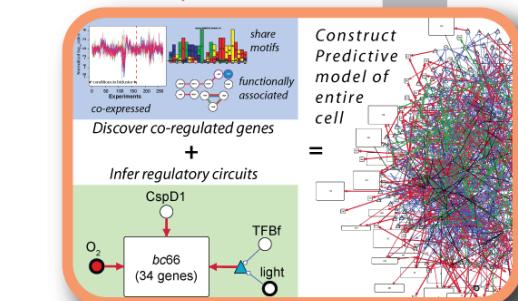
Characterize sub-circuit behavior



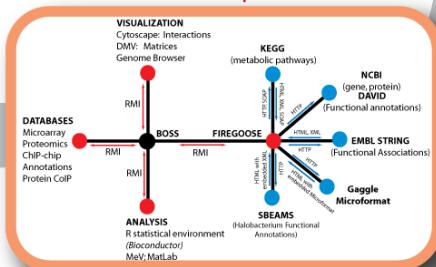
III: Construct modules and experimentally validate dynamics



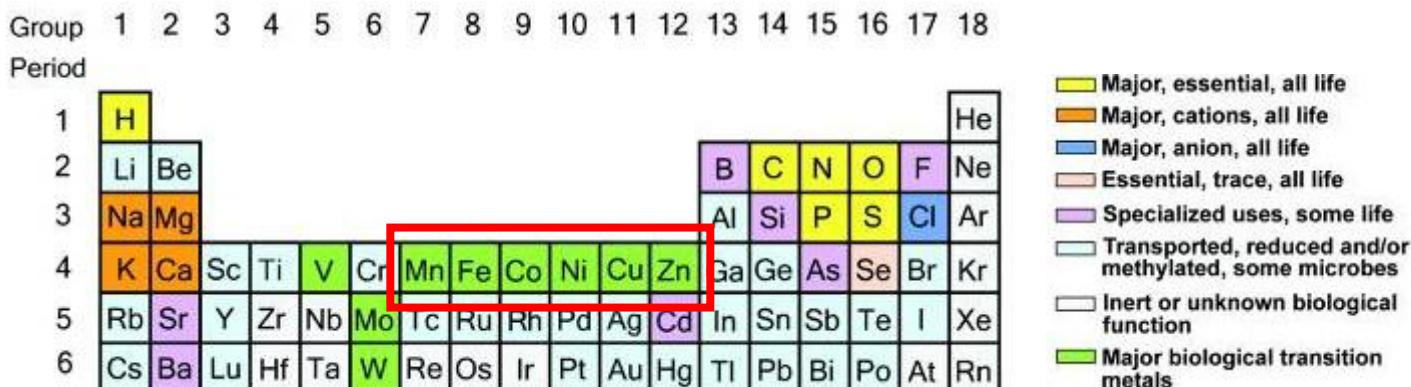
II: Formulate and test new hypotheses via global-systems analysis



III: Develop software to explore models and design experiments to test model predictions



Baliga lab



Wackett et. al, *App. Env. Microbiol.*, 2004

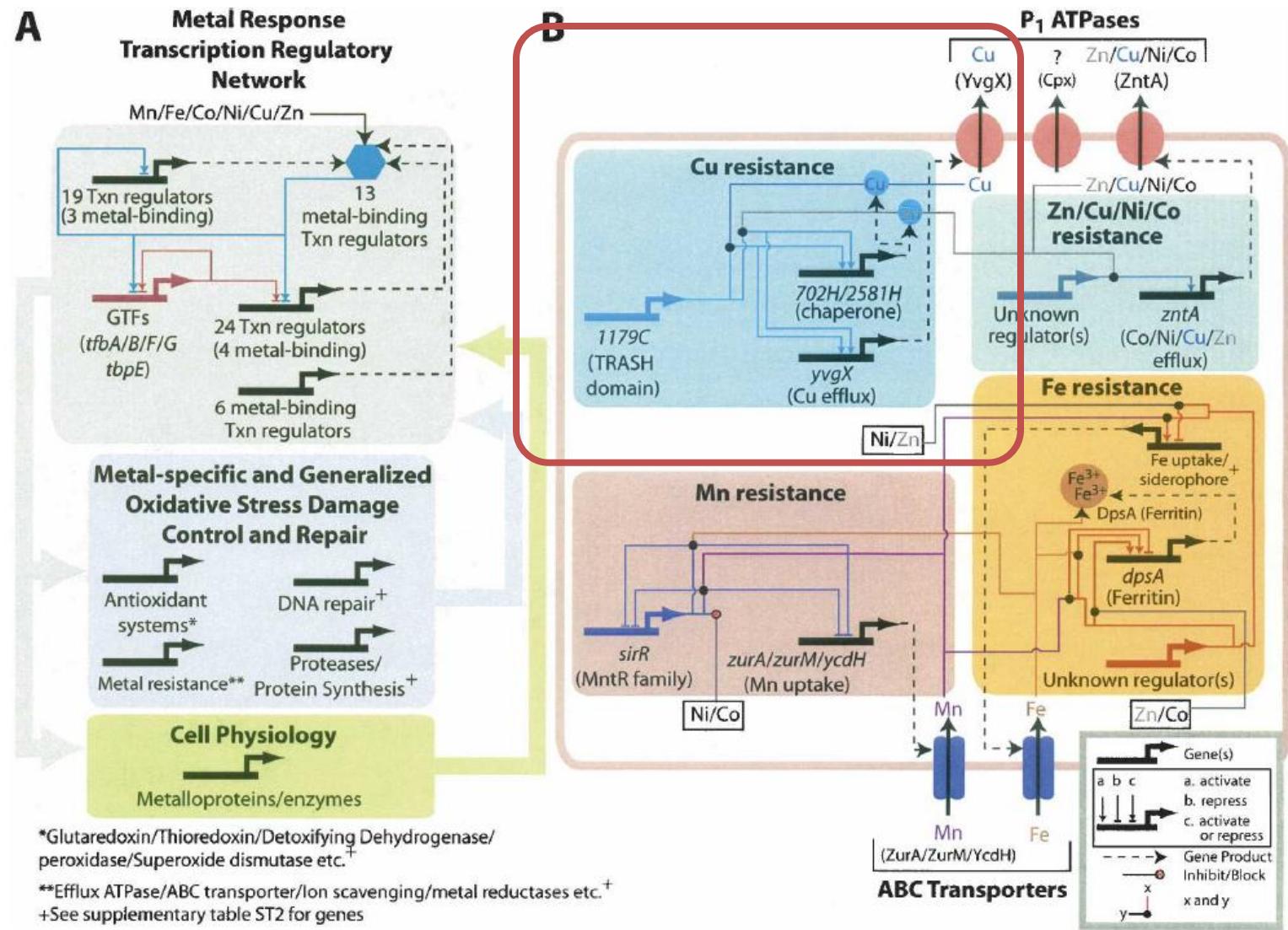
## Article

# A systems view of haloarchaeal strategies to withstand stress from transition metals

Amardeep Kaur,<sup>1,3</sup> Min Pan,<sup>1,3</sup> Megan Meisslin,<sup>1</sup> Marc T. Faccioli,<sup>1</sup> Raafat El-Gewely,<sup>2</sup> and Nitin S. Baliga<sup>1,4</sup>

