Synthetic Metabolism: Lessons from Metabolic Engineering



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- Structural limitations
- Polyhydroxybutyrate synthesis in yeast
- Optimal yields of PHB synthesis

Metabolic flux is not proportional to enzyme amount

Altering enzymes affects metabolites more than fluxes

Abolishing feedback inhibition is a bad idea

Pull, don't push.

Coenzyme Imbalance

Success story

Summary

Limitations by network structure

ROOKES Structural limitations

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Any introduced pathway must obtain carbon skeletons and coenzymes (NADPH, ATP, etc) from the host network. This introduces couplings, and hence constraints, to the host metabolic network.

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Solution

Apply structural analysis techniques (e.g. elementary modes analysis, linear programming (FBA)) to the combined network to determine overall stoichiometries and optimal conversion efficiencies of potential routes.

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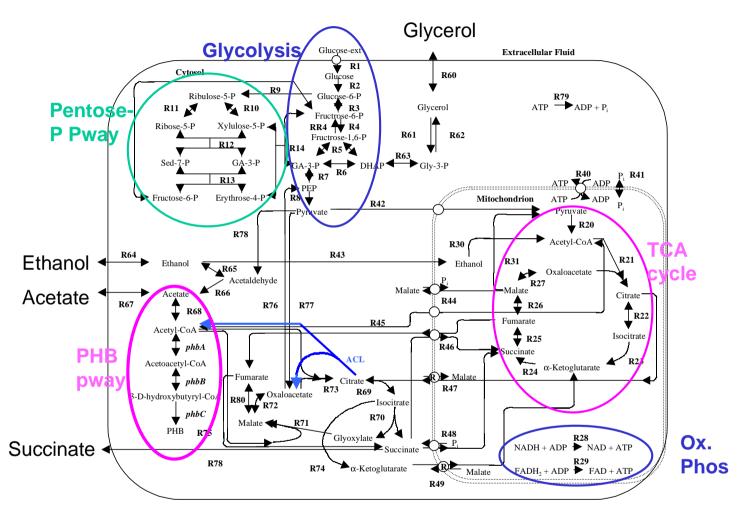
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Wild-type yeast + PHB pathway

- $\label{eq:2.1} 1. \quad 2 \text{ Acetate} + \text{EtOH} \rightarrow \text{PHB} + 2 \text{ CO}_2 \qquad \qquad 0.67$
- 2. 65 Ac. + 31 EtOH \rightarrow 30 PHB + 72 CO $_2$ ~ 0.63

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- 2. 65 Ac. + 31 EtOH \rightarrow 30 PHB + 72 CO $_2$ ~~0.63

Wild-type yeast + ATP-citrate lyase + PHB pathway

- 3. 12 EtOH \rightarrow 5 PHB + 4 CO₂ 0.83
- 4. 77 EtOH + 31 Glycerol \rightarrow
 - 48 PHB + 4 Ac. + 47 CO₂ 0.78

(Number following each mode is the fractional carbon conversion.)



Metabolic flux is not

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- Non–linearity of Flux–Enzyme Relationship
- Dependence of *E. coli* growth rate on β -galase
- Engineering Aromatic Biosynthesis
- The Example of Yeast Trp Biosynthesis
- Increasing Productivity Gets Harder
- Penicillin Synthesis 1

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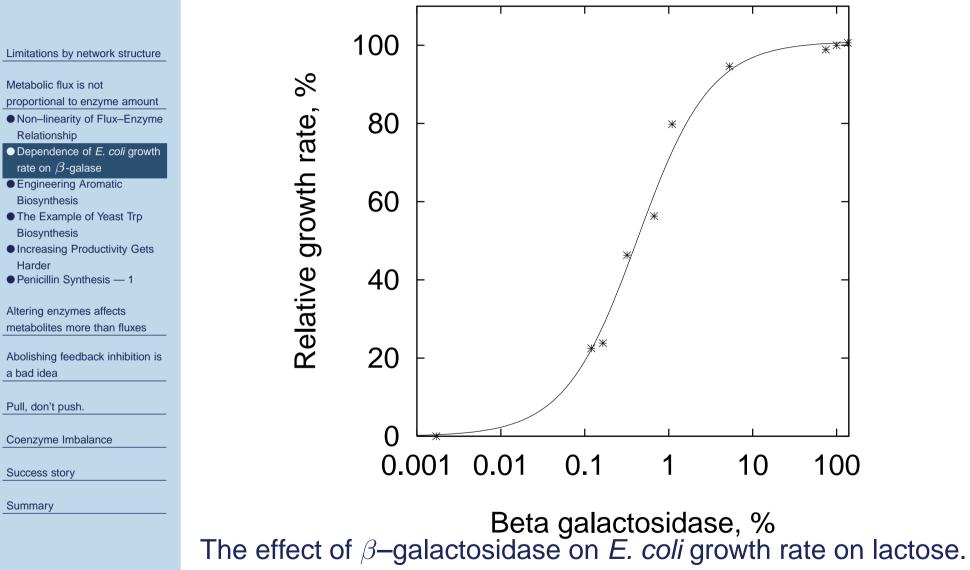
Problem

