

# The costs and benefits of microbial procrastination

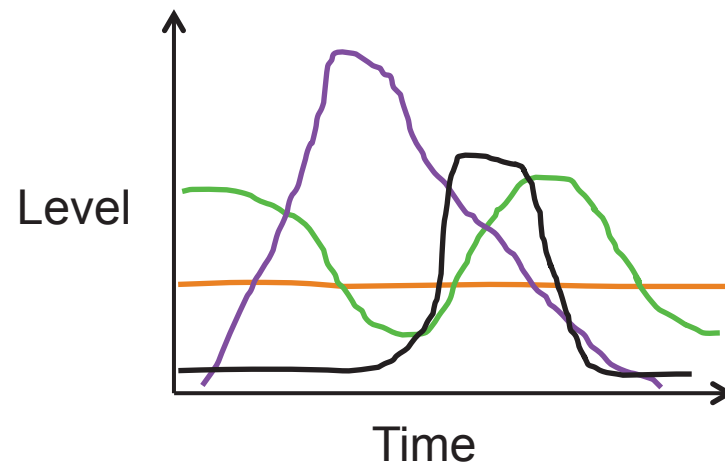
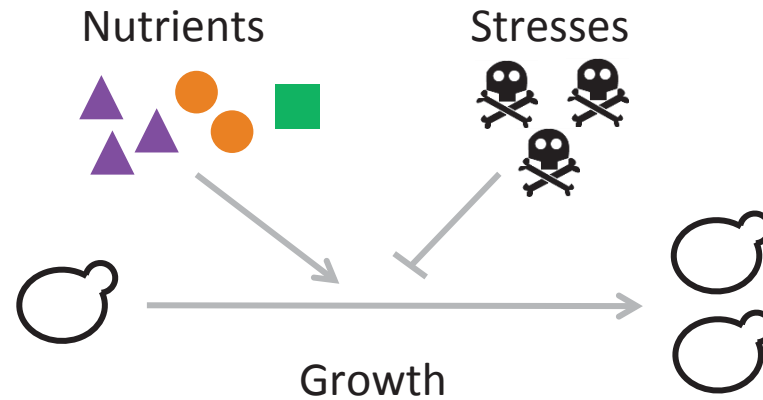
ICTP

June 27<sup>th</sup>, 2014

Michael Springer

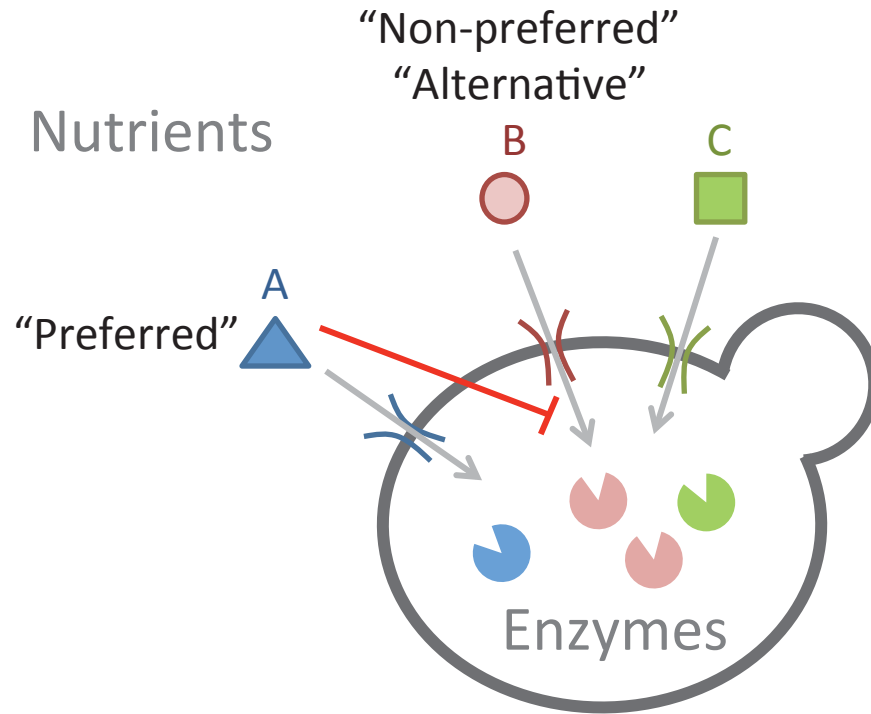
Harvard Medical School

# Cells live in mixed, dynamic environments.

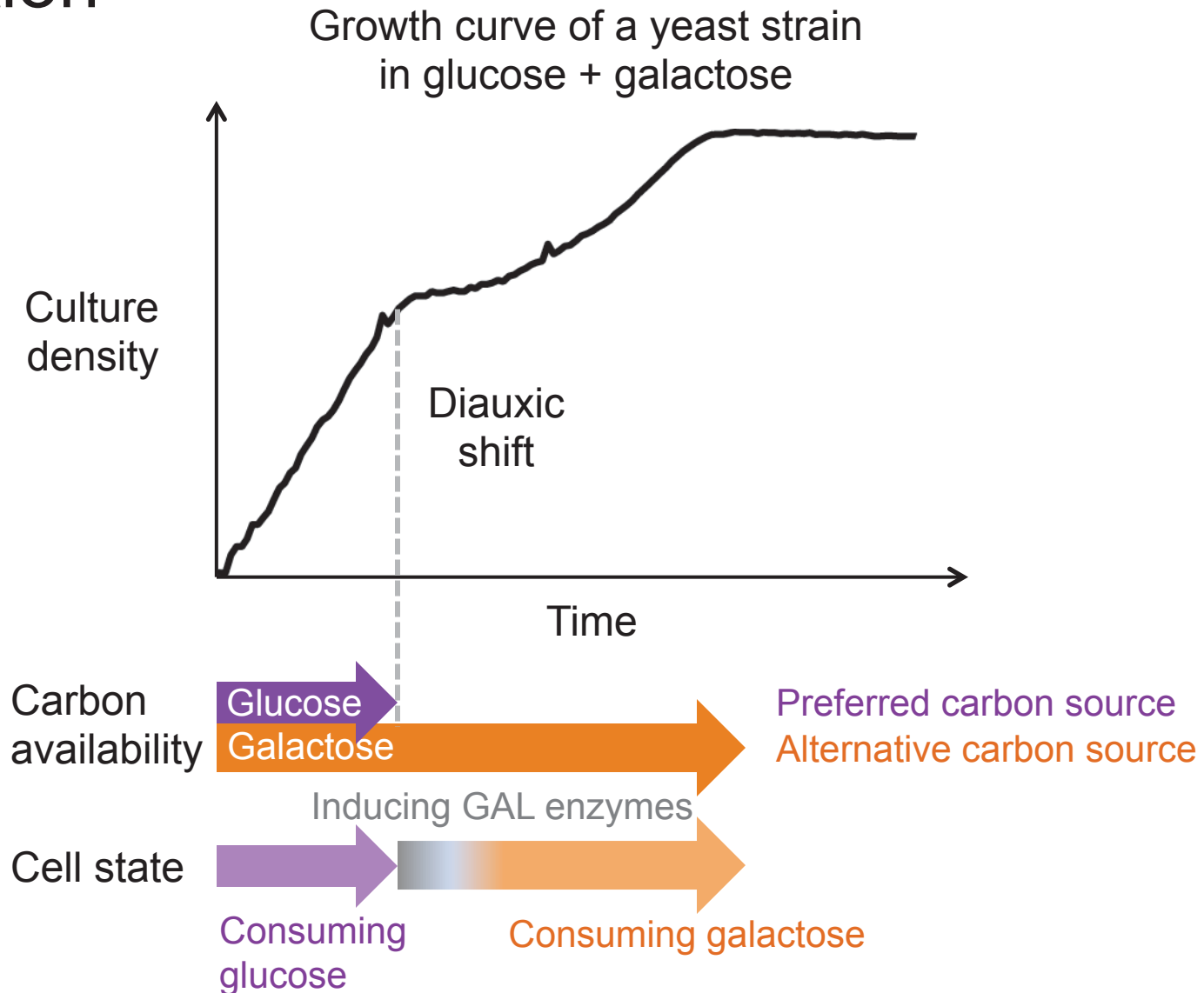


## How do they deal with this?

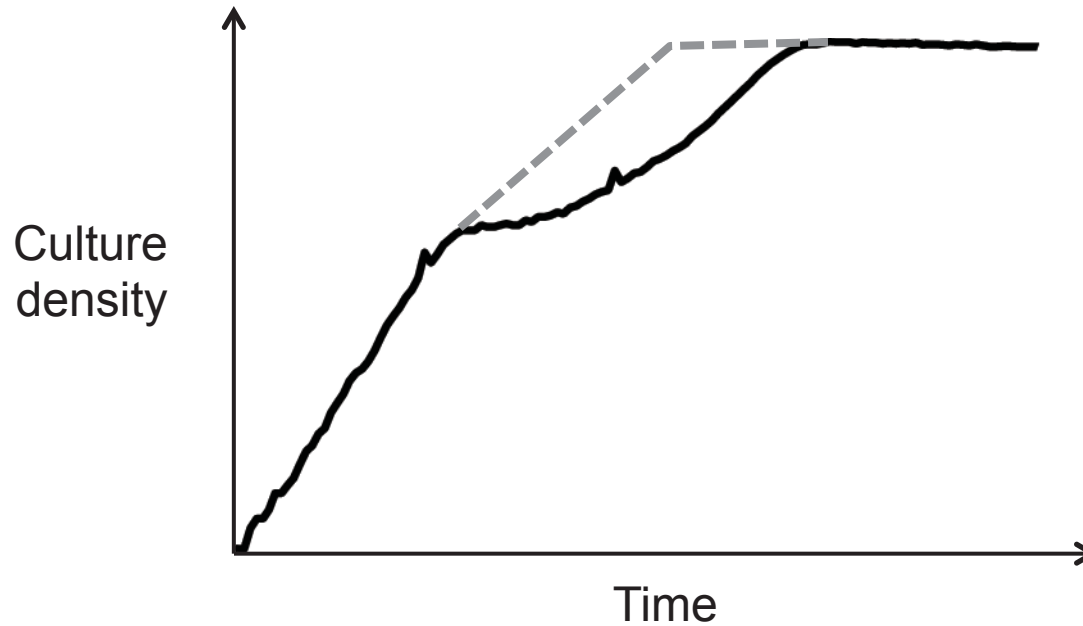
# Microbes use gene regulation to choose between nutrients



# Diauxic growth: a classic example of gene regulation



# Why don't cells “prepare” for glucose depletion?



Consuming  
glucose



Consuming galactose



# Examples of microbial preparation

- Simple biochemical circuits can predict environmental changes
  - E. coli: heat shock, low oxygen
  - Yeast: heat stress, oxidative stress
  - Many organism: circadian oscillators

Glucose -> Ethanol (derived from glucose)

Glucose -> Galactose

# Why don't cells prepare? Maybe they do?

Are difference in lag time due to difference in preparation?

New et al. (Verstrepen) –

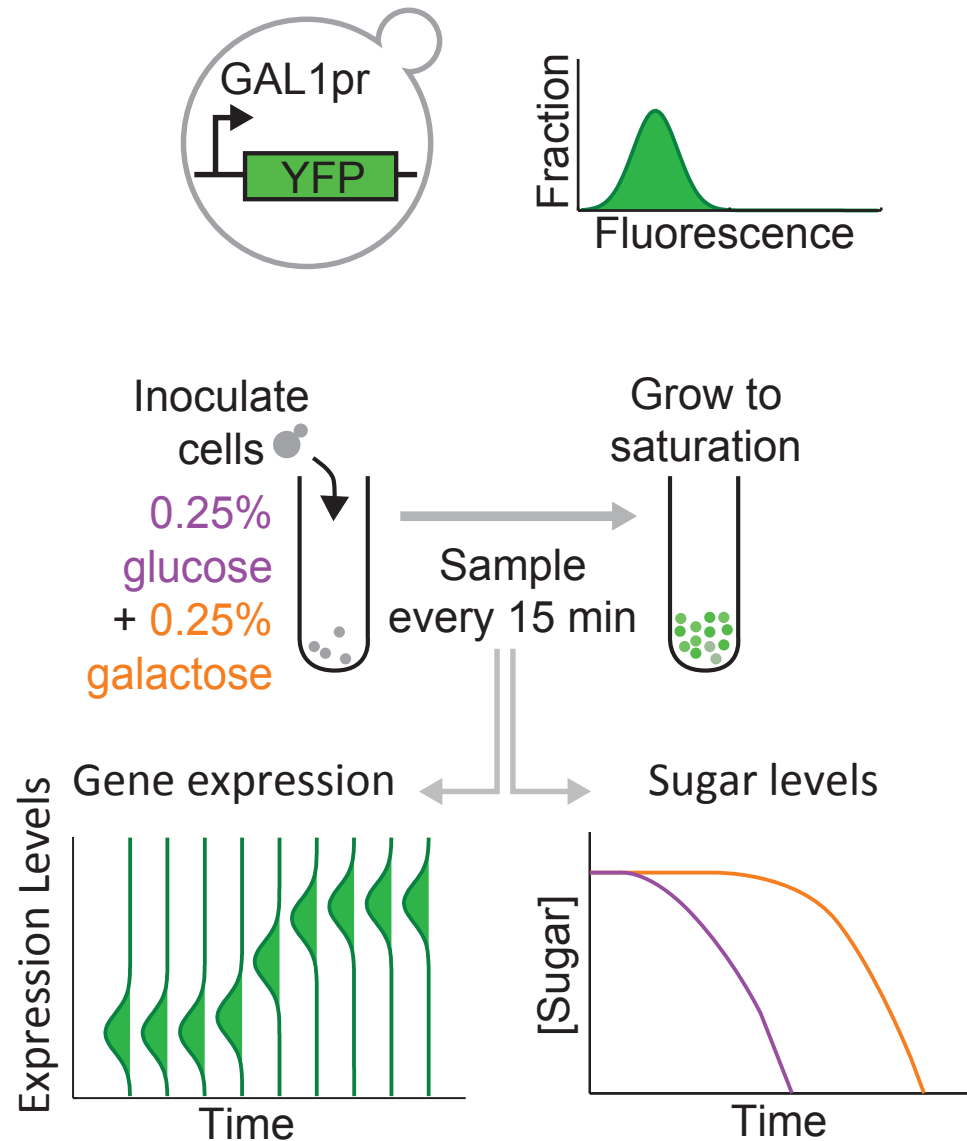
Found variation in yeast.

Showed that they can evolve diauxic shift length

Spencer et al. (Doebeli) –

E. coli diauxic length variability (Quick and slow responders)

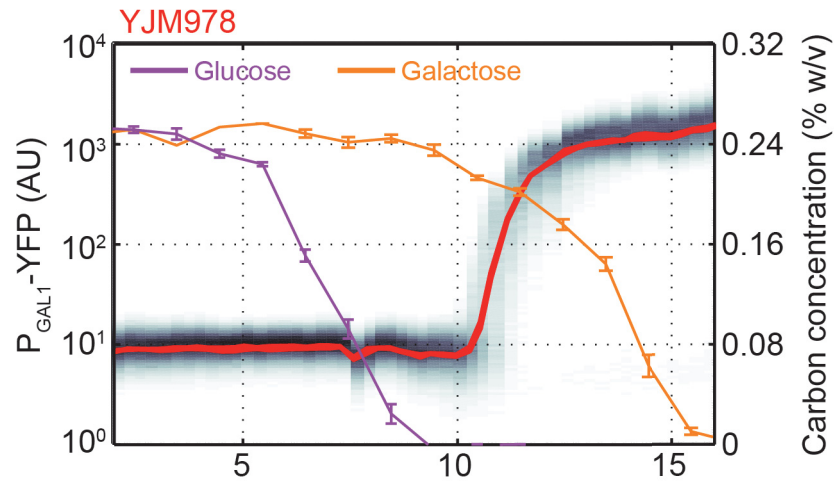
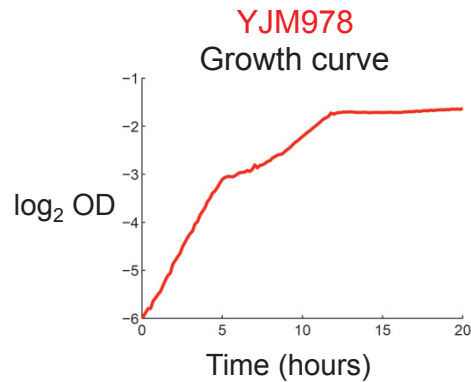
# How to tell if cells are preparing for galactose utilization before glucose depletion?





**YJM978** induces GAL genes *after* glucose depletion.

**BC187** induces GAL genes *before* glucose depletion.



# How should a cell decide whether to prepare?

Parameters	Costs	Benefits
Environmental	<p>Sensing –</p> <ul style="list-style-type: none"><li>Ability to sense</li><li>Predictability of environment</li><li>Time scale of cellular response versus environment</li><li>Cost of false response</li></ul>	<ul style="list-style-type: none"><li>Length of benefit</li><li>Size of benefit</li><li>Direct</li></ul>
Organismal	<p>Response –</p> <ul style="list-style-type: none"><li>Speed of response (execution time)</li><li>Beginning of response -<ul style="list-style-type: none"><li>Time decision is made</li><li>Time decision is acted upon</li></ul></li><li>Strength of response</li><li>Memory/Decay of response</li></ul>	<ul style="list-style-type: none"><li>Indirect</li></ul>

# Let nature tell us what it cares about

Voltaire: “Observe that noses were made to wear spectacles ...”

Differences in lag time:

New et al. (Verstrepen) –

Found variation in yeast.