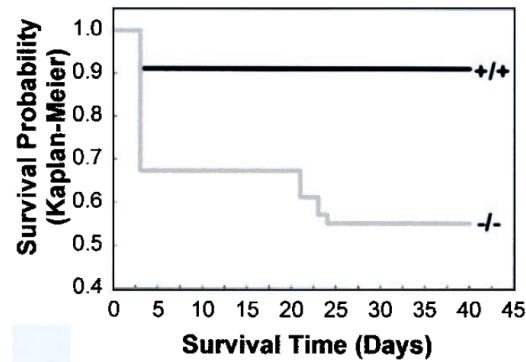
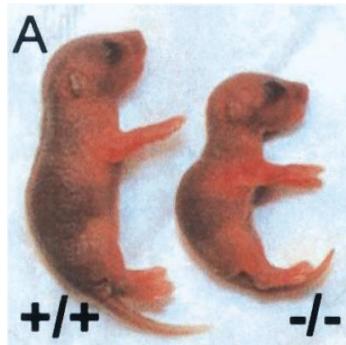
<sup>1</sup>*Institute for Systems Biology, Seattle, Washington 98103-8904 USA;* <sup>2</sup>*University of Tromso, 9037 Tromso, Norway*

# A systems-level model for transition metal stress response of *Halobacterium NRC-1*



# Cu: essential and hazardous

- Crucial micronutrient
    - Co-factor in electron transport
    - Redox detoxification
  - Misregulation linked to:
    - Wilson's disease
    - Menke's syndrome
    - Alzheimer's
- } Cu import / efflux disorders

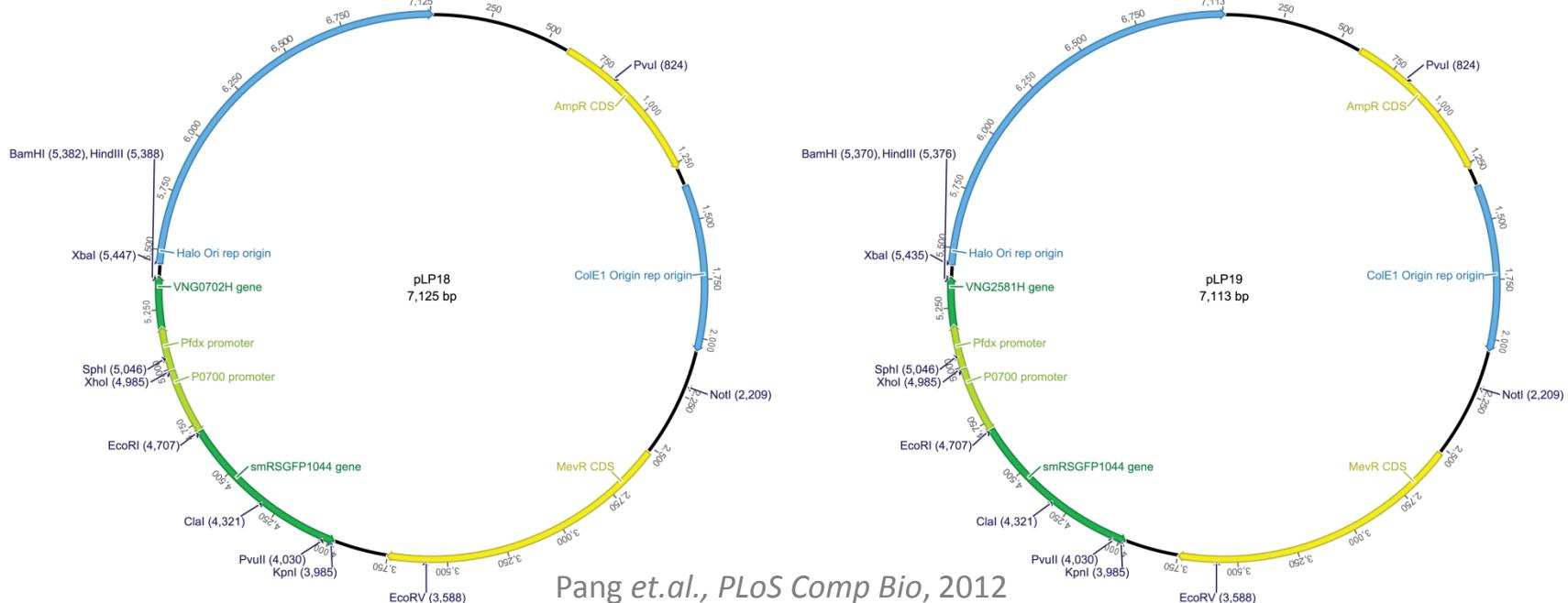


Hamza et.al, PNAS, 2001

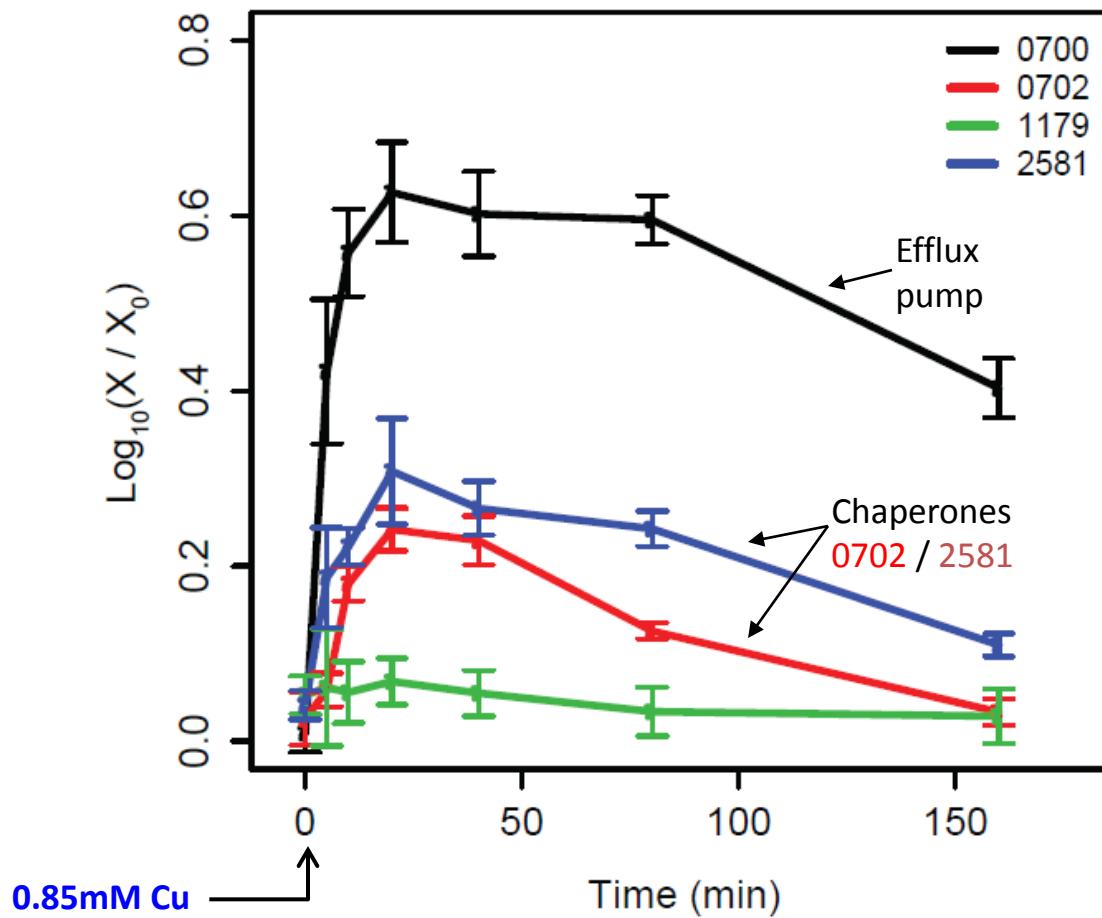


# Experimental Methods

- Assay for YvgX expression
  - Transcriptionally fused GFP expression
- Assay for intracellular Cu
  - Inductively coupled plasma mass spectrometry (ICP-MS)
- Compare:
  - Deletion of chaperones
  - Constitutive overexpression of chaperones

