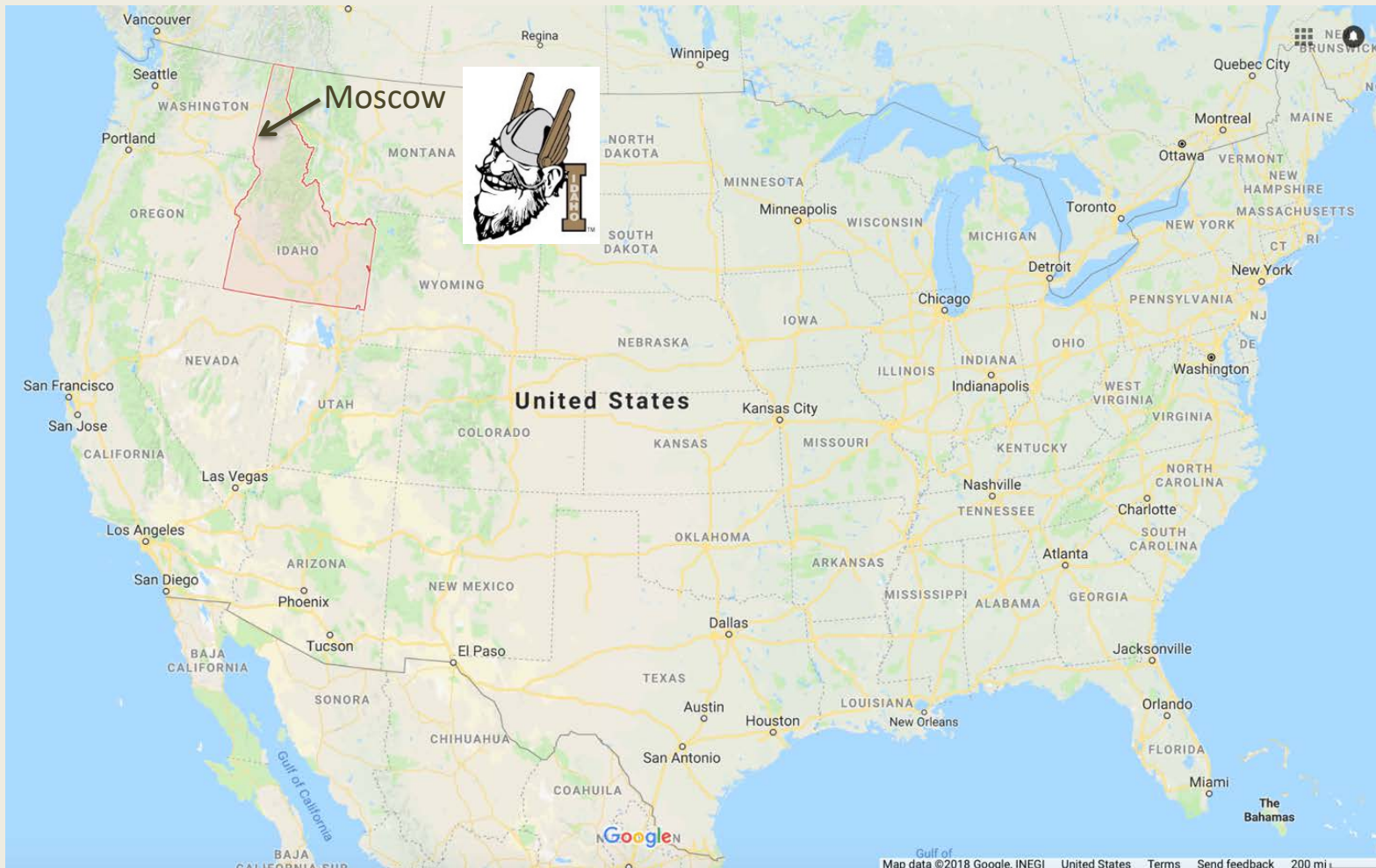


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# ASYMMETRIC, BIMODAL TRADE-OFFS DURING ADAPTATION OF *METHYLOBACTERIUM* TO DISTINCT GROWTH SUBSTRATES

Ming-Chun Lee,<sup>1,2</sup> Hsin-Hung Chou,<sup>1,3</sup> and Christopher J. Marx<sup>1,4</sup>

<sup>1</sup> Department of Organismic and Evolutionary Biology, Harvard University, 16 Divinity Avenue, Cambridge, MA 02138

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**Mapping the Fitness Landscape of Gene Expression Uncovers the cause of Antagonism and Sign Epistasis between Adaptive Mutations**

Hsin-Hung Chou,<sup>1,2\*</sup> Nigel F. Delaney,<sup>1</sup> Jeremy A. Draghi,<sup>1,4</sup> Christopher J. Marx<sup>1,5,6\*</sup>

<sup>1</sup> Department of Organismic and Evolutionary Biology, Harvard University, Cambridge, Massachusetts, United States of America, <sup>2</sup> Institute of Molecular Systems Biology, ETH Zurich, Zurich, Switzerland, <sup>3</sup> Department of Zoology, University of British Columbia, Vancouver, Canada, <sup>4</sup> Department of Biology, University of Pennsylvania, Philadelphia, Pennsylvania, United States of America, <sup>5</sup> Faculty of Arts and Sciences Center for Systems Biology, Harvard University, Cambridge, Massachusetts, United States of America

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PLOS GENETICS

**Fast Growth Increases the Selective Advantage of a Mutation Arising Recurrently during Evolution under Metal Limitation**

Hsin-Hung Chou, Julia Berthet<sup>1</sup>, Christopher J. Marx<sup>1</sup>

Department of Organismic and Evolutionary Biology, Harvard University, Cambridge, Massachusetts, United States of America



RESEARCH ARTICLE



**Effective use of a horizontally-transferred pathway for dichloromethane catabolism requires post-transfer refinement**

Joshua K. Michener<sup>1</sup>, Aline A. Camargo Neves<sup>1,2</sup>, Stéphane Vuilleumier<sup>1</sup>, Françoise Bringle<sup>1</sup>, Christopher J. Marx<sup>1,3,4,5\*</sup>

**Evolution of bidirectional costly mutualism from byproduct consumption**

William R. Harcombe<sup>1,2,3,4,5</sup>, Jeremy M. Chacón<sup>1,2</sup>, Elizabeth M. Adamowicz<sup>1,2,4</sup>, Lon M. Chubiz<sup>1,2,3,4</sup>, and Christopher J. Marx<sup>1,2,3,4,5,6</sup>

Cell Reports  
Article

**Metabolic Resource Allocation in Individual Microbes Determines Ecosystem Interactions and Spatial Dynamics**

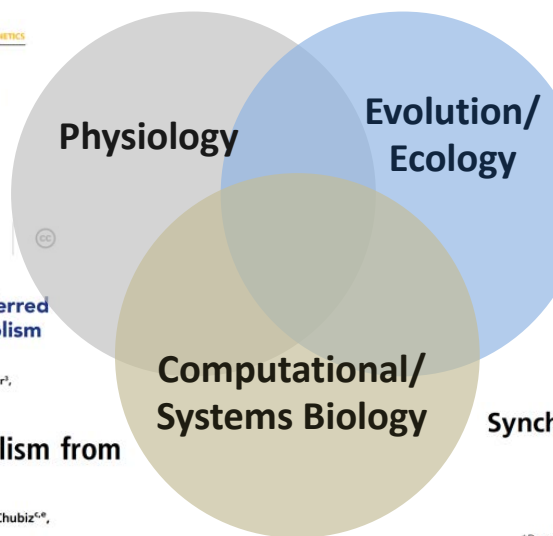
William R. Harcombe,<sup>1,2,3,4</sup> William J. Riehl,<sup>2,7,8</sup> Ilija Dukovski,<sup>2</sup> Brian R. Granger,<sup>2</sup> Alex Betts,<sup>1,10</sup> Alex H. Lang,<sup>3</sup> Gracia Bonilla,<sup>2</sup> Amrita Kar,<sup>2</sup> Nicholas Leiby,<sup>1,4</sup> Pankaj Mehta,<sup>1,2</sup> Christopher J. Marx,<sup>1,2,3,7,8</sup> and Daniel Segrè<sup>2,6,\*</sup>

# Diminishing Returns Epistasis Among Beneficial Mutations Decelerates Adaptation

Hsin-Hung Chou,<sup>1,\*</sup> Hsuan-Chao Chiu,<sup>2</sup> Nigel F. Delaney,<sup>1</sup> Daniel Segrè,<sup>2,3</sup> Christopher J. Marx<sup>1,4,\*</sup>

**Large-Effect Beneficial Synonymous Mutations Mediate Rapid and Parallel Adaptation in a Bacterium**

Deepa Agashe,<sup>1,2</sup> Mrudula Sane,<sup>1,3</sup> Krutika Phalnikar,<sup>1,1</sup> Gaurav D. Diwan,<sup>1,1,3</sup> Alefiyah Habibullah,<sup>1</sup> Norma Cecilia Martinez-Gomez,<sup>2</sup> Vinaya Sahasrabudhe,<sup>1</sup> William Polachek,<sup>2</sup> Jue Wang,<sup>2,5</sup> Lon M. Chubiz,<sup>1,2</sup> and Christopher J. Marx<sup>1,2,3,4</sup>



Cell Reports  
Report

**Optimization of Gene Expression through Divergent Mutational Paths**

Hsin-Hung Chou<sup>1,3</sup> and Christopher J. Marx<sup>1,2,\*</sup>

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PLOS GENETICS

**Repeated, Selection-Driven Genome Reduction of Accessory Genes in Experimental Populations**

Ming-Chun Lee<sup>1\*</sup>, Christopher J. Marx<sup>1,2\*</sup>

<sup>1</sup> Department of Organismic and Evolutionary Biology, Harvard University, Cambridge, Massachusetts, United States of America, <sup>2</sup> Faculty of Arts and Sciences Center for Systems Biology, Harvard University, Cambridge, Massachusetts, United States of America

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**Evolution after Introduction of a Novel Metabolic Pathway Consistently Leads to Restoration of Wild-Type Physiology**

Sean Michael Carroll<sup>1</sup>, Christopher J. Marx<sup>1,2\*</sup>

<sup>1</sup> Department of Organismic and Evolutionary Biology, Harvard University, Cambridge, Massachusetts, United States of America, <sup>2</sup> Faculty of Arts and Sciences Center for Systems Biology, Harvard University, Cambridge, Massachusetts, United States of America

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**Metabolic Erosion Primarily Through Mutation Accumulation, and Not Tradeoffs, Drives Limited Evolution of Substrate Specificity in *Escherichia coli***

Nicholas Leiby<sup>1,2</sup>, Christopher J. Marx<sup>1,3,4\*</sup>

<sup>1</sup> Organismic and Evolutionary Biology, Harvard University, Cambridge, Massachusetts, United States of America, <sup>2</sup> Systems Biology Graduate Program, Harvard University, Cambridge, Massachusetts, United States of America, <sup>3</sup> Faculty of Arts and Sciences Center for Systems Biology, Harvard University, Cambridge, Massachusetts, United States of America

Current Biology  
Article

**Selection Maintains Apparently Degenerate Metabolic Pathways due to Tradeoffs in Using Methylamine for Carbon versus Nitrogen**

Dipti D. Nayak,<sup>1,2</sup> Deepa Agashe,<sup>1,3</sup> Ming-Chun Lee,<sup>1,2</sup> and Christopher J. Marx<sup>1,2,4,5\*</sup>

**Synchronous Waves of Failed Soft Sweeps in the Laboratory: Remarkably Rampant Clonal Interference of Alleles at a Single Locus**

Ming-Chun Lee<sup>1,\*</sup> and Christopher J. Marx<sup>1,2,\*</sup>

<sup>\*</sup>Department of Organismic and Evolutionary Biology and <sup>1</sup> Faculty of Arts and Sciences Center for Systems Biology, Harvard University, Cambridge, Massachusetts 02138

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**The Ability of Flux Balance Analysis to Predict Evolution of Central Metabolism Scales with the Initial Distance to the Optimum**

William R. Harcombe<sup>1</sup>, Nigel F. Delaney<sup>1,2\*</sup>, Nicholas Leiby<sup>1,2</sup>, Niels Klitgaard<sup>1,2\*</sup>, Christopher J. Marx<sup>1,2,3,4\*</sup>

<sup>1</sup> Department of Organismic and Evolutionary Biology, Harvard University, Cambridge, Massachusetts, United States of America, <sup>2</sup> Systems Biology Program, Harvard University, Cambridge, Massachusetts, United States of America, <sup>3</sup> Bioinformatics Graduate Program, Boston University, Boston, Massachusetts, United States of America, <sup>4</sup> Faculty of Arts and Sciences Center for Systems Biology, Harvard University, Cambridge, Massachusetts, United States of America



# Experimental Evolution of *Methylobacterium*: 15 Years of Planned Experiments and Surprise Findings

15

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<https://doi.org/10.21775/9781912530045.15>

## Abstract

Experimental evolution has become an increasingly common approach for studying evolutionary phenomena, as well as uncovering physiological connections in a manner complementary to traditional genetics. Here I describe the development of *Methylobacterium* as a model system for using experimental evolution to study questions at the intersection of metabolism and evolution. Each experiment was initiated to address a particular question inspired by patterns in natural methylo-trophs, such as trade-offs between single-carbon and multi-carbon growth, or the challenges involved in incorporating novel metabolic pathways or genes with poor codon usage that are acquired via horizontal gene transfer. What I could not have appreciated initially, however, was just how many fortuitous, surprise findings would emerge. These have ranged from the repeatability of evolution, complex dynamics within populations, epistasis between beneficial mutations, and even the ability to use simple mathematical models to generate testable, quantitative hypotheses about the fitness landscape.

