

Análise de modos elementares

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DEPARTAMENTO DE

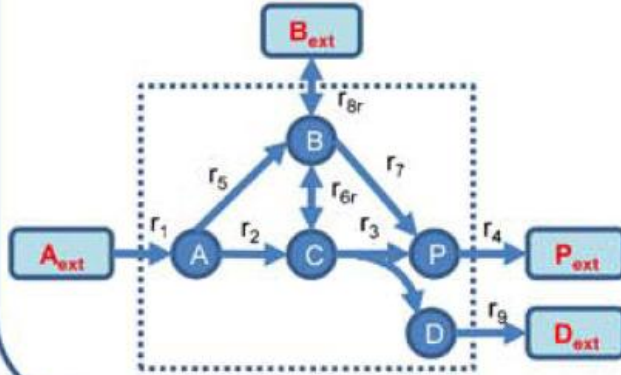
MICroBiologia

UNIVERSIDADE DE SÃO PAULO

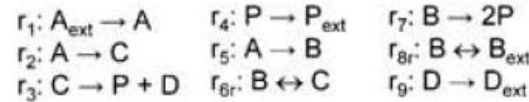
analysis of cellular metabolism

Problem statement

Network



Stoichiometric reactions



Stoichiometric matrix

	r ₁	r ₂	r ₃	r ₄	r ₅	r _{6r}	r ₇	r _{8r}	r ₉
A	1	-1	0	0	-1	0	0	0	0
B	0	0	0	0	1	-1	-1	-1	0
C	0	1	-1	0	0	1	0	0	0
D	0	0	1	0	0	0	0	0	-1
P	0	0	1	-1	0	0	2	0	0

$$\underline{r} = [r_1 \ r_2 \ r_3 \ r_4 \ r_5 \ r_{6r} \ r_7 \ r_{8r} \ r_9]^T$$

Equations to solve

$$\underline{S} \cdot \underline{r} = \underline{0}$$

Thermodynamic constraints:
r_{1,5,7,9} ≥ 0

A

$$\frac{d}{dt} \underline{C} = \underline{S} \times \underline{r} - \mu \times \underline{C},$$

μ · C (negligible)

dC/dt = 0 (steady state)

$$\underline{S} \cdot \underline{r} = 0 \text{ (Eq 2)}$$

$$r_i \geq 0 \text{ (Eq 3)}$$

Tools for analysis of cellular metabolism can be grouped into three categories, all of them developed from the same mathematical model:

- (1) Metabolic flux analysis,
- (2) Flux balance analysis and
- (3) Metabolic pathway analysis (Elementary mode analysis).

Metabolic Flux Analysis

$$S_{\underline{u}} = \begin{matrix} & r_3 & r_4 & r_5 & r_{6r} & r_7 \\ \text{A} & 0 & 0 & -1 & 0 & 0 \\ \text{B} & 0 & 0 & 1 & -1 & -1 \\ \text{C} & -1 & 0 & 0 & 1 & 0 \\ \text{D} & 1 & 0 & 0 & 0 & 0 \\ \text{P} & 1 & -1 & 0 & 0 & 2 \end{matrix}$$

$$S_{\underline{m}} = \begin{matrix} & r_1 & r_2 & r_{8r} & r_9 \\ \text{A} & 1 & -1 & 0 & 0 \\ \text{B} & 0 & 0 & -1 & 0 \\ \text{C} & 0 & 1 & 0 & 0 \\ \text{D} & 0 & 0 & 0 & -1 \\ \text{P} & 0 & 0 & 0 & 0 \end{matrix}$$

$$\underline{r}_m = \begin{bmatrix} r_1 \\ r_2 \\ r_{8r} \\ r_9 \end{bmatrix} = \begin{bmatrix} 1 \\ 0.3 \\ 0 \\ 0.75 \end{bmatrix}$$

Measured fluxes

Equations to solve

$$S \cdot \underline{r} = \underline{0}$$

$$\begin{bmatrix} S_{\underline{u}} & S_{\underline{m}} \end{bmatrix} \begin{bmatrix} \underline{r}_u \\ \underline{r}_m \end{bmatrix} = \underline{0}$$

$$\underline{r}_u = -S_{\underline{u}}^{-1} \cdot S_{\underline{m}} \cdot \underline{r}_m$$

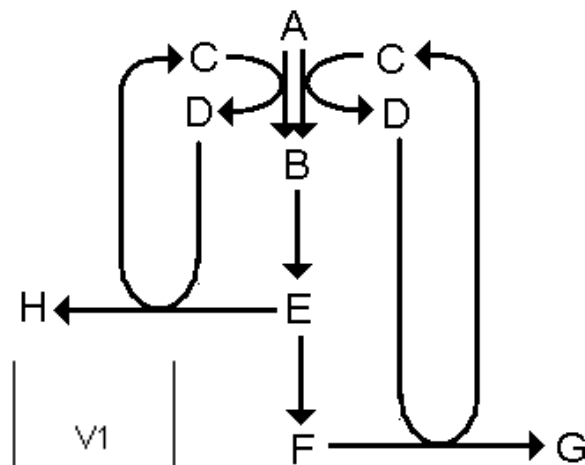
Solution

$$\underline{r}_u = \begin{bmatrix} r_3 \\ r_4 \\ r_5 \\ r_{6r} \\ r_7 \end{bmatrix} = \begin{bmatrix} 0.75 \\ 1.25 \\ 0.7 \\ 0.45 \\ 0.25 \end{bmatrix}$$