Showed that they can evolve diauxic shift length

Spencer et al. (Doebeli) –

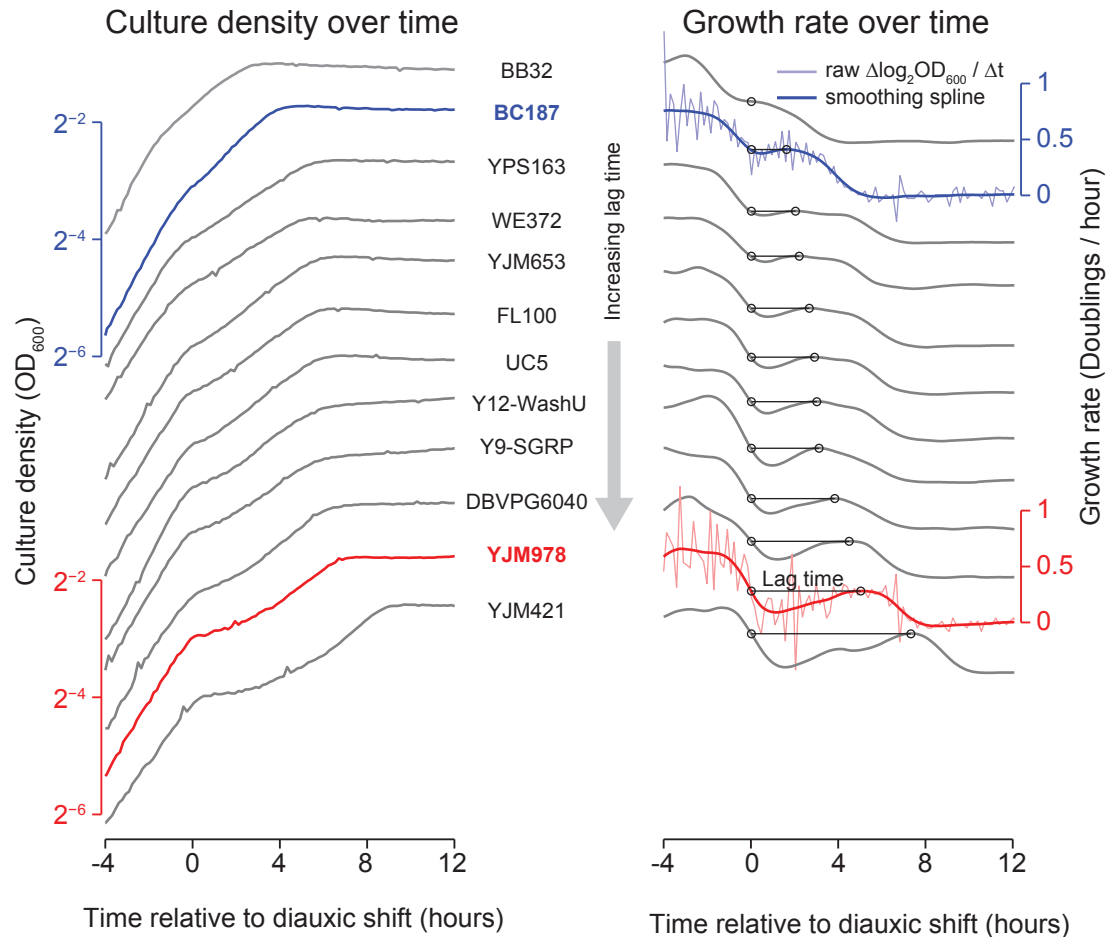
*E. coli* diauxic length variability (Quick and slow responders)

From The *Saccharomyces* Genome Resequencing Project (Sanger Institute) and Justin Fay (Washington U.)

63 strains of *S. cerevisiae*

- Genetically similar (can mate)
- Ecologically and geographically diverse
- Many phenotypic differences

# We have strains with differences in diauxic lag

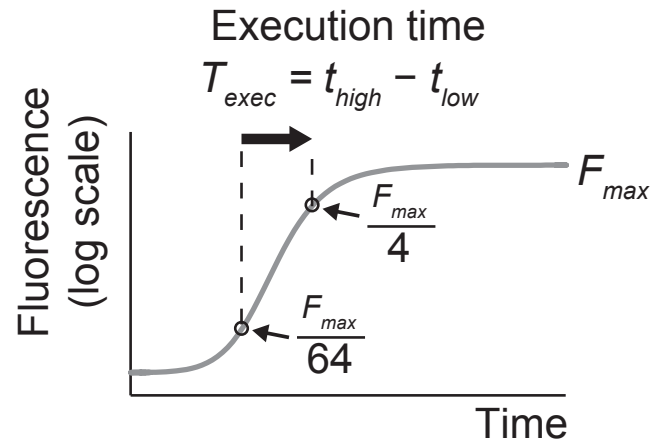
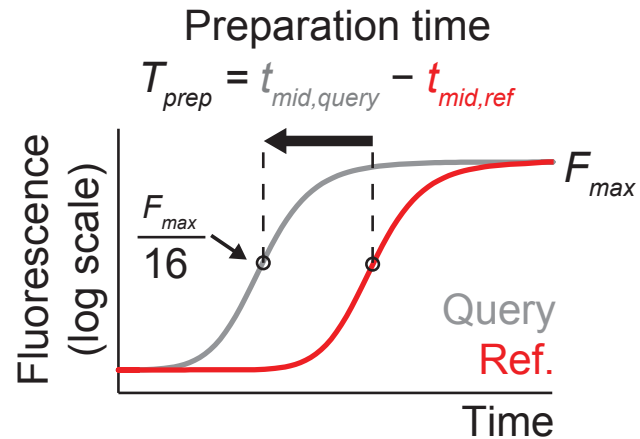
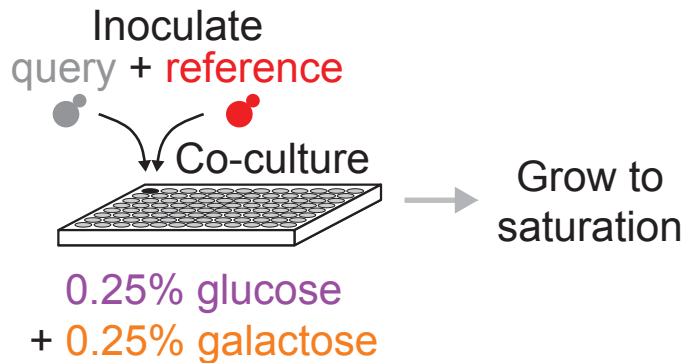


# Why are some cells preparing?

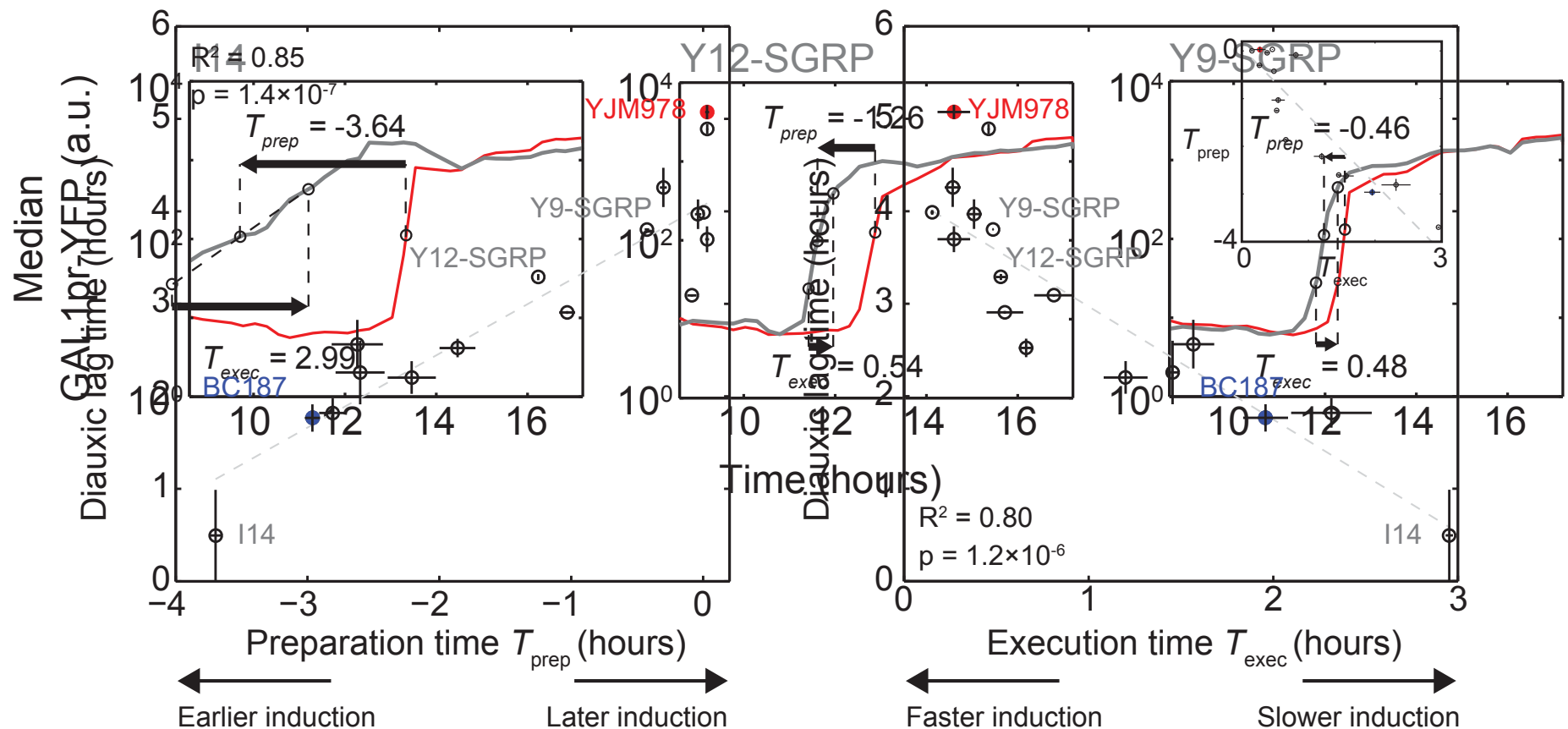
## Speed of response or timing of response?

Parameters	Costs	Benefits
Environmental	<p>Sensing –</p> <p><b>Ability to sense</b></p> <p>Predictability of environment</p> <p>Time scale of cellular response versus environment</p> <p>Cost of false response</p>	<p>Length of benefit</p> <p>Size of benefit</p> <p>Direct</p>
Organismal	<p>Response –</p> <p><u>Speed of response (execution time)</u></p> <p><u>Preparation Time-</u></p> <p>Time decision is made</p> <p>Time decision is acted upon</p> <p>Strength of response</p> <p>Memory/Decay of response</p>	<p>Indirect</p>

# Schema and metrics to compare preparation and execution times



# Preparation not execution time correlates with lag time

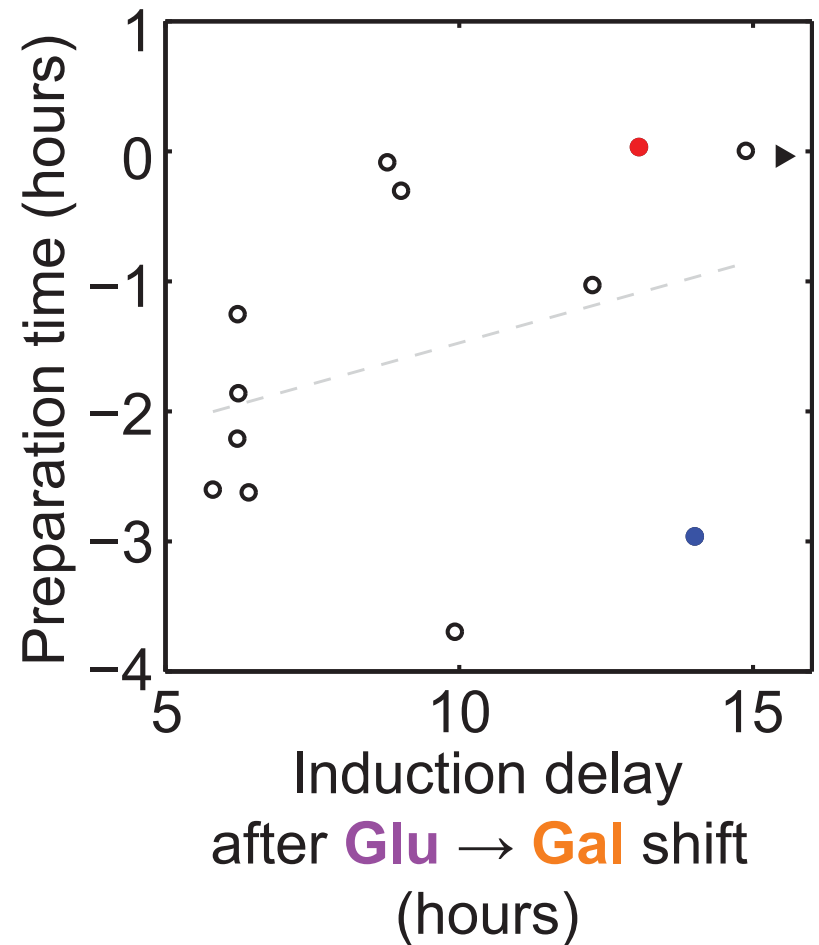
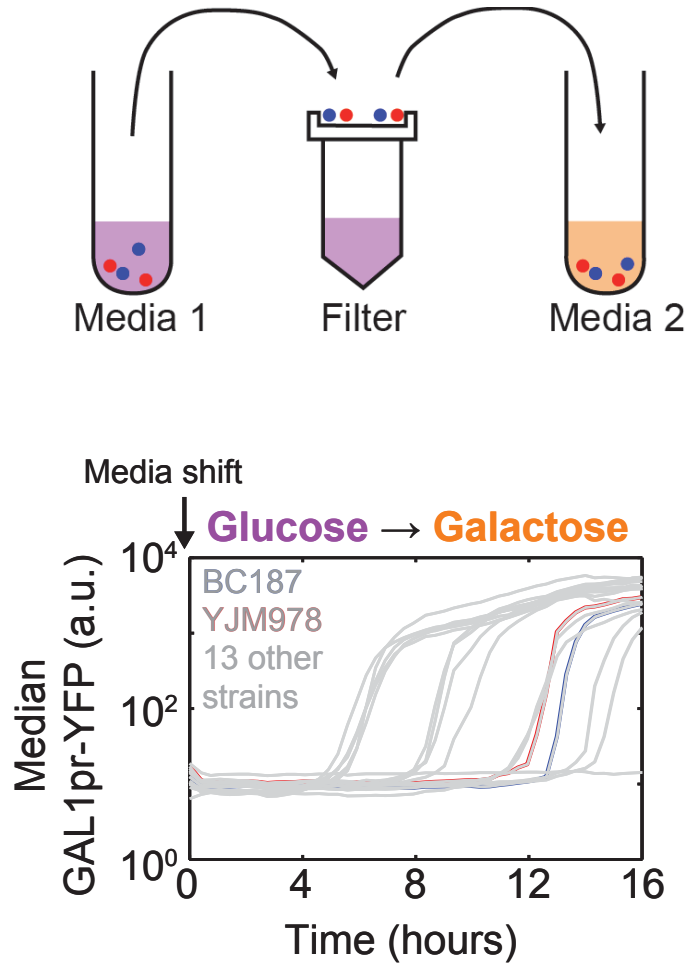


# What controls the preparation time?

Parameters	Costs	Benefits
Environmental	<p>Sensing –</p> <p><b>Ability to sense</b></p> <p>Predictability of environment</p> <p>Time scale of cellular response versus environment</p> <p>Cost of false response</p>	<p>Length of benefit</p> <p>Size of benefit</p> <p>Direct</p>
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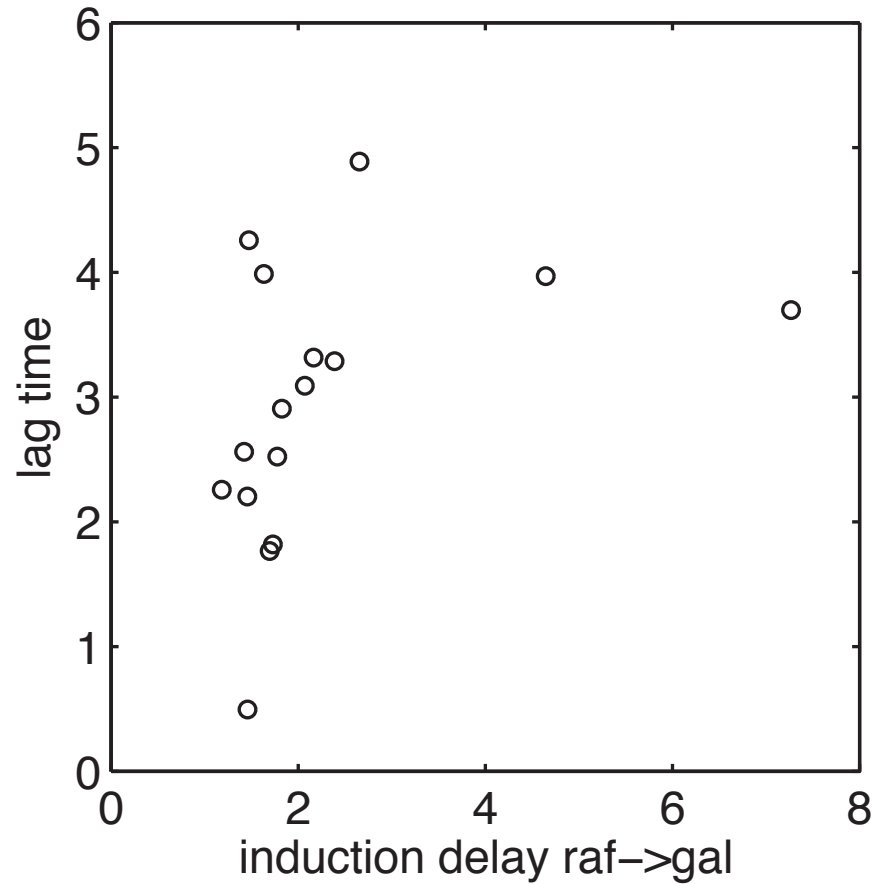
Differences between strains are not due to kinetics differences in delay before execution



# What controls preparation time?

Parameters	Costs	Benefits
Environmental	<p>Sensing –</p> <p><b>Ability to sense</b></p> <p>Predictability of environment</p> <p>Time scale of cellular response versus environment</p> <p>Cost of false response</p>	<p>Length of benefit</p> <p>Size of benefit</p> <p>Direct</p>
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Do difference in time until a response  
explain the diauxic lag?