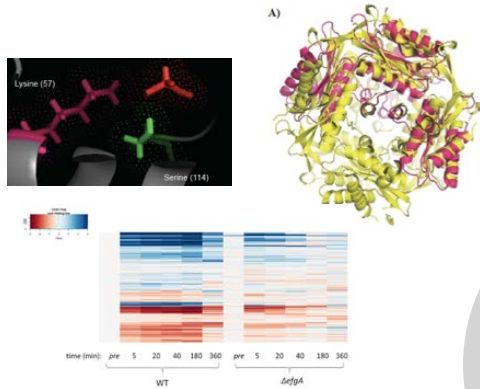
## Introduction

Experimental evolution of populations in the laboratory allows a researcher to simultaneously address evolutionary and physiological questions. The great

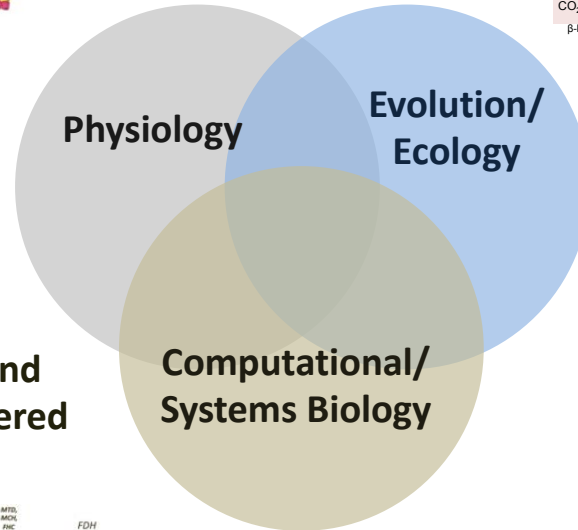
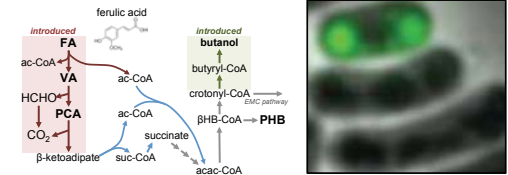
advantage from an evolutionary perspective is that – in a typical experimental design – replicate populations initially have no within- or between-population genetic variation, and the selective conditions are under the control of the experimenter. This allows for a ‘reductionist’ approach to evolutionary questions, whereby the influence of one or a few individual factors upon the outcome can be ascertained (reviewed in Lenski, 2017). From a physiological perspective, experimental evolution is simply a patient version of a genetic selection experiment (reviewed in Marx, 2011). Rather than requiring a discrete change in phenotype to be immediately apparent upon plating, the continued transfers of the experiment permit mutations of ‘modest’ effect – such as a 10% increase in growth rate – to occur, escape drift, and rise towards fixation. Furthermore, the advent of high-throughput sequencing has revolutionized the ability to address both the evolutionary and physiological questions (reviewed in Bruger and Marx, 2018).

The kind invitation I received to write this chapter was a request to specifically describe the work in my laboratory where we have repeatedly used experimental evolution with *Methylobacterium extorquens* to address both evolutionary and physiological questions. Given that charge, I will shamelessly describe themes arising from our own work, but my primary goal is to highlight two broader messages. The first message is that experimental evolution can

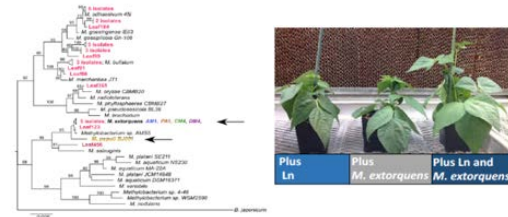
# Novel regulator linking toxicity to translation in formaldehyde stress response



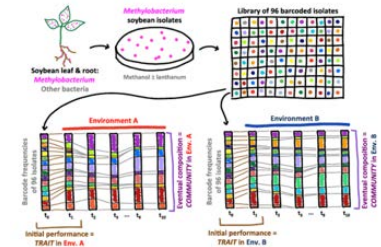
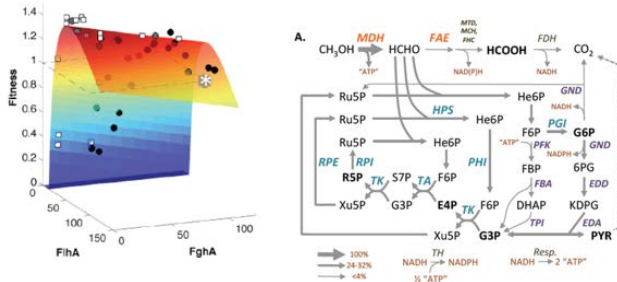
# Phenotypic heterogeneity in metabolism converting plant-derived aromatics to bioproducts



# Within-genus diversity on plants: connecting traits, genomes, phylogeny



# Fitness landscapes and evolvability of engineered metabolism





# Epistasis

DEF. DIFFERENT EFFECT OF MUTATION UPON A PHENOTYPE  
DEPENDENT UPON OTHER MUTATIONS PRESENT

↳ CAN BE ANY PHENOTYPE, HERE MAINLY FITNESS

(MAGINE TWO MUT., X & Y, EACH INDIVIDUALLY  
IMPROVE GROWTH BY 50%:

$W = \text{FITNESS}$

$$W_{\text{ANC}} = 1.0$$

$$W_X = 1.5$$

$$W_Y = 1.5$$

$$W_{XY} = \boxed{\phantom{000}}?$$

$$1.0 \leftarrow W_{\text{ANC}} \quad s_X - s_Y$$

$$1.5 \leftarrow \text{LARGEST SINGLE}$$

$$\boxed{2.0} \leftarrow 1 + s_X + s_Y$$

$$\boxed{2.25} \leftarrow (1 + s_X) \cdot (1 + s_Y)$$

$$3.0 \leftarrow W_A + W_B \quad 1 + s_X + 1 + s_Y$$

# How calculate epistasis?

- WHICH NULL MODEL FOR "INDEPENDENCE" TO USE?

- FOR SMALL  $s$   $(1+s_x)(1+s_y) \approx 1+s_x+s_y$

- EPISTASIS IS DEVIATION FROM INDEPENDENCE ( $E$ )

TWO THOUGHT EXAMPLES  $\rightarrow$  MULTIPLICATIVE

1. SUCCESSFUL SEEDLINGS



#SEEDS



PROP. THAT GERMINATE

TOTAL GERMINATED:

$(\#SEEDS) \times (PROP. THAT GERMINATE)$

$$1.5 \cdot 1.5 = 2.25$$

2. ENZYME ACTIVITY



EXPRESSION  
LEVEL  $[E]$



ACTIVITY PER  
MOLECULE  
( $K_{cat}$ )

TOTAL ACT =  $V_{max} = [E] \cdot K_{cat}$

$$1.5 \cdot 1.5 = 2.25$$

# Depict epistasis graphically

$$W_{ANC} = 1.0$$

$$W_X = 1.1$$

$$W_Y = 1.2$$

$$W_{XY} = \boxed{1.32}$$
  
(NUCL)

X	Y
0	0
1	0
0	1
1	1

0 = ANCESTRAL  
1 = EVOLVED

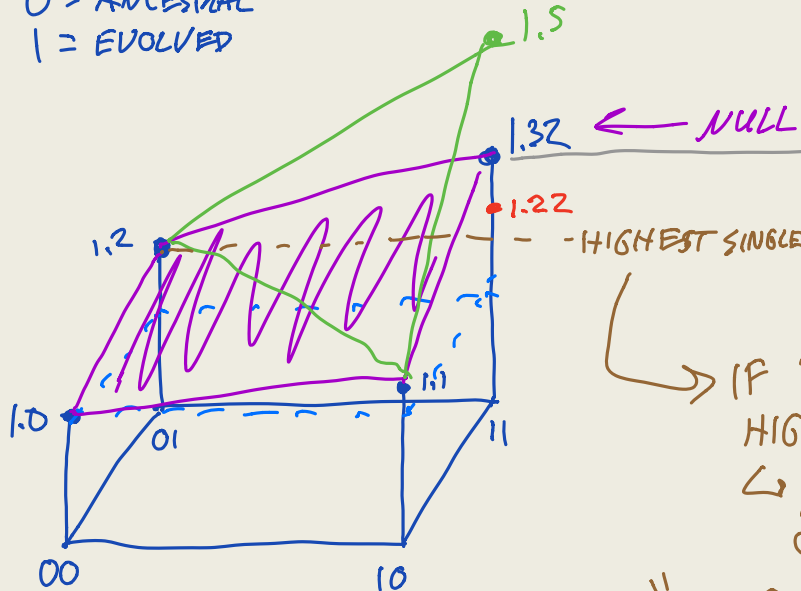
		X	
		0	1
Y	0	1.0	1.1
	1	1.2	1.32

$$E = W_{DATA} - W_{NULL}$$

$$E = W_{XY} - W_X \cdot W_Y$$

"LOLLIPOP"  
DIAGRAM

$\log(w)$  ↑



"MAGNITUDE" EPISTASIS



# Sign epistasis

DEF: ONE OR MORE ALLELES CHANGE FROM BEN. TO DELETERIOUS

X

	0	1
Y 0	1.0	1.1
Y 1	1.2	0.8

SIGN EPISTASIS FOR BOTH

X

	0	1
Y 0	1.0	0.5
Y 1	0.3	1.0

X

	0	1
Y 0	1.0	1.2
Y 1	1.5	1.3

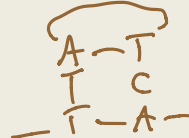
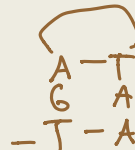
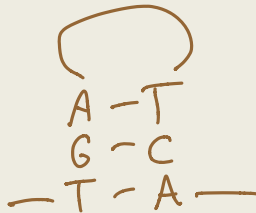
ONLY SIGN EPISTASIS FOR X

→ ALL COMBOS EXCEPT (11) ARE VIABLE,  
BUT (11) IS DEAD

↳ SYNTHETIC LETHAL

CROSSING A "FITNESS VALLEY"  
SLOW CHANGES IN  
IGS mRNA

COMMON FOR "COMPENSATORY" MUTATIONS



# Epistasis w/in proteins

- EVOLVED ALLELES w/ SEVERAL MUTATIONS

- HOW DO MUT. AFFECT EACH OTHER?

- STRONG ENOUGH TO LIMIT PATHS OF ADAPTATION?

- EXAMPLE: TEM-1 BETA LACTAMASE IN E. coli

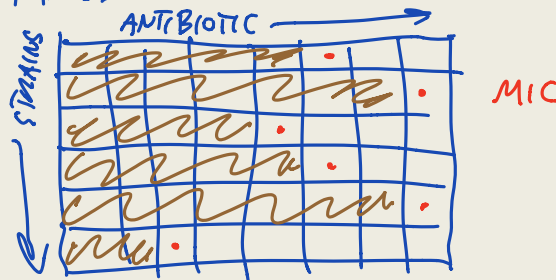
↳ ENZYME THAT PROVIDES RESISTANCE TO PENICILLINS

WT  $\xrightarrow{5 \text{ MUT.}}$  TEM\* (HIGH RESISTANCE TO CEFOTAXIME)