B

A B E F C D G H

-1	1	0	0	-1	1	0	0
0	-1	1	0	0	0	0	0
0	0	-1	1	0	0	0	0
0	0	0	-1	1	-1	1	0
0	0	-1	0	1	-1	0	1



$$F = J - K$$

Flux Balance Analysis

$$\text{Obj: max } r_4$$

$$\text{s.t.: } \underline{S} \cdot \underline{r} = \underline{0}$$

$$r_1 = 1$$

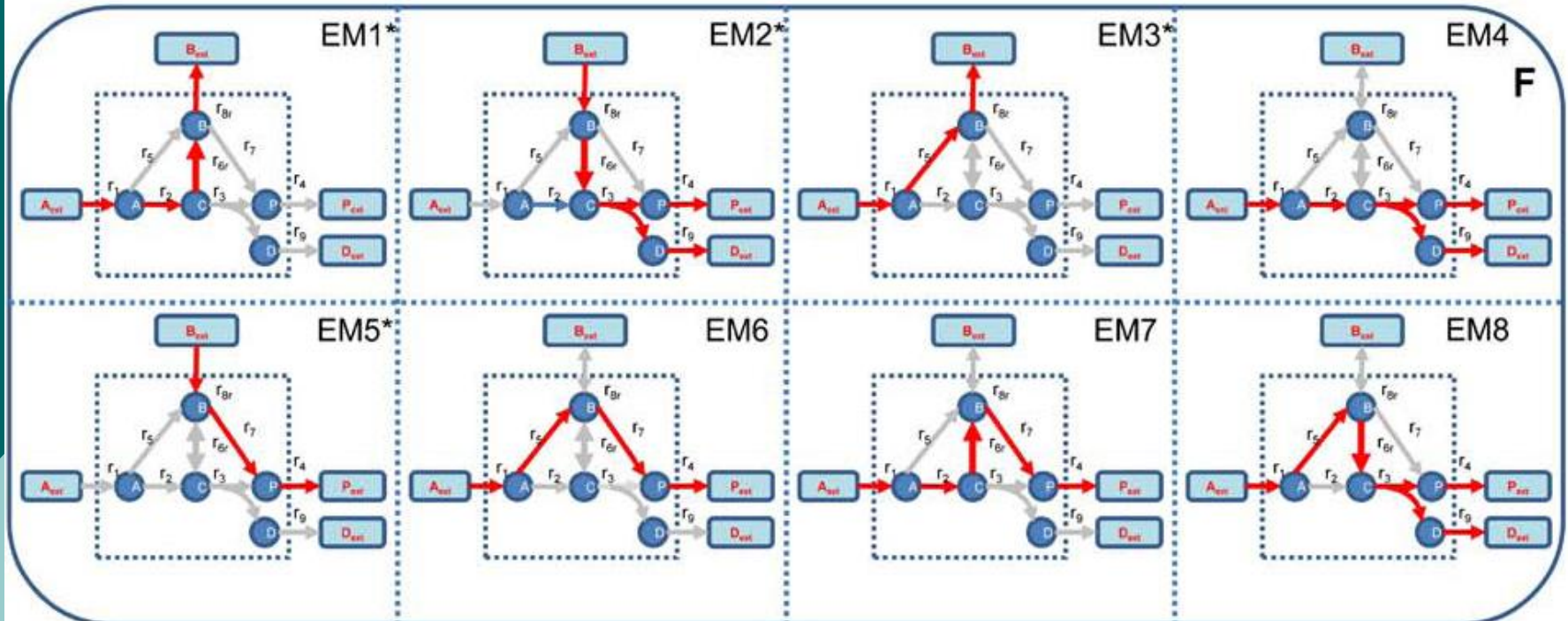
$$r_{8r} = 0$$

$$r_{2-5,7,9} \geq 0$$

$$\underline{r} = \begin{bmatrix} r_1 \\ r_2 \\ r_3 \\ r_4 \\ r_5 \\ r_{6r} \\ r_7 \\ r_{8r} \\ r_9 \end{bmatrix} = \begin{bmatrix} 1 \\ 0.35 \\ 0 \\ 2 \\ 0.65 \\ -0.35 \\ 1 \\ 0 \\ 0 \end{bmatrix}$$

C

Metabolic pathway analysis (Elementary (flux) analysis)

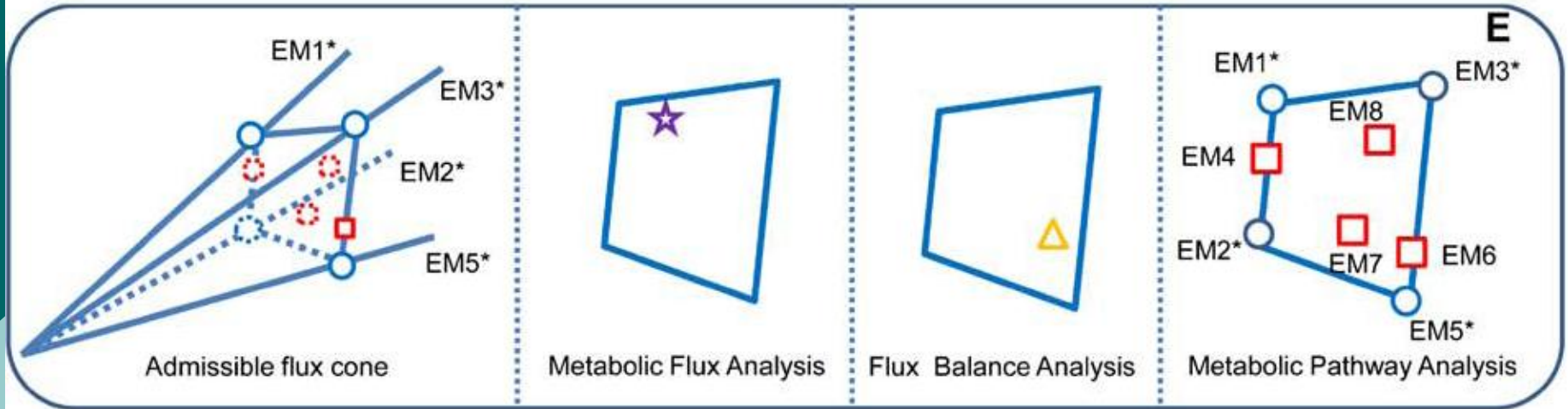


$$S \cdot r = 0 \quad (\text{Eq 2})$$

$$r_i \geq 0 \quad (\text{Eq 3})$$

Elementary mode analysis calculates all solutions in the admissible flux space by solving Eq 2 in conjunction with the thermodynamic constraint (3) and additional non-decomposability and systematic independence constraints. Each solution (re)presents an elementary (flux) mode.