Parameters	Costs	Benefits
Environmental	Sensing – <b>Ability to sense</b> Predictability of environment Time scale of cellular response versus environment Cost of false response	Length of benefit  Size of benefit  Direct
Organismal	Response – <del>Speed of response (execution time)</del> <b>Preparation Time -</b> <u>Time decision is made</u> <del>Time decision is acted upon</del> Strength of response Memory/Decay of response	Indirect

## Costs

## Benefits

## Sensing –

## Length of benefit

## Predictability of environment

## Time scale of cellular response

versus environment

## Cost of false response

## Size of benefit

## Direct

Response –

~~Speed of response (execution time)~~

## Indirect

### Preparation Time -

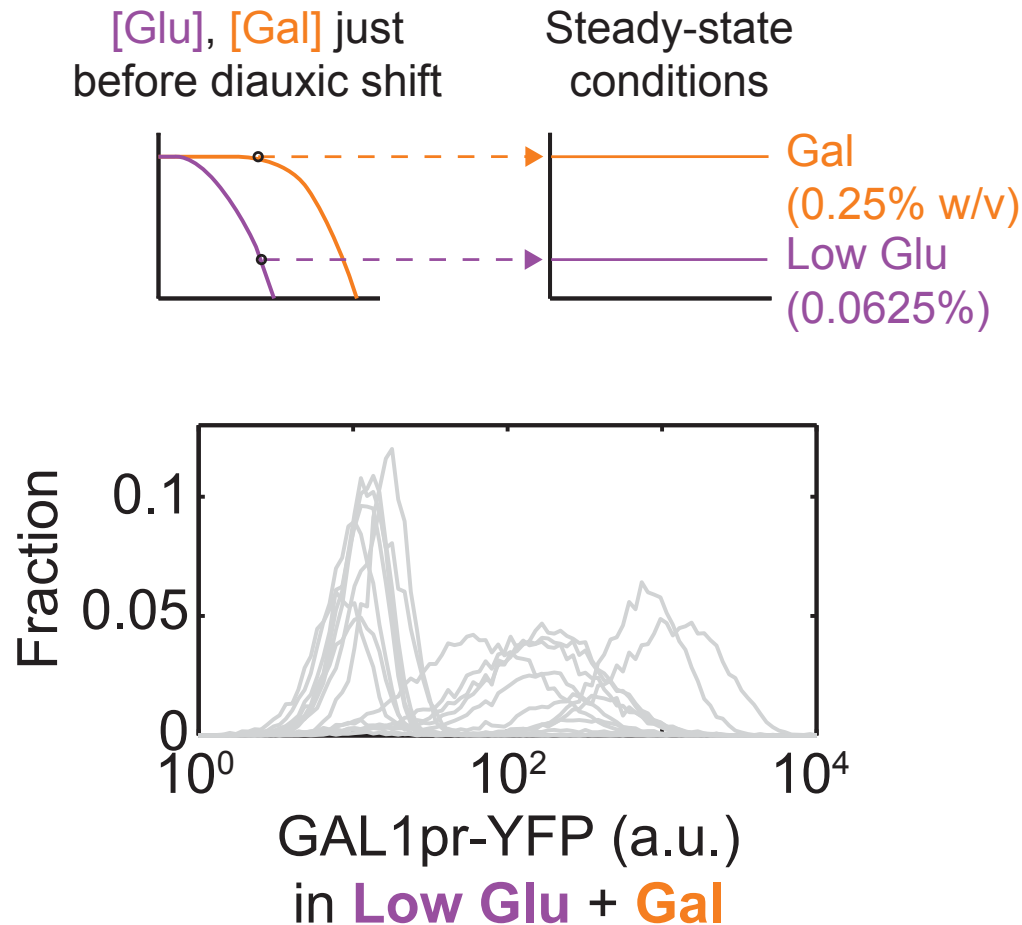
Time decision is made

~~Time decision is acted upon~~

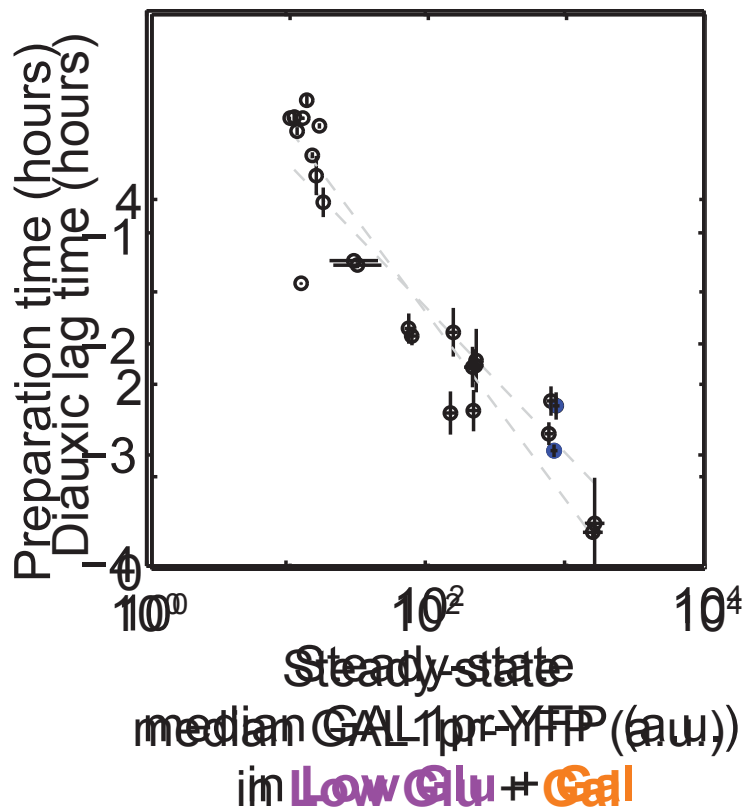
## Strength of response

## Memory/Decay of response

# Measuring differences in response – steady-state difference at low glucose



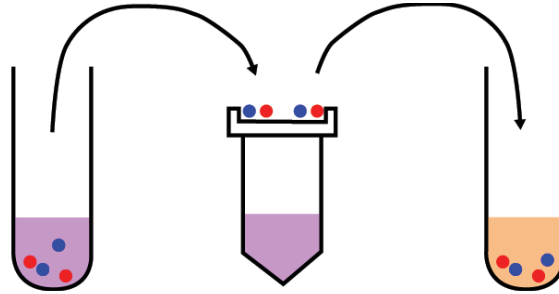
# Steady-state expression correlates with lag and preparation times



# Do all strains prepare?

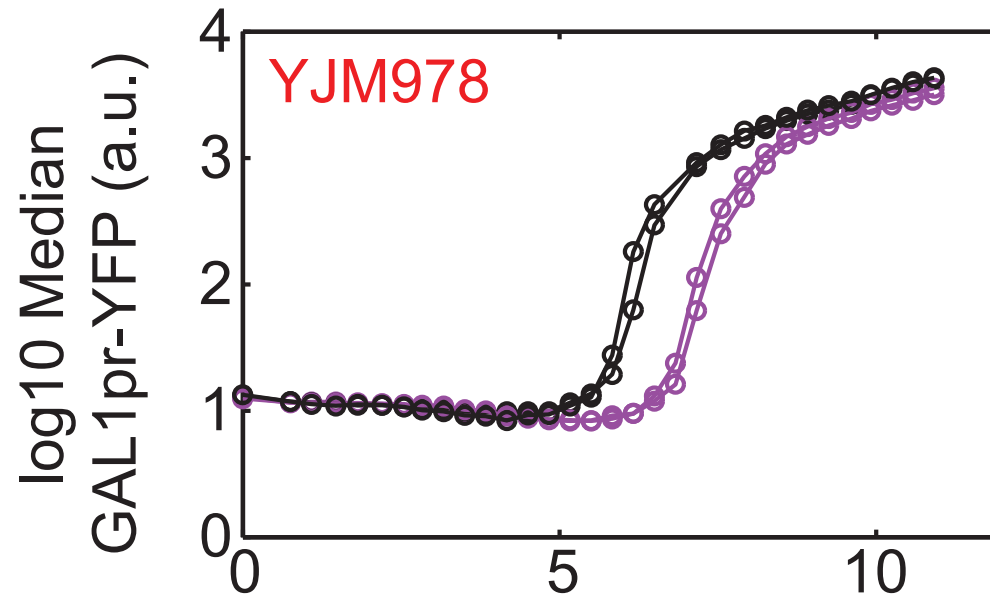
Parameters	Costs	Benefits
Environmental	<p>Sensing –</p> <p><b>Ability to sense</b></p> <p>Predictability of environment</p> <p>Time scale of cellular response versus environment</p> <p>Cost of false response</p>	<p>Length of benefit</p> <p>Size of benefit</p> <p>Direct</p>
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# Do all strains prepare?



Low glucose + galactose  
Low glucose

galactose  
galactose

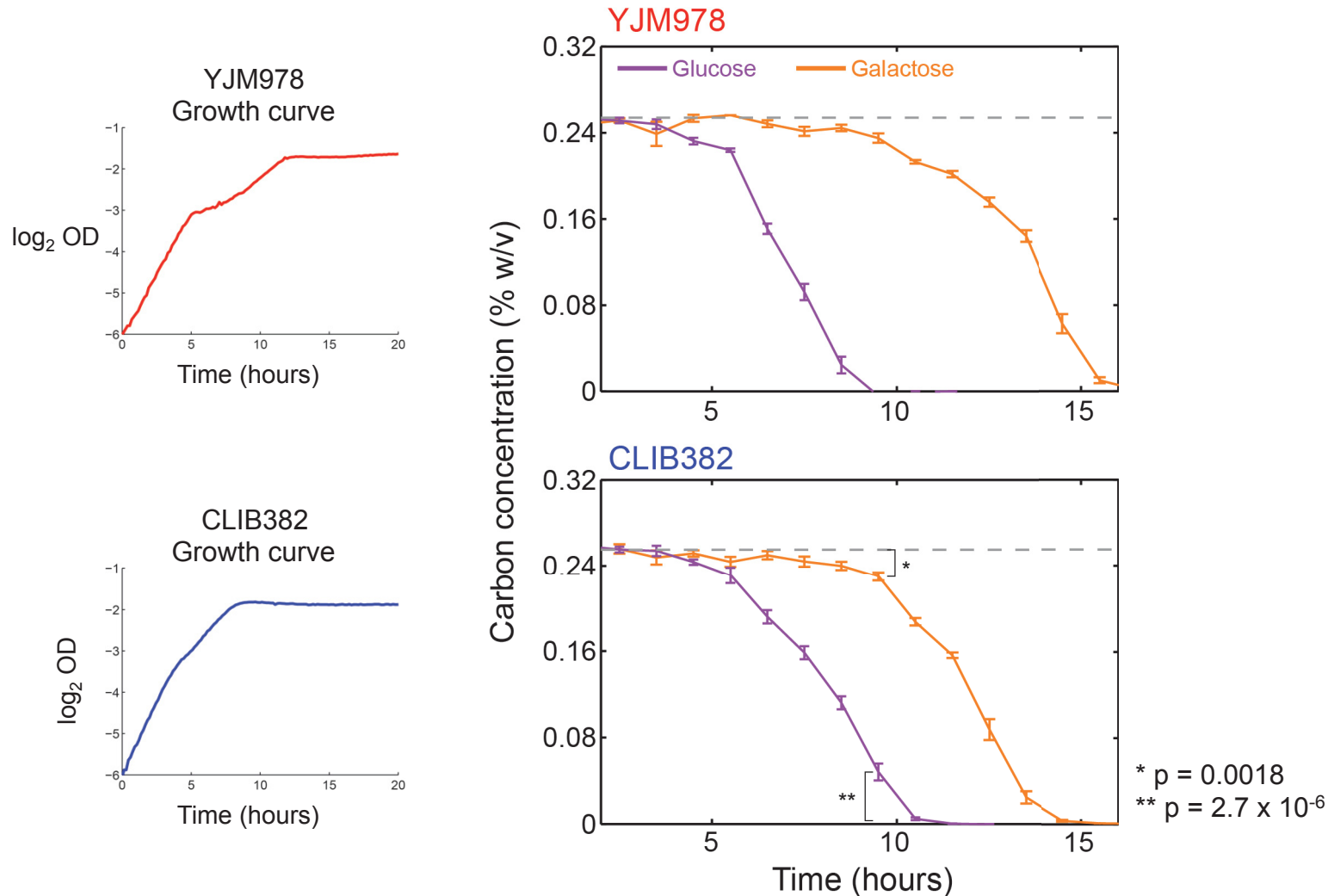




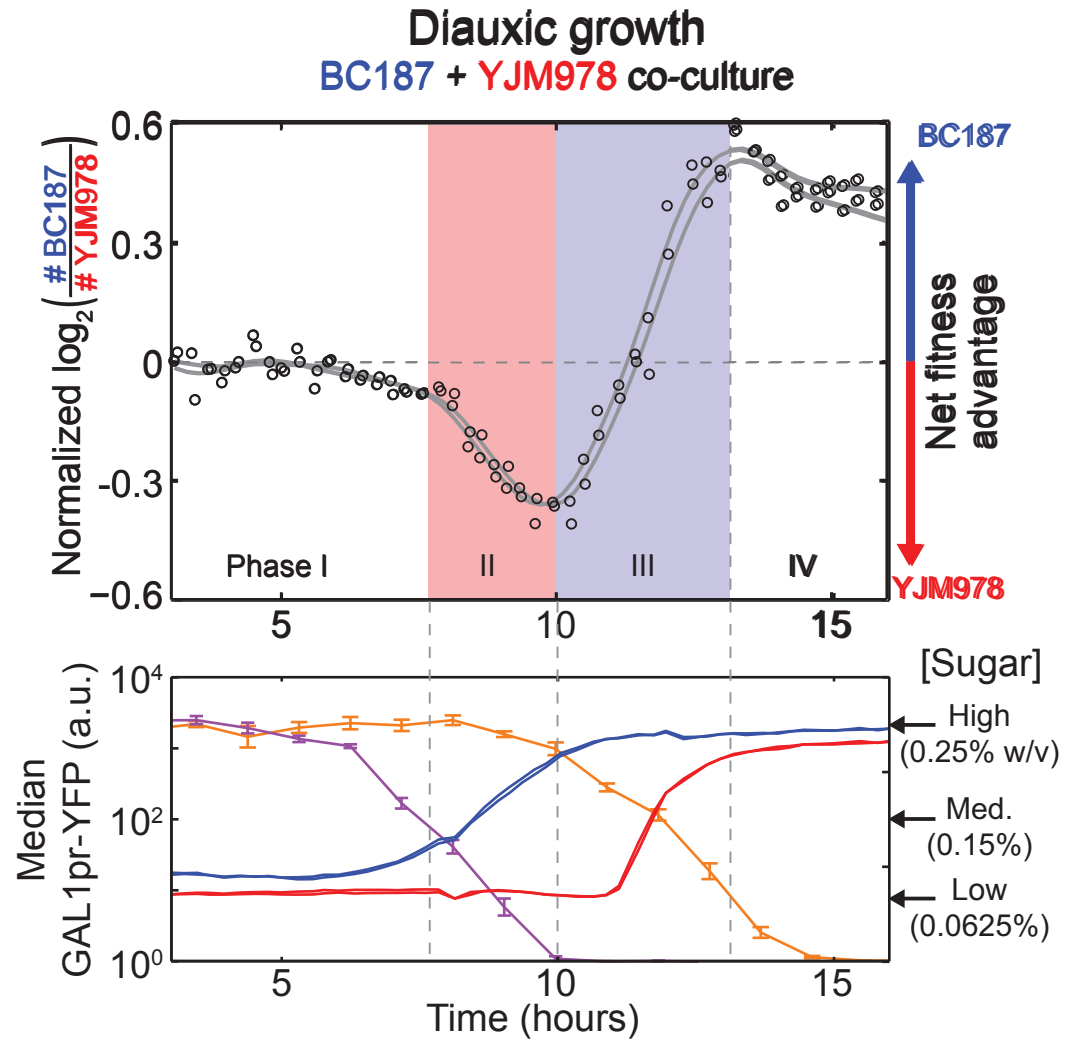
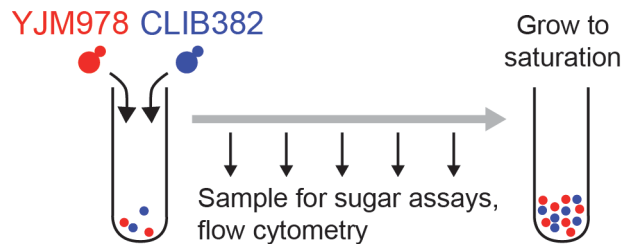
# What are the cost and benefits of preparing?