40,000 - FOLD INCREASE

1. CONSTRUCTED ALL  $2^5 = 32$  ALLELES (4 NON-SYNON., 1 PROMOTER)

2. ASSAY RESISTANCE: "MINIMUM INHIBITORY CONCENTRATION" (MIC)

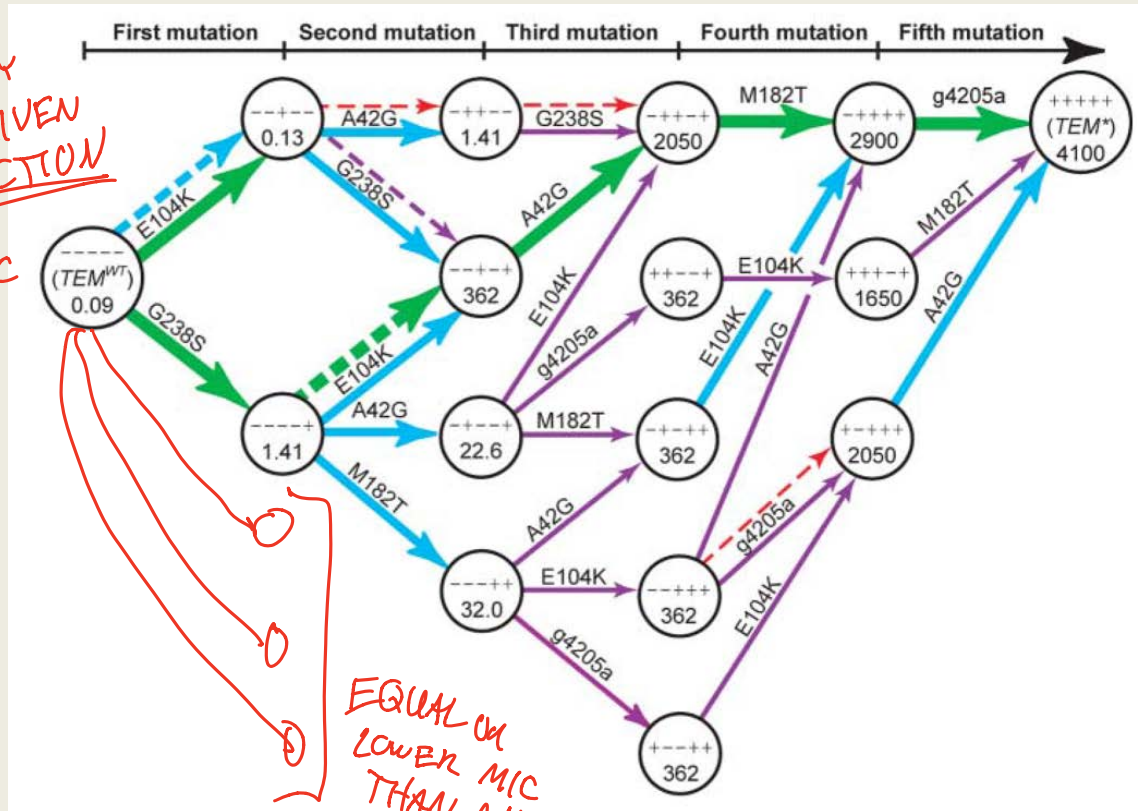


↳ IN PARTICULAR COND.  
37°C, LB, 96-WELL PLATE

24 h LATENT

BELOW SOME THRESHOLD  
OF GROWTH

# Epistasis w/in proteins

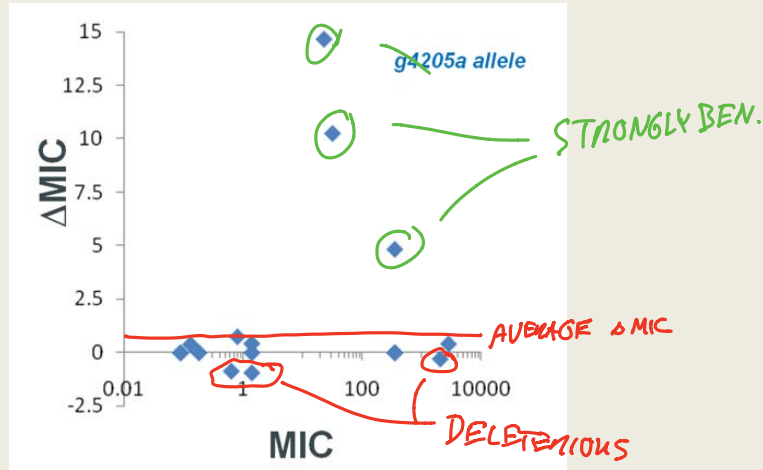


- MANY COMBOS MISSING: SOME FLAT OR DOWNWARD STEPS
- SINGLE PEAK → NO INTERMEDIATES TO GET TRAPPED UPON
- RELATIVELY FEW PATHS POSSIBLE OF 120 POTENTIAL, SOME MORE LIKELY



# Patterns of epistasis btw/ genes?

- REPLOTED TO SEE  
FULL SET OF DATA  
↳ ONE ALLELE ON ALL  
BACKGROUNDS TESTED



- SIGN EPISTASIS

-  $E$  OFTEN  $\gg \bar{S}$

- IDIOSYNCRATIC w/ REGARD TO BACKGROUND MIC

→ GENERALLY  
TRUE

# Studying epistasis btw/ genes

- WILL SAME TRENDS HOLD FOR btw/ GENES

W/IN PROTEINS = BIOPHYSICS

btw/ PROTEINS  $\dots \rightarrow$  BIOPHYSICS (AT PROTEIN INTERFACES)  
OR PROT-DNA INTERACTIONS

$\Rightarrow$  "INTERACT" THROUGH PHYSIOLOGY

- IMAGINE ANALOGOUS EXPT FOR EPISTASIS btw/ GENES

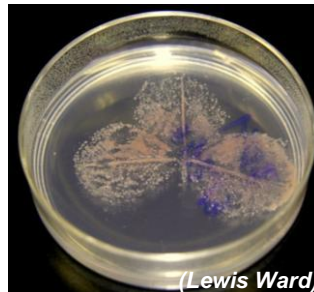
WT  $\longrightarrow$  EVOLVED

SEQ. TO  
FIND MUTATIONS

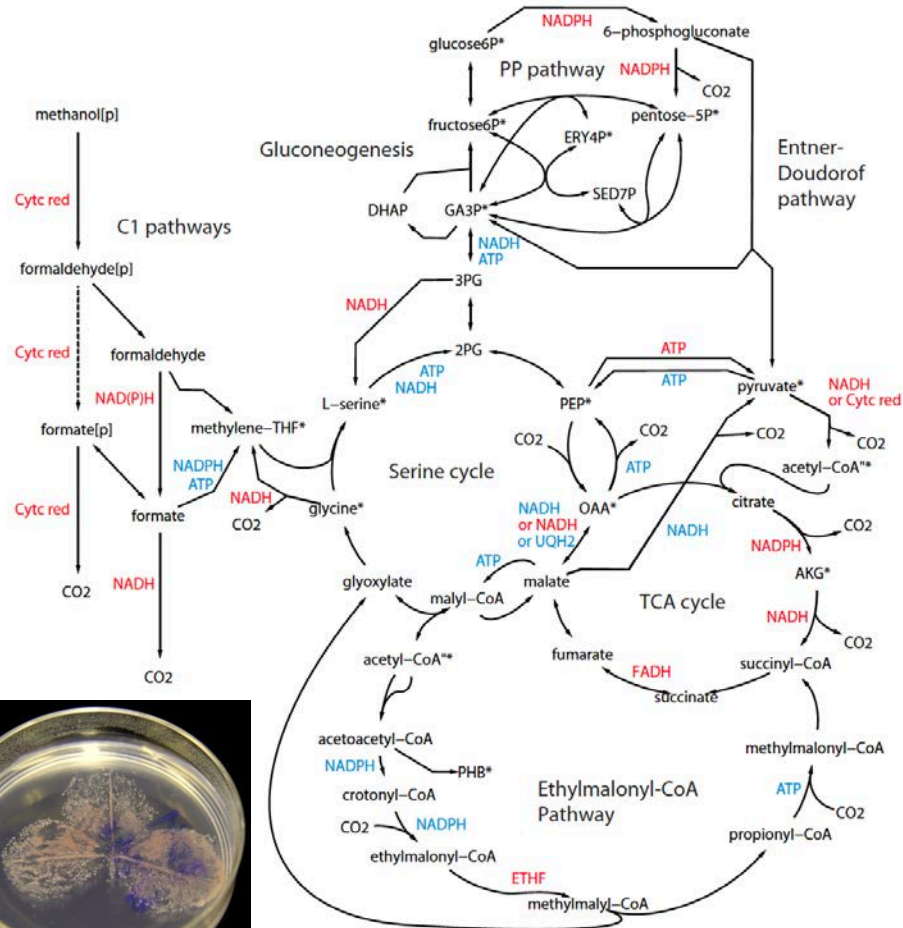
$\hookrightarrow$  MAKE COMBOS  
TEST FITNESS

# *Methylobacterium* model for methylotrophy

- *M. extorquens* main system for 60 years
- Dominant member of plant microbiome
- Facultative methylotroph that grows on limited multi-C substrates
- Uncovered majority of knowledge of C<sub>1</sub> dissimilation and assimilation



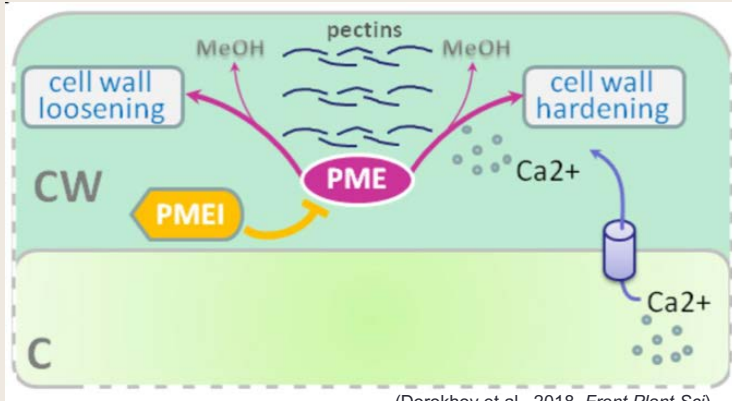
(Lewis Ward)



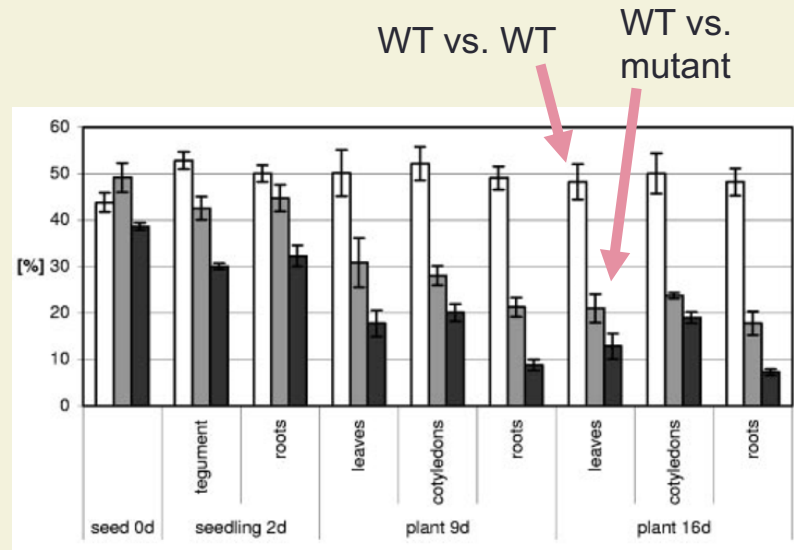
(Peyraud et al., 2011. *BMC Syst Biol*)



# Methanol release as connection between plant microbiome niche and C<sub>1</sub> use



(Dorokhov et al., 2018. *Front Plant Sci*)

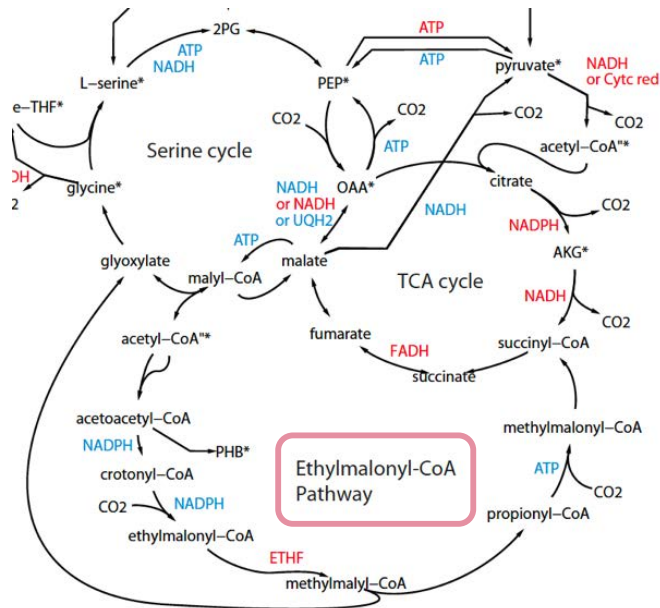


(Sy et al., 2005. *Appl Env Microbiol*)

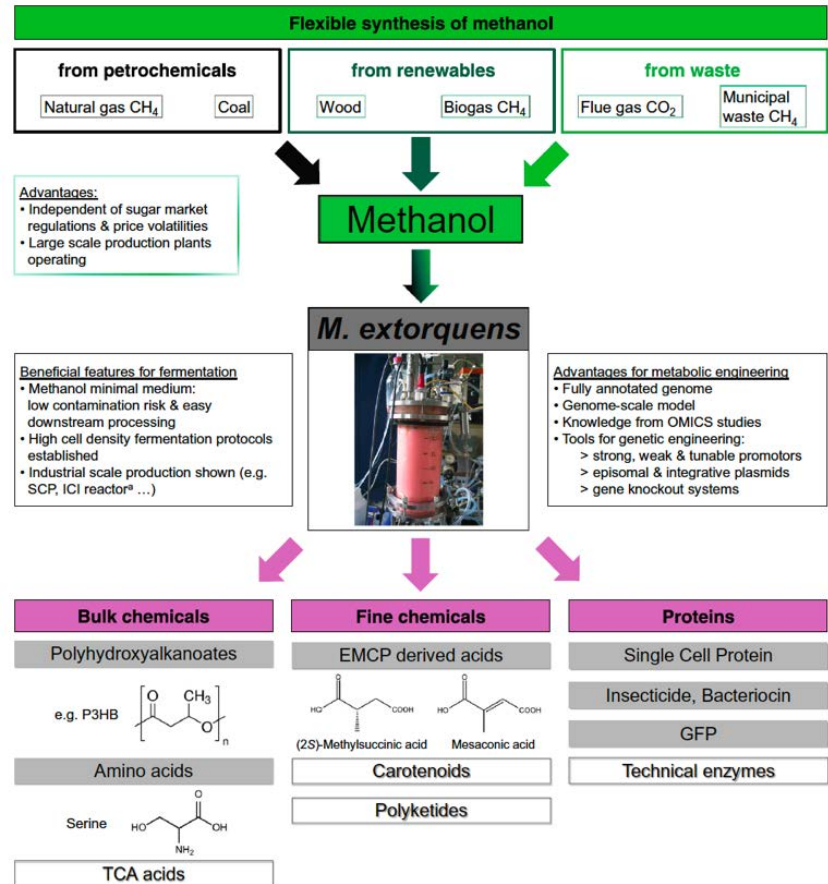
- Plants release 3-10% NPP as methanol
- Mainly from pectin methylesterases

