

# Optimization of Fermentation processes Both at the Process and Cellular Levels

'Simultaneous saccharification and fermentation  
of starch to lactic acid'



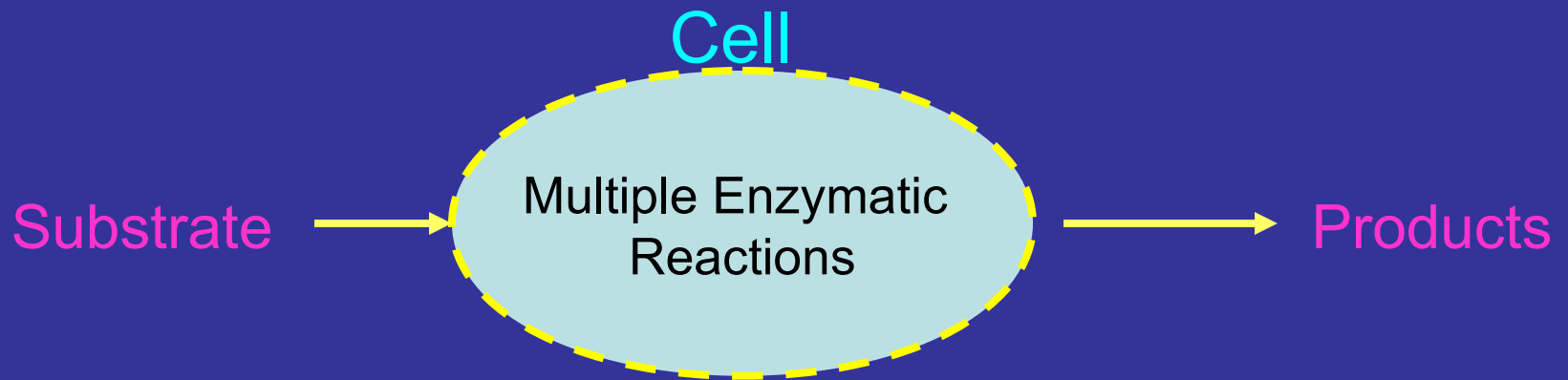
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# Introduction

- Living cells can be used to produce biochemical products
- Natural screening of the environment to isolate microorganisms
- Isolated microorganisms or cells as pure cultures are grown in bioreactor – fermentation processes
- Fermentation processes are used to produce chemicals ranging from food, polymer, pharmaceuticals, bulk chemicals, bio-energy, waste management etc

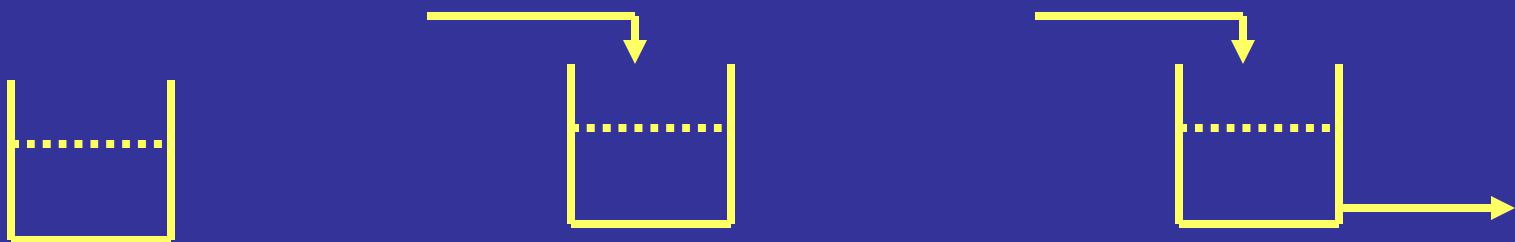
# Metabolism



1. Diverse products can be produced by various living cells
2. Diversity depends on the metabolism evolved in a particular organism; Yeast – ethanol, Lactobacillus – Milk to yogurt etc

# Fermentation Process

- Cells/Microorganisms require a medium for its growth
- Medium typically contains a carbon, nitrogen and essential nutrients
- Optimal pH and temperature
- Optimization at the process level: Media, environmental conditions
- Operation – batch, fed-batch or continuous