Parameters	<u>Costs</u>	<u>Benefits</u>
Environmental	<p>Sensing –</p> <p><b>Ability to sense</b></p> <p>Predictability of environment</p> <p><b>Time scale of cellular response</b></p> <p>versus environment</p> <p>Cost of false response</p>	<p>Length of benefit</p> <p>Size of benefit</p> <p>Direct</p>
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# Short diauxic lag is associated with earlier galactose consumption



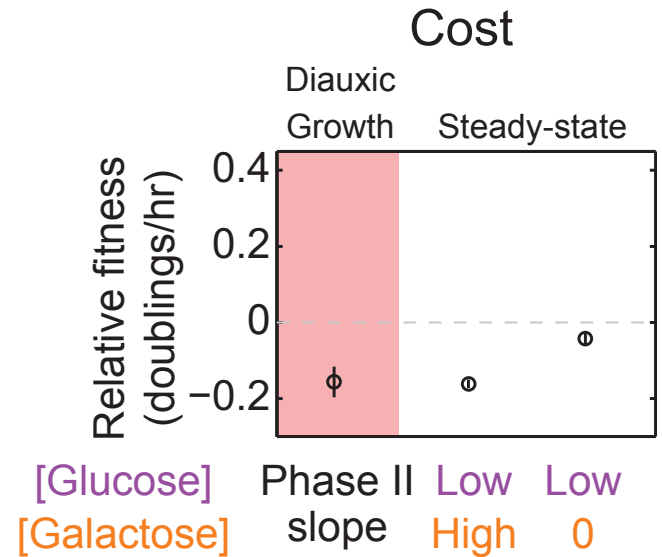
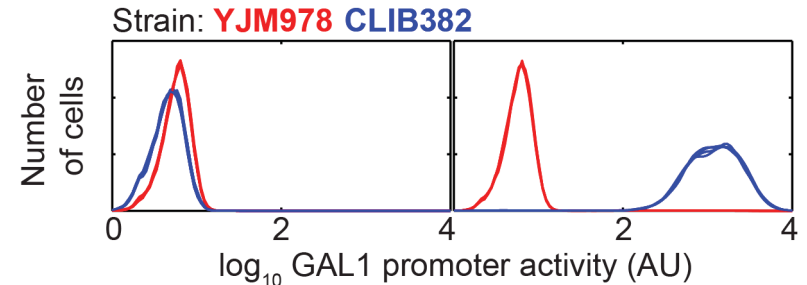
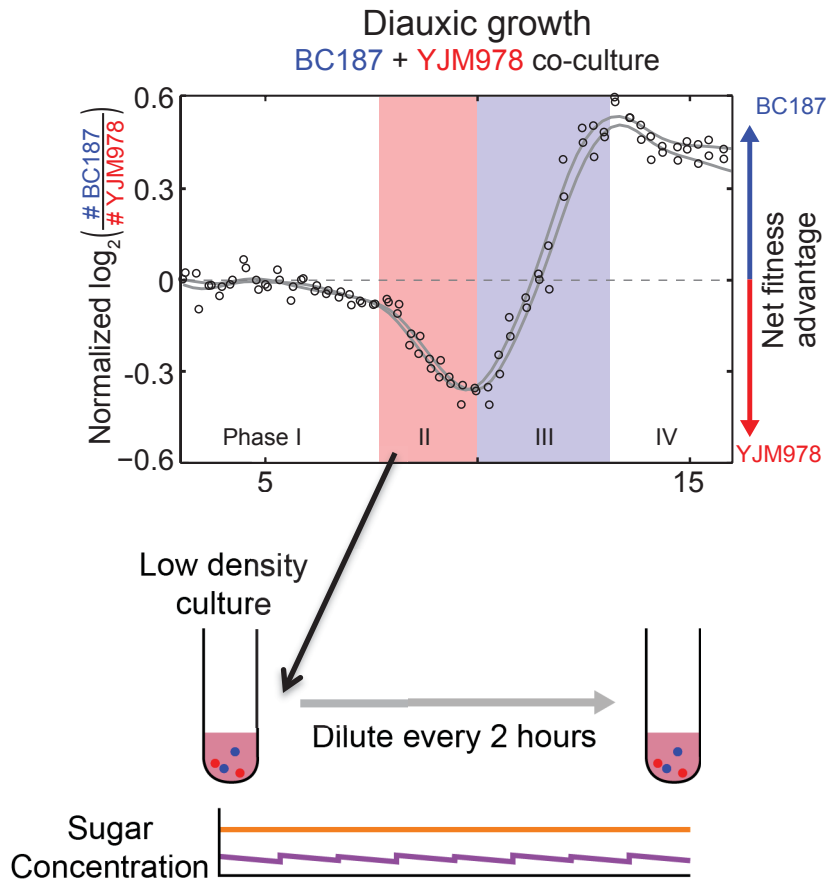
# Measuring the cost and benefits of preparation



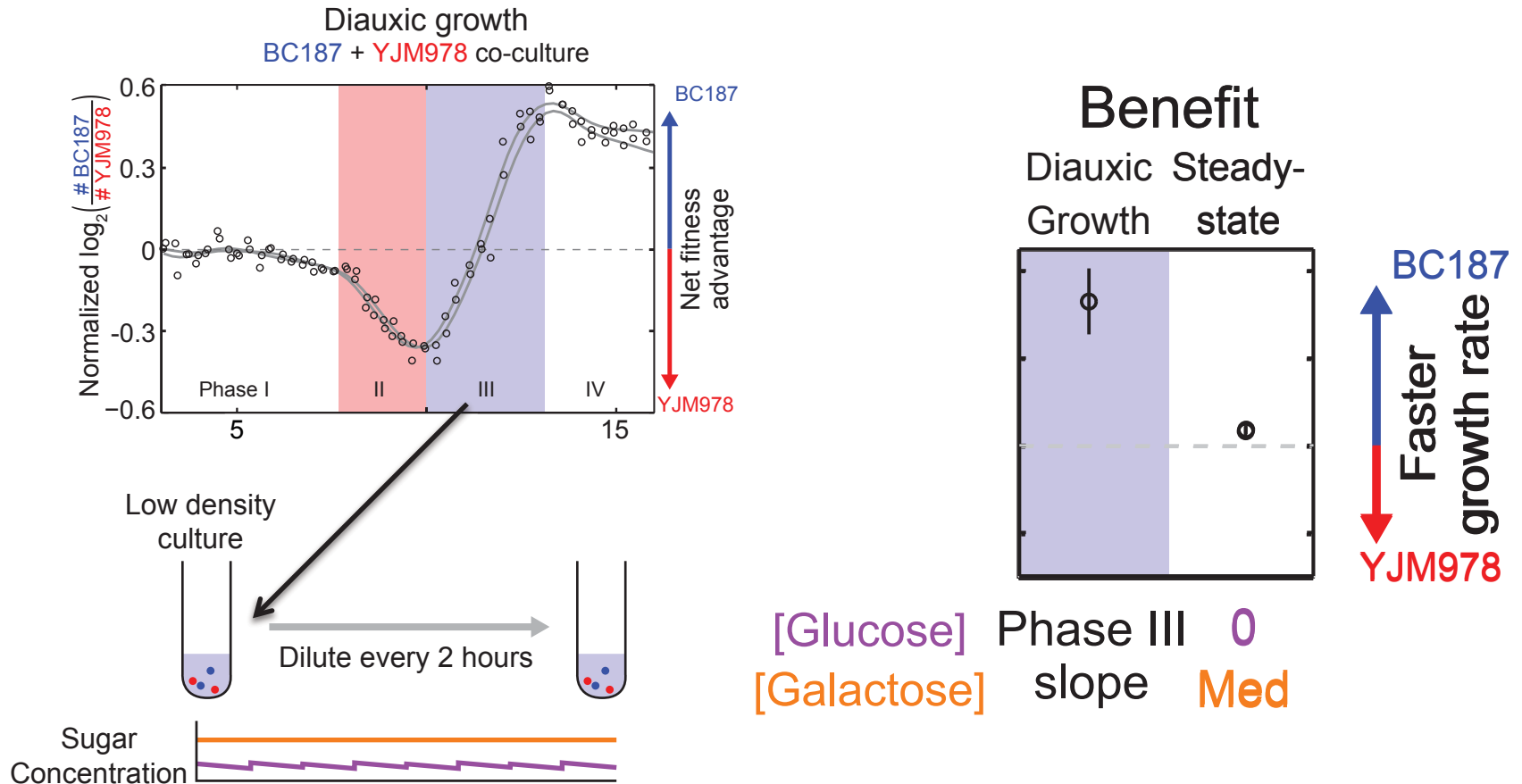
# What is the nature of the cost and benefits?

Parameters	Costs	Benefits
Environmental	<p>Sensing –</p> <p><b>Ability to sense</b></p> <p>Predictability of environment</p> <p><b>Time scale of cellular response</b></p> <p>versus environment</p> <p>Cost of false response</p>	<p>Length of benefit</p> <p>Size of benefit</p> <p>Direct</p>
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# Is the cost steady-state or kinetic?



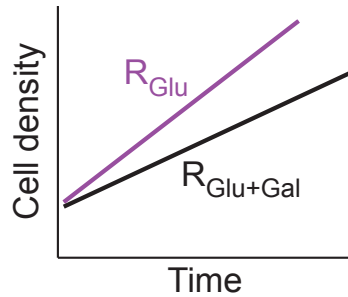
# Is the benefit steady-state or kinetic?



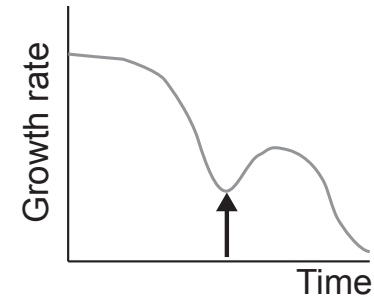
# Is the decision to response limited by the cost and benefits we measure?

Parameters	Costs – steady-state	Benefits - kinetic
Environmental	Sensing – <b>Ability to sense</b> Predictability of environment <b>Time scale of cellular response</b> versus environment <b>Cost of false response</b>	<b>Length of benefit</b>  <b>Size of benefit</b>  <b>Direct</b>
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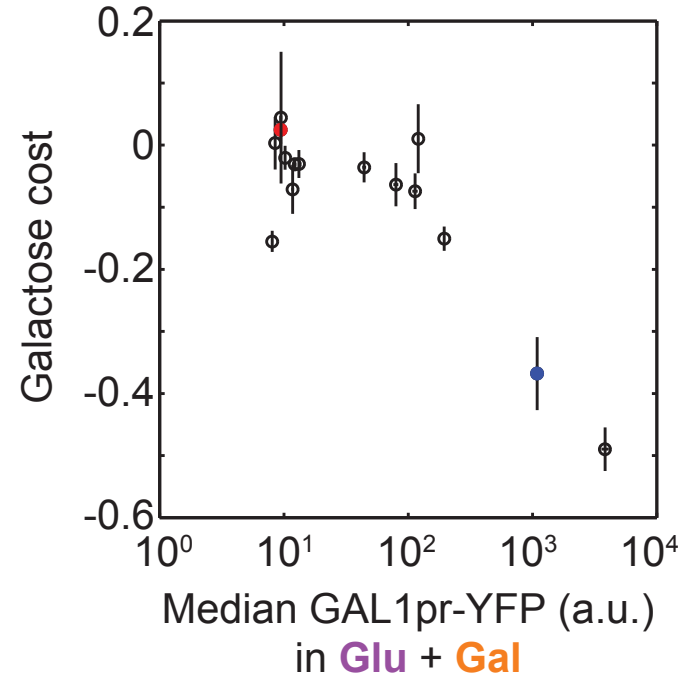
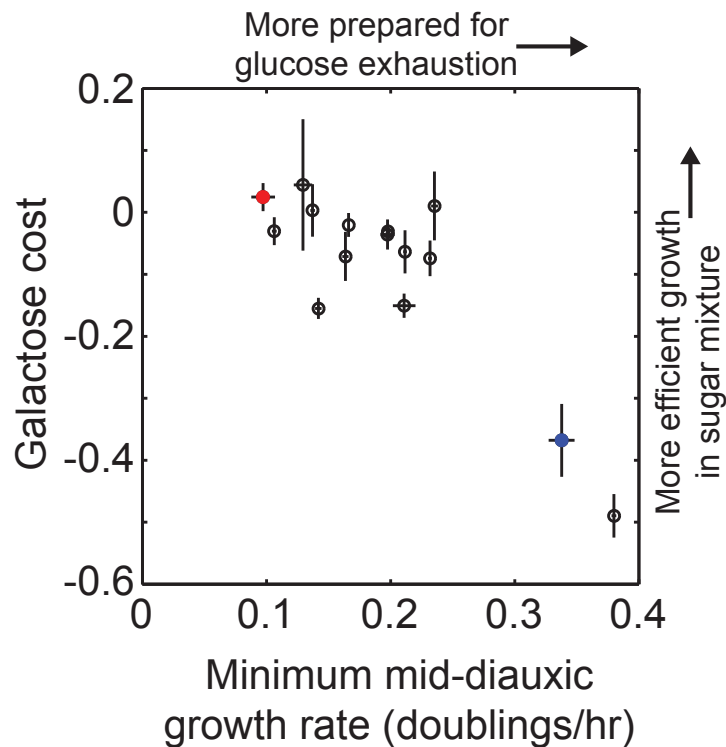
# Trade-off between costs and benefits



$$\text{Preparation cost} = R_{\text{Glu+Gal}} - R_{\text{Glu}}$$



Minimum mid-diauxic growth rate



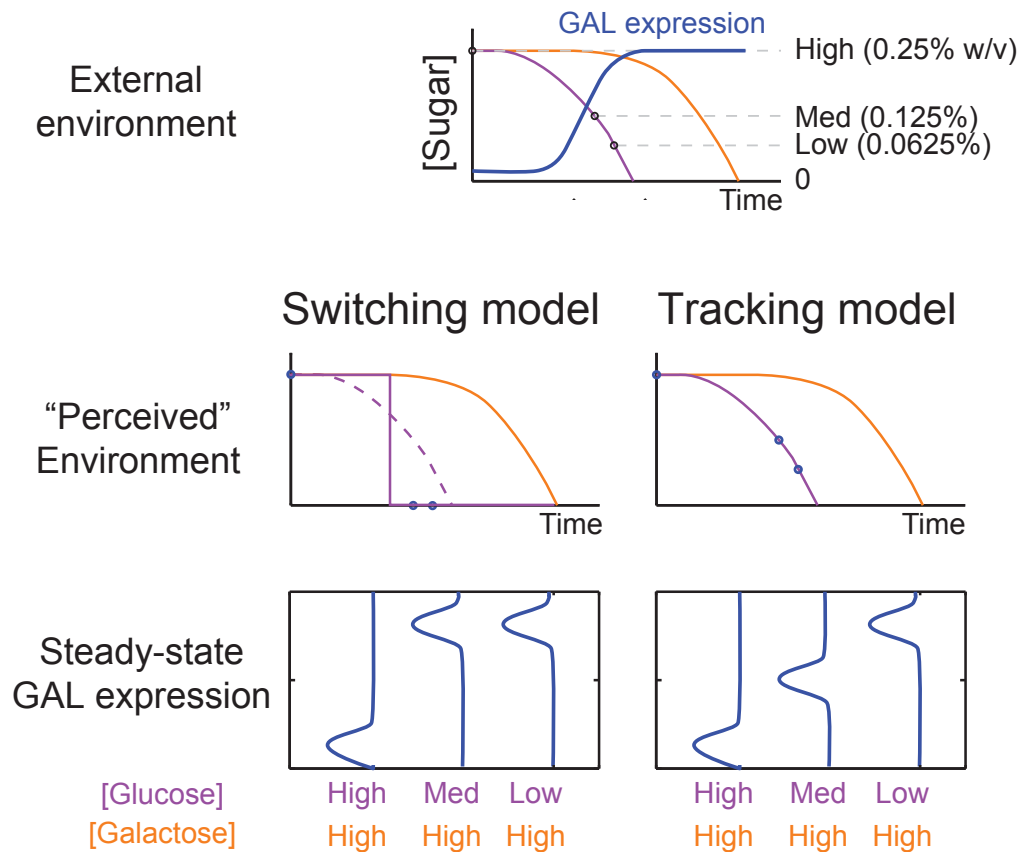


# Is the decision to response limited by the cost and benefits we measure?

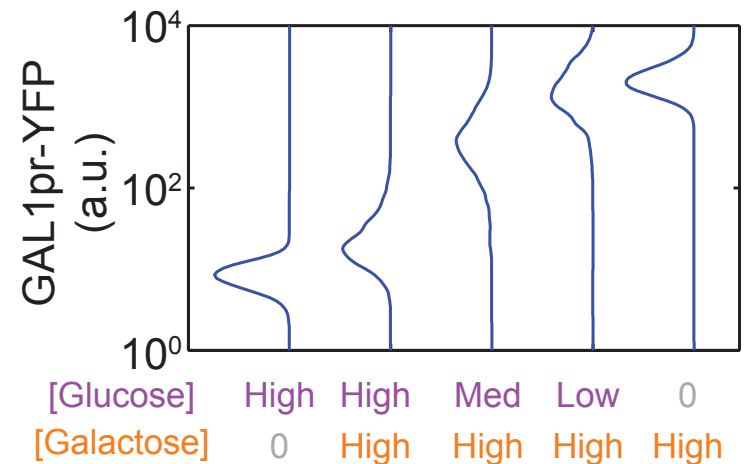
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Environmental	<div>Sensing –</div> <div><b>Ability to sense</b></div> <div>Predictability of environment</div> <div><b>Time scale of cellular response</b></div> <div>versus environment</div> <div><b>Cost of false response</b></div>	<div><b>Length of benefit</b></div> <div><b>Size of benefit</b></div> <div><b>Direct</b></div>
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# Does glucose modulate galactose response

