

Problem 9.2 of Shuler & Kargi. Batch fermentor operated in two stages.
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Cell growth parameters:

$$\mu_{m1} := 0.3 \text{ h}^{-1} \quad \mu_{m2} := 0 \quad K_s := 0.1 \text{ g/liter} \quad Y_x := 0.4 \text{ g cell/g substrate}$$

$$\mu_1(s) := \frac{\mu_{m1} \cdot s}{K_s + s} \quad \mu_2(s) := \frac{\mu_{m2} \cdot s}{K_s + s}$$

Product formation parameters:

$$Y_p := 0.6 \text{ g product/g substrate} \quad q_p := 0.02 \text{ g product/(g cell}\cdot\text{h)}$$

Initial condition $x_0 := 0.1 \quad s_0 := 5 \quad y_0 := 0 \quad p_0 := 0 \quad n := 100 \quad xsp_0 := \begin{pmatrix} x_0 \\ s_0 \\ p_0 \end{pmatrix}$

Dynamic equations for the first phase of batch fermentor.

$$dx1dt(x, s) := (0 \leq s) \cdot (0 \leq x) \cdot \mu_1(s) \cdot x$$

$$ds1dt(x, s) := (0 \leq s) \cdot (0 \leq x) \cdot \left(-\frac{1}{Y_x}\right) \cdot \mu_1(s) \cdot x$$

$$dp1dt(x, s) := 0$$

$$dxs1dt(t, xs) := \begin{pmatrix} dx1dt(xs_0, xs_1) \\ ds1dt(xs_0, xs_1) \\ dp1dt(xs_0, xs_1) \end{pmatrix}$$

Dynamic equations for the second phase of batch fermentor.

$$dx2dt(x, s) := (0 \leq s) \cdot (0 \leq x) \cdot \mu_2(s) \cdot x$$

$$ds2dt(x, s) := (0 \leq s) \cdot (0 \leq x) \cdot \left(-\frac{1}{Y_x}\right) \cdot \mu_2(s) \cdot x - \frac{1}{Y_p} \cdot q_p \cdot x$$

$$dp2dt(x, s) := (0 \leq s) \cdot (0 \leq x) \cdot q_p \cdot x$$

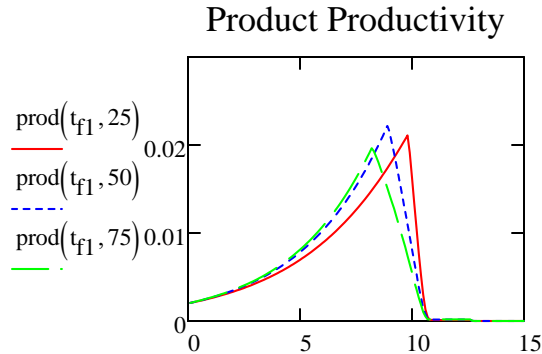
$$dxsp2dt(t, xsp) := \begin{pmatrix} dx2dt(xsp_0, xsp_1) \\ ds2dt(xsp_0, xsp_1) \\ dp2dt(xsp_0, xsp_1) \end{pmatrix}$$

Integrate 2 ODEs sequentially

$$txsp(t_{f1}, t_{f2}) := \left[\begin{array}{l} txsp1 \leftarrow \text{rkfixed}(xsp_0, 0, t_{f1}, n, dxs1dt) \\ txsp2 \leftarrow \text{rkfixed} \left(\begin{pmatrix} txsp1_{n,1} \\ txsp1_{n,2} \\ txsp1_{n,3} \end{pmatrix}, t_{f1}, t_{f2}, n, dxsp2dt \right) \\ \text{return stack}(txsp1, txsp2) \end{array} \right] \quad \begin{array}{l} \text{final} := 2 \cdot n + 1 \\ Pf(t_{f1}, t_{f2}) := txsp(t_{f1}, t_{f2})_{\text{final}, 3} \\ \text{prod}(t_{f1}, t_{f2}) := \frac{Pf(t_{f1}, t_{f2})}{t_{f2}} \end{array}$$

Maximize product productivity

$$t_{f1} := 0, 0.1 \dots 15$$

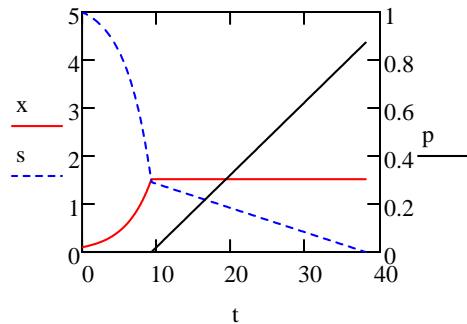


Provide initial guess $t_{f1} := 10$ $t_{f2} := 50$ $\text{prod}(t_{f1}, t_{f2}) = 8.147 \times 10^{-3}$

$$\begin{pmatrix} t_{f1} \\ t_{f2} \end{pmatrix} := \text{Maximize}(\text{prod}, t_{f1}, t_{f2}) = \begin{pmatrix} 9.318 \\ 38.063 \end{pmatrix} \quad \text{prod}(t_{f1}, t_{f2}) = 0.023$$

The productivity in 2 CSTRs in series was 0.027 g/(L-h)

profile $\text{txsp} := \text{txsp}(t_{f1}, t_{f2})$ $(t \ x \ s \ p) := (\text{txsp}^{(0)} \ \text{txsp}^{(1)} \ \text{txsp}^{(2)} \ \text{txsp}^{(3)})$



The product is encoded in a plasmid. Upon cell division, there is a small probability $P=0.001$ of a plasmid-bearing cell x producing a plasmid-free offspring y .