# Starch as a carbon Source

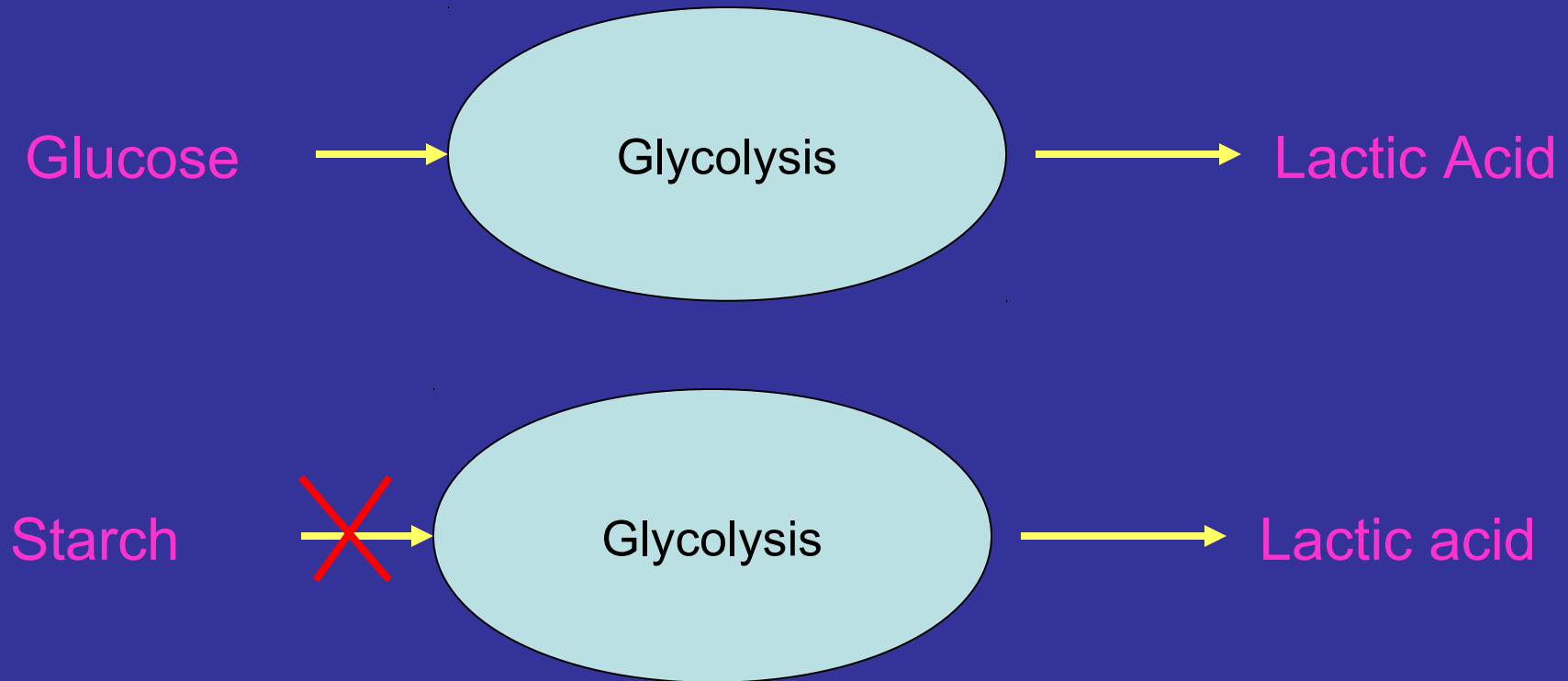
- Starch is a polysaccharide of glucose molecules
- Enzymatic hydrolysis to glucose