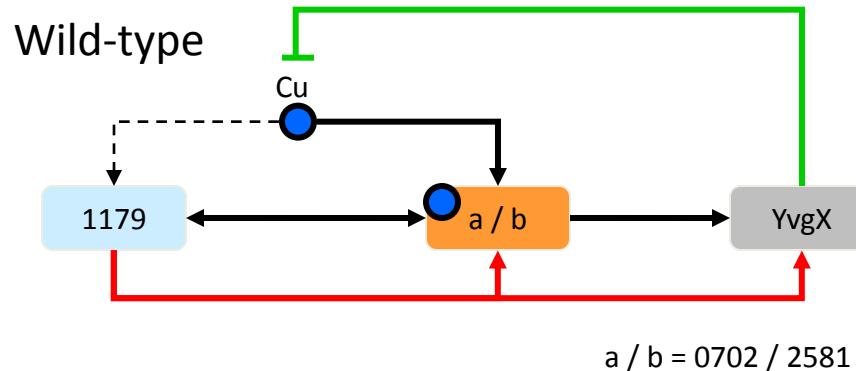


## Cu Efflux has pulse dynamics



mRNA profiles show pulse responses for efflux pump and metallochaperones

# Metallochaperone Function

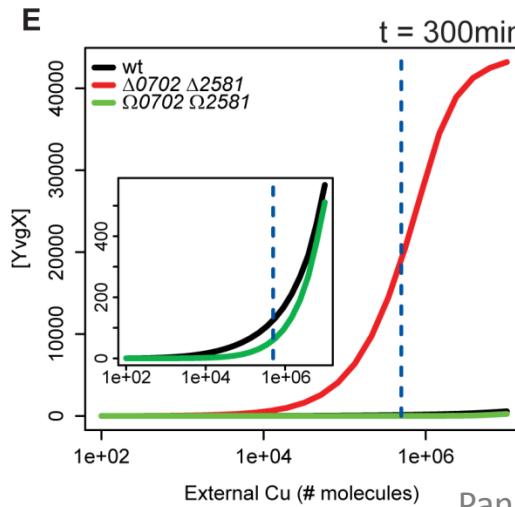
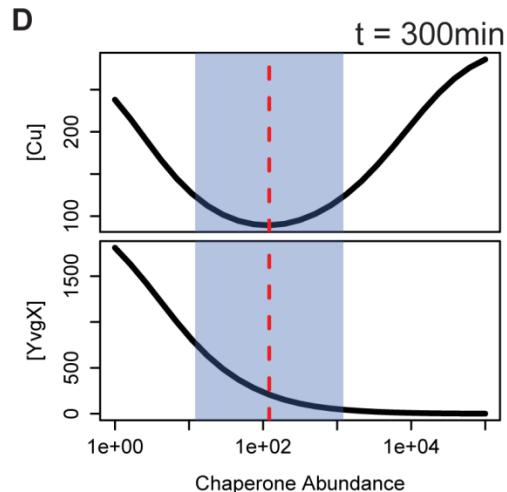
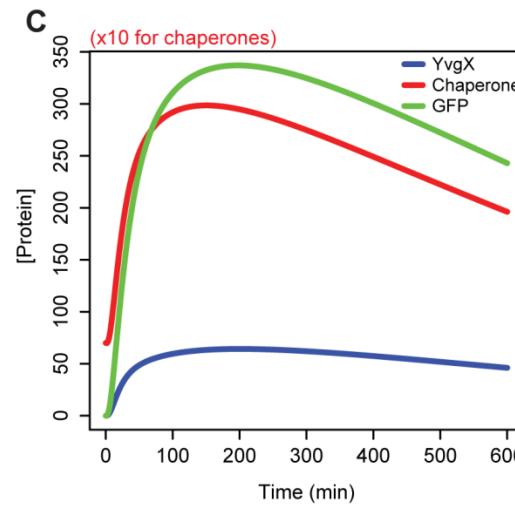
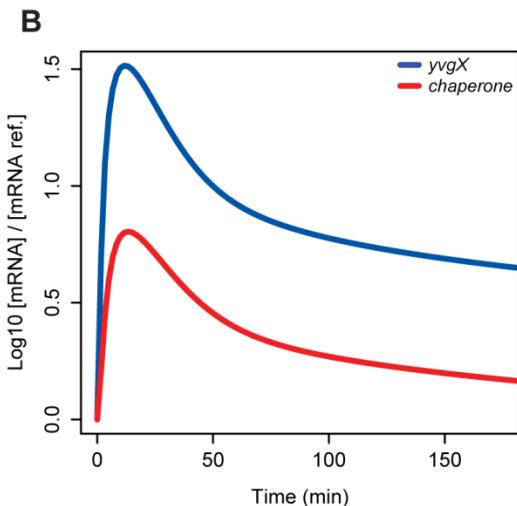
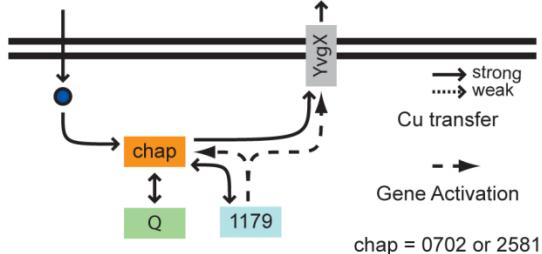