- C<sub>1</sub> mutants (grey, black) compromised on plants

# Methylobacterium and biotechnology

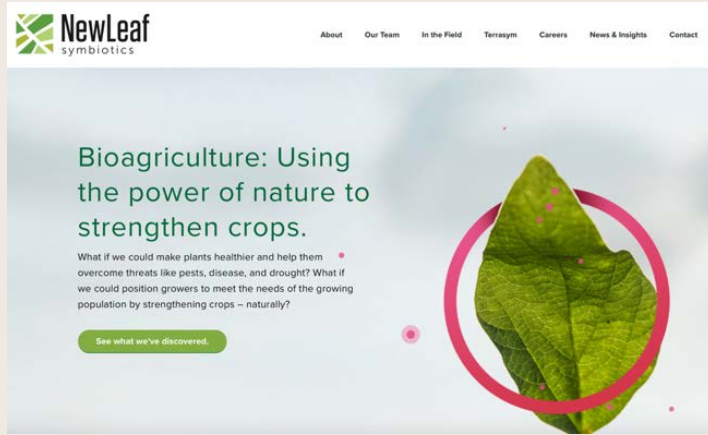


- High flux through reduced  $C_3$ ,  $C_4$ ,  $C_5$  compounds
- Can be cultured to  $>40$  g DCW/liter ( $OD_{600} > 150$ )



(Ochsner et al., 2014. *Appl Microbiol Biotechnol*)

# *Methylobacterium* biotechnology: plant growth & aquafeed ingredient

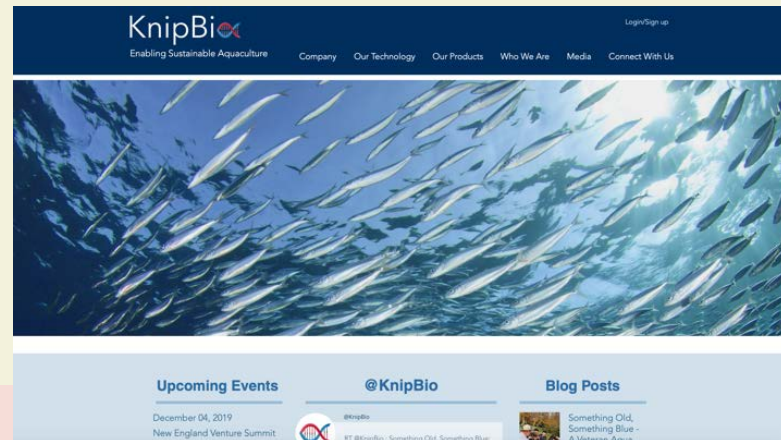


- Commercialization of plant growth promotion



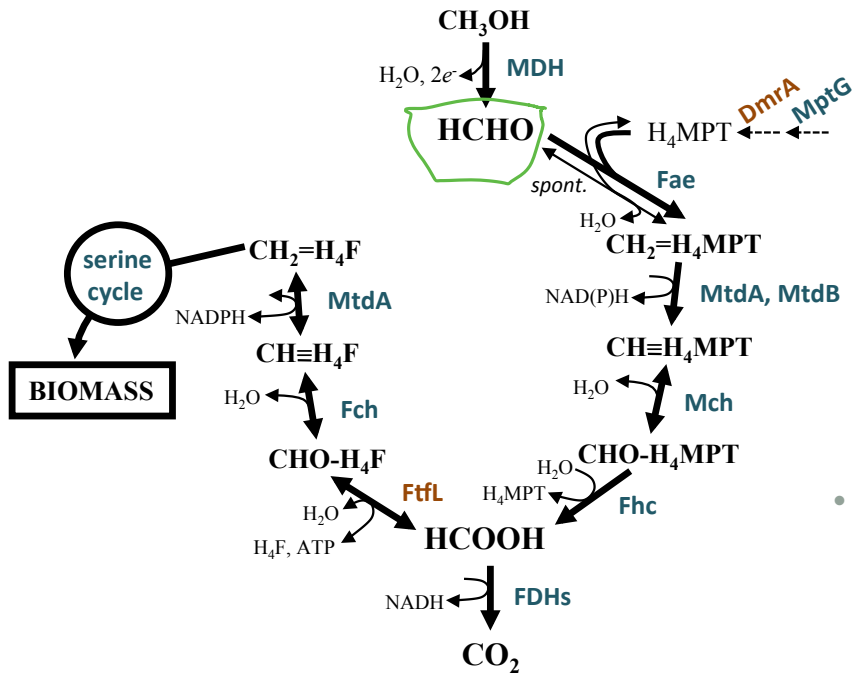
- Biotechnological platform for aquafeed

- *CJM is co-founder and board member of KnipBio, Inc.*





# Formaldehyde as key intermediate



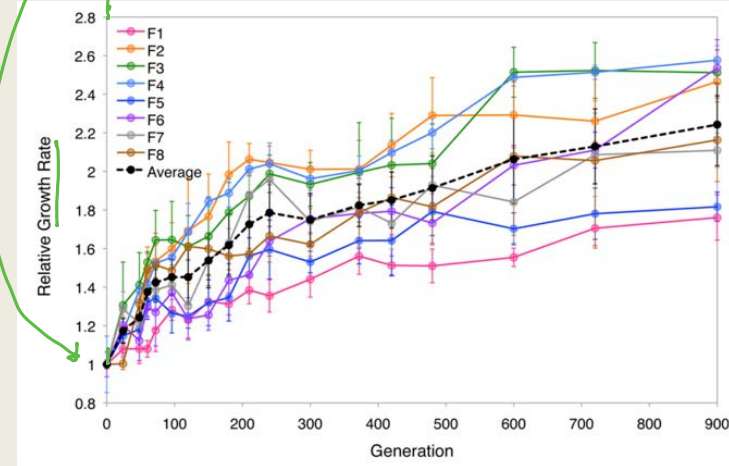
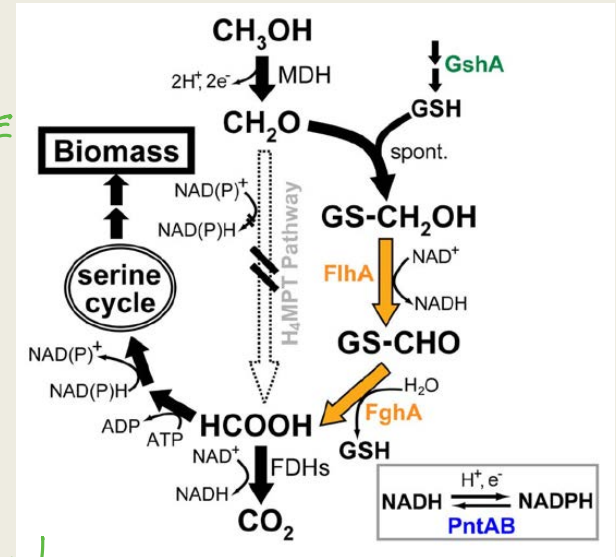
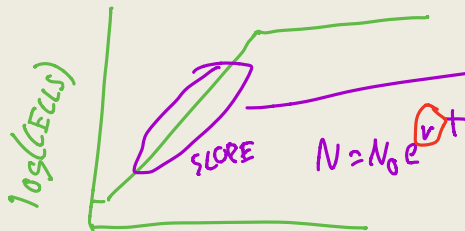
- Produced & consumed at 2 mM/s during growth on methanol

# Evolution with new pathway

- GRAD STUDENT → REPLACE THE NATIVE  
F OXID. PATHWAY w/ FOREIGN PATH.  
↳ GROW, BUT MUCH SLOWER

- POSTDOC → STARTED EXP. EVOL. w/  
ENGINEERED STRAIN

↳ BATCH TRANSFER w/  $\frac{1}{64}$  DILUTION  
↳ 6 GEN/TR.  
↳  $N_{FINAL} \approx 1-2 \cdot 10^9$

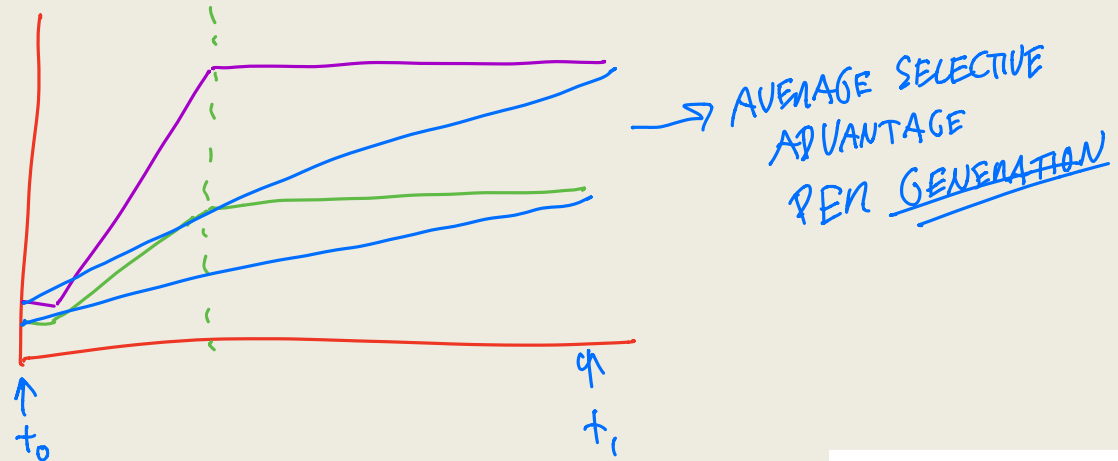


# Assay fitness via competition

~PAIRWISE CHANGE IN FREQ.

↳ STRAINS w/ FLUORESCENT PROTEINS

↳ 50K CELLS IN A MINUTE



**Table 2.** Fitness of fluorescent strains against wild-type *Methylobacterium*.

Strains	Methanol		Succinate	
	Plate count	Flow cytometer	Plate count	Flow cytometer
CM1176	0.9948±0.0036	0.9955±0.0036	0.9908±0.0131	0.9968±0.0012
CM1178	0.9798±0.0179	0.9799±0.0016	0.9790±0.0056	0.9869±0.0009
CM1180	1.0130±0.0078	1.0021±0.0030	0.9942±0.0093	0.9996±0.0003

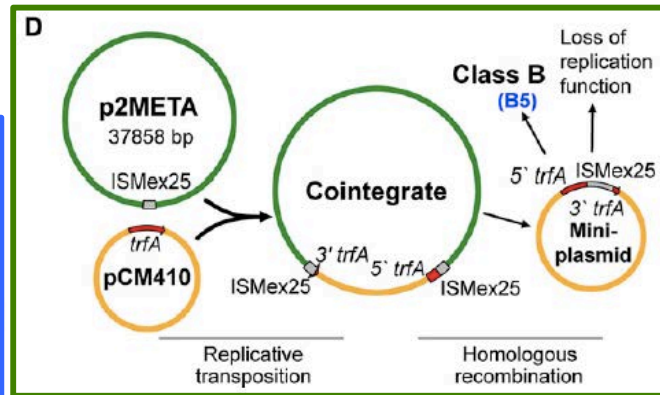
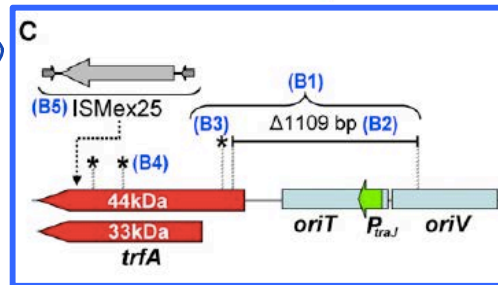
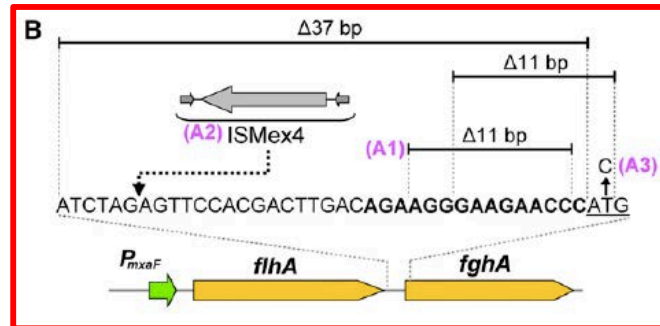
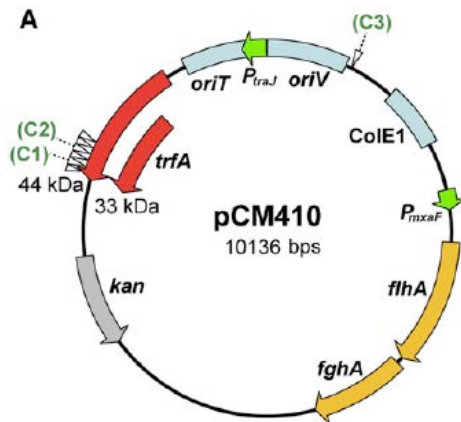
$$W = \frac{\log\left(\frac{R_1 \cdot 64}{R_0}\right)}{\log\left(\frac{(1 - R_1) \cdot 64}{1 - R_0}\right)}$$