Rate of the enzymatic process  
is reduced due to glucose inhibition

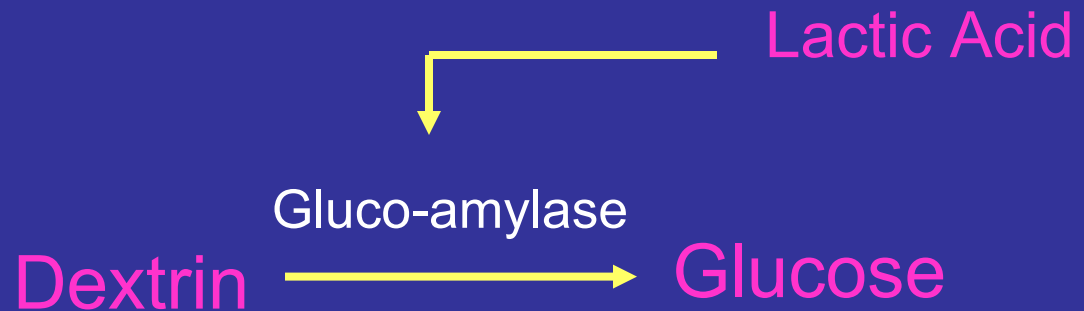
# Lactic acid fermentation

- *Lactobacillus* strain converts glucose to lactic acid



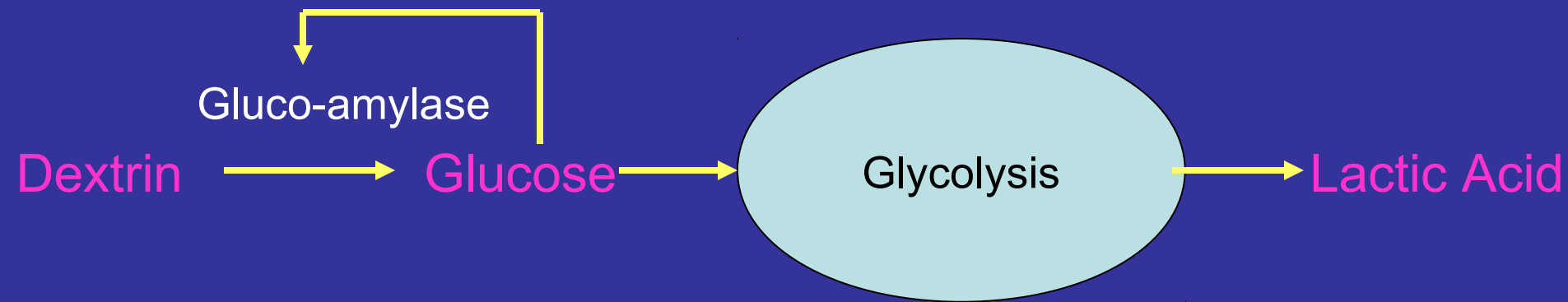
# Inhibition of Saccharification by fermentative products

- Lactic acid
- Ethanol
- Butanol
- Diacetyl
- Acetoin
- Citric acid



The above products offer lesser inhibition than glucose

# Simultaneous Saccharification and fermentation



Enzymatic reaction and fermentation in the same reactor will not allow the accumulation of glucose to inhibit the saccharification step



# Strategy

- Detailed modeling and experimental analysis of the saccharification step
- Detailed modeling and experimental analysis of the fermentation step
- Prediction of optimal condition for SSF using model
- Temperature (45C), pH (5.5) and glucose concentration ( $< 20$  g/L) crucial for the operation of SSF
- Experimental verification to demonstrate increased rates and productivities
- Fed-batch operation for reducing product inhibition

# Cellular Optimization

- Cells screened from nature are typically optimized for growth
- Cells are the micro-reactors in the fermentation process
- The main step for economical process is to perform cellular optimization.
- Metabolic and genetic engineering can be used to alter the cellular behaviour.
- Directed mutation versus random mutation.

# Metabolic Network analysis

1. Determine the limiting step in the Metabolism
2. Quantification of feasible metabolic space
3. Removal of the limiting step in the network.
4. Detailed Kinetics of the process using metabolism.
5. Elementary mode analysis

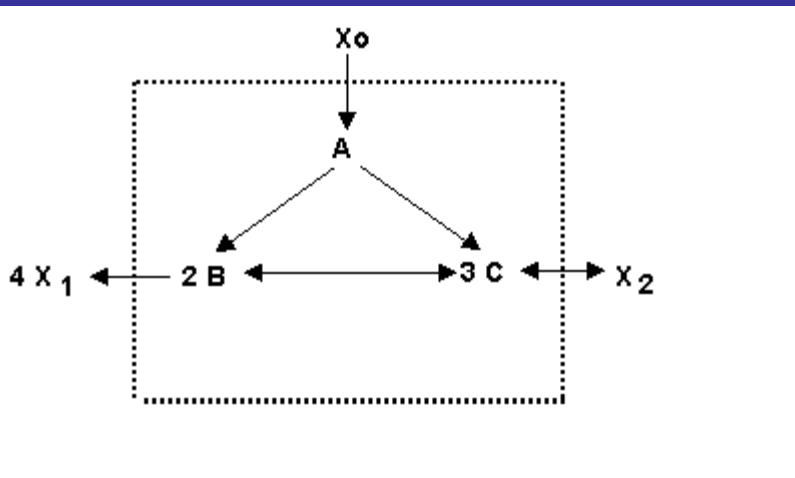
# What are the elementary modes ?