Chaperones are a functionally important element in Cu efflux

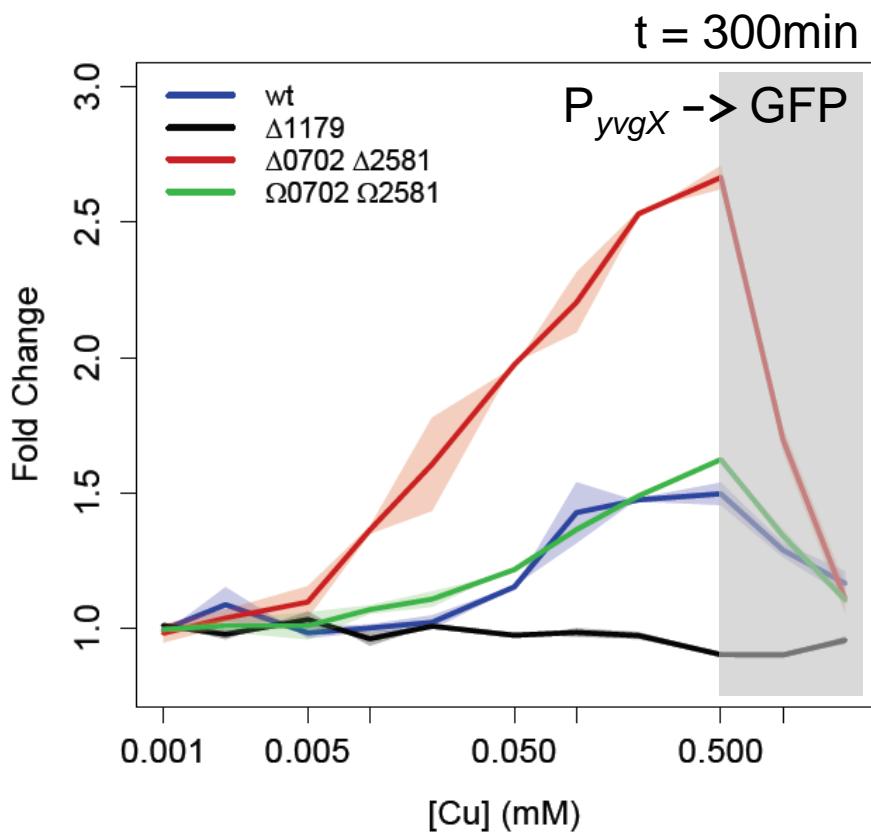
Trafficks Cu between sensory and efflux components

Mediates negative feedback

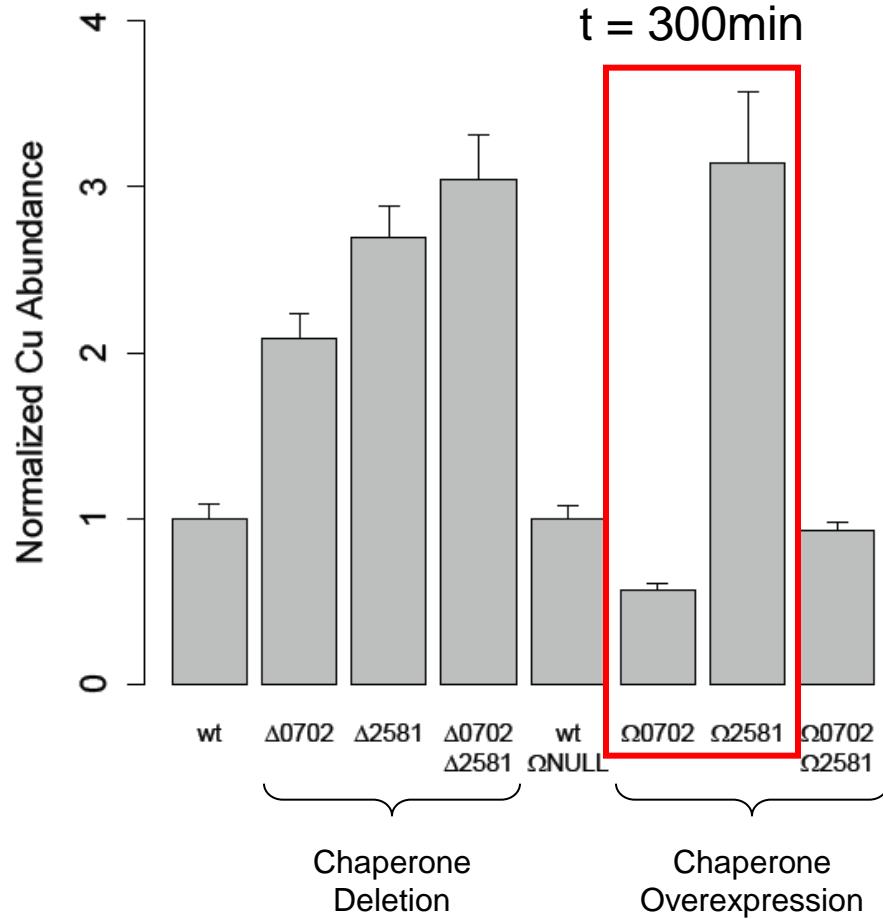
# A simple model for Cu Efflux



# Transcriptional dynamics of YvgX and associated consequences on intracellular Cu levels

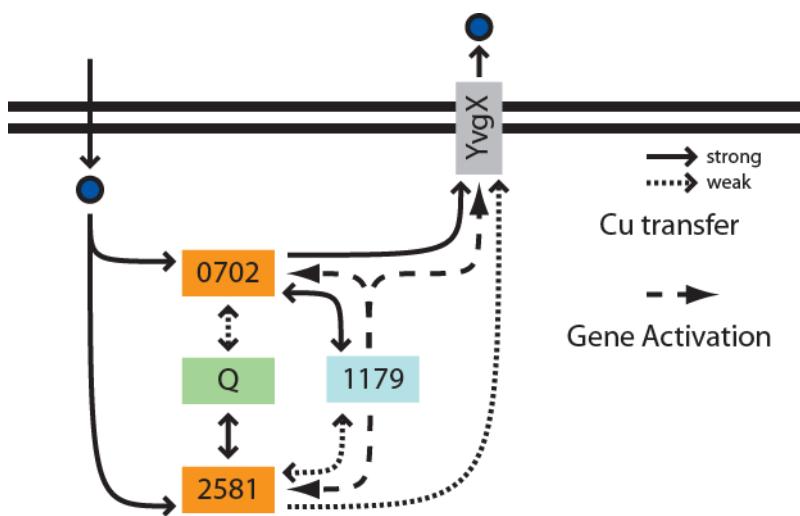


Chaperone **deletion** increases sensitivity to Cu  
Chaperone **overexpression** quantitatively similar to **wt**