Interpretação Geométrica



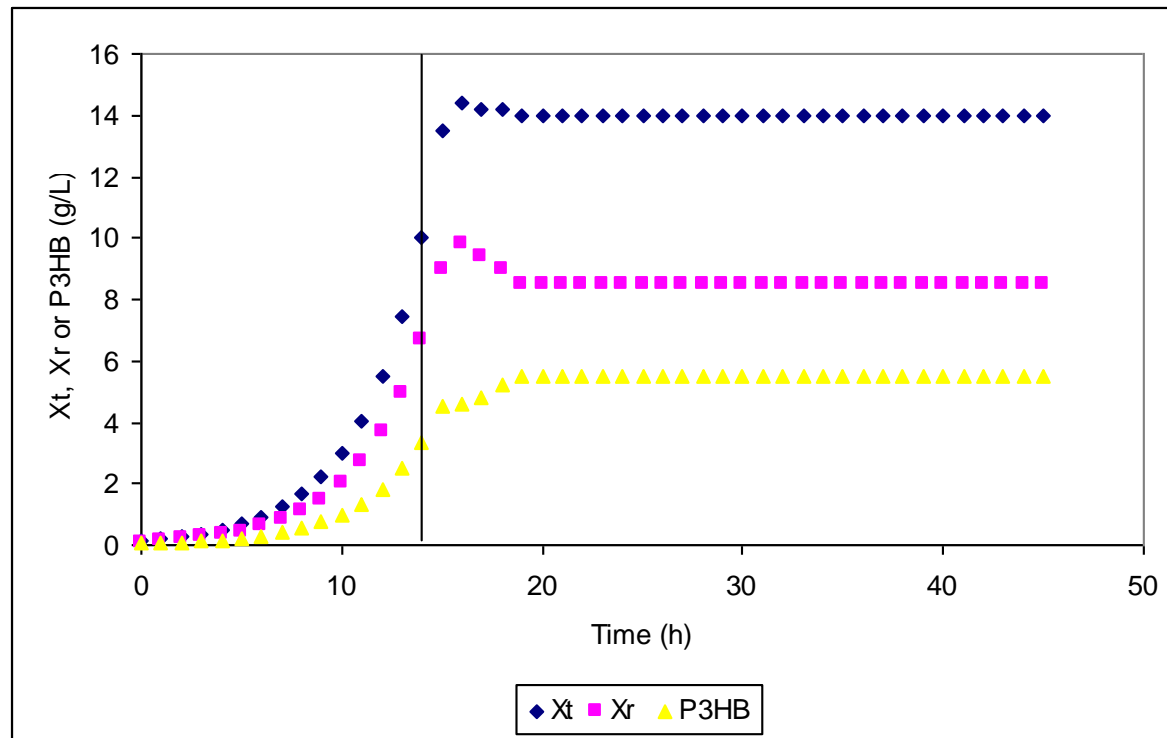
- ✓ O cone de fluxos admissíveis representa todas as possíveis vias que podem existir.
- ✓ Alguns modos elementares ficam na face ou na base do cone.
- ✓ AFM identifica somente uma via que se localiza em qualquer local do cone. ABF representa somente uma via em qualquer local do cone e satisfaz a função objetivo definida.
- ✓ AVM identifica todas as vias geneticamente independentes, com vias extremas em azul e modos elementares em vermelho.

Steady state



Steady state

Continuous culture



Steady state

Continuous culture

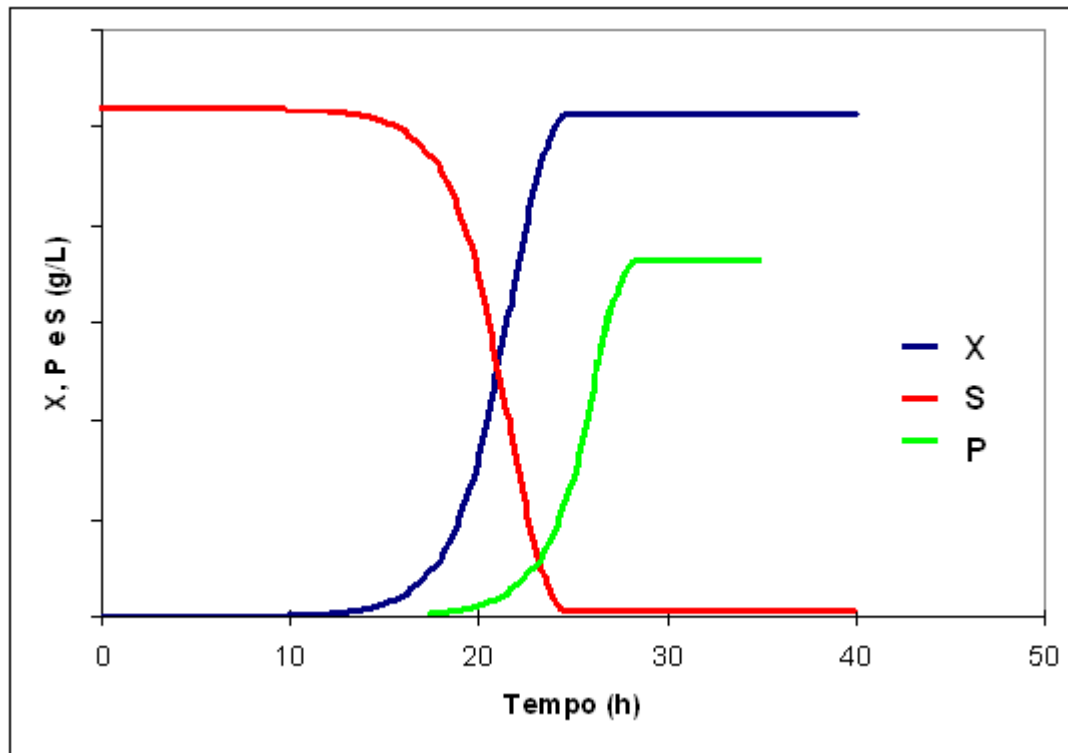
$$\frac{dX}{dt} \frac{1}{X} = \mu = \text{constante}$$