# What types of mutations to test in combination?

1. COMBINED PAIRS OF ALLELES FROM DIFFERENT POPULATIONS, BUT AFFECTING THE SAME, INTRODUCED PATHWAY
2. COMBINED ALLELES FROM A SINGLE ADAPTIVE TRAJECTORY

# Beneficial from different lineages affecting same pathway

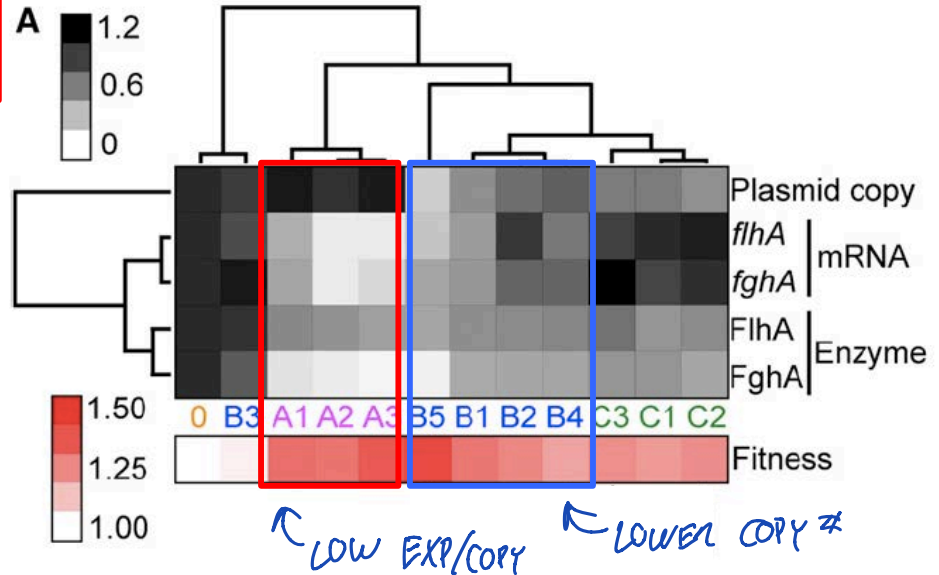
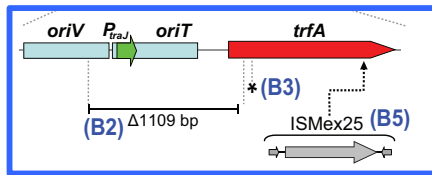
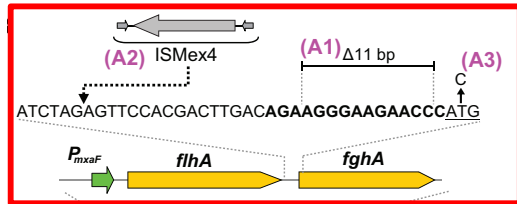
↙ btw/ 2 GENES PATHWAY



→ INTEGRATE PLASMID INTO HOST GENOME

- Mutations of many types in different populations; 25-45% benefit; affect expression differently

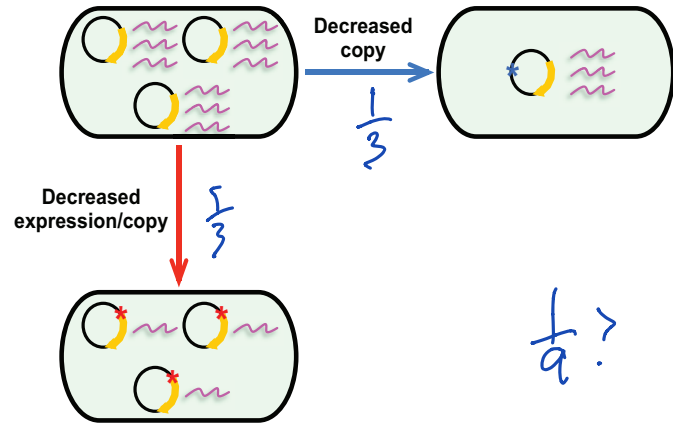
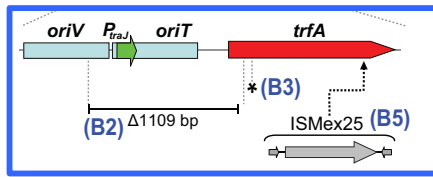
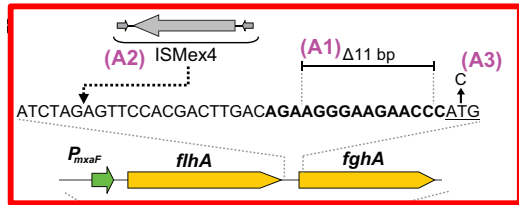
# Expression per copy vs. copy#



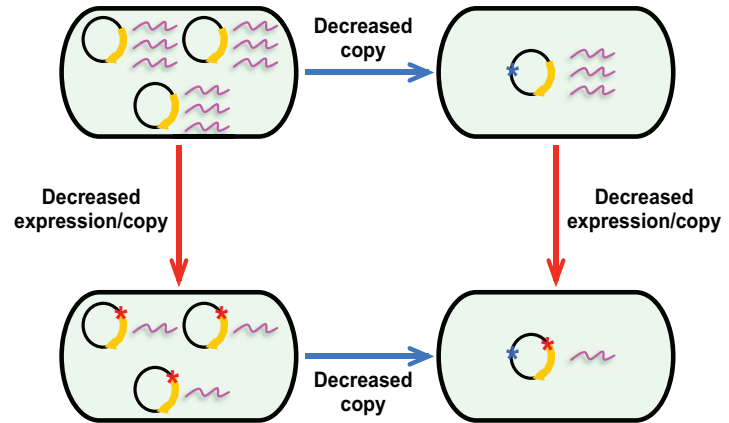
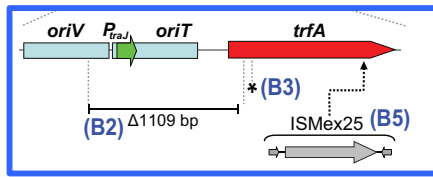
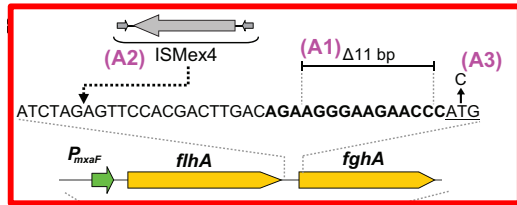
- Distinct, independent mechanisms to **reduce** expression of the GSH pathway enzymes
- But no promoter mutations?...



# Independent effects upon expression



# Independent effects upon expression



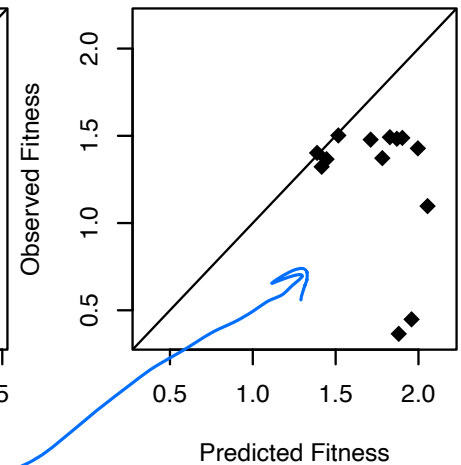
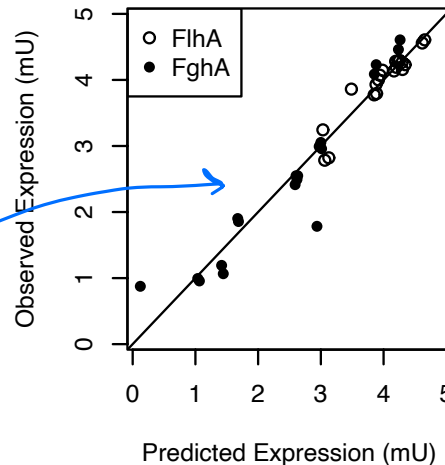
- Two classes should interact independently:

- $E_{AB} = E_A \times E_B$

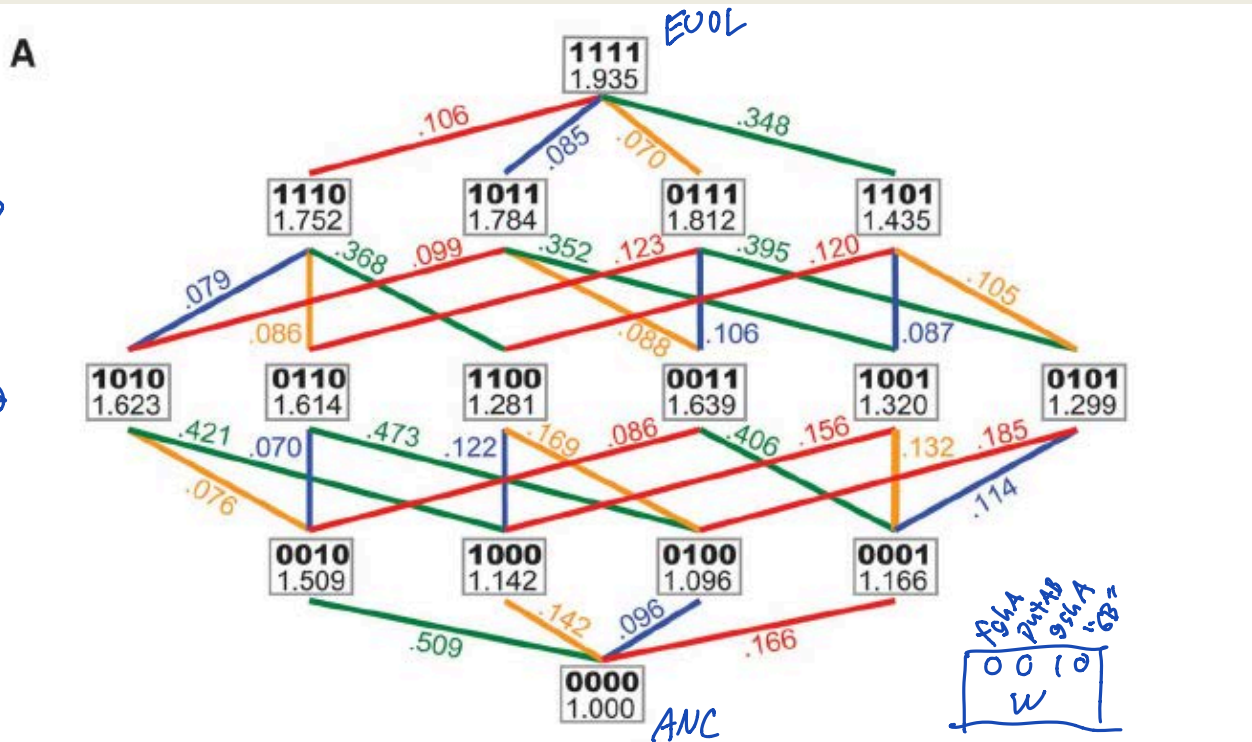
- Yes

- Indep. upon fitness?

- No.