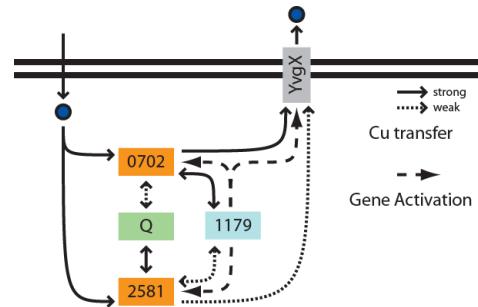


# Unique chaperone roles

## Two Chaperone Model 1

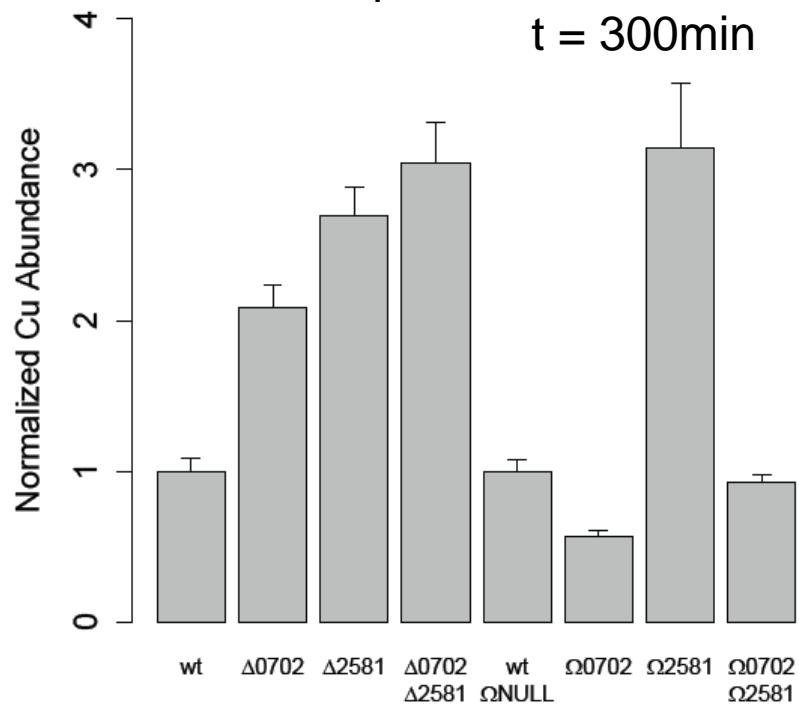


Parameter	Default	Model 0	Model 1.1
k.D2581.P1179.Cu.binding	0.01	0	
k.D2581.P1179.Cu.dissociation	0.1	0	
k.M2581.degradation	0.003262	0	
k.M2581.transcription	0.424167	0	
k.OE2581.transcription	0.004242	0	
k.P0700.Cu.by.P2581.F1	0.01	0	
k.P0700.Cu.by.P2581.R1	0.1	0	
k.P0700.Cu.by.P2581.F2	1	0	0.1
k.P0702.Cu.bind	0.01		
k.P0702.Cu.by.P1179.F1	0.01		
k.P0702.Cu.by.Q.F1	0.001		
k.P0702.Cu.by.P2581.F1	0.01	0	0
k.P0702.Cu.by.P2581.R1	0.1	0	0
k.P0702.degradation	0		
k.P2581.Cu.bind	0.01	0	
k.P2581.Cu.by.P1179.F1	0.01	0	
k.P2581.Cu.by.P0702.F1	0.01	0	0
k.P2581.Cu.by.P0702.R1	0.1	0	0
k.P2581.Cu.by.Q.F1	0.001	0	
k.P2581.Cu.debind	0.001	0	
k.P2581.Cu.degradation	0	0	
k.P2581.degradation	0	0	
k.P2581.translation	0.030769	0	
k.P1179.Cu.by.P0702.F1	0.01		
k.P1179.Cu.by.P0702.R1	0.1		
k.P1179.Cu.by.P0702.F2	0.1		
k.P1179.Cu.by.P2581.F1	0.01	0	
k.P1179.Cu.by.P2581.R1	0.1	0	
k.P1179.Cu.by.P2581.F2	0.1	0	0.01
k.Q.Cu.by.P0702.F1	0.01		