$$\frac{dP}{dt} \frac{1}{X} = q_p = \text{constante}$$

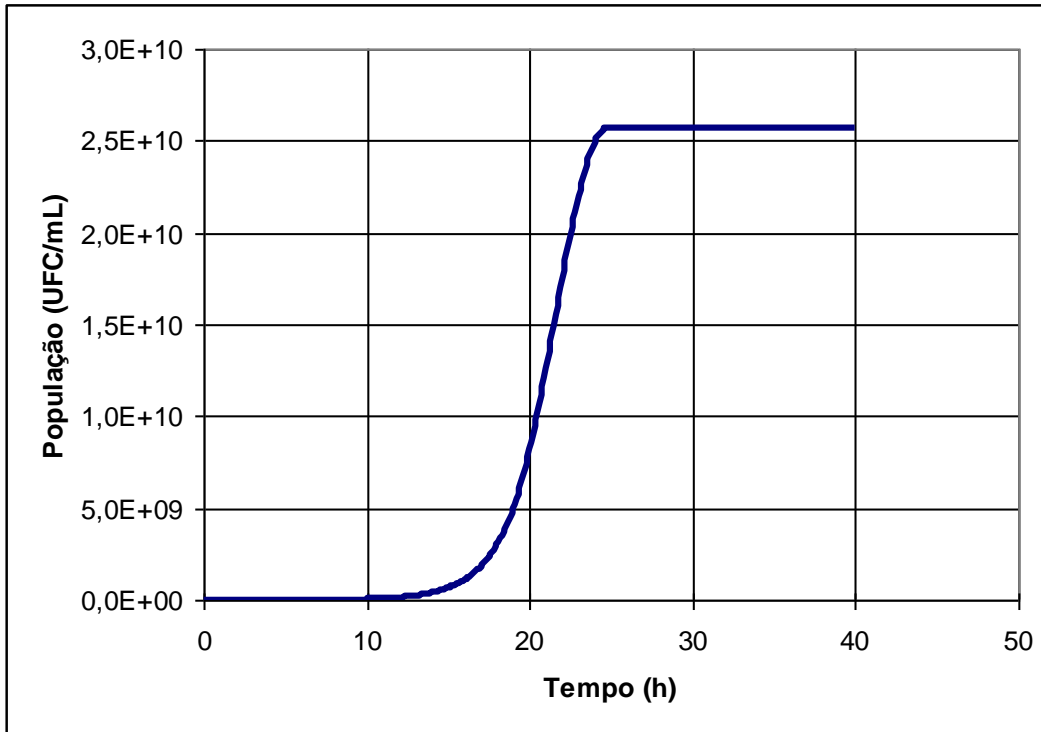
$$\frac{dS}{dt} \frac{1}{X} = q_s = \text{constante}$$

Y são constantes?