# Fitness values of mutational combinations



AFTER 600 GEN: 9 MUTATIONS

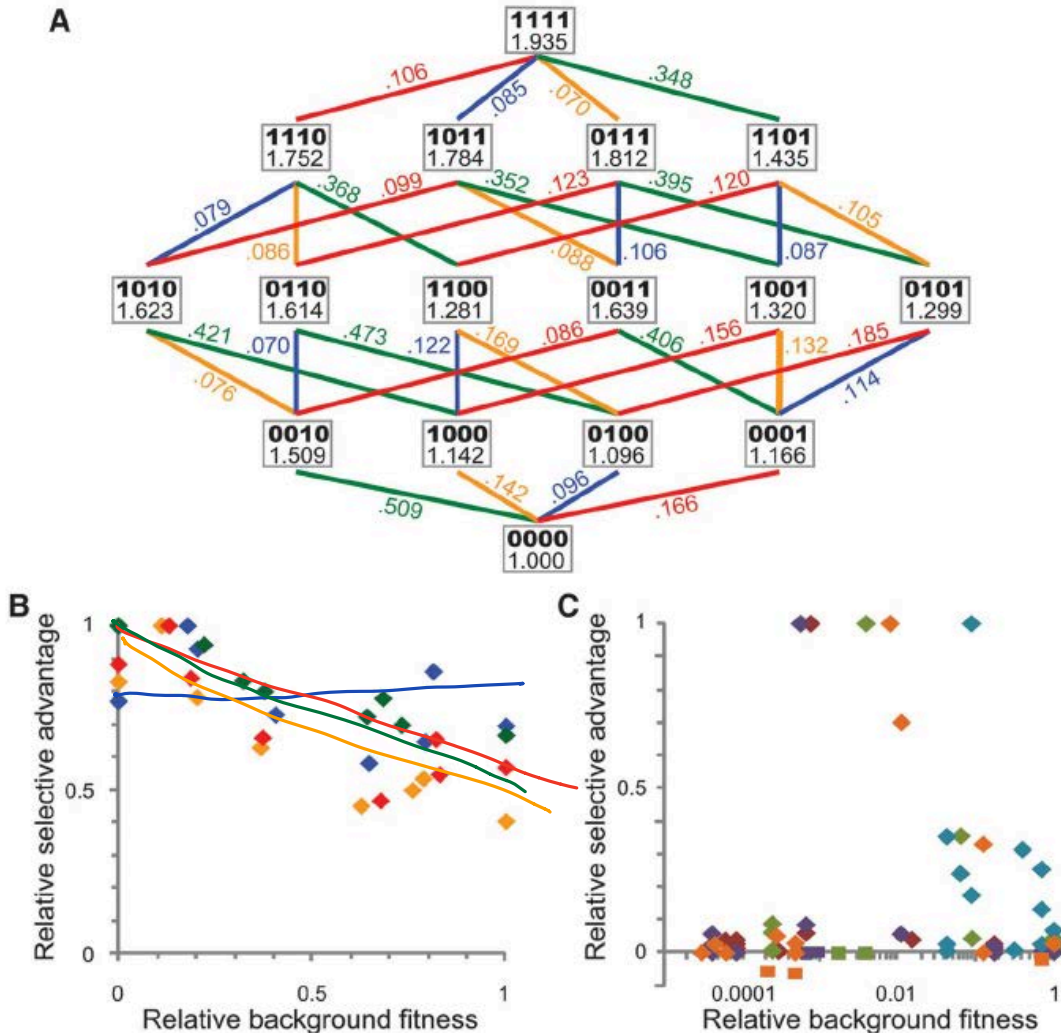
3 IN  $C_1$  METAB:

6 OTHERS → LUMPED AS ONE "ALLELE" (NEW)

\* NO SIGN EPISTASIS: ALL ALLELES BEN.  
ON ALL BACKGROUNDS  
↳ EVERY TRAJECTORY POSSIBLE

\* MAGNITUDE:  $\frac{3}{4}$  ALLELES DECLINE  
IN MAGNITUDE w/ W

# Epistasis across genes vs. within protein



- IN (B), PLOTTED RELATIVE  $s$  (DIVIDED BY MAX  $s$ ) AGAINST RELATIVE FITNESS (SCALED FROM ZERO TO ONE)

ACROSS GENOME

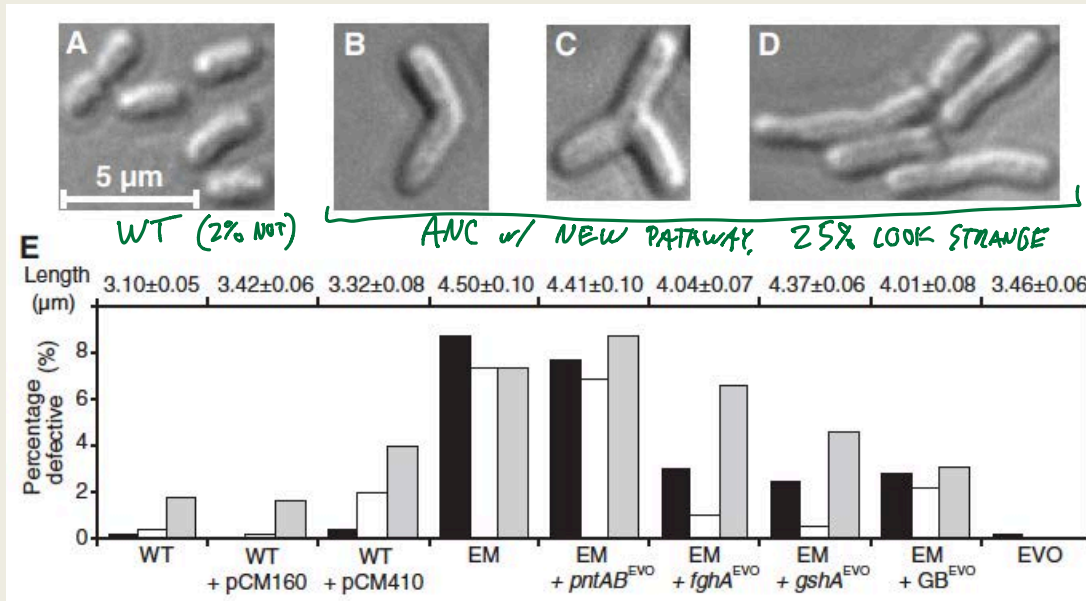
- SEE "DIMINISHING RETURNS"  
↳ ANTAGONISTIC

-  $E < 5$

- SCALES GENERALLY w/  $W$  (FOR  $\frac{3}{4}$ )

\* CONTRIBUTES TO ADAPTATION SLOWING DOWN

# What might cause diminishing returns?

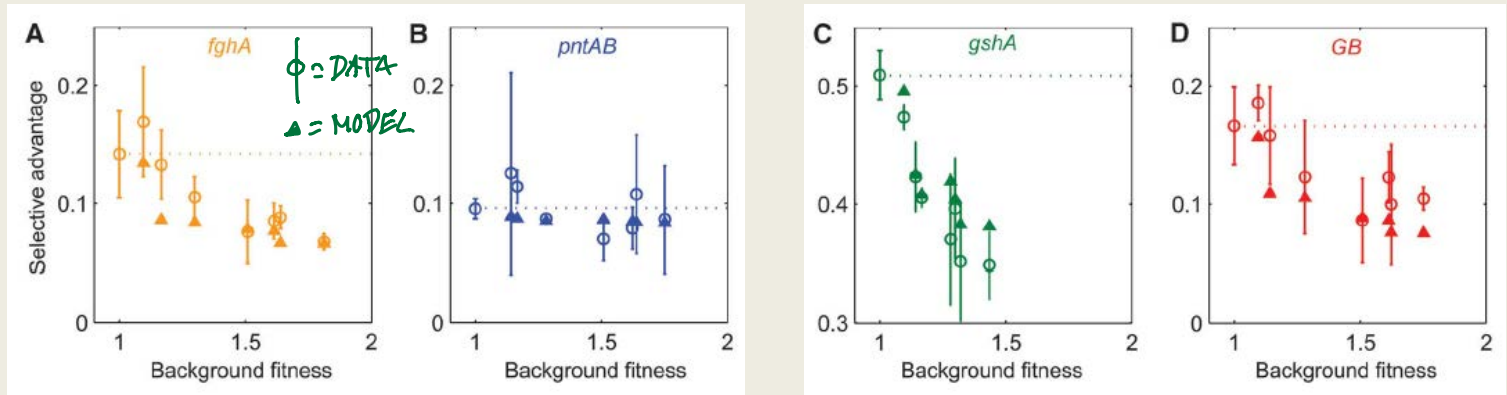


- EXPRESSION OF FOREIGN PATHWAY CAUSES THE CELLULAR ABNORMAL.  
 ↳ COST, LOOKED LIKE PROT. EXP
- EVOLVES AWAY

*pntAB*  
OTHER THREE

LOWER % DEFECTIVE	NO	NO
DIMINISHING RETURNS FOR W	YES	YES

# What might cause diminishing returns?



$$\text{FITNESS} = (\text{GROWTH w/o COSTS})_{b_0} - \text{COSTS}_{c_0}$$

$$W_{\text{AVC}} = 1.14 - 0.14 = 1$$

$$W_i = \lambda_i \cdot b_0 - \theta_i \cdot c_0$$

PROPOSED:  $W_{ij} = \lambda_i \lambda_j b_0 - \theta_i \theta_j c_0$  ← FIT PARAM. FROM WT & SINGLES

→ PREDICT DOUBLE → QUAD STRAINS

$$R^2 = 0.97 \text{ AS TWO PHENOTYPE}$$

$$R^2 = 0.64 \text{ } (W_{AB} = W_A \cdot W_B)$$

• EACH BEN. ALLELE COULD AFFECT ONE OR BOTH TRAITS  $(\lambda_i, \theta_i)$

↳ PROT. RED. IN STRANGE CELLS



# Classic system: Lenski long-term evolution

## Experimental evolution: the Lenski populations

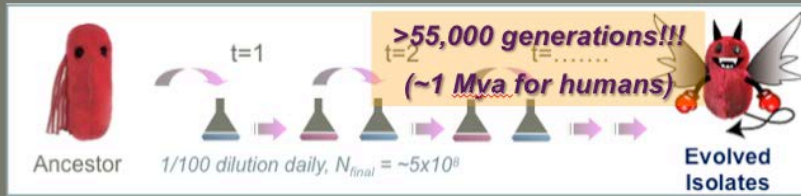
1.) Approach and model system

2.) Major findings

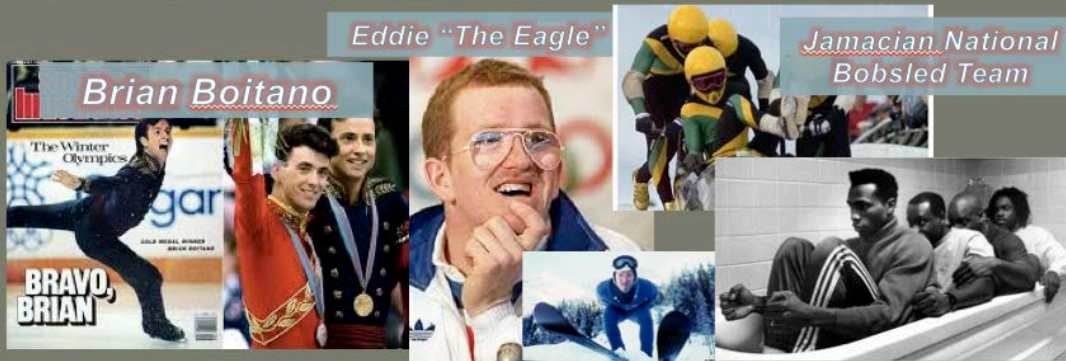
3.) Tradeoffs

4.) Conclusions

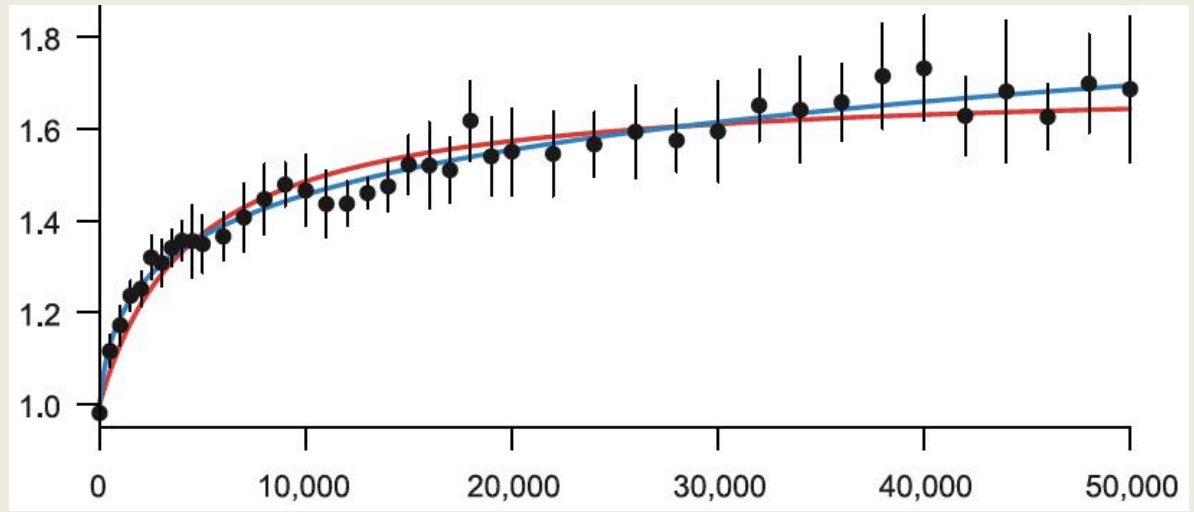
- On February 24<sup>th</sup>, 1988, Rich Lenski started 12 populations of *E. coli* B in minimal glucose medium