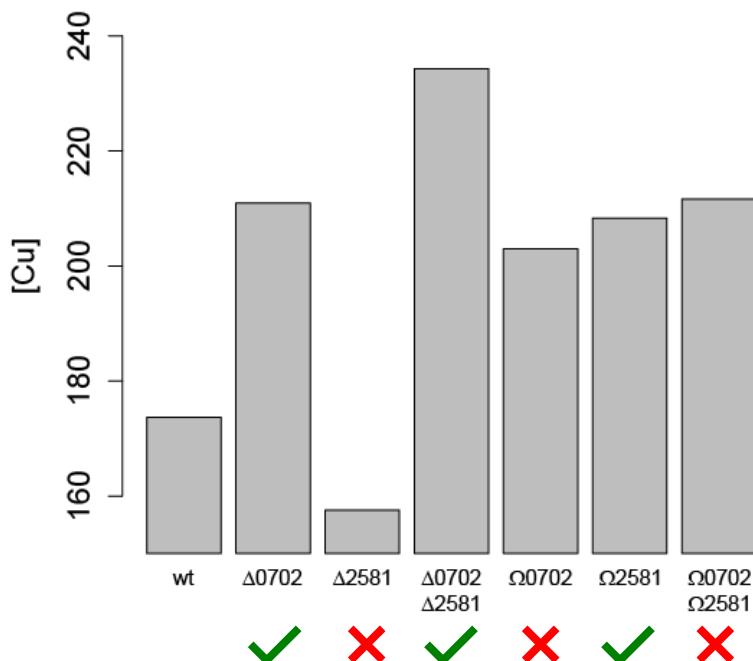


## Experiment

$t = 300\text{min}$

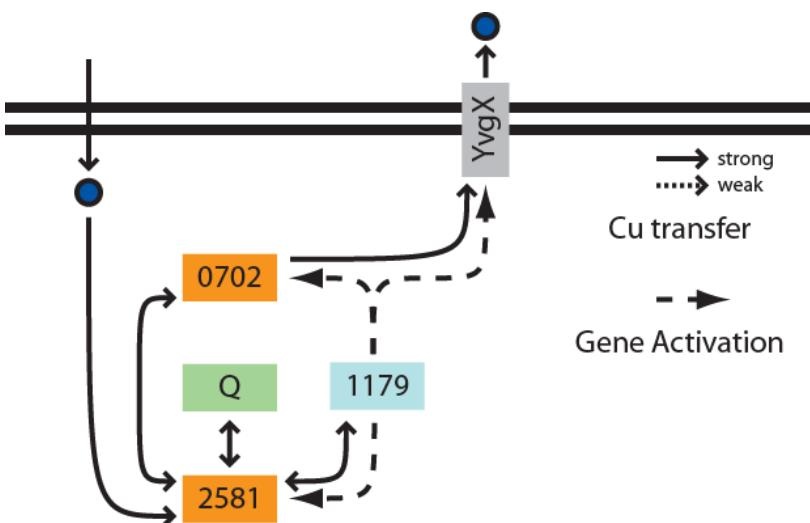


## Simulation

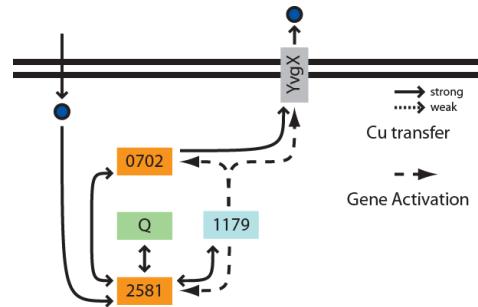


# Unique chaperone roles

## Two Chaperone Model 2

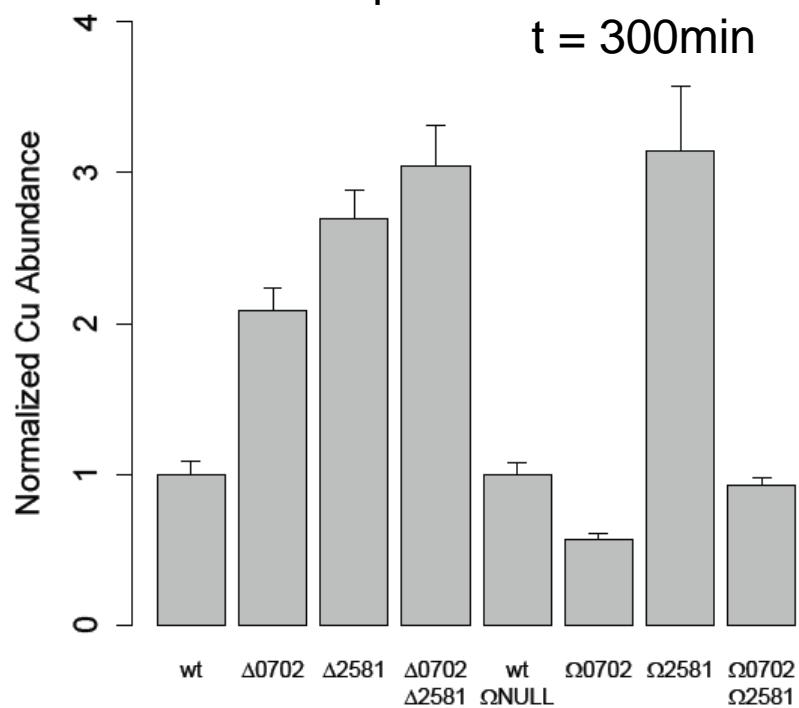


Parameter	Default	Model 0	Model 1.1	Model 1.2
k.D2581.P1179.Cu.binding	0.01	0		
k.D2581.P1179.Cu.dissociation	0.1	0		
k.M2581.degradation	0.003262	0		
k.M2581.transcription	0.424167	0		
k.OE2581.transcription	0.004242	0		
k.P0700.Cu.by.P2581.F1	0.01	0		0
k.P0700.Cu.by.P2581.R1	0.1	0		0
k.P0700.Cu.by.P2581.F2	1	0	0.1	0
k.P0702.Cu.bind	0.01			
k.P0702.Cu.by.P1179.F1	0.01			0
k.P0702.Cu.by.Q.F1	0.001			0
k.P0702.Cu.by.P2581.F1	0.01	0	0	
k.P0702.Cu.by.P2581.R1	0.1	0	0	
k.P0702.degradation	0			
k.P2581.Cu.bind	0.01	0		
k.P2581.Cu.by.P1179.F1	0.01	0		
k.P2581.Cu.by.P0702.F1	0.01	0	0	
k.P2581.Cu.by.P0702.R1	0.1	0	0	
k.P2581.Cu.by.Q.F1	0.001	0		
k.P2581.Cu.debind	0.001	0		
k.P2581.Cu.degradation	0	0		
k.P2581.degradation	0	0		
k.P2581.translation	0.030769	0		
k.P1179.Cu.by.P0702.F1	0.01			0
k.P1179.Cu.by.P0702.R1	0.1			0
k.P1179.Cu.by.P0702.F2	0.1			0
k.P1179.Cu.by.P2581.F1	0.01	0		
k.P1179.Cu.by.P2581.R1	0.1	0		
k.P1179.Cu.by.P2581.F2	0.1	0	0.01	
k.Q.Cu.by.P0702.F1	0.01			0

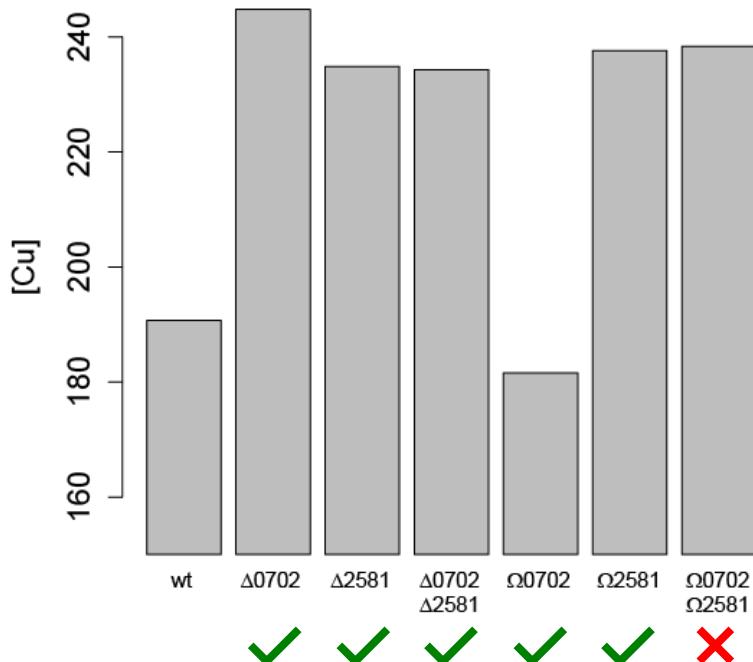


## Experiment

$t = 300\text{min}$



## Simulation

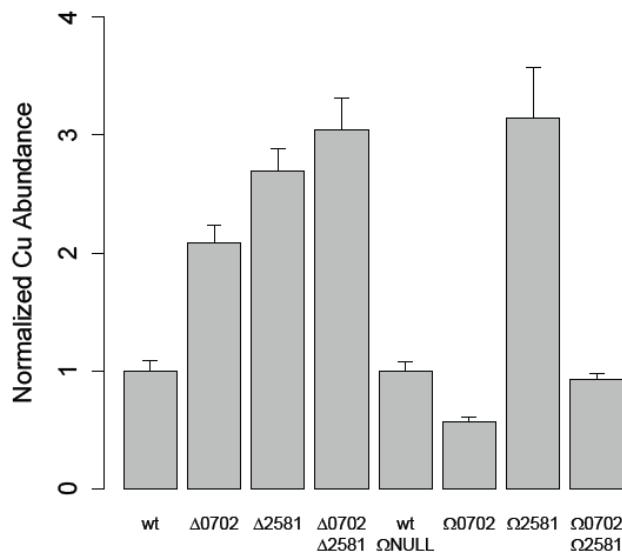


# Steady-state model for intracellular Cu

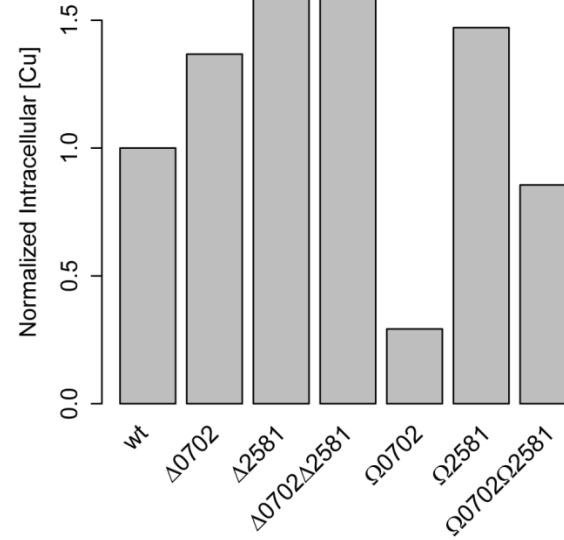
$$Cu_{in} = \frac{k_0 + \frac{c_2}{k_{21}}}{1 + \frac{c_2}{k_{21}} + f(c_2, k_{20}, k_{22}) \frac{c_1}{k_{11}} + f(c_2, 0, k_{23})}$$

where  $f(x, k_1, k_2) = \frac{k_1 + \frac{x}{k_2}}{1 + \frac{x}{k_2}}$

$c_1$  and  $c_2$  are concentrations of 0702 and 2581 metallochaperones, respectively