## - do cell switch or track?



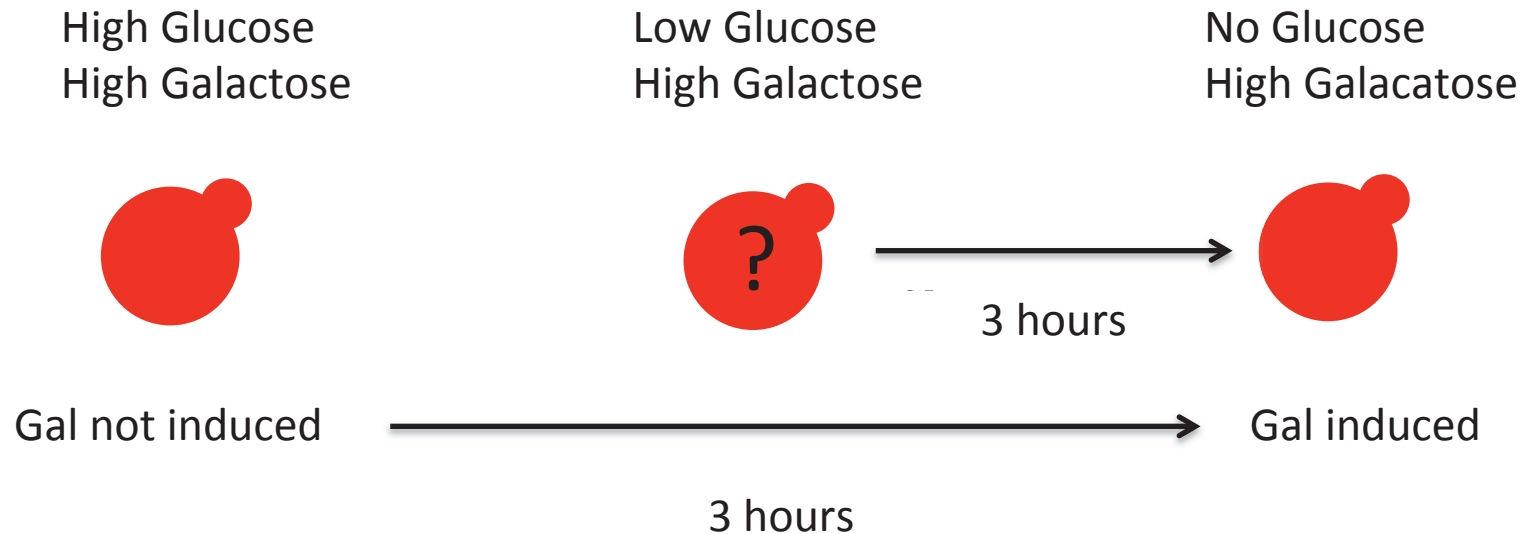
Cells Track!



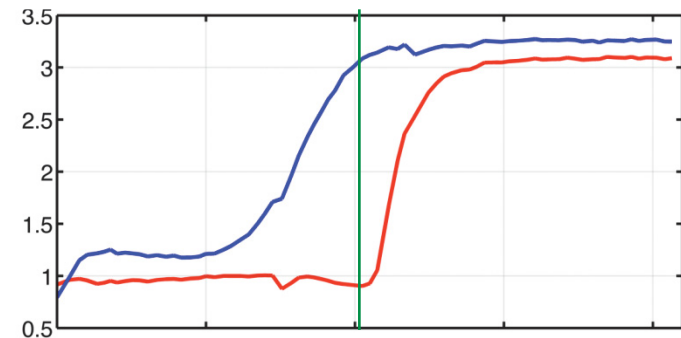
# Cells are preparing. How do they decide when and how to respond?

Parameters	Costs – steady-state	Benefits - kinetic
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# Why do we see multiple strategies in nature?



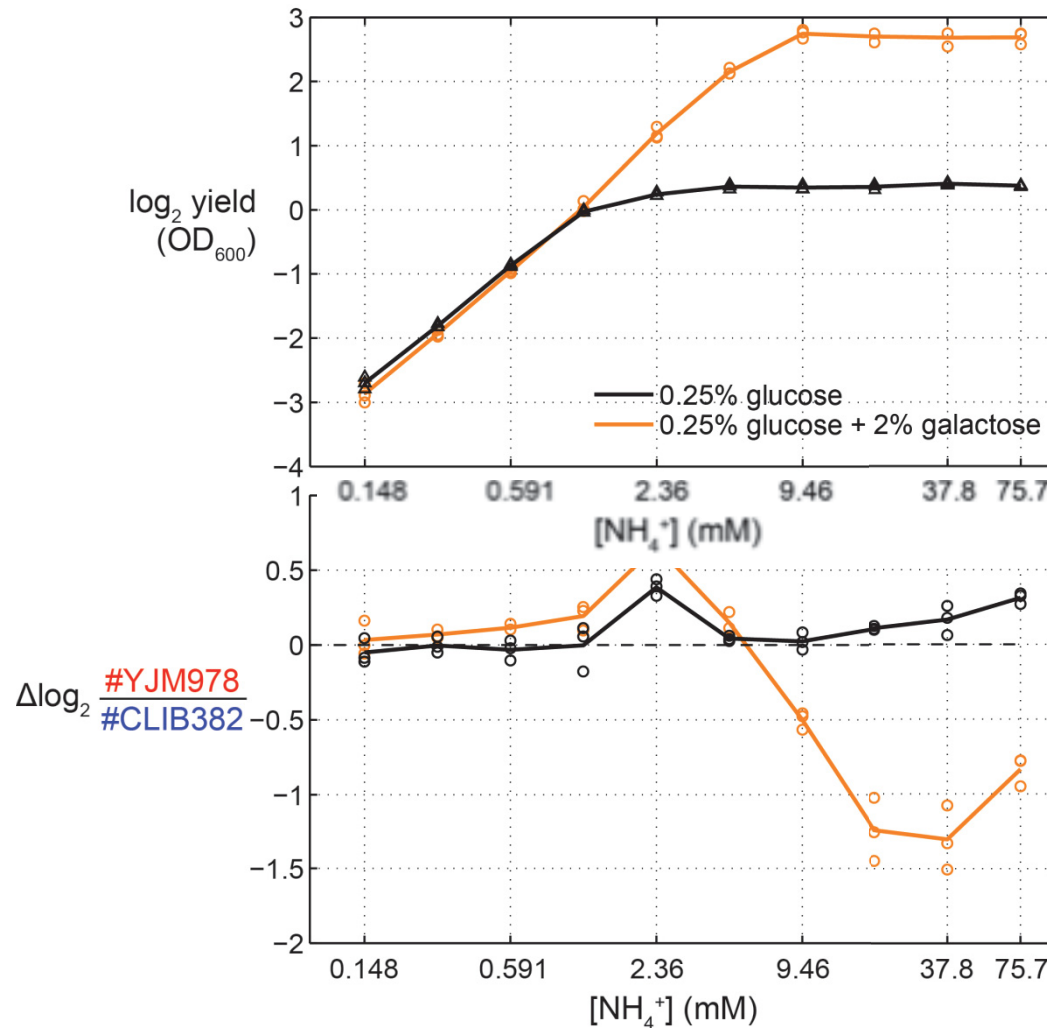
But what if a different nutrient becomes limiting and it cannot be predicted?



# Cells are preparing. How do they decide when and how to respond?

Parameters	Costs – steady-state	Benefits - kinetic
Environmental	Sensing – <b>Ability to sense</b> <u>Predictability of environment</u> <b>Time scale of cellular response</b> versus environment <b>Cost of false response</b>	<b>Length of benefit</b>  <b>Size of benefit</b>  <b>Direct</b>
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If there are not enough non-carbon nutrients to finish consuming carbon, it can “freeze time”.



Presence of galactose selects against pre-emptive utilization of galactose.

# Cells are preparing. How do they decide when and how to respond?

Parameters	Costs – steady-state	Benefits - kinetic
Environmental	Sensing – <b>Ability to sense</b> <u>Predictability of environment</u> <b>Time scale of cellular response</b> <u>versus environment</u> <b>Cost of false response</b>	<b>Length of benefit</b> <b>Size of benefit</b> <b>Direct</b>
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# Acknowledgements

## Ratio Sensing

**Renan Escalante**

Chris Marx

**Yonatin Savir**

Sean Carroll

John Ingraham

## Anticipation

**Jue Wang**

Esha Atolia

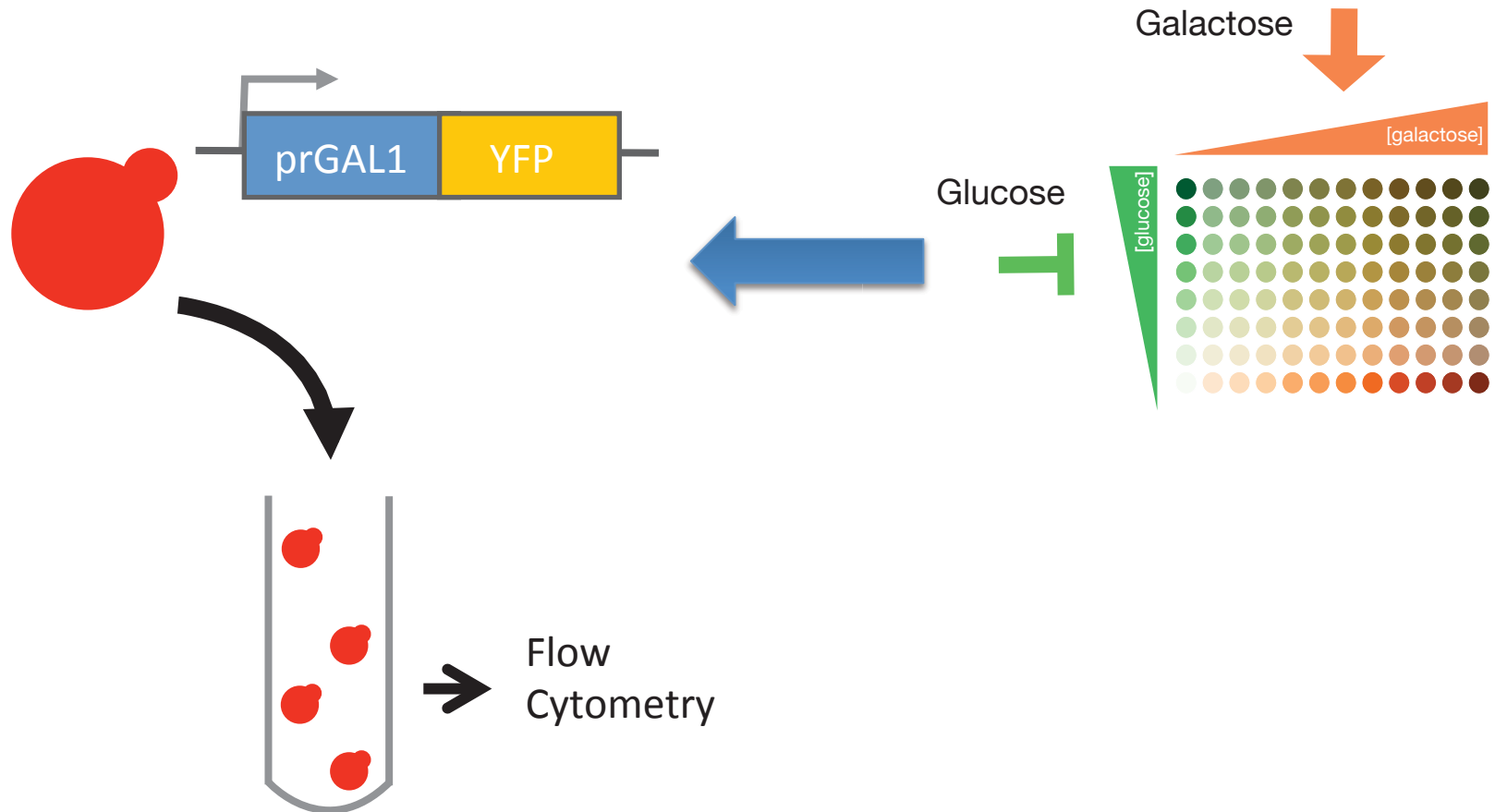
Bo Hua

Yonatin Savir

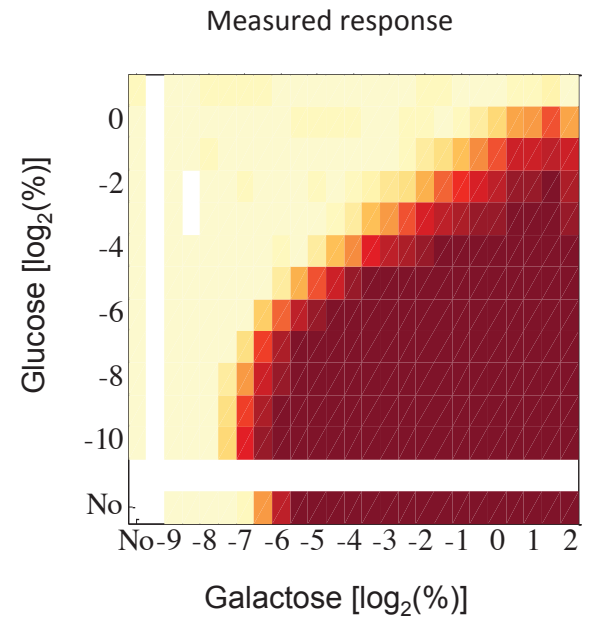
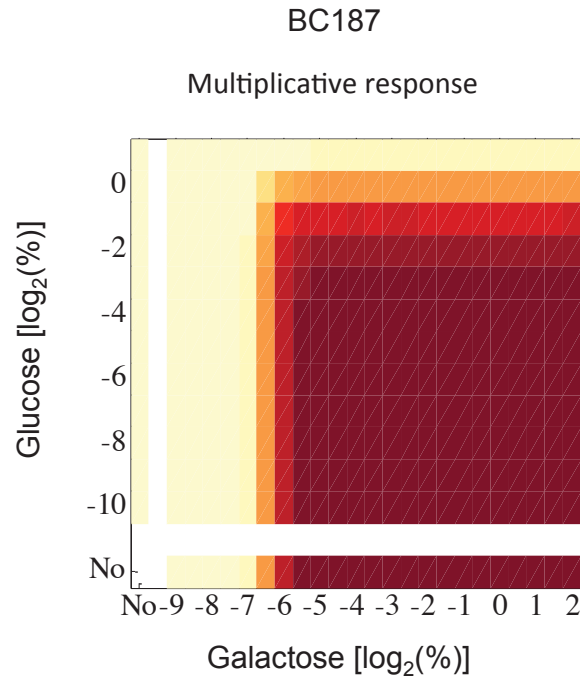
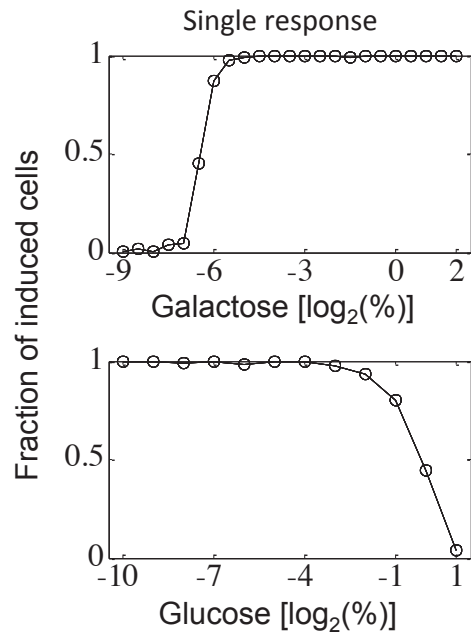
Renan Escalante



# How do cells respond to galactose in the presence of glucose?

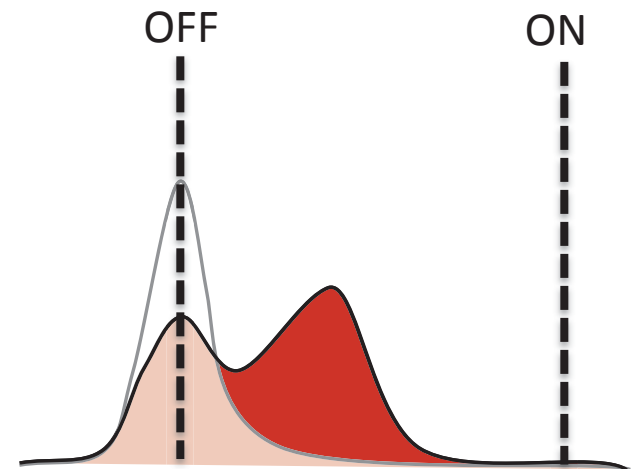
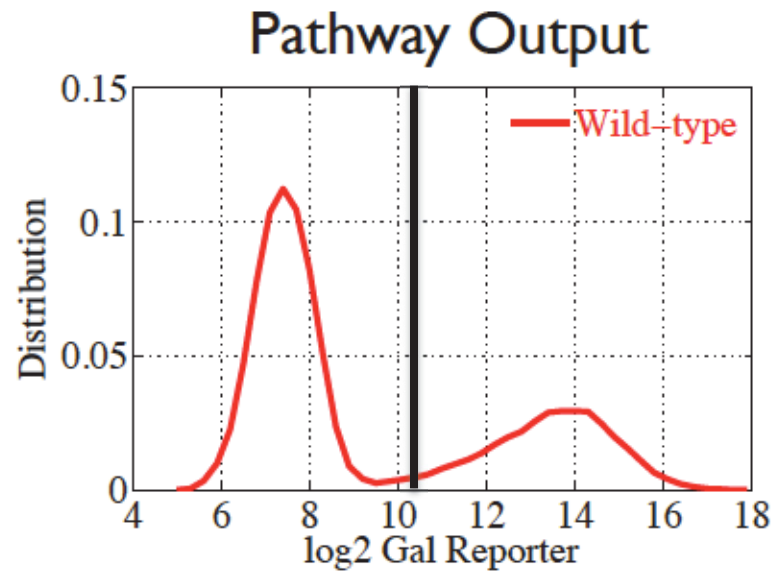