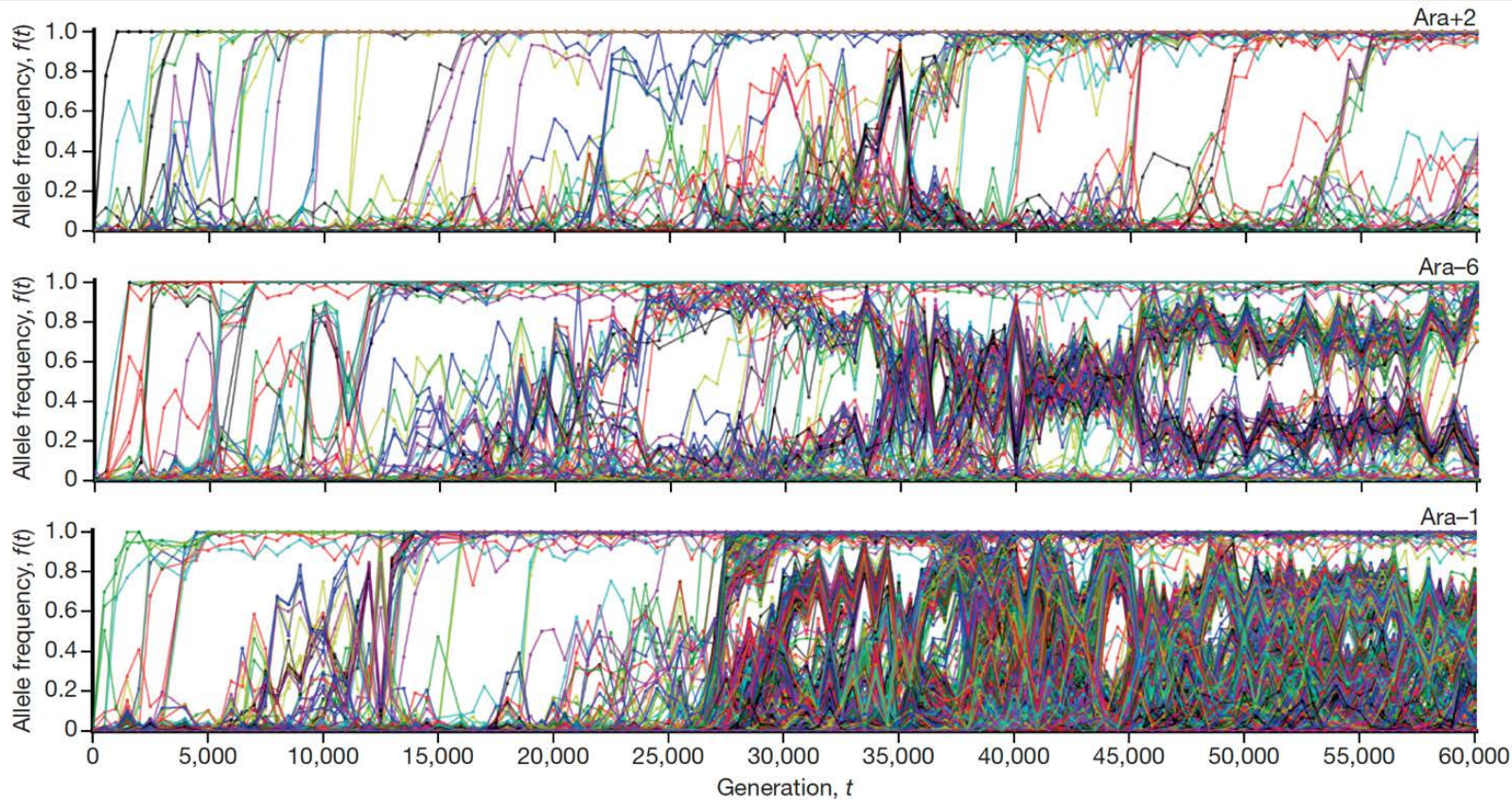
- On February 24<sup>th</sup>, 1988: amidst the Calgary Winter Olympics:



# Continued improvement for 25+ years

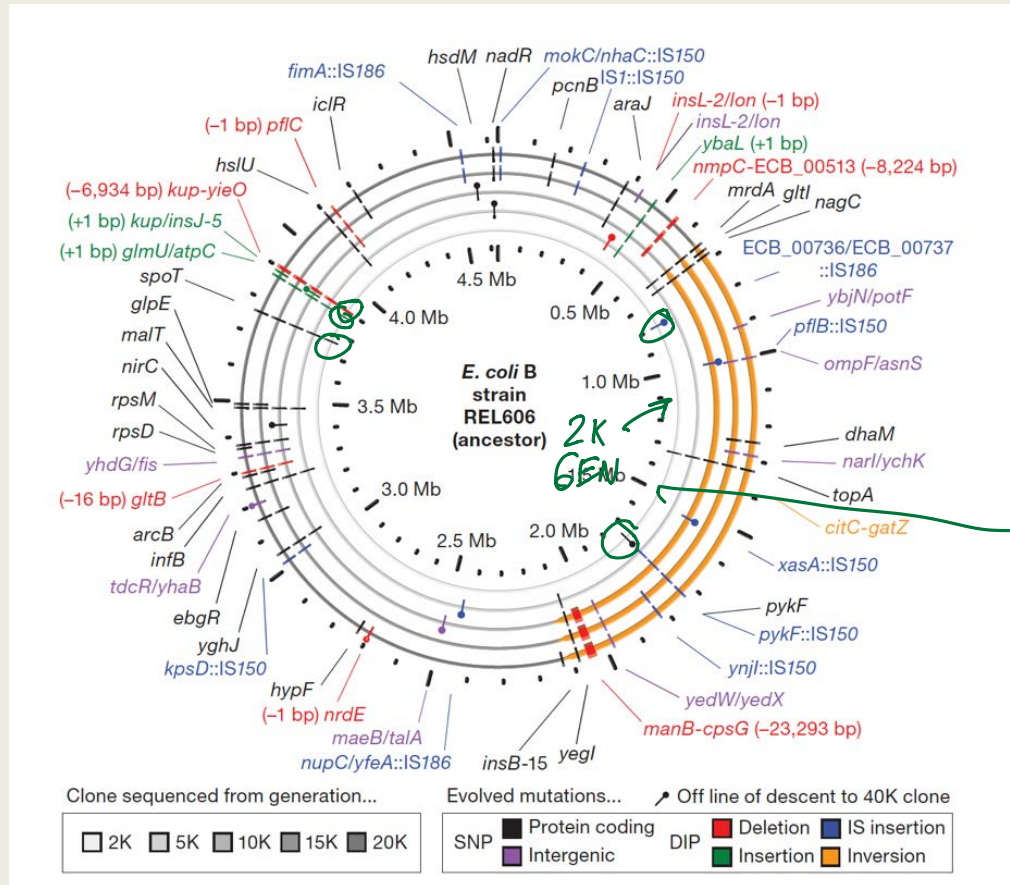


# Picture of genomic change during adaptation





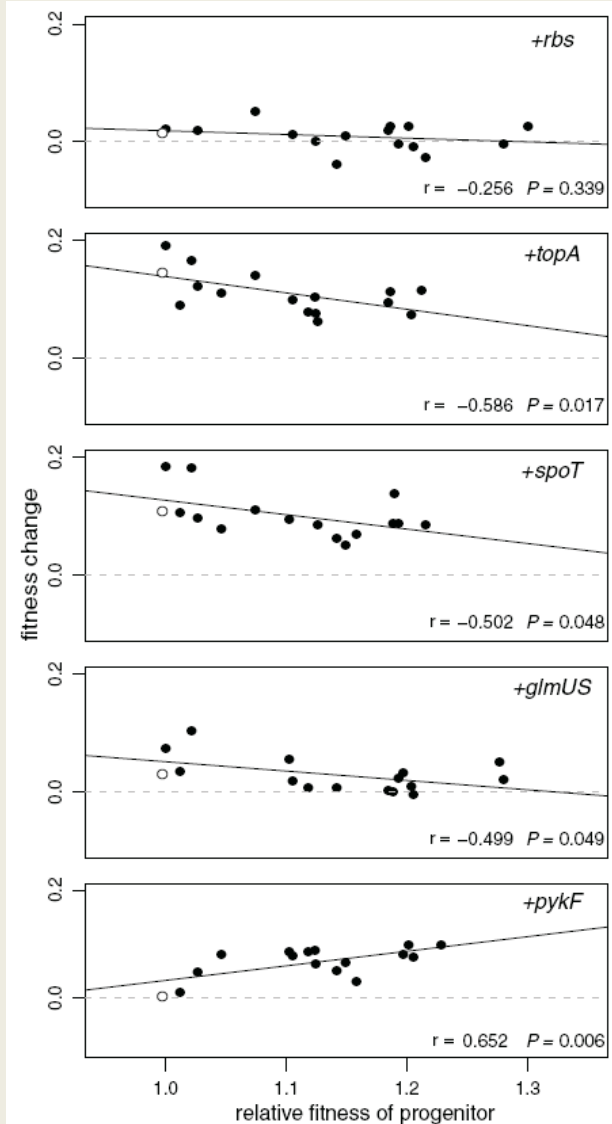
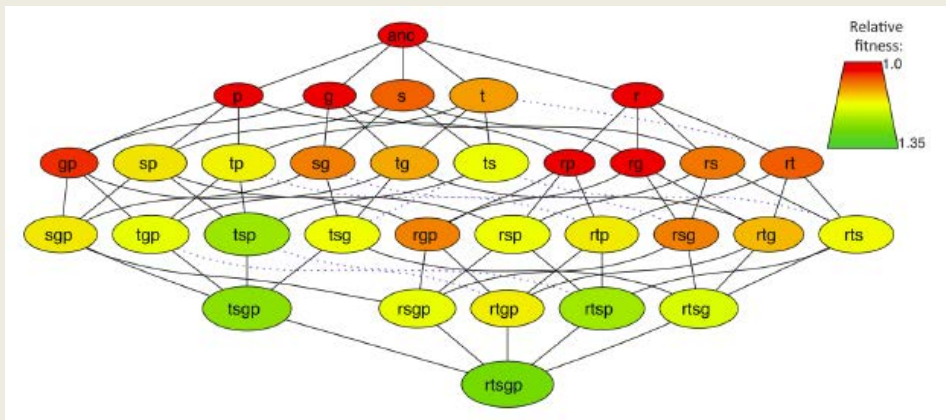
# Picture of genomic change during adaptation



ALL COMBOS  
OF 5 MUT.  
FROM E.coli  
EVL. ON GLUCOSE

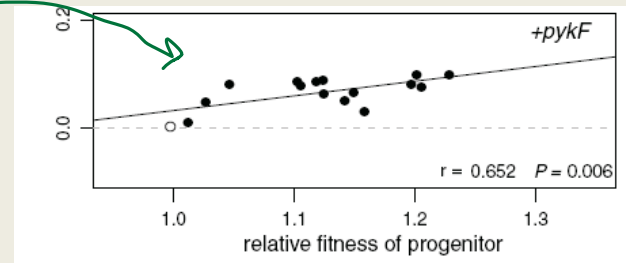
# Diminishing returns in *E. coli*

- $E < \bar{s}$
- NO SIGNIFICANT SIGN EPISTASIS
- 4/5 ALLELES w/ DIMINISHING RETURNS



# Some loci have synergistic effects

-  $\frac{1}{5}$  FROM E.coli (PTS SYSTEM FOR GLUCOSE TRANSPORT)

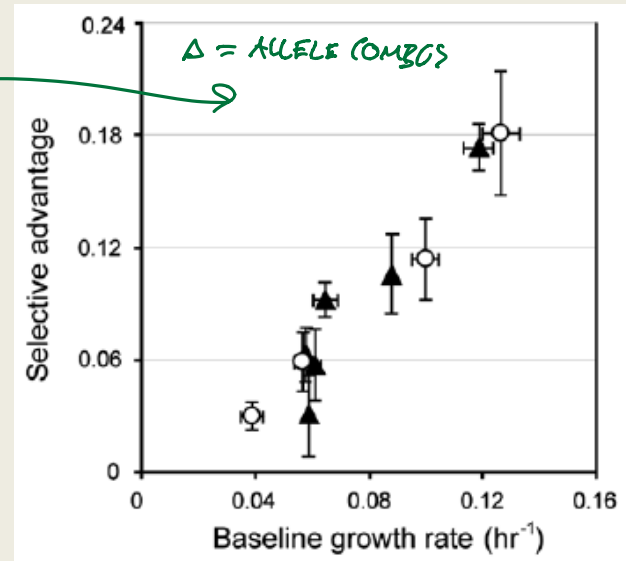


- ONE ALLELE (Co TRANSPORTER)

- EPISTASIS =  $G \times G$

- GENOTYPE  $\times$  ENVIRONMENT =  $G \times E$   
"DY"