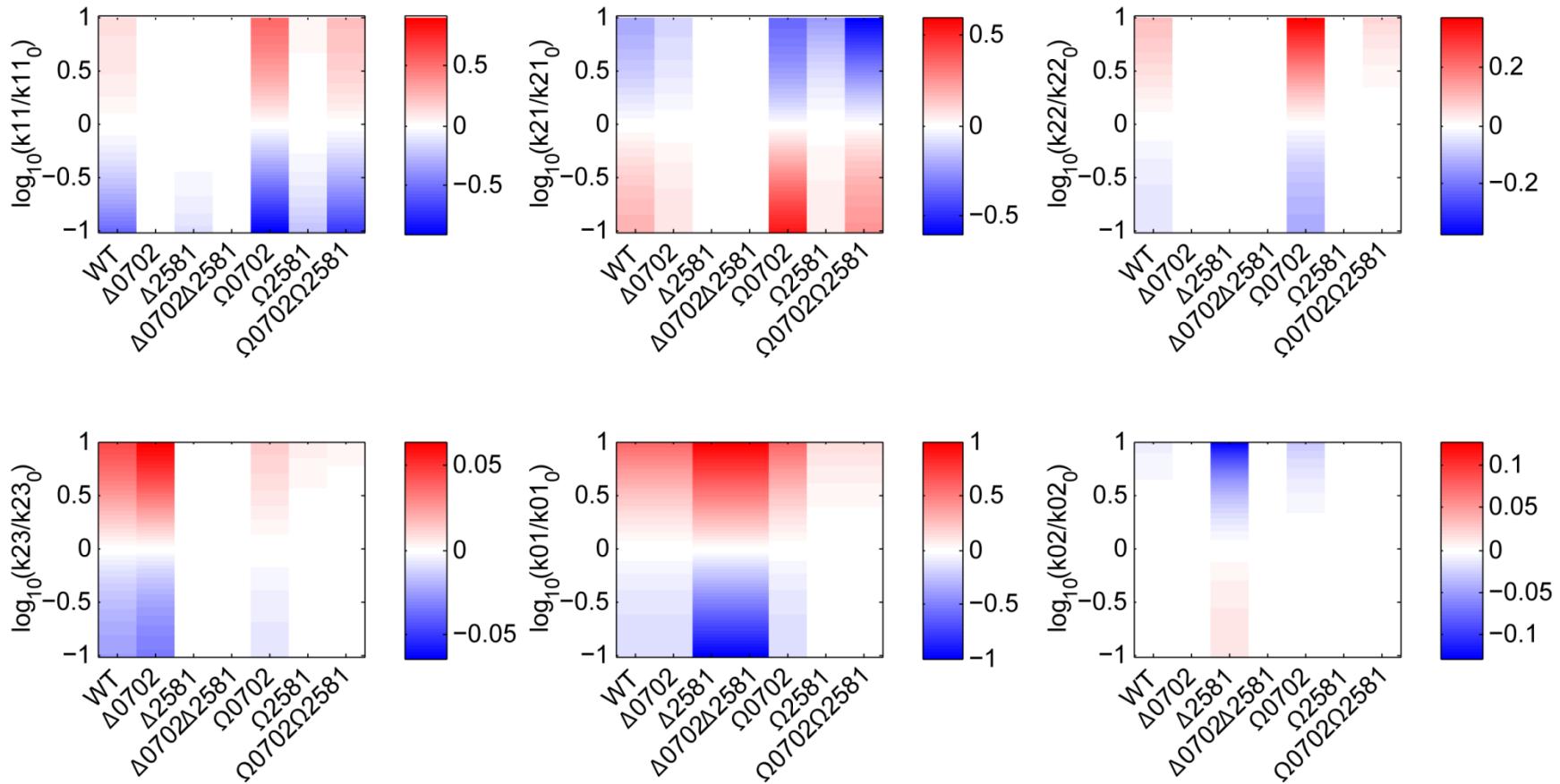


Experiment



*In silico* simulated levels of intracellular Cu for different genetic backgrounds

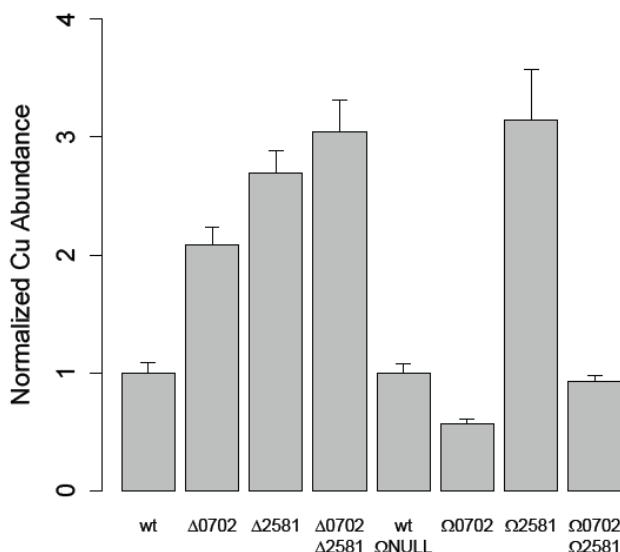
# Sensitivity analysis of the steady-state GHF model



# GHF model $\Rightarrow$ Improvement of the portrait model

## Added

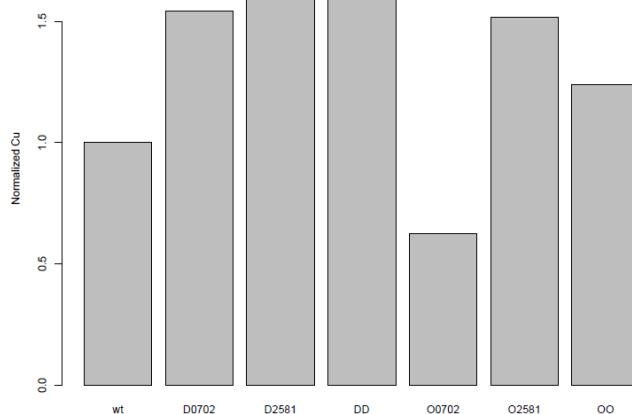
- basal Cu affinity of 0702
- basal Cu trafficking of 2581 to YvgX
- degradation (on the order of cell growth) to the chaperones. Specifically, 2581 (MC2) is degraded slightly faster than 0702 (MC1).