Batch

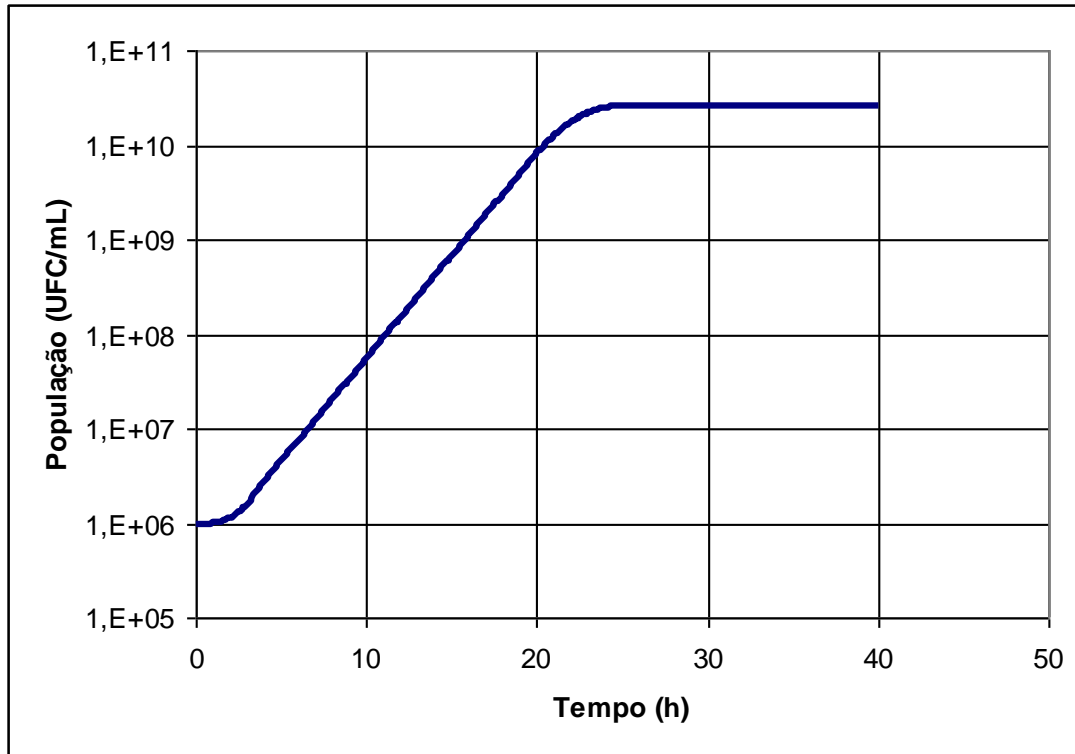


Fases de crescimento



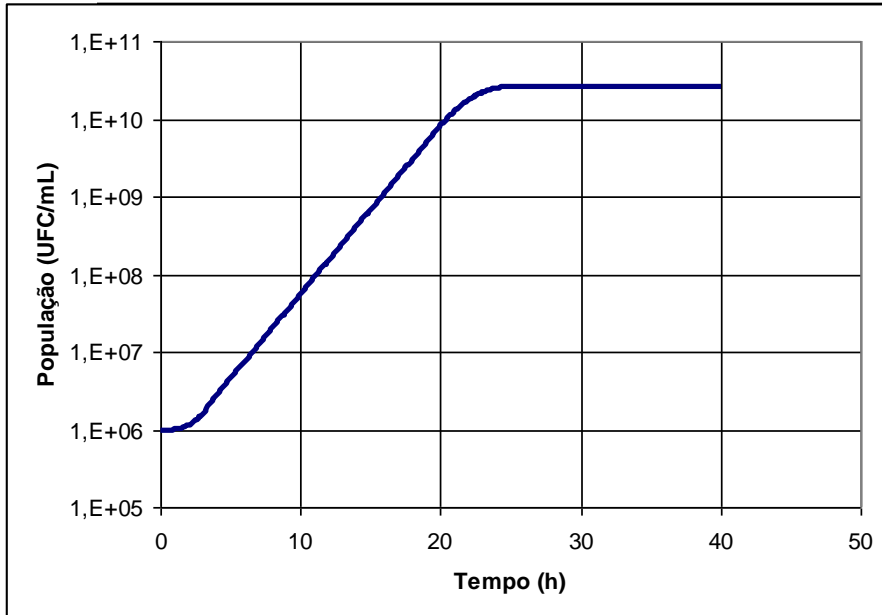
Lag
Exponencial
Estacionária

Fases de crescimento

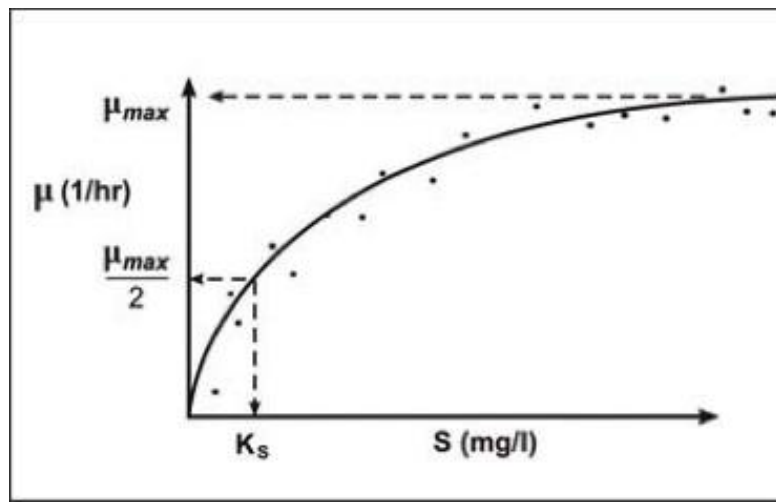


Lag
Exponencial
Estacionária

Fases de crescimento



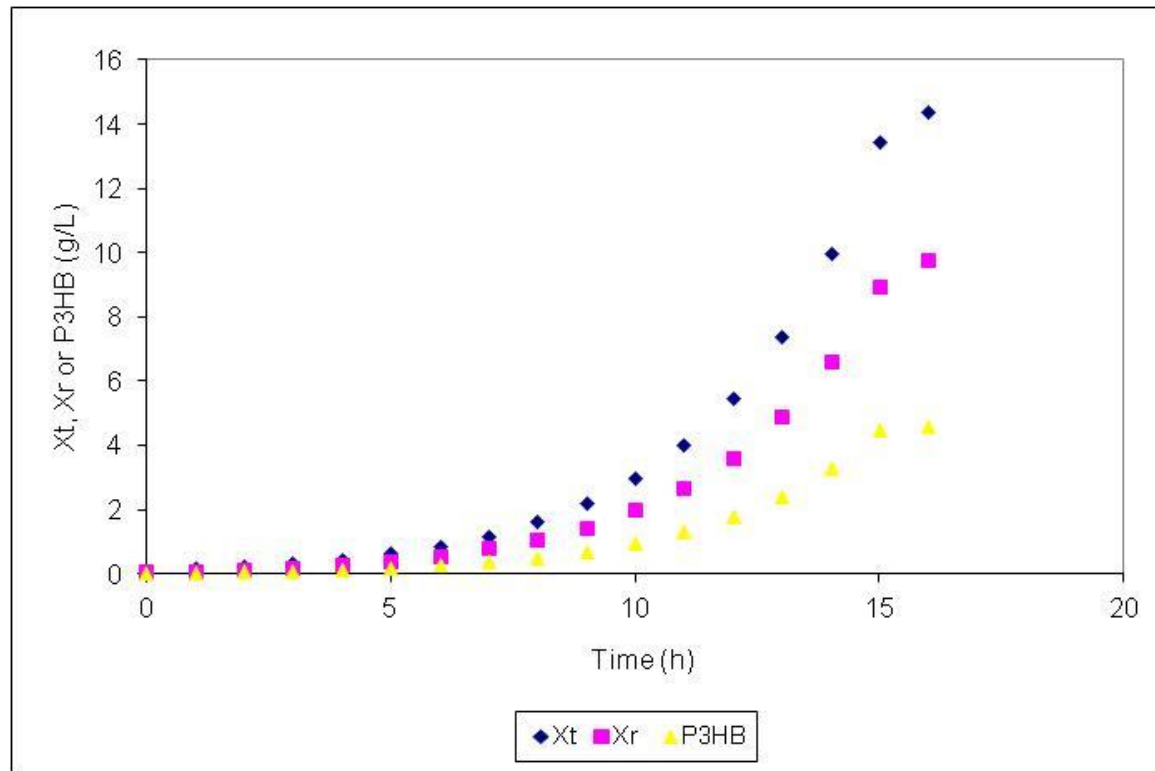
Lag
Aceleração
Exponencial
Desaceleração
Estacionária