An elementary mode is a minimal subset of enzymes in a network that can operate at steady state with all irreversible reactions proceeding in the direction as prescribed by thermodynamics.

Elementary mode analysis links network structure to flux balance (evaluation of reaction rates)

# Methodology: Hypothetical Network

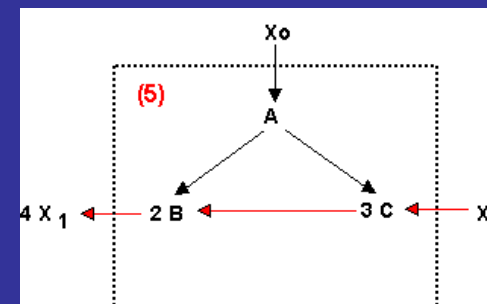
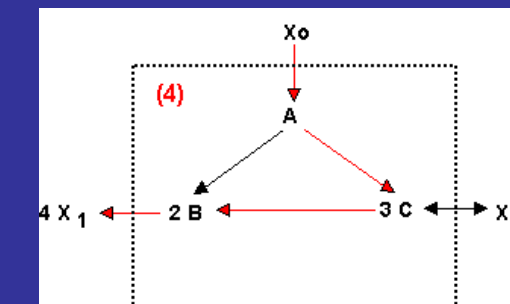
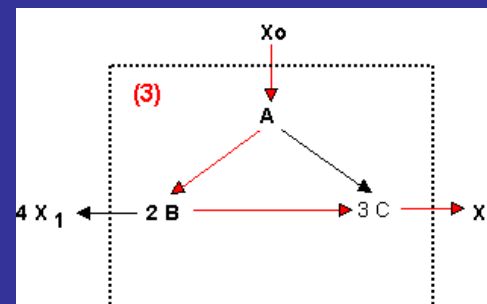
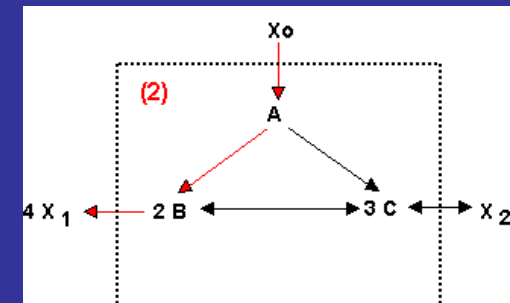
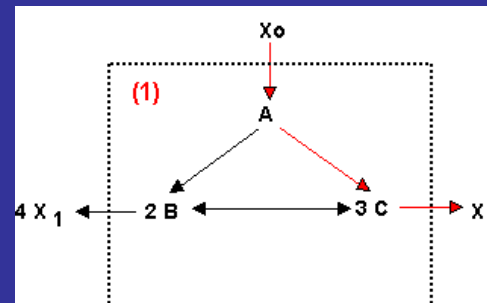
## System chosen



Fluxes of elementary modes    Reaction stoichiometry

$v_1$	$X_0 \longrightarrow X_2$
$v_2$	$X_0 \longrightarrow 4X_1$
$v_3$	$X_0 \longrightarrow X_2$
$v_4$	$X_0 \longrightarrow 4X_1$
$v_5$	$X_2 \longrightarrow 4X_1$

## Elementary modes



# Problem formulation

## Rates of external metabolites

$$\frac{dX_0}{dt} = v_1 + v_2 + v_3 + v_4$$

$$\frac{dX_1}{dt} = 4v_2 + 4v_4 + 4v_5$$

$$\frac{dX_2}{dt} = v_1 + v_3 - v_5$$

## In matrix form

$$\begin{bmatrix} 1 & 1 & 1 & 1 & 0 \\ 0 & 4 & 0 & 4 & 4 \\ 1 & 0 & 1 & 0 & -1 \end{bmatrix} \begin{bmatrix} v_1 \\ v_2 \\ v_3 \\ v_4 \\ v_5 \end{bmatrix} = \begin{bmatrix} dX_0/dt \\ dX_1/dt \\ dX_2/dt \end{bmatrix}$$