Even if flux is initially limited by the activity of introduced enzymes, increasing their activity inevitably transfers the limitation to other points in the network.

Solutions

- 1. Find, and then over-express the limiting enzymes; repeat; repeat; repeat; repeat...
- 2. Bring about balanced changes in all the enzymes along the route.

BROOKES Dependence of *E. coli* growth rate on β -galase



Dykhuizen et al, Genetics, 115, 25-31 (1987).

ROOKES Engineering Aromatic Biosynthesis

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Summary

Synthesis of DAHP in *E. coli* studied in an *aroB* mutant that excretes DAHP.

- Synthesis increased by overproduction of a feedback resistant DAHP synthetase (AroG).
- Further increase obtained by overproduction of transketolase (yields E4P).
- Still further increase obtained overexpressing pyruvate, water dikinase to increase formation of PEP.
 Pyruvate, water dikinase only has an effect when the other two enzymes are first overexpressed.

R. Patnaik et al, Biotech. Bioeng. 46, 361-370 (1995).

BROOKES UNIVERSITY The Example of Yeast Trp Biosynthesis

	Ger	nes	over	expr	essed	Mean	Relative
Limitations by network structure	2	4	1	3	5	change	trp flux
Metabolic flux is not proportional to enzyme amount	_	-	-	•	•	9.1	
● Non–linearity of Flux–Enzyme							
Relationship • Dependence of <i>E. coli</i> growth	-	-	-	-	-	1	1.0
rate on β-galase ● Engineering Aromatic Biosynthesis	-	-	+	+	-	58	2.0
• The Example of Yeast Trp Biosynthesis	+	+	-	+	-	35	2.4
 Increasing Productivity Gets Harder Penicillin Synthesis — 1 	+*	-	+	+	-	34	1.2
Altering enzymes affects metabolites more than fluxes	+*	+	+	+	-	30	2.1
Abolishing feedback inhibition is	+	+	-	+	+	19	8.2
a bad idea	+*	+	+	+	+	23	8.8
Pull, don't push.							
Coenzyme Imbalance	(1) indicator the enzyme was everegened; () indicator						
Success story	'+' indicates the enzyme was overexpressed; '-' indicates						
Summary	wild-type level. The mean change column gives the aver-						
	age fold over-expression.						
	P. Niederberger et al, <i>Biochem. J.</i> 287, 473–479 (1992)						

ROOKES Increasing Productivity Gets Harder

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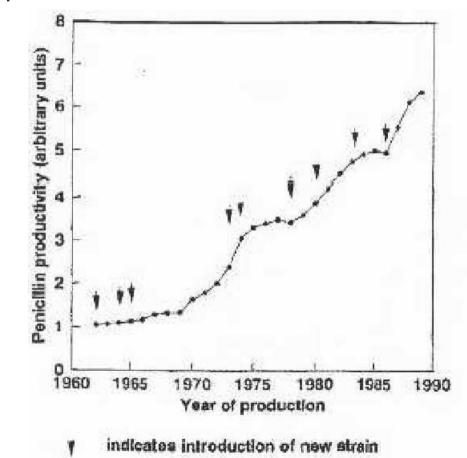
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Coenzyme Imbalance

Success story

Summary

Productivity was increased by mutation and selection rather than rationally, but changes occurred in many aspects of precursor uptake and metabolism.





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Penicillin Synthesis — 1

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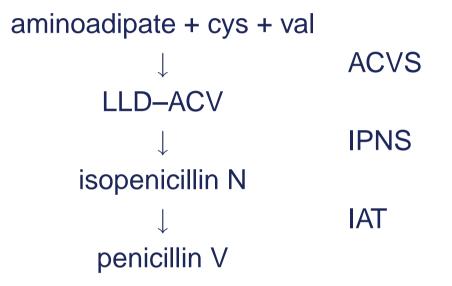
Pull, don't push.