# Response to glucose and galactose

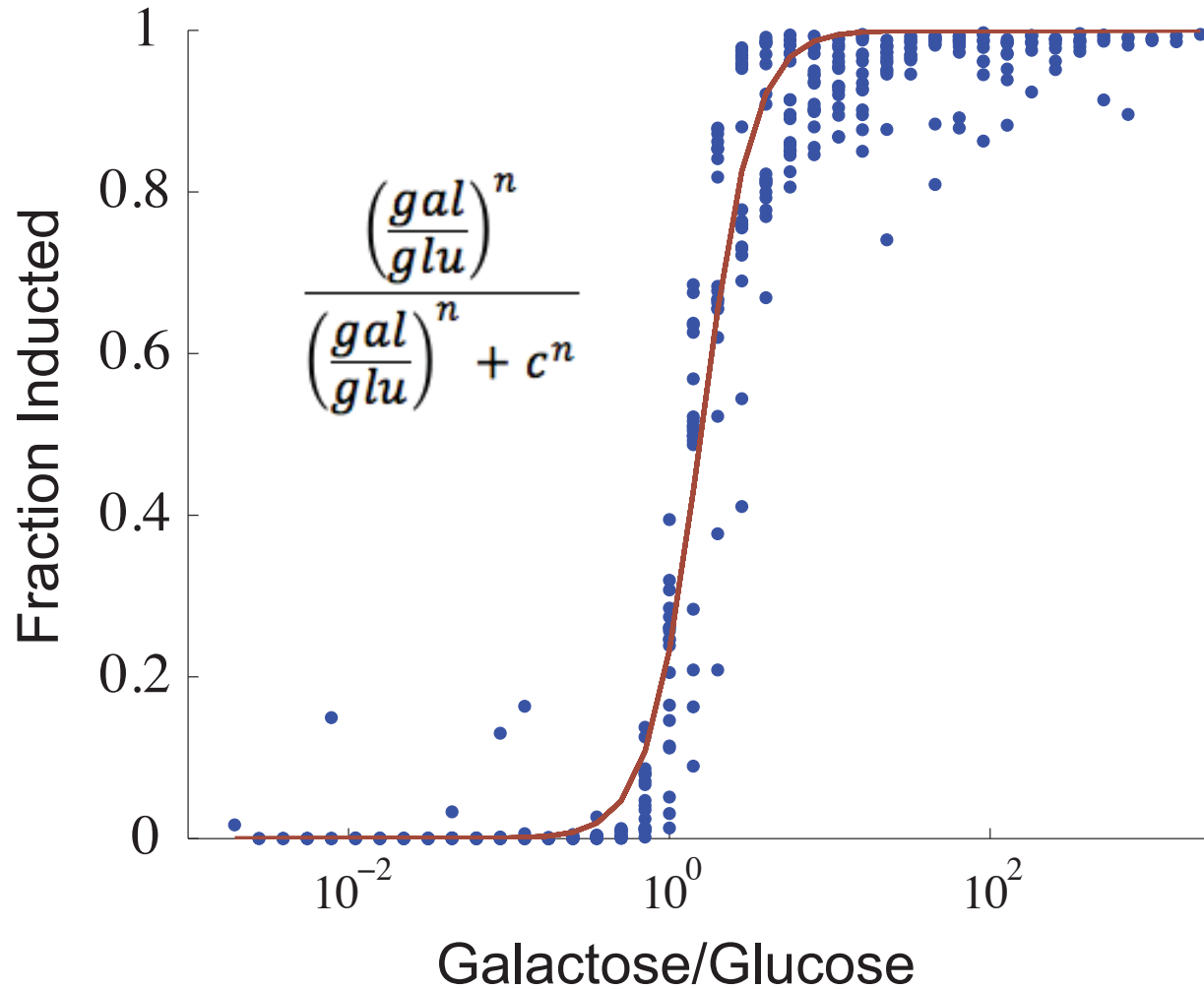


# Decision versus output

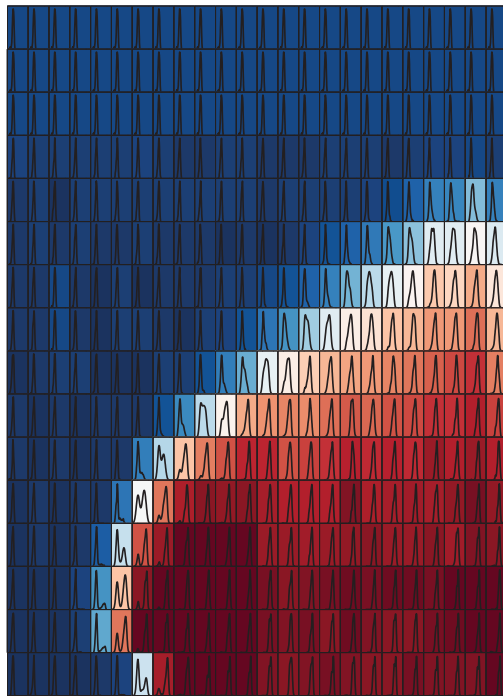
Output = Decision



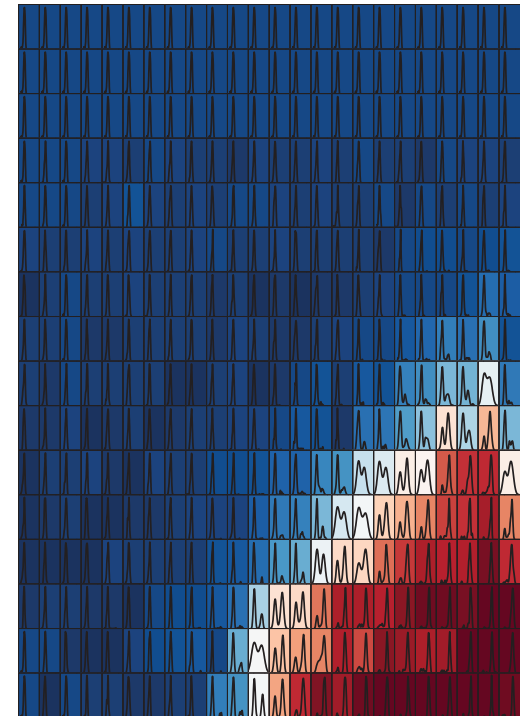
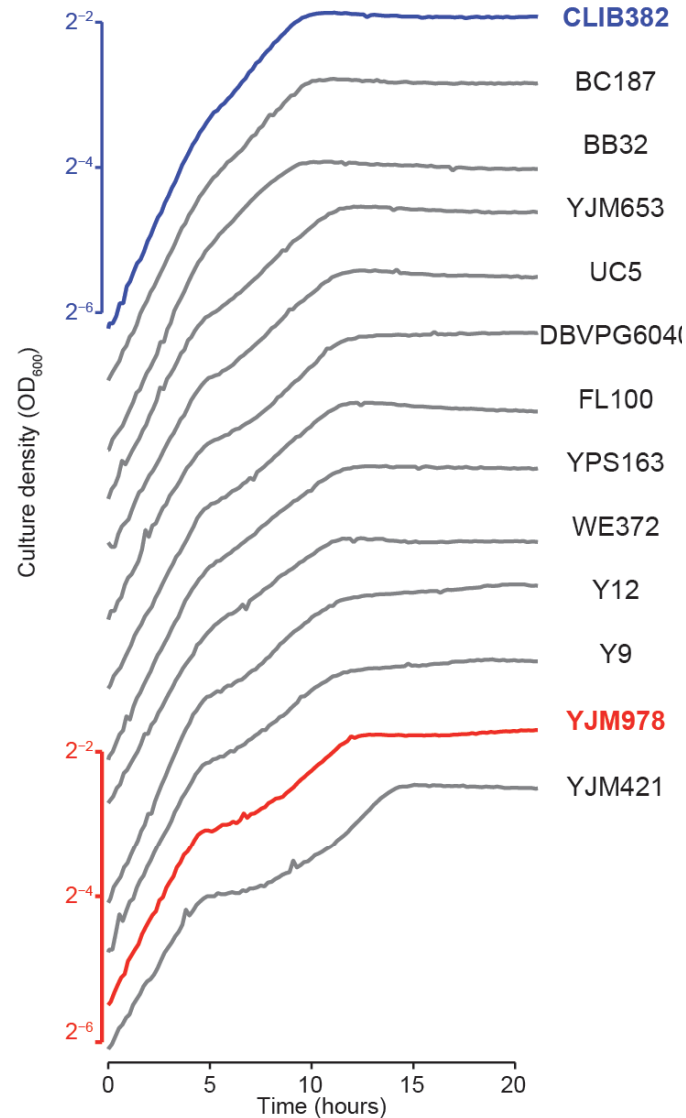
# Response is one dimensional



# Diauxuxic lag duration varies across strains with similar growth rates in galactose



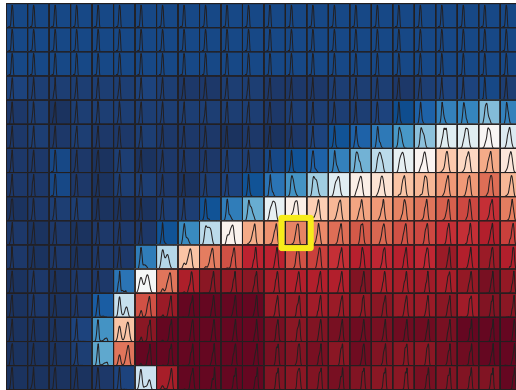
CLIB382



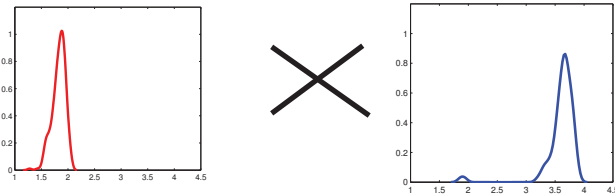
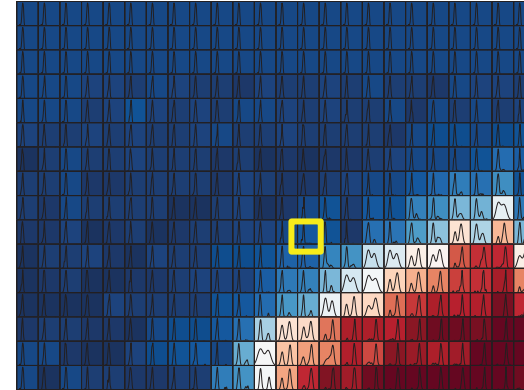
YJM978

# How many genes?

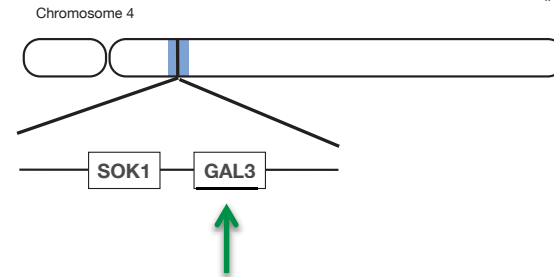
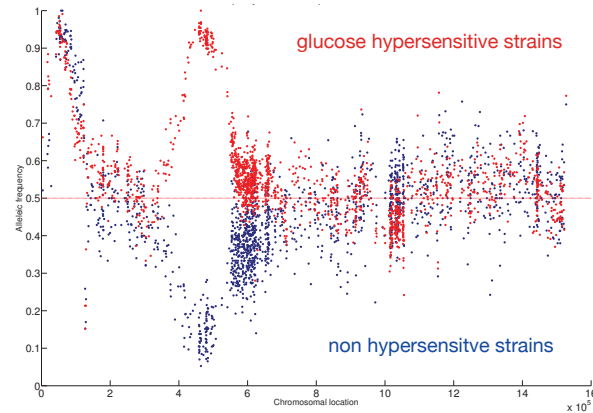
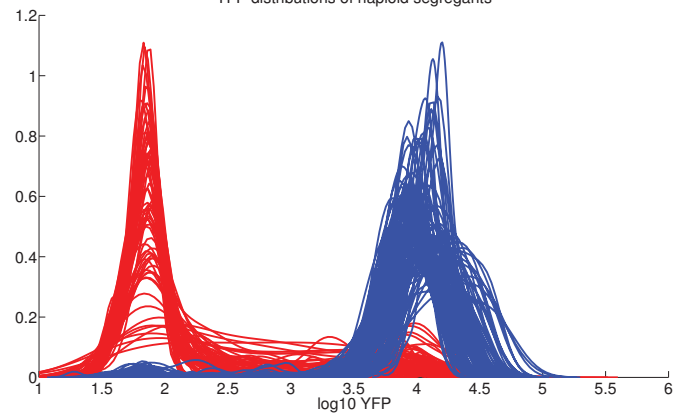
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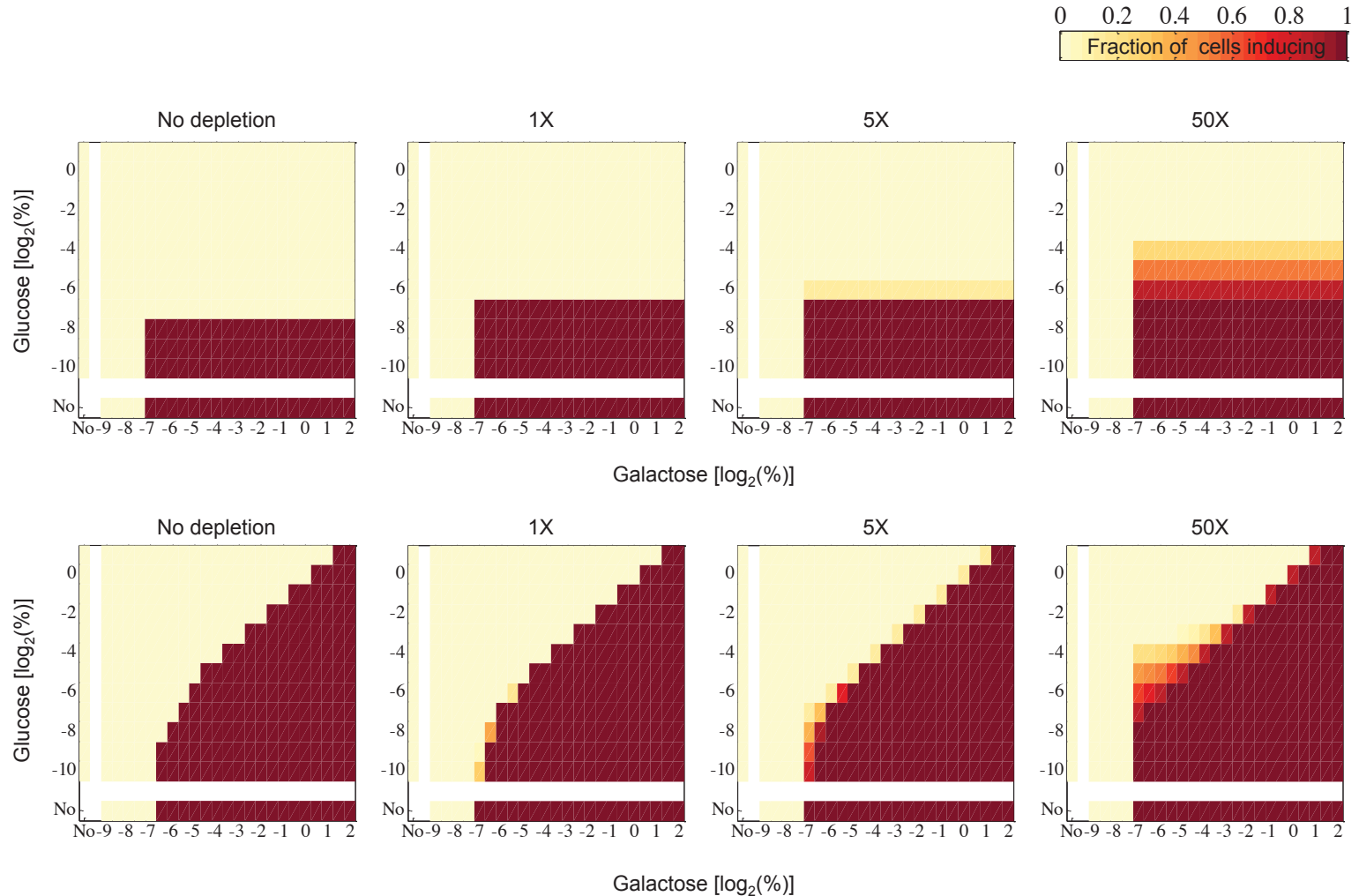
YJM978