## Linear programming formulation

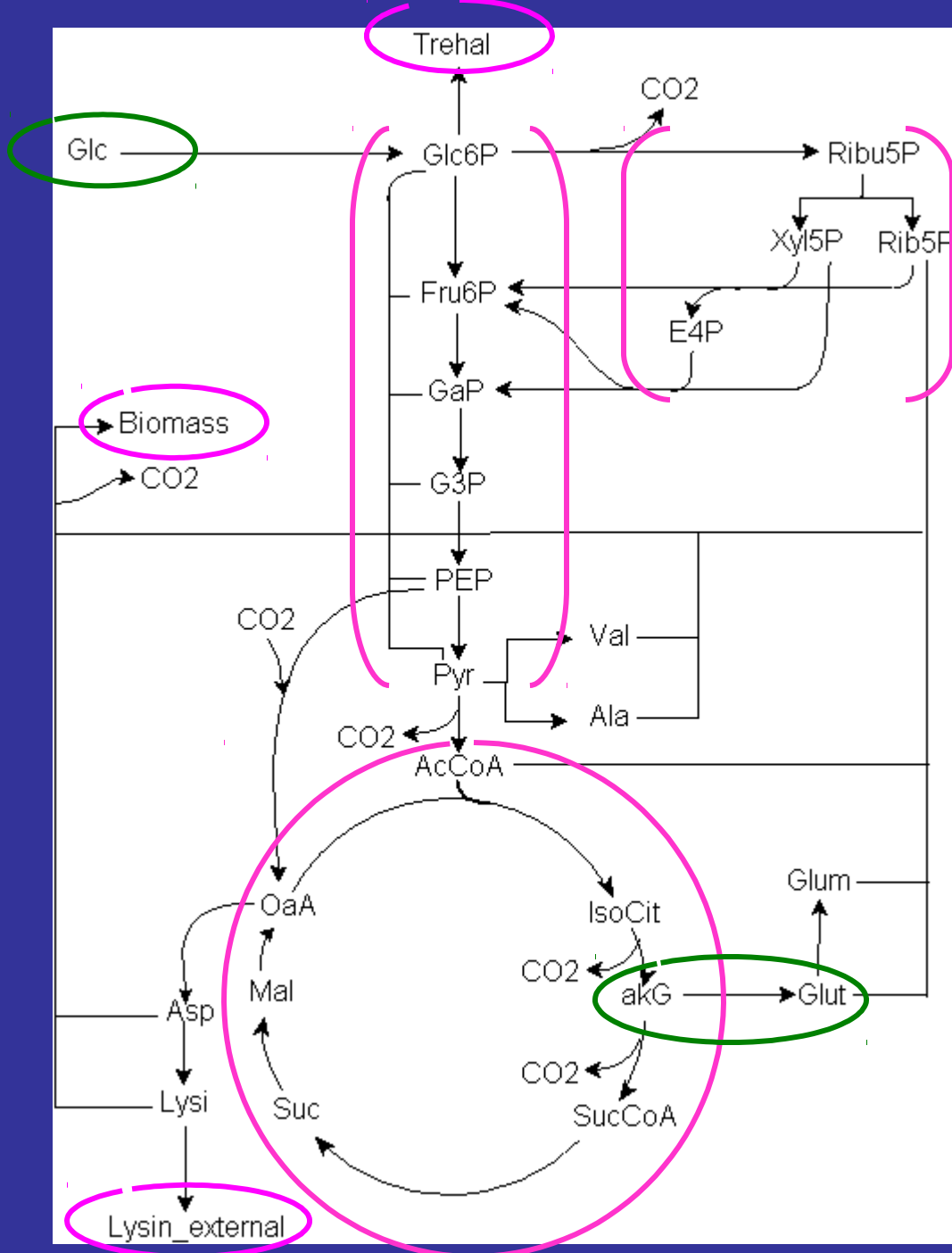
$$\text{Objective function} = \text{maximize} \left( \frac{dX_2}{dt} \right)$$

Subject to

$$\begin{bmatrix} 1 & 1 & 1 & 1 & 0 \\ 0 & 4 & 0 & 4 & 4 \end{bmatrix} \begin{bmatrix} v_1 \\ v_2 \\ v_3 \\ v_4 \\ v_5 \end{bmatrix} = \begin{bmatrix} dX_0/dt \\ dX_1/dt \end{bmatrix}$$