Coenzyme Imbalance

Success story

Summary

There are 3 enzymes on the main route from amino acids to penicillin V.





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 Enzyme Effects on Metabolites

- Over–Expression of Potato PFK
- Engineering Tryptophan
 Production

Abolishing feedback inhibition is a bad idea

Pull, don't push.

Coenzyme Imbalance

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BROOKES Enzyme Effects on Metabolites

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The concentrations of metabolites generally respond more sensitively to changes in a single enzyme activity than do fluxes. Adverse effects can follow through osmotic effects or metabolite toxicity.

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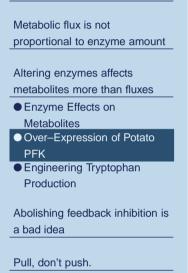
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Solution

Proportionate changes in all enzymes along the path (Kacser & Acerenza Universal Method), or activating whole pathways by manipulating a global regulator.

BROOKES Over-Expression of Potato PFK

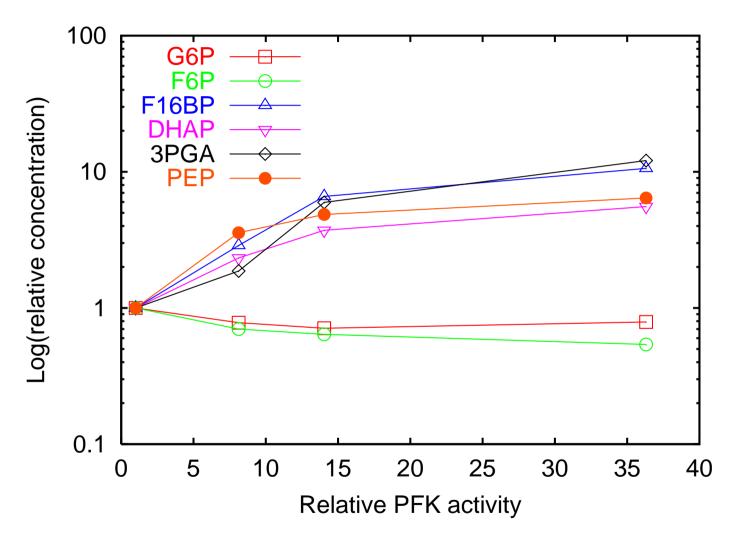
Limitations by network structure



Coenzyme Imbalance

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ROOKES Engineering Tryptophan Production

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Coenzyme Imbalance

Success story

Summary

Increased trp production in *Corynebacterium glutamicum* by:

- Starting with a phe, tyr auxotroph derepressed to overexpress all trp enzymes a few fold.
- Overexpressing DAHP synthase (8x) and all the trp genes (11x) after chorismate.
- Abolishing feedback on PRT to stop accumulation of toxic anthranilate caused by imbalance in ANS-PRT activities.

but

Continuous selection pressure needed to retain plasmid.

R. Katsumata & M. Ikeda, *Biotechnology* 11, 921–925, (1993).



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Abolishing feedback inhibition

• Yeast Glycolysis

Pull, don't push.

Coenzyme Imbalance

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Abolishing feedback inhibition is a bad idea



5 Abolishing feedback inhibition

Problem

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Yeast Glycolysis

Pull, don't push.

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Feedback inhibition has long and widely been stated to be a control mechanism on metabolic fluxes. Hence abolishing these effects has often been tried as a first step.



S Abolishing feedback inhibition

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Solution

Take note that:

- 1. Feedback inhibition is an antidote to the tendency of reactions at the start of a pathway to have the greater control of flux.
- 2. Feedback inhibition improves homoeostasis of the concentration of the feedback metabolite; increased cooperativity of the inhibition specifically enhances this effect.
- 3. Feedback inhibition improves the stability of pathways in that it speeds up the return to a steady state after random perturbation,



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Abolishing feedback inhibitionYeast Glycolysis

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Summary

The allosteric PFK of yeast glycolysis has been replaced with a non–regulated version by complementation of *pfk-* mutants with a non–allosteric enzyme from *D. discoideum*. Results:

- 1. The glycolytic rate and growth rate were unchanged from the wild-type with a regulated PFK.
- 2. Even if just the F26BP regulation was abolished, The concentrations of glycolytic intermediates were substantially higher.