$$\mu = \mu_{max} \left(\frac{S}{S+K_s} \right) \quad (5)$$

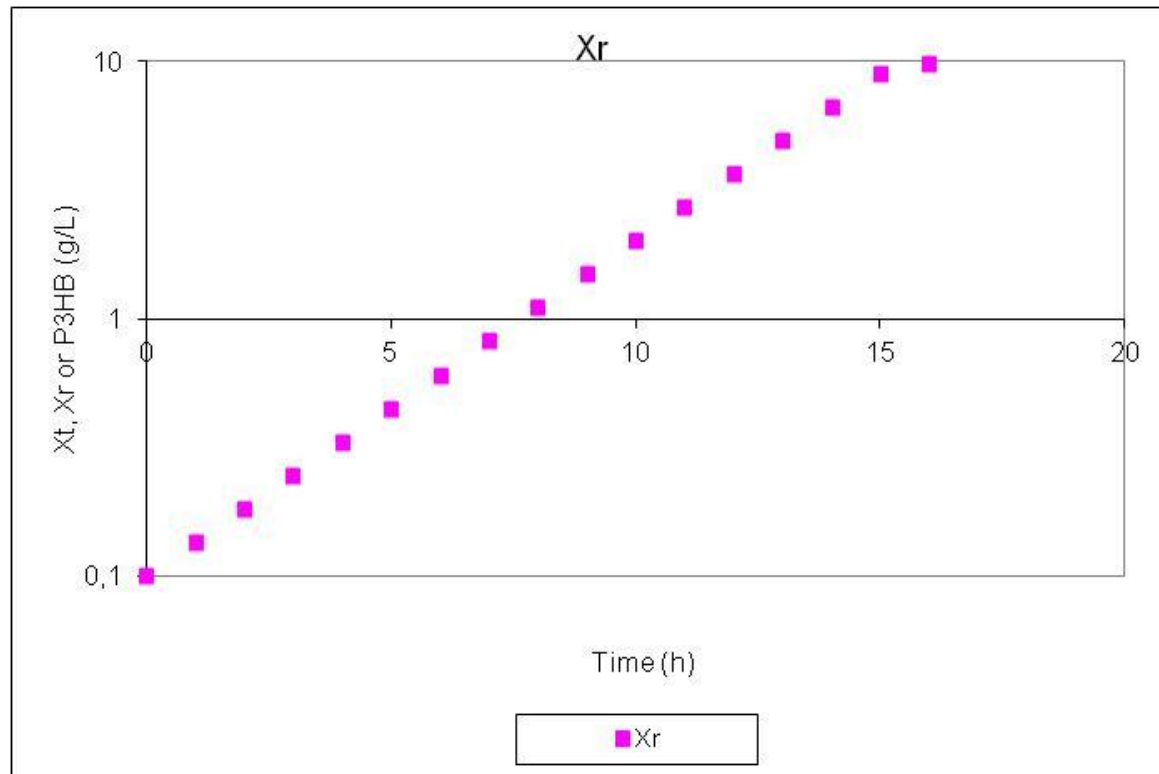
(Pseudo or Quase) Steady state

Batch – Exponential Growth phase



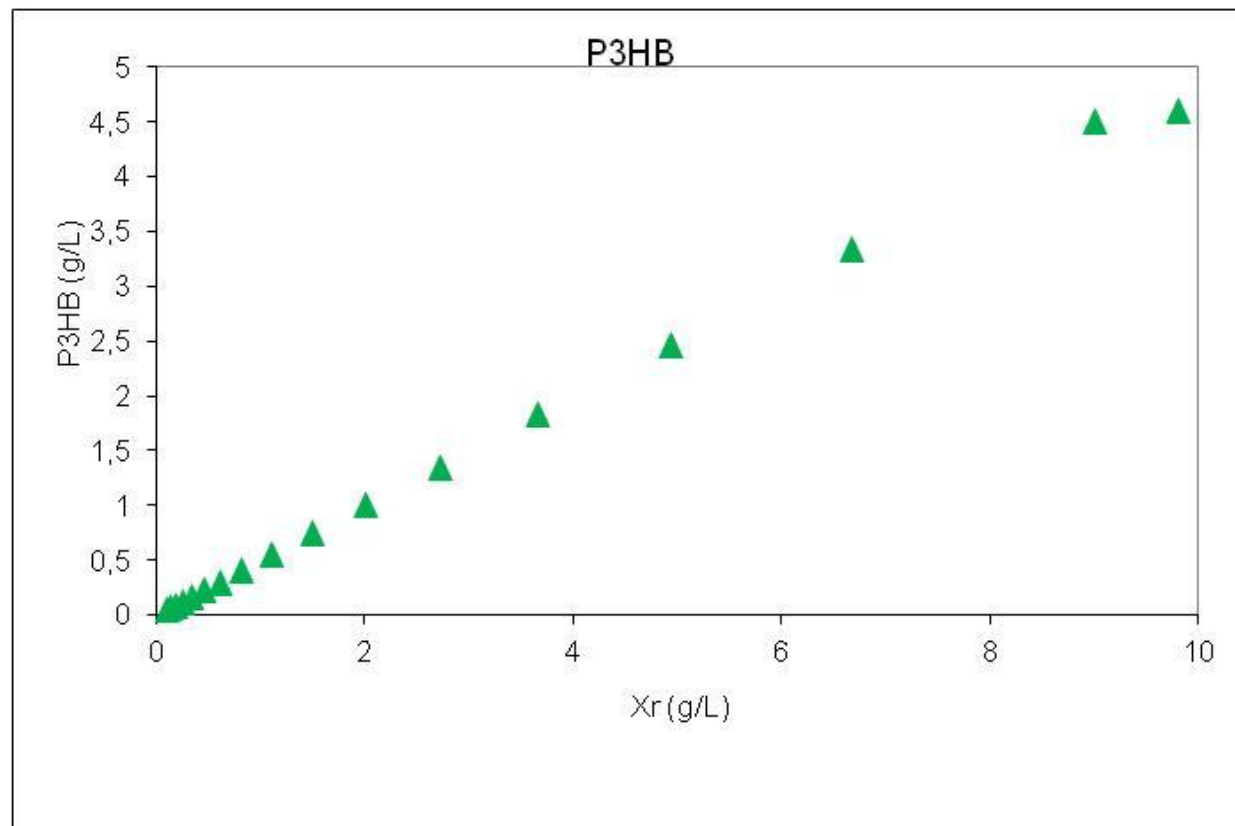
(Pseudo or Quase)Steady state

Batch – Exponential Growth phase



(Pseudo or Quase)Steady state

Batch – Exponential Growth phase



(Pseudo or Quase)Steady state