Experimentally Determined (known)

and  $0 \leq v_i \leq \infty$  for all  $i^{\text{th}}$  elements



# Biochemical Network of *Corynebacterium glutamicum*

Metabolites : 39  
Reactions: 40

Substrates: Glucose, ammonia and oxygen

Products: Lysine, Biomass, Trehalose and Carbon dioxide

# Elementary Modes for the network of *C. glutamicum*

1.  $290682X\_glm + 238464 X\_NH3 + 325944 X\_O2 \rightarrow 73926 X\_lac + 398358 X\_CO2 + 324000X\_biom + 1027296 X\_h2o$
2.  $9492 X\_glm + 11352 X\_NH3 + 14987 X\_O2 \rightarrow 20374 X\_CO2 + 2000 X\_biom + 40108 X\_h2o + 4940 X\_Lys$
3.  $38 X\_glm + 44 X\_NH3 + 62 X\_O2 \rightarrow 84 X\_CO2 + 160 X\_H2O + 1 X\_Treh + 22 X\_Lys$
4.  $4572 X\_glm + 4792 X\_NH3 + 3507 X\_O2 \rightarrow 1640 X\_lac + 5614 X\_CO2 + 2000 X\_biom + 13868 X\_h2o + 1660 X\_Lys$
5.  $14 X\_glm + 12 X\_NH3 + 6 X\_O2 \rightarrow 8 X\_lac + 12 X\_CO2 + 32 X\_h2o + 1 X\_Treh + 6 X\_Lys$
6.  $12 X\_glm + 12 X\_NH3 + 6 X\_O2 \rightarrow 8 X\_lac + 12 X\_CO2 + 32 X\_h2o + 6 X\_Lys$
7.  $18 X\_glm + 22 X\_NH3 + 31 X\_O2 \rightarrow 42 X\_CO2 + 80 X\_h2o + 11 X\_Lys$
8.  $10 X\_glm + 12 X\_NH3 + 6 X\_O2 \rightarrow 4 X\_lac + 12 X\_CO2 + 28 X\_h2o + 6 X\_Lys$
9.  $11 X\_glm + 14 X\_NH3 + 17 X\_O2 \rightarrow 24 X\_CO2 + 46 X\_h2o + 7 X\_Lys$
10.  $208 X\_glm + 208 X\_NH3 + 364 X\_O2 \rightarrow 468 X\_CO2 + 884 X\_h2o + 13 X\_Treh + 104 X\_Lys$
11.  $14 X\_glm + 16 X\_NH3 + 28 X\_O2 \rightarrow 36 X\_CO2 + 68 X\_h2o + 8 X\_Lys$
12.  $5 X\_glm + 2 X\_NH3 + 11 X\_O2 \rightarrow 12 X\_CO2 + 22 X\_h2o + 1 X\_Treh + 1 X\_Lys$
13.  $3 X\_glm + 2 X\_NH3 + 11 X\_O2 \rightarrow 12 X\_CO2 + 22 X\_h2o + 1 X\_Lys$
14.  $3420 X\_glm \rightarrow 3420 X\_lac + 3420 X\_h2o + 855 X\_Treh$
15.  $855 X\_glm \rightarrow 1710 X\_lac + 1710 X\_h2o$
16.  $2695160 X\_glm + 1074560 X\_NH3 + 5764810 X\_O2 \rightarrow 6091120 X\_CO2 + 1460000 X\_biom + 12028940 X\_h2o + 417925 X\_Treh$
17.  $4701762 X\_glm + 2717312 X\_NH3 + 14577862 X\_O2 \rightarrow 15403024 X\_CO2 + 3692000 X\_biom + 30418388 X\_h2o$
18.  $9490 X\_glm + 9892 X\_NH3 + 15619 X\_O2 \rightarrow 19698 X\_CO2 + 6000 X\_biom + 40928 X\_h2o + 2738 X\_Lys$
19.  $8639480 X\_glm + 3989120 X\_NH3 + 17986270 X\_O2 \rightarrow 19197640 X\_CO2 + 5420000 X\_biom + 38509100 X\_h2o + 1153105 X\_Treh$
20.  $3166635 X\_glm + 1994560 X\_NH3 + 8993135 X\_O2 \rightarrow 9598820 X\_CO2 + 2710000 X\_biom + 19254550 X\_h2o$
21.  $326808 X\_glm + 278208 X\_NH3 + 565083 X\_O2 \rightarrow 649566 X\_CO2 + 378000 X\_biom + 1444932 X\_h2o$
22.  $384536 X\_glm + 313536 X\_NH3 + 393411 X\_O2 \rightarrow 113600 X\_lac + 488622 X\_CO2 + 426000 X\_biom + 1303844 X\_h2o$