Experiment

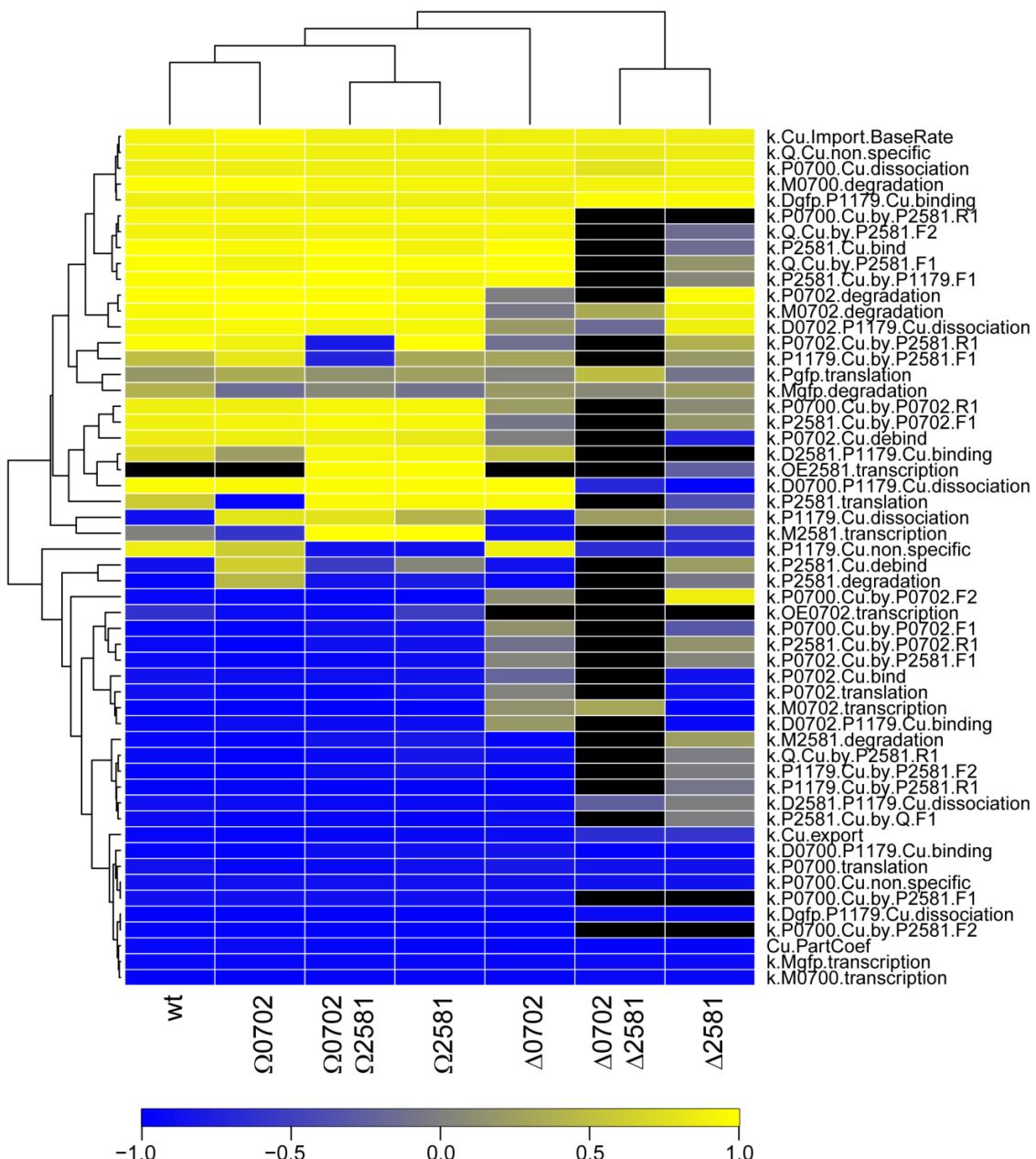
## Modified

- the equilibrium for Cu mediated 0702-2581 dimers that are formed during the Cu 'hand-off' - made their prevalence lower.
- the activation rate of 1179 by 2581



Portrait model simulation results

# Sensitivity analysis of the portrait model



Reducing the activity of VNG0702H results in an increase in intracellular Cu. This can occur in several ways:

- the binding affinity of VNG0702H can be reduced (decreasing the equilibrium ratio between apo-/Cu-bound VNG0702H, or apo-VNG0702H / Cu-VNG2581H).
- trafficking efficiency of VNG0702H to VNG0700G can be reduced.
- the lifetime of VNG0702H proteins can be reduced via increased specific degradation.

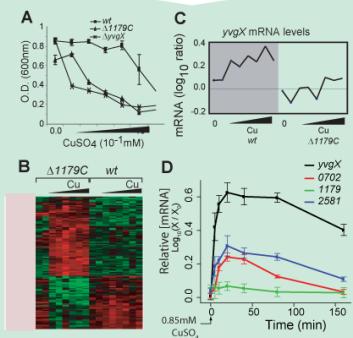
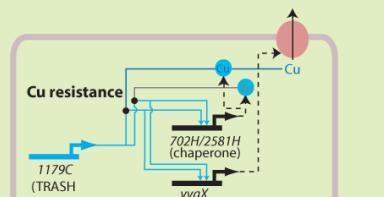
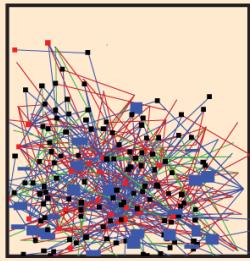
MODEL

PREDICTION

EXPERIMENT

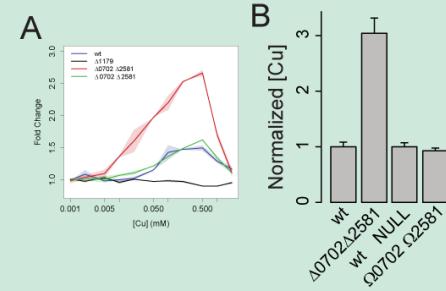
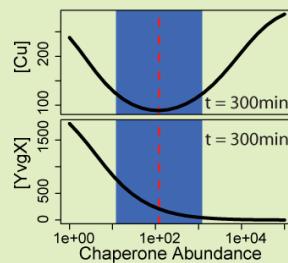
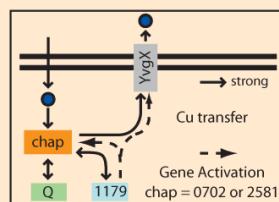
## ITERATION 1

## EGRIN



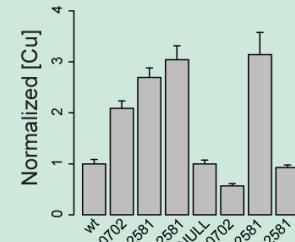
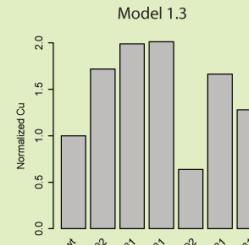
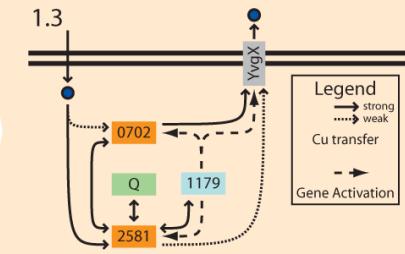
## ITERATION 2

## Model 0



## Generalized Hill function method

## ITERATION 3



# Acknowledgements

Baliga and Aitchison Groups, ISB

- Lee Pang
- Amardeep Kaur
- Min Pan
- Aaron Brooks
- Danielle (Miller) Durudas
- Nitin Baliga
- John Aitchison

Adams Group, UGa

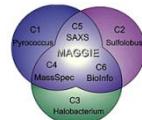
- Aleksandar Cvetkovic
- Sunil Kumar
- Michael W. W. Adams

ENIGMA, LBL:

- Adam Arkin

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- NIH
- Department of Energy
  - MAGGIE
  - Enigma



- Center for Systems Biology