Batch – Exponential Growth phase

$$\frac{dX}{dt} \frac{1}{X} = \mu = \text{constante}$$

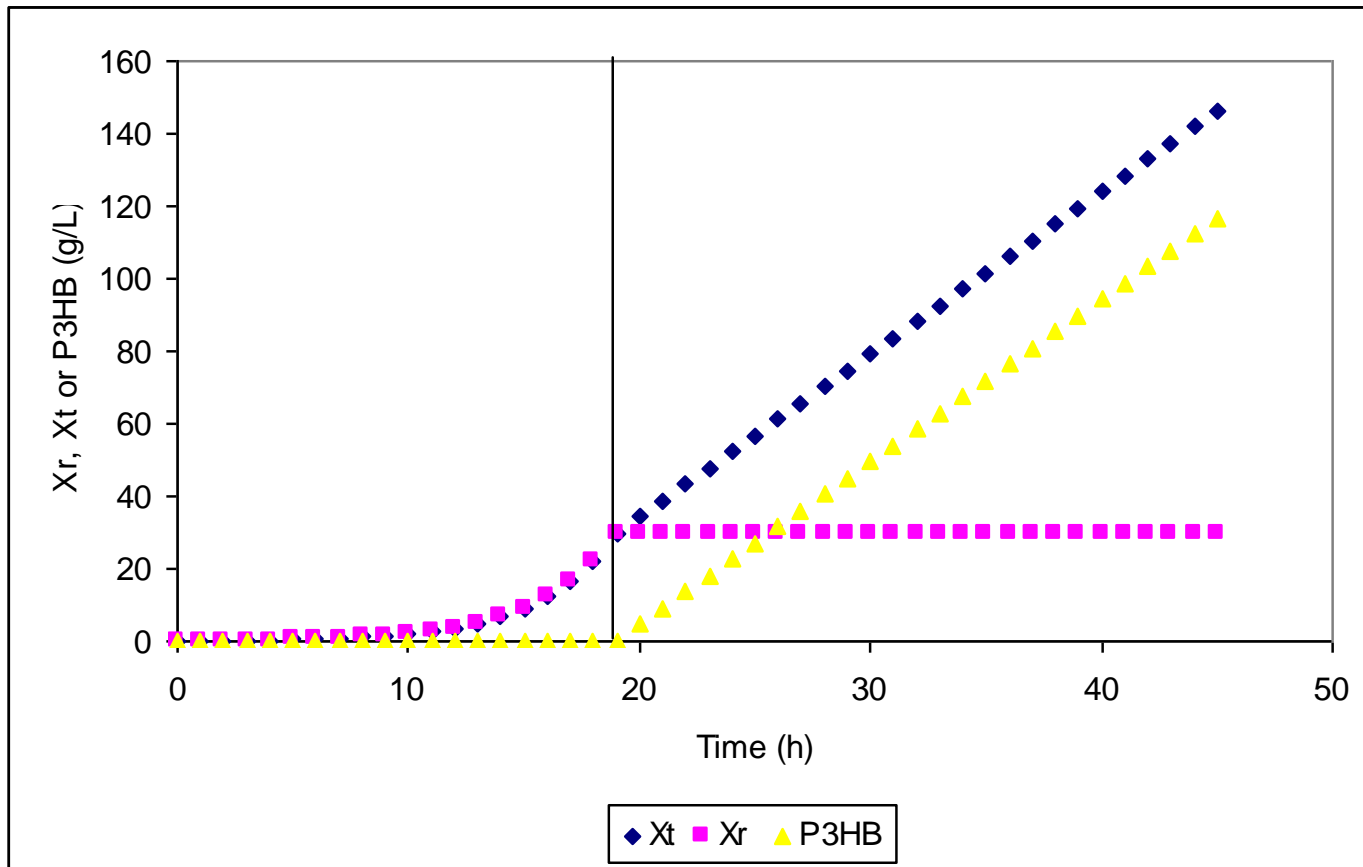
$$\frac{dP}{dt} \frac{1}{X} = q_p = \text{constante}$$

$$\frac{dS}{dt} \frac{1}{X} = q_s = \text{constante}$$

Y são constantes?

(Pseudo or Quasi)Steady state

Batch or Fed-batch



(Pseudo or Quasi)Steady state

Batch or Fed-batch
(stationary phase)