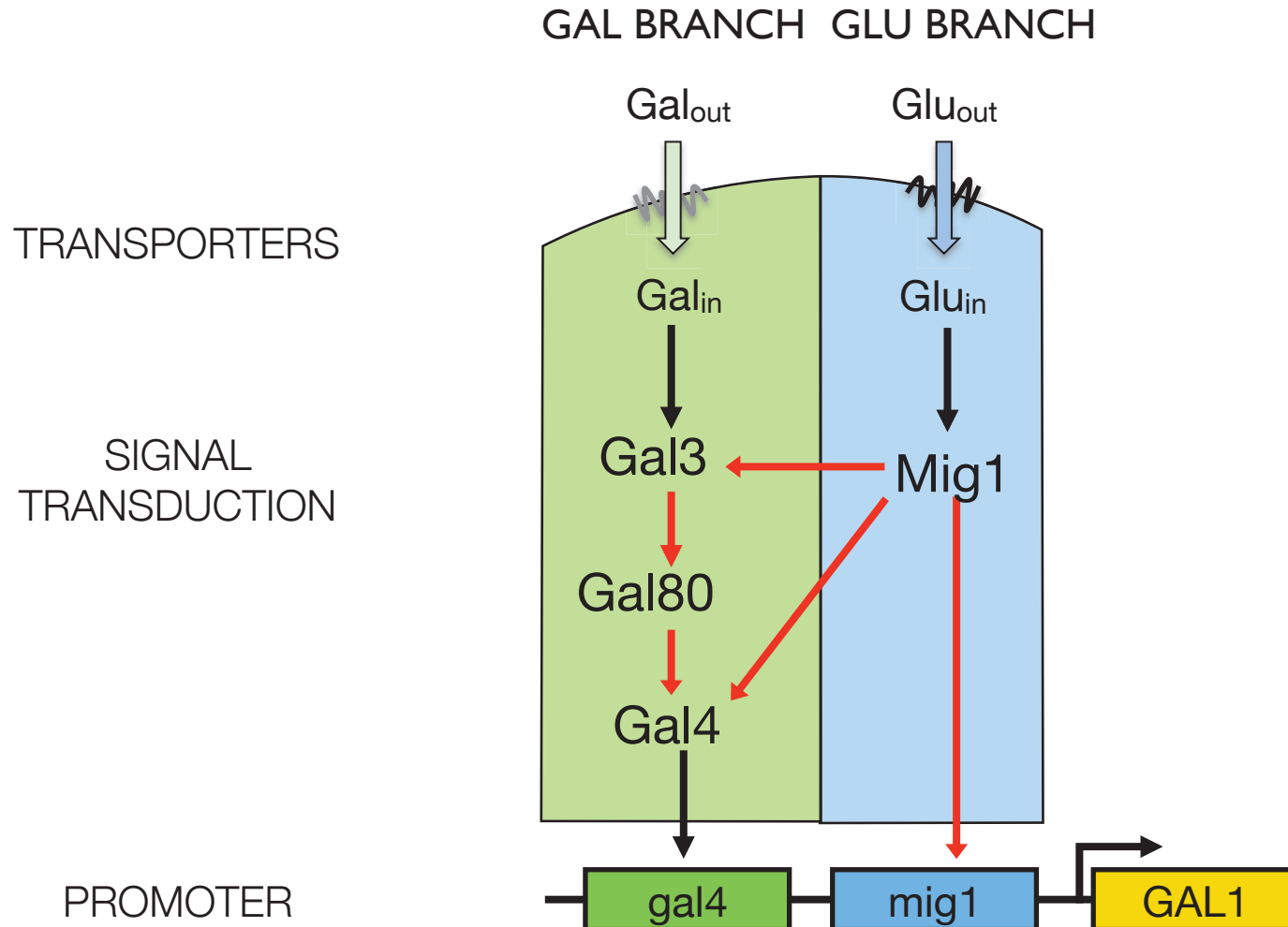
YFP distributions of haploid segregants



# Ratio sensing is not an artifact of depletion



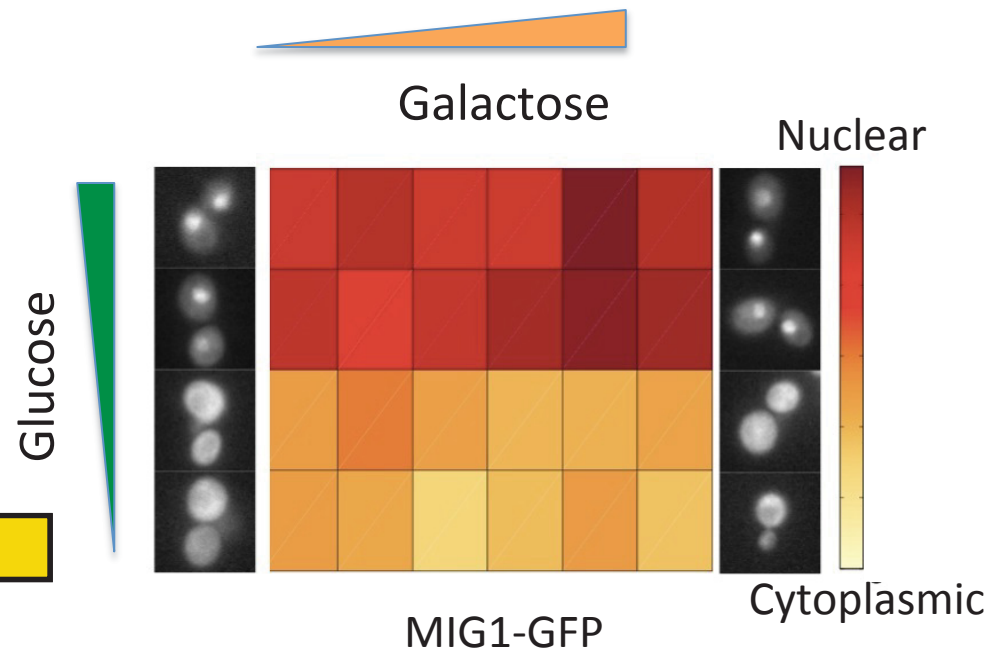
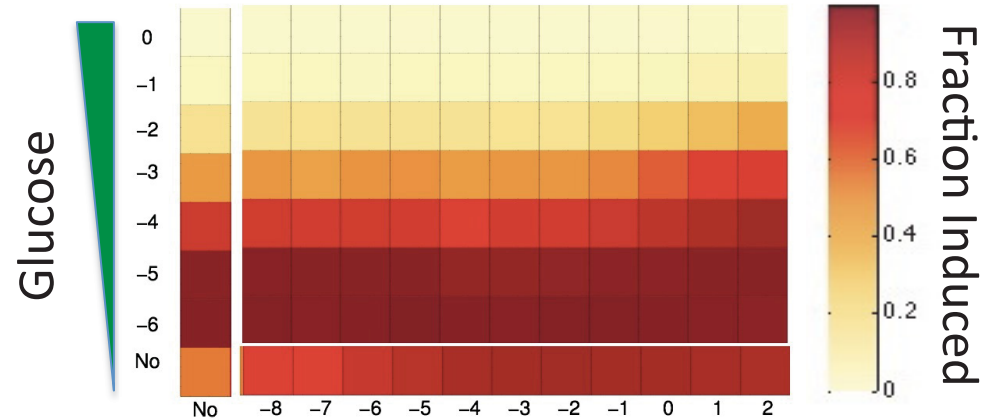
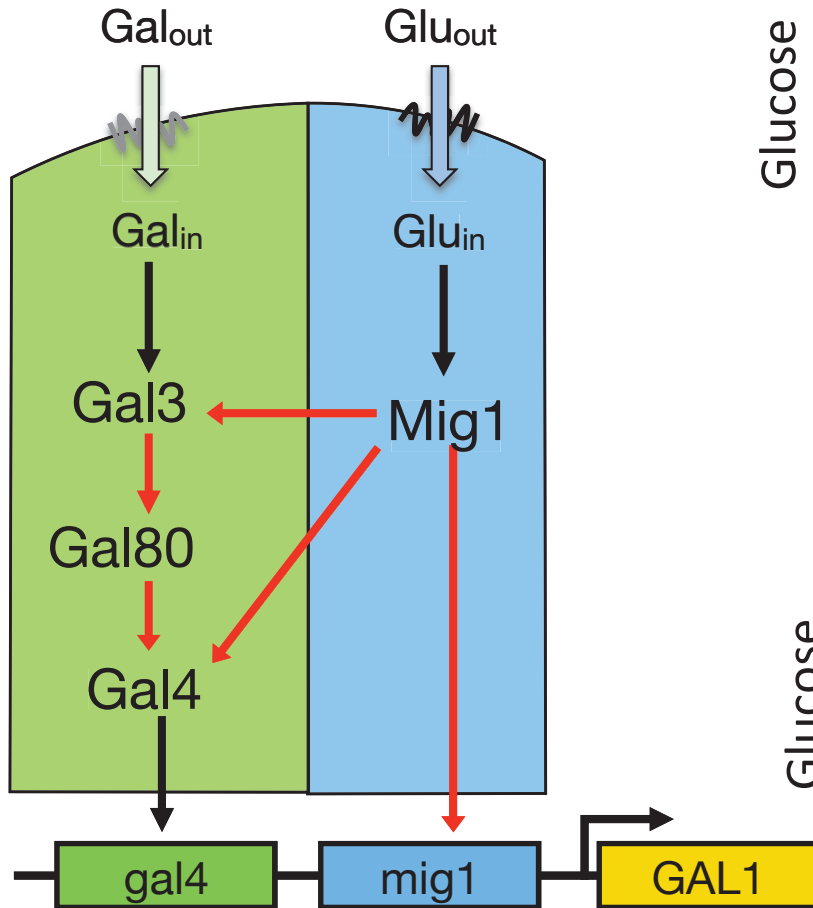
# Where is glucose and galactose ratio?





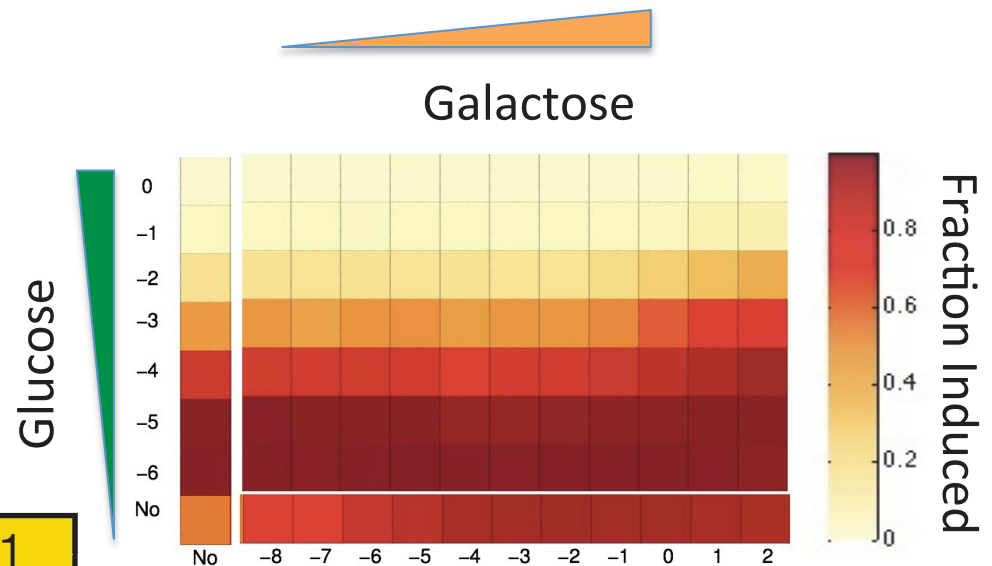
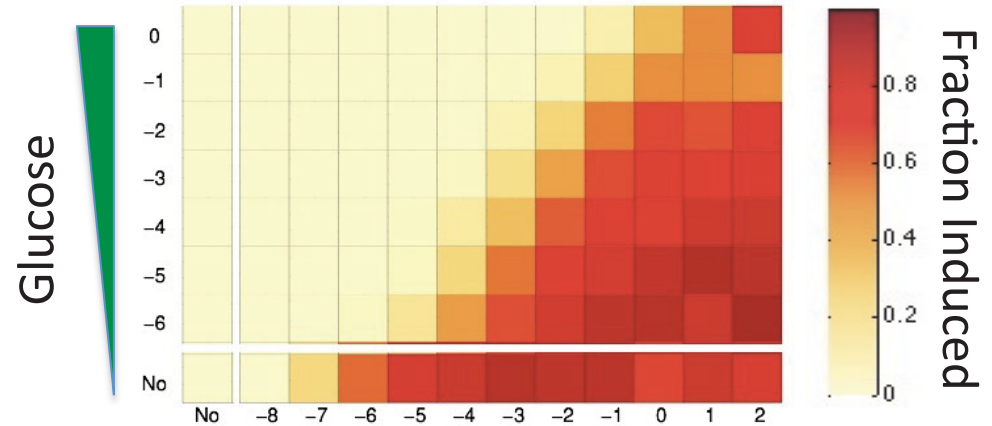
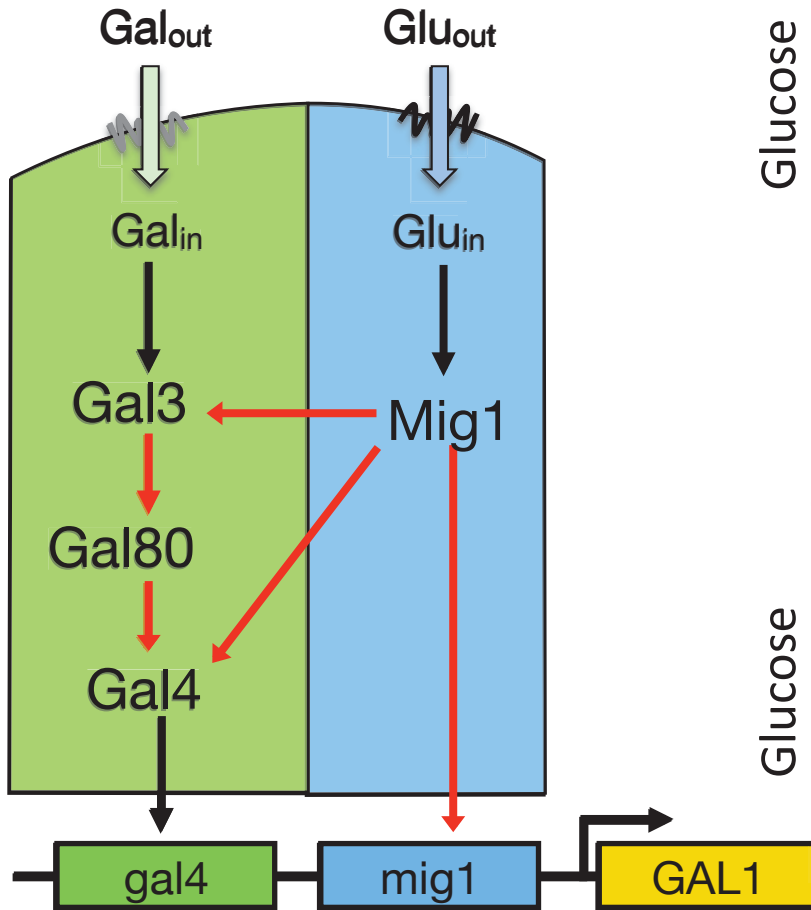
# Is the glucose branch really galactose independent?

GAL BRANCH GLU BRANCH

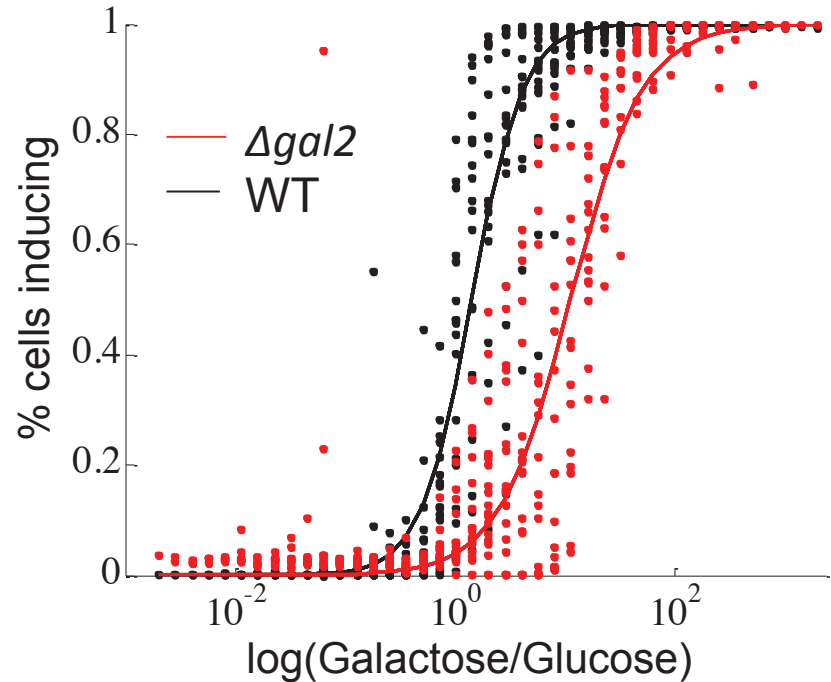
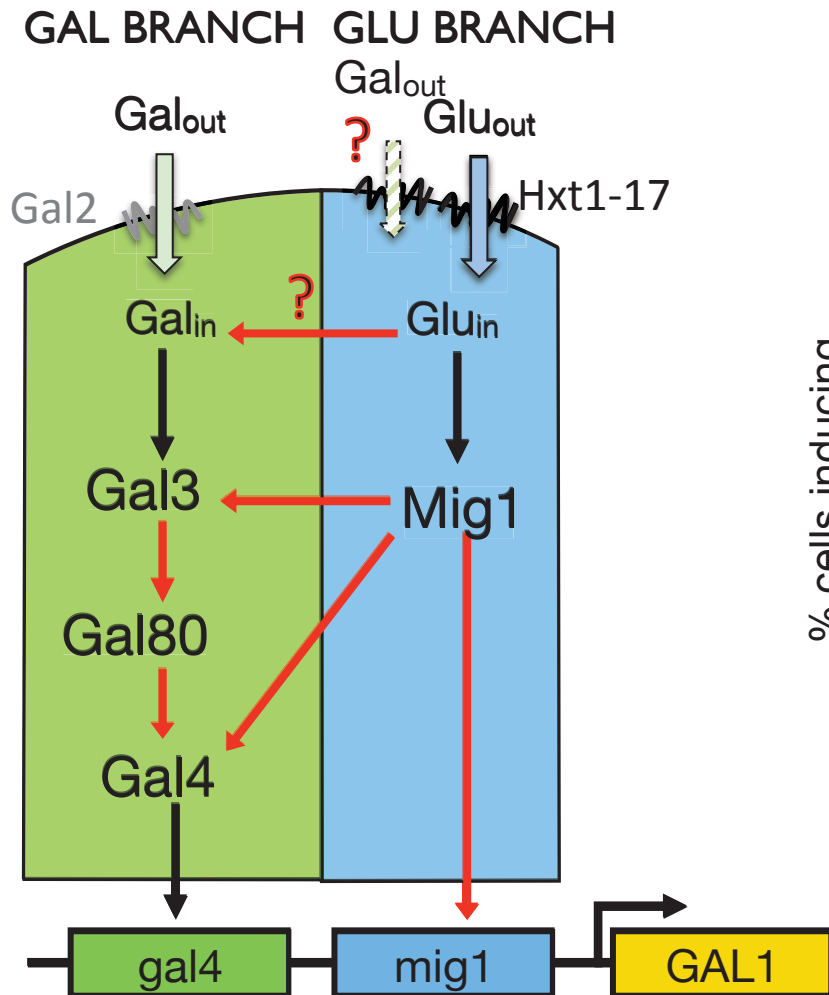