3. In the latter case, yeast showed slower aerobic-anaerobic transitions because of the raised metabolite levels.

A. M. Estévez et al, FEBS Lett, 374, 100–104, (1995). E. Boles et al, Mol. Microbiol. 20, 65–76 (1996).



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Pull, don't push.

• Pull, don't push

• Lysine biosynthesis

● Lysine — Partial Success

• C glutamicum and Lysine Export

Coenzyme Imbalance

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Metabolism can be seen to be resistant to stimulating biosynthesis by expressing or over–expressing pathway enzymes. Control of the flux soon passes elsewhere, and metabolite concentrations rise. But what's the alternative?



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Solution

Exploit the natural homeostatic mechanisms of the cell: pull the products out, rather than push precursors towards them. The metabolic network will tend to replace material that's removed. Feedback loops in metabolism transfer control from the 'supply' steps near the beginning to the 'demand' reactions after the feedback loop.



Lysine biosynthesis

Figure of lysine biosynthesis pathway from aspartate showing feedback inhibition.

Limitations by network structure

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Summary

In Corynebacterium glutamicum,

- Of the 6 enzymes tested between asp and lys, only overexpression of feedback-resistant aspartate kinase and dihydrodipicolinate synthase leads to excretion of lysine.
- Overexpression of both these together gives higher yields than either separately.
 - In aspartate kinase overexpressers, overexpression of phosphoenolpyruvate carboxylase increases lysine synthesis, though it has no effect alone.
- However, the plasmid coding the feedback resistant aspartate kinase is very unstable.
- J. Cremer et al. Appl. Env. Microbiol. 57, 1746–1752 (1991)



C glutamicum and Lysine Export

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Summary

Strains with different lysine productivities have different lysine export activities.¹

A lysine-inducible, energy-dependent lysine exporter (lysE) has been isolated.²

Over–expression of lysE in wild–type C glutamicum causes a 5–fold increase in lysine excretion and is more effective than making aspartate kinase resistant to feedback inhibition by lysine.²

¹ Broer et al, *Appl. Env. Microbiol. 59,* 316–321, 1993. ² Vrljic et al, *Mol. Microbiol. 22*, 815–826, 1996.



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Coenzyme Imbalance

Cofactor Imbalance

Xylose metabolism

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It can be difficult to reconcile the poise of coenzyme couples to be suitable for both general cellular metabolism and the desired pathway.



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Solution

? This is really difficult. Changing the source/ kinetics of the enzymes involved may help.

BROOKES Xylose metabolism

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 Xylose metabolism

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Summary

- Pentilla and colleagues are engineering S. cerevisiae to metabolise the xylose component of hemicellulose to ethanol.
- The pathway involves reduction by an NADPH-linked xlose reductase to xylitol. This is then oxidised by an NAD–linked xylitol dehydrogenase to give xylulose. After phosphorylation, this enters the pentose phosphate pathway as xylulose 5–P.
- Conditions are suitable for the first reaction with NADPH generated adequately. The second reaction is limited by NAD supply.
- This is difficult to fix without disrupting the cell's metabolism.



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Success story

- Artemisinin by Synthetic Biology
- Artemisinin Production
- Multiple Metabolic
 Manipulations

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BROOKES Artemisinin by Synthetic Biology

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Figure or artemisinin pathway

OXFORD BROOKES Artemisinin Production

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Summary

Jay Keasling's group achieved good productivity of the malaria drug artemisinin in *S. cerevisiae* by:

Engineering the farnesyIPP pathway to increase productivity and reduce diversion to sterols;

Introduced the amorphadiene synthase gene (ADS) from Artemisia annua;

Introducing a P450 enzyme to carry out the three—step oxidation of amorphadiene to artemisinin.

Ro et al, Nature 440, 940-943, 2006



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Figure showing productivity of strains as successive changes are introduced form: Ro et al, Nature 440, 940–943, 2006

OXFORD BROOKES Summary

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Read the Theory First!

- Molecular biologists suffered many disappointments through naïve attempts to modify metabolism to increase productivity of desired products.
- Metabolic engineering started to achieve better results when it absorbed concepts from modern theory of the control of metabolism.
- The artemisinin project confirms that synthetic biology projects need to build on the lessons from metabolic engineering.

BROOKES Read the Theory First!

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