$$\frac{dX}{dt} \frac{1}{X} = \mu = \text{constante} = 0$$

$$\frac{dP}{dt} \frac{1}{X} = q_p = \text{constante}$$

$$\frac{dS}{dt} \frac{1}{X} = q_s = \text{constante}$$

$$\frac{dX}{dt} = \text{constante} = 0$$

$$\frac{dP}{dt} = \text{constante}$$

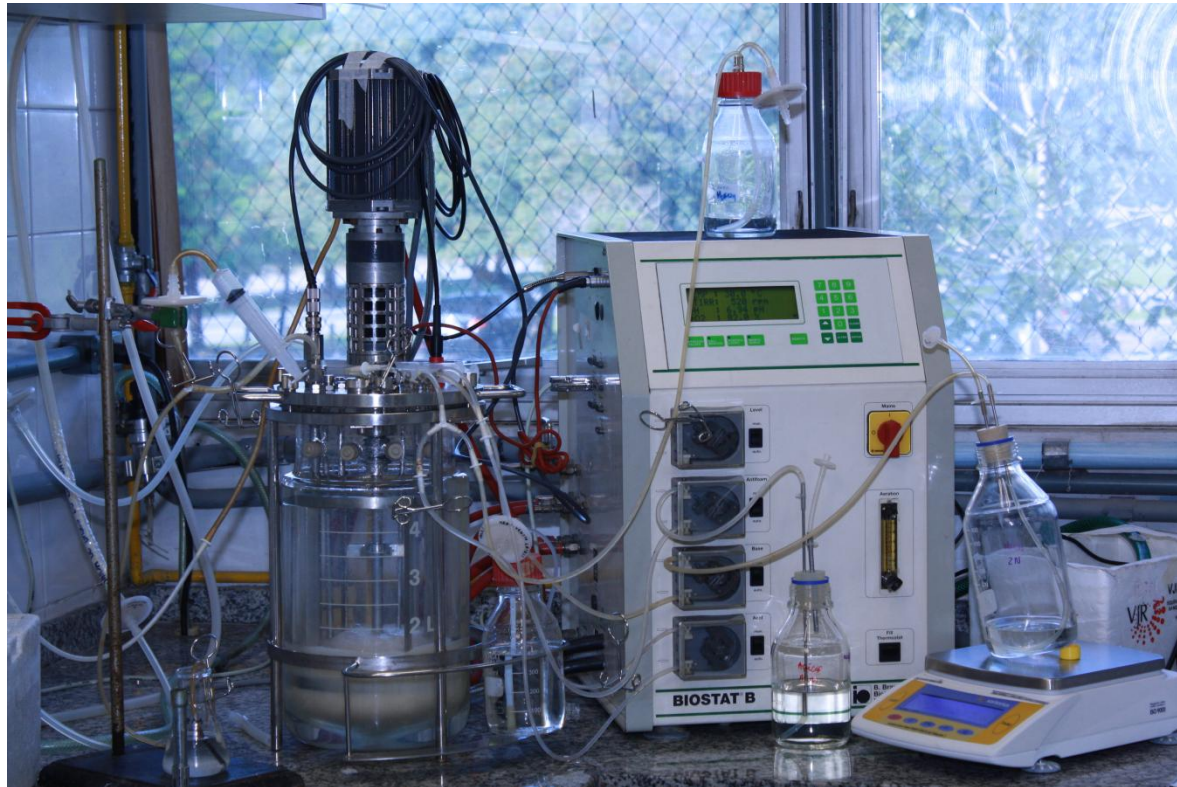
$$\frac{dS}{dt} = \text{constante}$$

Y são constantes?

(Pseudo or Quasi)-Steady state

Fed-batch

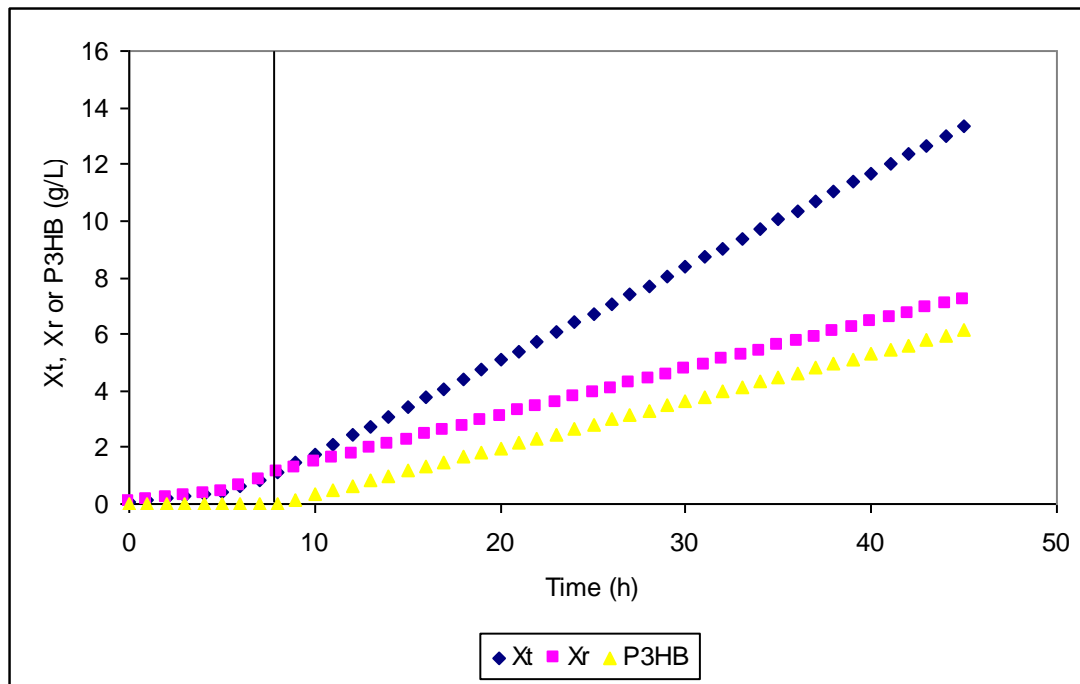
Continuous feeding



(Pseudo or Quasi)-Steady state

Fed-batch

Continuous feeding



(Pseudo or Quasi)-Steady state

Fed-batch

Continuous feeding

$$\frac{dX}{dt} \frac{1}{X} = \mu \text{ (Não constante)}$$

$$\frac{dP}{dt} \frac{1}{X} = q_p \text{ (Não constante)}$$

$$\frac{dS}{dt} \frac{1}{X} = q_s \text{ (Não constante)}$$

$$\frac{dX}{dt} = \text{constante}$$

$$\frac{dP}{dt} = \text{constante}$$

$$\frac{dS}{dt} = \text{constante}$$

Y são constantes?