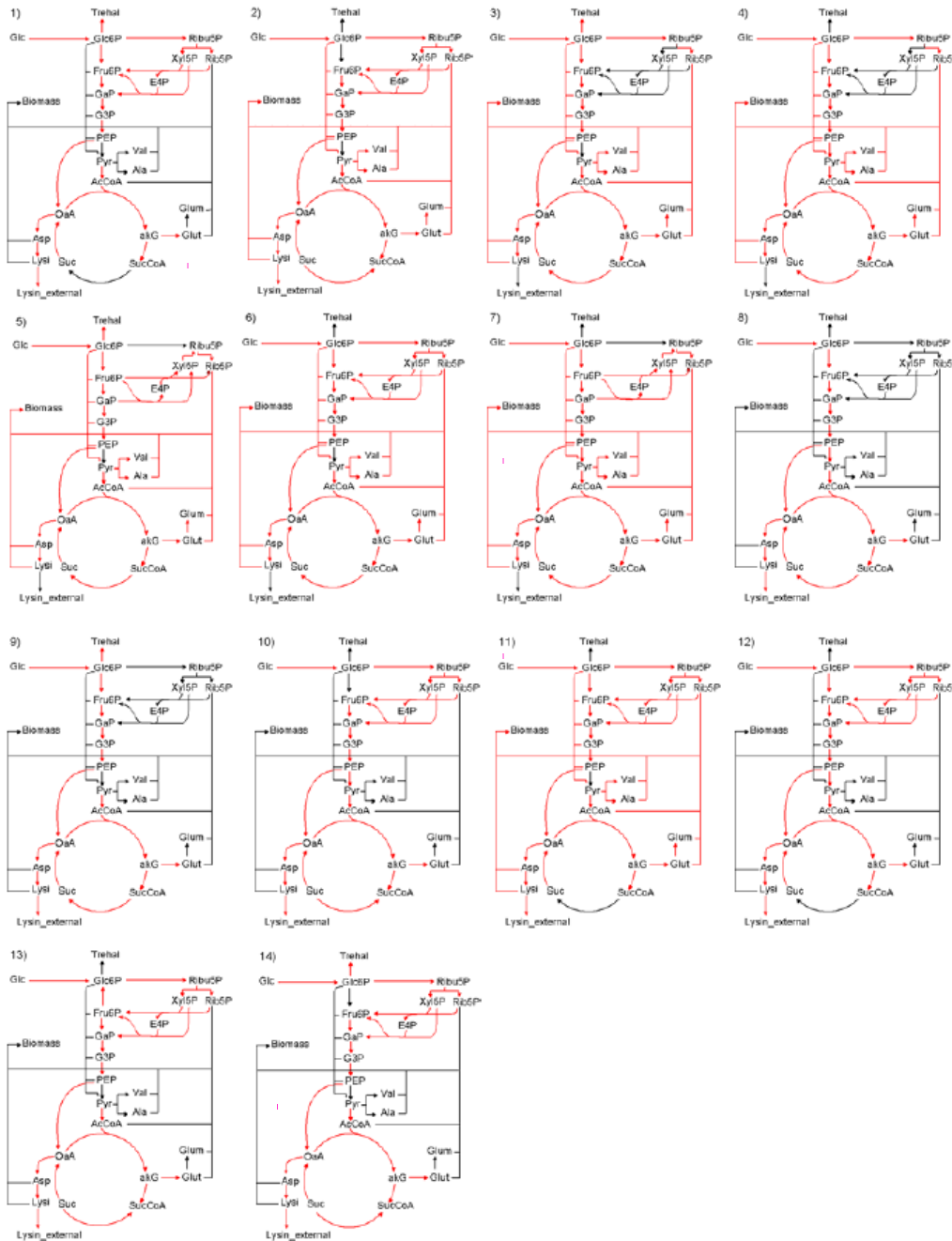


# Elementary modes operational in *Corynebacterium glutamicum*

Fourteen elementary modes

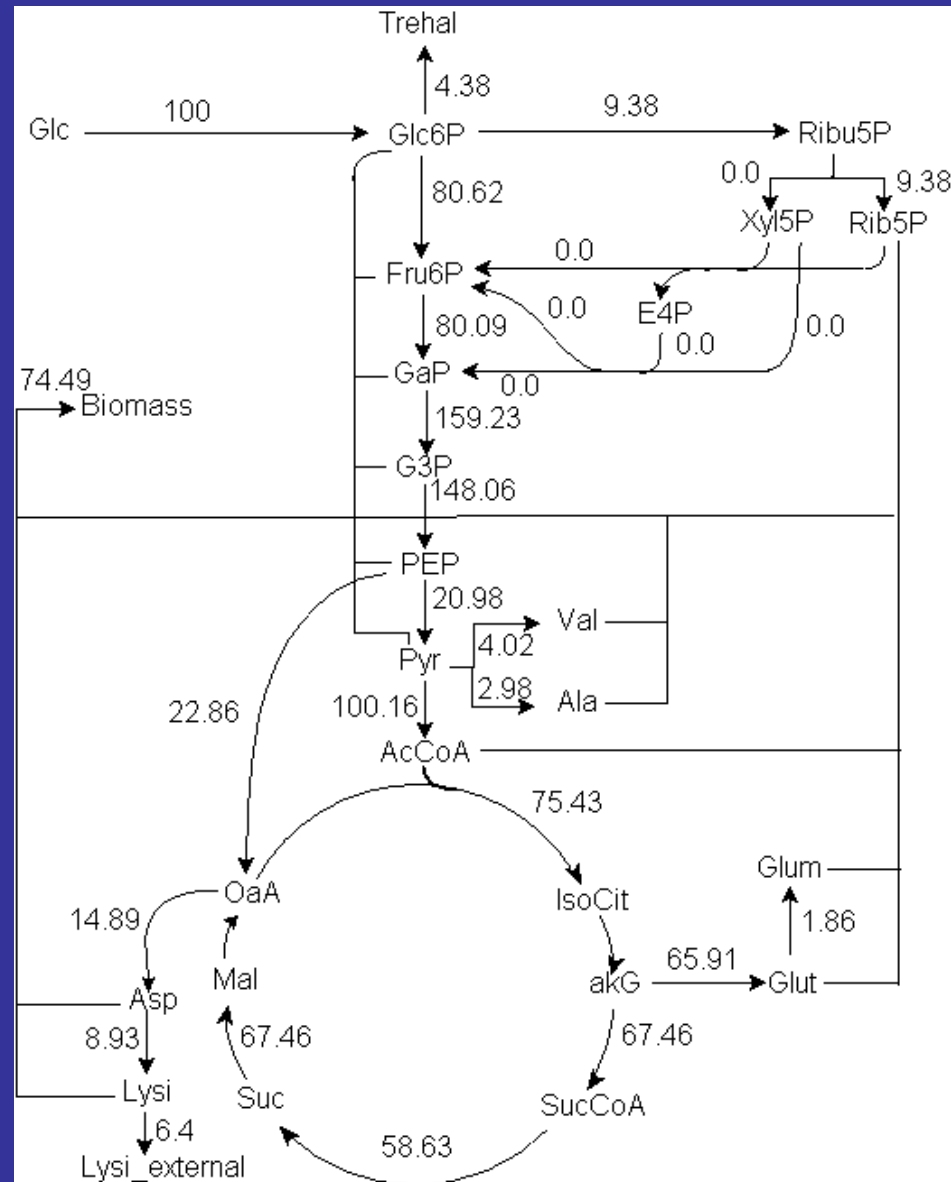
Maximum biomass (124)

Maximum Lysine (63.5)



# Flux distribution map of *C. glutamicum* for lysine production

Optimal  
Biomass



# Conclusions

- Two level Optimization of fermentation processes – reactor and cellular
- Reactor: Engineering approaches - SSF, fed-batch operation, in situ separation etc
- SSF concept has been used for conversion of cellulose to biofuels
- Cellular: Metabolic Engineering
- Quantification of biological processes is a key step in such an application

# Acknowledgement

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***Thank  
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