# Is the ratio dependent of the 'glucose branch'?

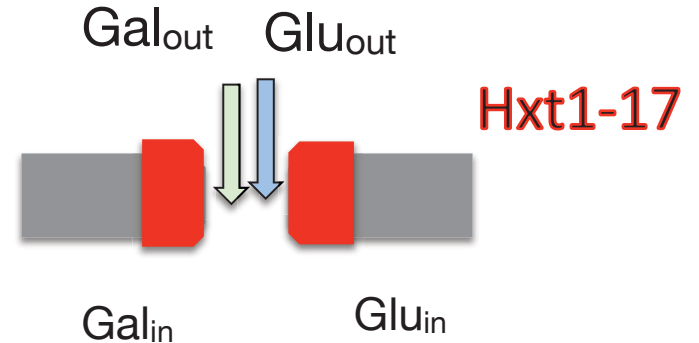
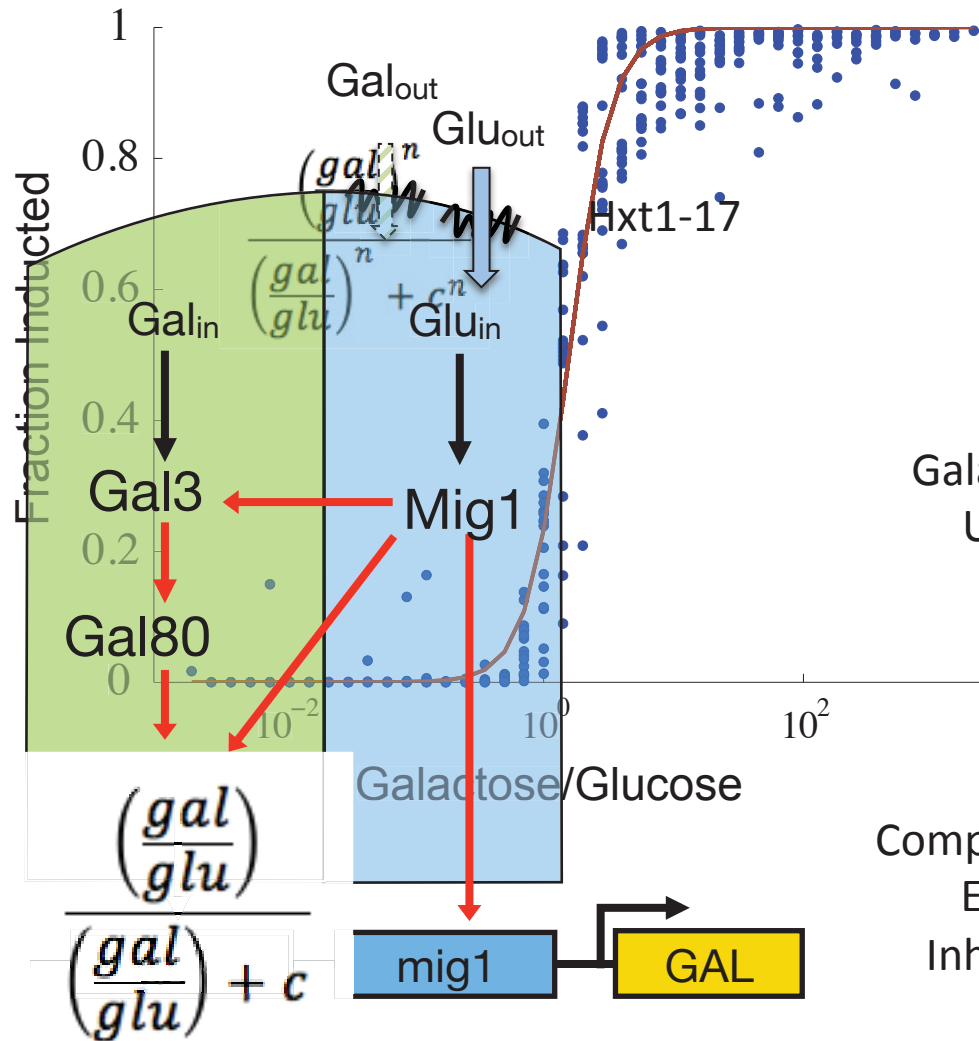
GAL BRANCH    GLU BRANCH



# Is Gal2 needed for ratio sensing?



# Competition through transport?



# Galactose Uptake Rate

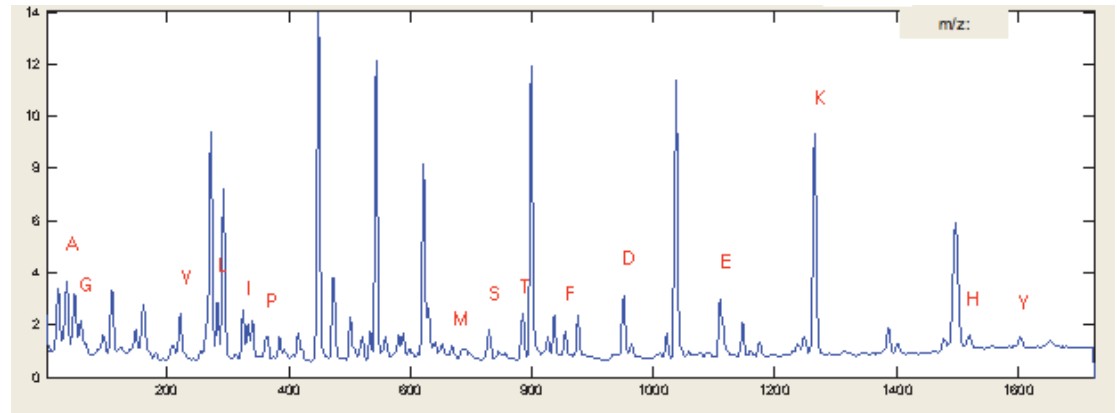
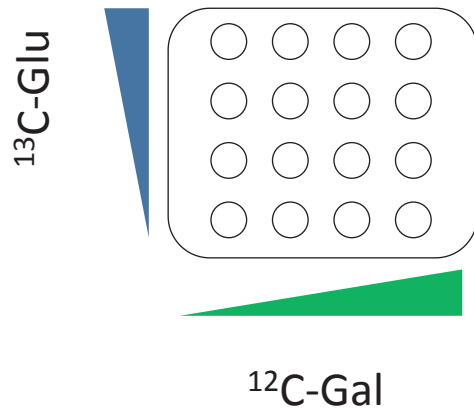
$$\frac{A_{galgal}}{A_{galgal} + A_{gluglu} + 1}$$

At saturation

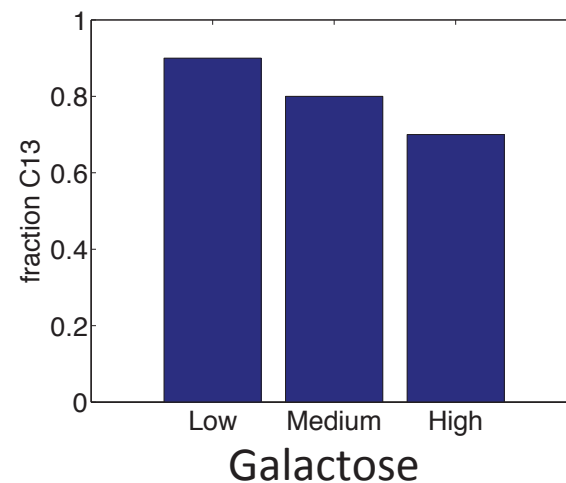
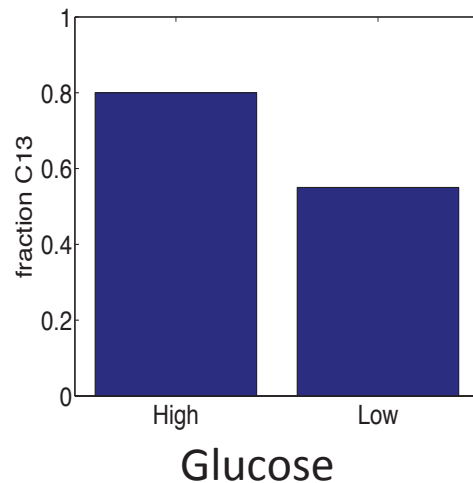
$$\frac{A_{galgal}}{A_{galgal} + A_{gluglu}}$$

# Competitive Enzyme Inhibition

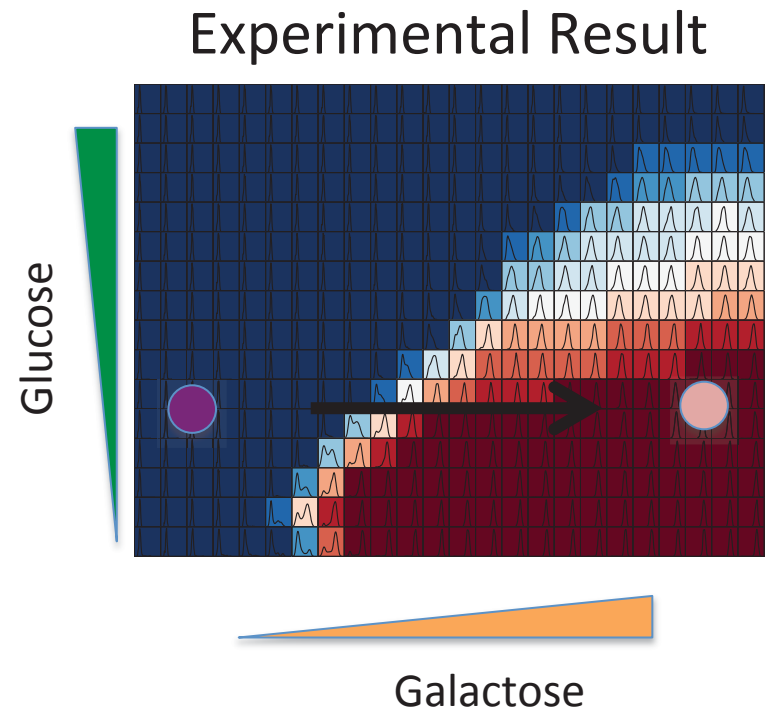
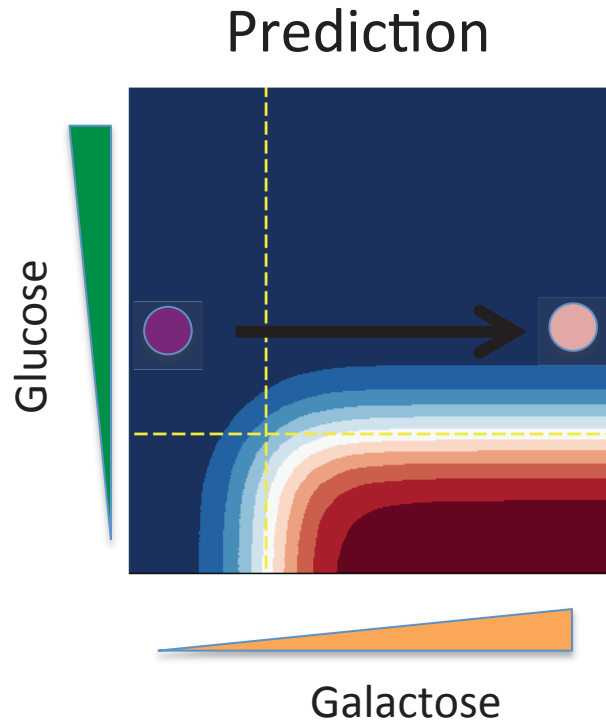
# Does gal uptake depend on the ratio of gal and glu?



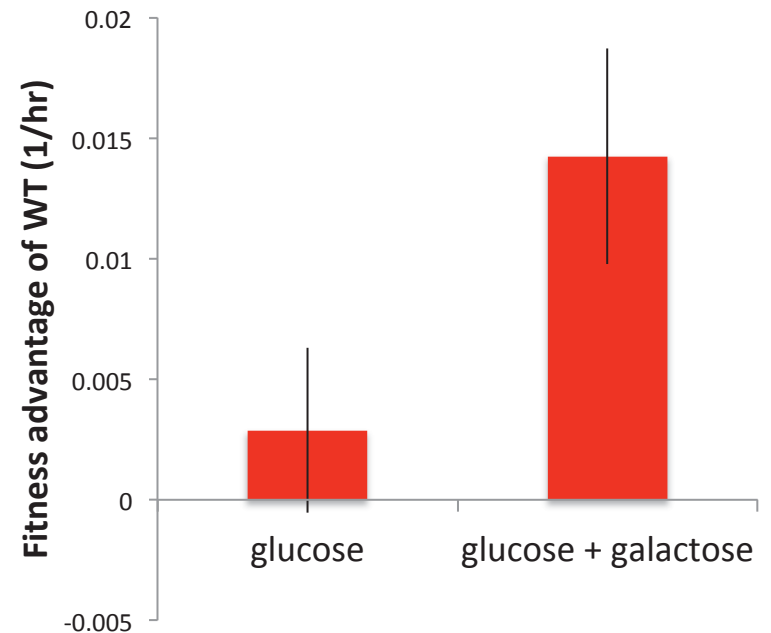
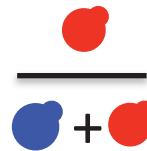
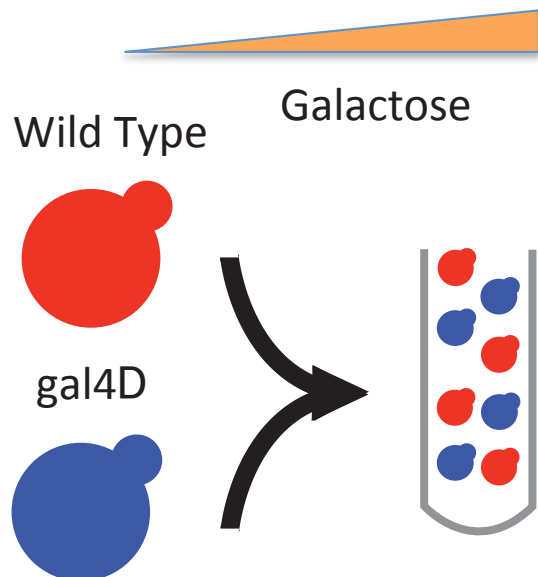
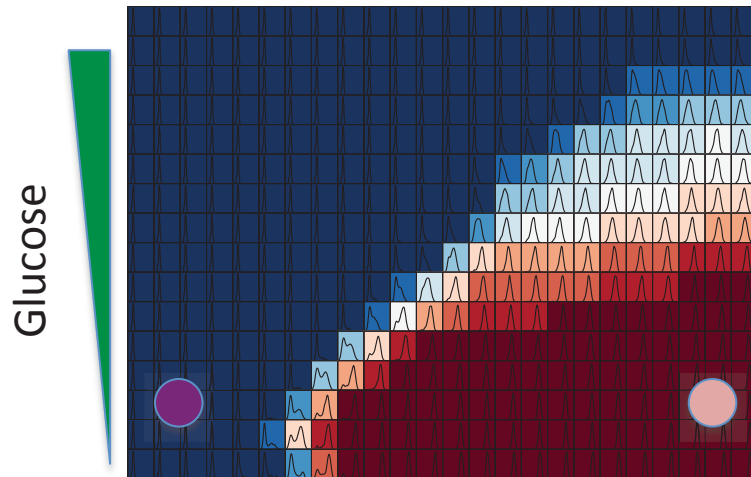
Measure C13/C12 Amino Acids by GC-MS



# Is there an advantage to ratio sensing?



# Can ratio sensing be advantageous?



# Ratio sensors could be everywhere

Promoter binding

$$\frac{K_A A}{K_A A + K_R R + \partial K_R K_A A R + 1}$$

Saturation

$$\partial \rightarrow \infty$$



$$\frac{\left(\frac{gal}{glu}\right)}{\left(\frac{gal}{glu}\right) + c}$$

Gal Ratio Sensor

Competitive Transport

$$\frac{\left(\frac{K}{P}\right)}{\left(\frac{K}{P}\right) + \alpha}$$

Reversible Modification

Kinase Phosphatase

HAT HDAC

$$\frac{\left(\frac{A}{R}\right)}{\left(\frac{A}{R}\right) + \alpha}$$

Exclusion

Competitive Binding



# Acknowledgements

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Bo Hua

Yonatin Savir

Renan Escalante