↳ GREW FAST WT STRAIN TO CHANGE GROWTH RATE

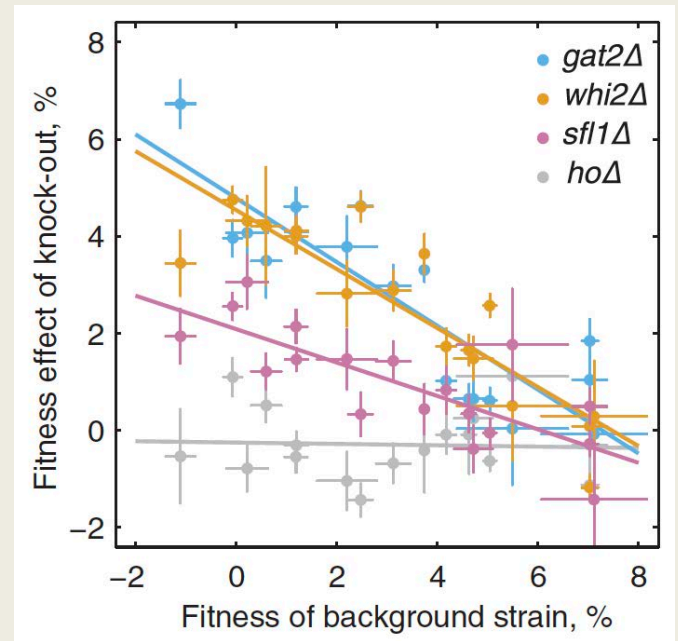




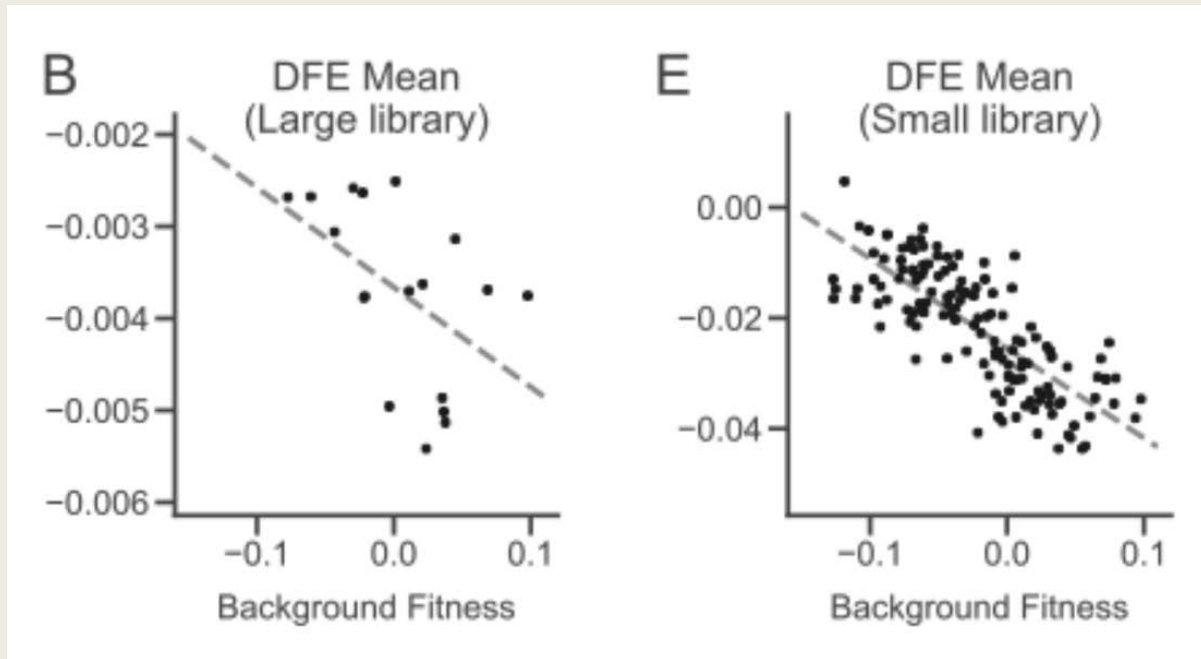
# Continued observation of diminishing returns

- YEAST EVOLUTION IN RICH MEDIUM  
IN DESAI LAB

- 3/4 TESTED MUT. w/ DIMINISHING.

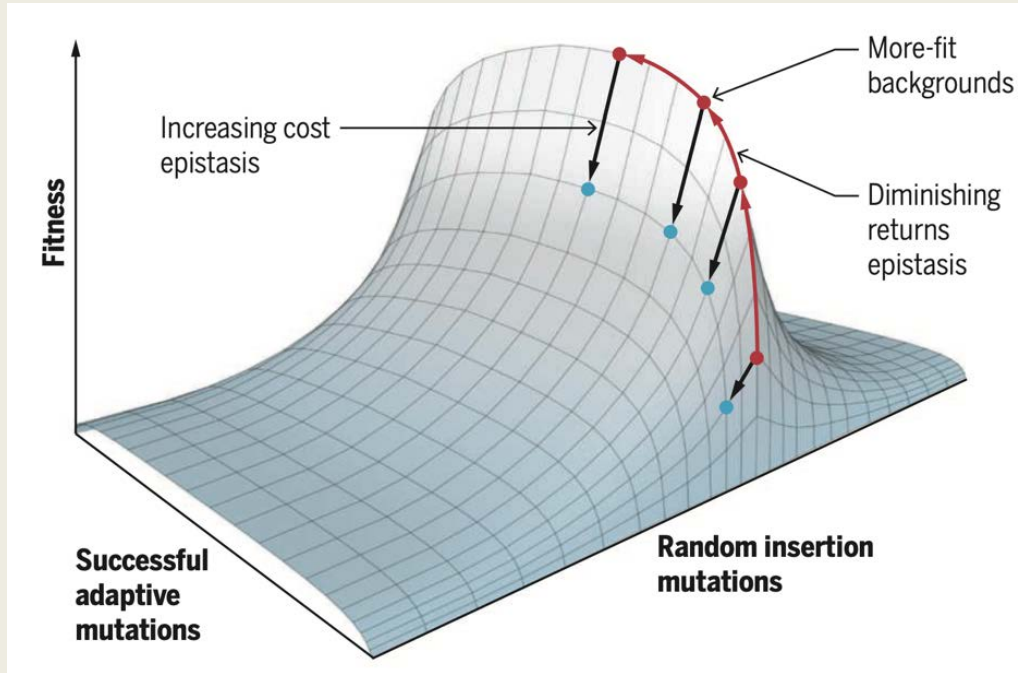


# Epistasis with beneficial mutations vs. deleterious



- NEW STUDY INTRODUCED MANY DELETERIOUS MUTATIONS INTO MANY FIT STRAINS
- GENERIC TREND w/ FITNESS, MUTATIONS HAD BIGGEST EFFECT ON HIGH FITNESS BACKGROUNDS

# Epistasis with beneficial mutations vs. deleterious

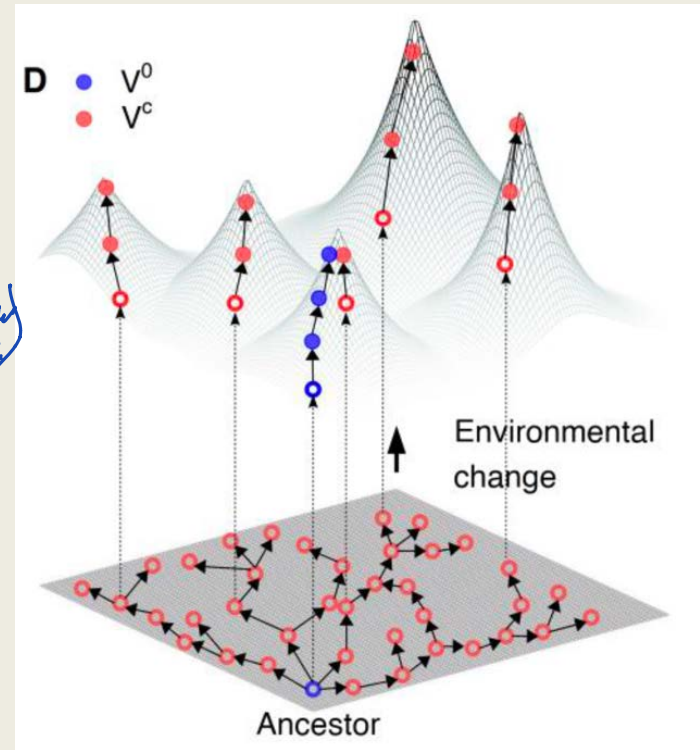


- DIFFERENT TRENDS FOR DELETERIOUS VS BEN. ALLELES

WHY???

# Changing environments allows cryptic variation to escape local fitness peaks

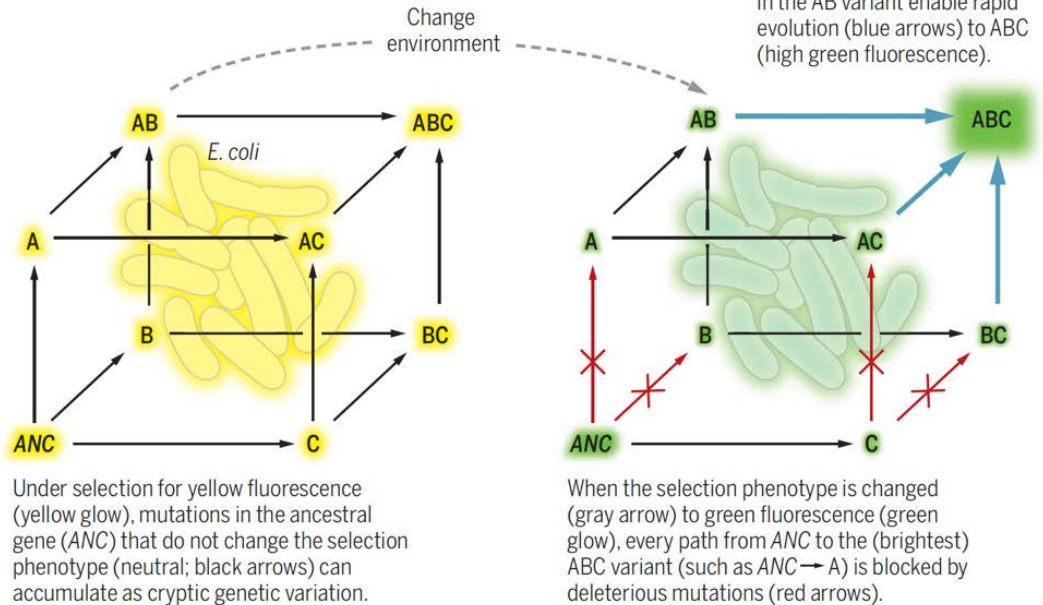
- CAN STARTING FROM MULTIPLE PLACES GENETICALLY PREVENT GETTING TRAPPED ON LOCAL PEAK?
- GENERATE NEUTRAL VARIATION UNDER PUMPING SELECTION (YFP & YELLOW FLUOR) → "CRYPTIC VARIATION"
- NOW SELECT FOR NOVEL TRAIT (YFP FOR GREEN FLUORESCENCE)



# Changing environments allows cryptic variation to escape local fitness peaks

## Cryptic mutations facilitate adaptation

Accumulation of mutations that yield neutral changes in a protein promotes adaptation when selecting for a new function.



- ONE ANSWER TO HOW  
TO CROSS A FITNESS  
VALLEY

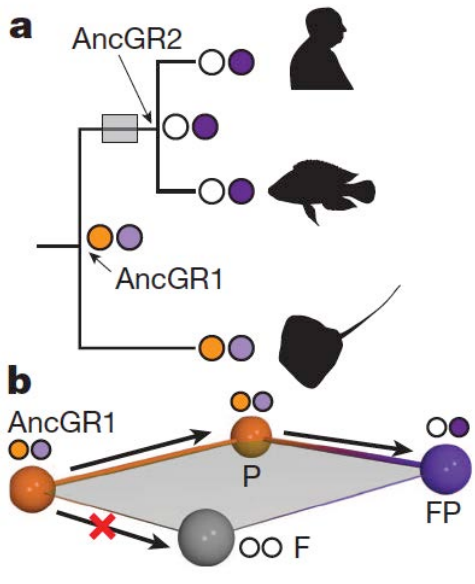
# Specific epistasis: basis of historical contingency

## LETTER

doi:10.1038/nature13410

### Historical contingency and its biophysical basis in glucocorticoid receptor evolution

Michael J. Harms<sup>1,2</sup> & Joseph W. Thornton<sup>2,3</sup>



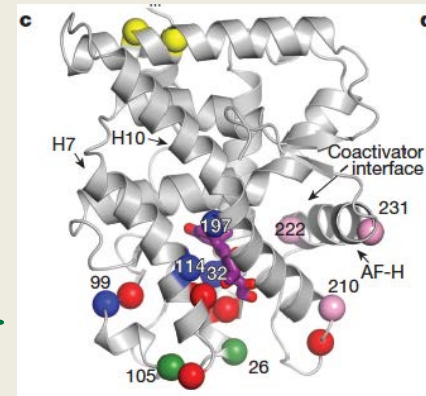
-EPISTASIS HAS AFFECTED PROTEIN EVOL. IN THE PAST

-THORNTON LAB DID PHYLOGENETIC RECONSTRUCTION OF EXTINCT NODES & TEST PHENOTYPES FOR HORMONE RECEPTOR FAMILY

-FOUND MUTATIONS THAT CHANGED SPECIFICITY

-NEUTRAL MUT. FOR SPECIFICITY THAT ARE REQ. FOR FXNL CHANGES

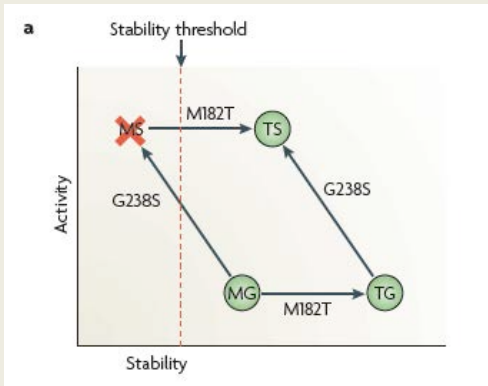
SPECIFIC QAME →  
MUTATIONS



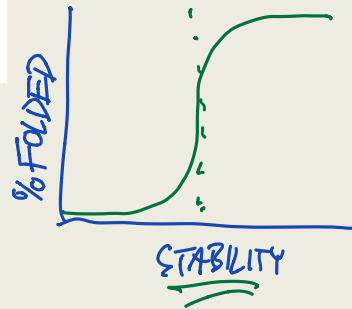
(Harms and Thornton, 2014. *Nature*)



# Generic epistasis: stability



-GENERIC TREND  
FOR PROTEINS  
RELATES TO  
FOLDING STABILITY



- STABILITY & ACTIVITY  
ARE BOTH RARE  
TRAITS