$$P := 0.001$$

$$\text{dx1}_{dt}(x, y, s) := (0 \leq s) \cdot (0 \leq x) \cdot (1 - P) \cdot \mu_1(s) \cdot x$$

$$\text{dy1}_{dt}(x, y, s) := (0 \leq s) \cdot (0 \leq x) \cdot \mu_1(s) \cdot y + P \cdot \mu_1(s) \cdot x$$

$$\text{ds1}_{dt}(x, y, s) := (0 \leq s) \cdot (0 \leq x) \cdot \left(-\frac{1}{Y_x} \cdot \mu_1(s) \cdot x - \frac{1}{Y_x} \cdot \mu_1(s) \cdot y \right)$$

$$\text{dp1}_{dt}(x, y, s) := 0$$

$$\text{I.C. } xysp_0 := \begin{pmatrix} x_0 \\ y_0 \\ s_0 \\ p_0 \end{pmatrix}$$

$$dxysp1_{dt}(t, xysp) := \begin{pmatrix} dx1_{dt}(xysp_0, xysp_1, xysp_2) \\ dy1_{dt}(xysp_0, xysp_1, xysp_2) \\ ds1_{dt}(xysp_0, xysp_1, xysp_2) \\ dp1_{dt}(xysp_0, xysp_1, xysp_2) \end{pmatrix}$$

$$dx2_{dt}(x, y, s) := (0 \leq s) \cdot (0 \leq x) \cdot (1 - P) \cdot \mu_2(s) \cdot x$$

$$dy2_{dt}(x, y, s) := (0 \leq s) \cdot (0 \leq x) \cdot \mu_1(s) \cdot y + P \cdot \mu_2(s) \cdot x$$

$$ds2_{dt}(x, y, s) := (0 \leq s) \cdot (0 \leq x) \cdot \left(-\frac{1}{Y_x} \cdot \mu_2(s) \cdot x - \frac{1}{Y_x} \cdot \mu_1(s) \cdot y - \frac{1}{Y_p} \cdot q_p \cdot x \right)$$

$$dp2_{dt}(x, y, s) := (0 \leq s) \cdot (0 \leq x) \cdot q_p \cdot x$$

$$dxysp2_{dt}(t, xysp) := \begin{pmatrix} dx2_{dt}(xysp_0, xysp_1, xysp_2) \\ dy2_{dt}(xysp_0, xysp_1, xysp_2) \\ ds2_{dt}(xysp_0, xysp_1, xysp_2) \\ dp2_{dt}(xysp_0, xysp_1, xysp_2) \end{pmatrix}$$

$$txysp(t_{f1}, t_{f2}) := \left[\begin{array}{l} txysp1 \leftarrow \text{rkfixed}(xysp_0, 0, t_{f1}, n, dxysp1_{dt}) \\ txysp2 \leftarrow \text{rkfixed} \left(\begin{array}{l} txysp1_{n,1} \\ txysp1_{n,2} \\ txysp1_{n,3} \\ txysp1_{n,4} \end{array}, t_{f1}, t_{f2}, n, dxysp2_{dt} \right) \\ \text{return stack}(txysp1, txysp2) \end{array} \right]$$

$$\text{final} := 2 \cdot n + 1$$

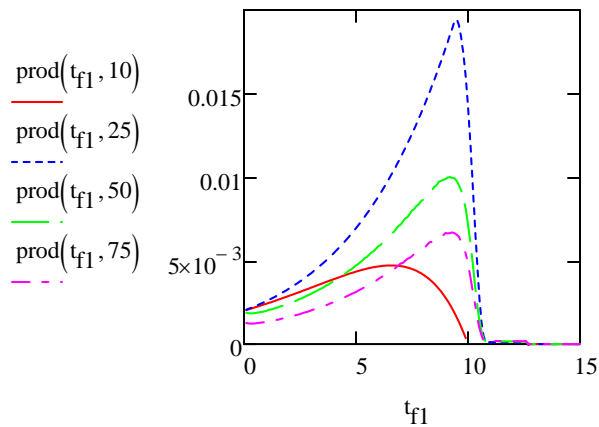
$$P_f(t_{f1}, t_{f2}) := txysp(t_{f1}, t_{f2})_{\text{final}, 4}$$

$$\text{prod}(t_{f1}, t_{f2}) := \frac{P_f(t_{f1}, t_{f2})}{t_{f2}}$$

Maximize product productivity

$$t_{f1} := 0, 0.1 \dots 15$$

Product Productivity



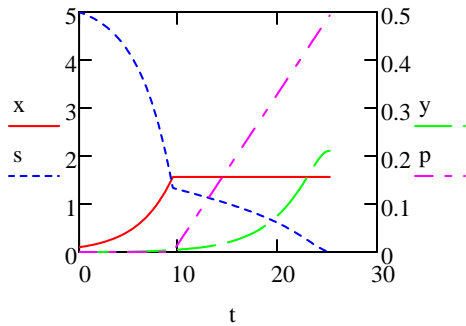
Provide initial guess $t_{f1} := 5$ $t_{f2} := 20$ $\text{prod}(t_{f1}, t_{f2}) = 6.505 \times 10^{-3}$

$$\begin{pmatrix} t_{f1} \\ t_{f2} \end{pmatrix} := \text{Maximize}(\text{prod}, t_{f1}, t_{f2}) = \begin{pmatrix} 9.429 \\ 25.24 \end{pmatrix} \quad \text{prod}(t_{f1}, t_{f2}) = 0.02$$

Optimal profile

$$\text{profile} := \text{txysp}(t_{f1}, t_{f2}) \quad (t \ x \ y \ s \ p) := (\text{profile}^{(0)} \ \text{profile}^{(1)} \ \text{profile}^{(2)} \ \text{profile}^{(3)} \ \text{profile}^{(4)})$$

Optimum Profile



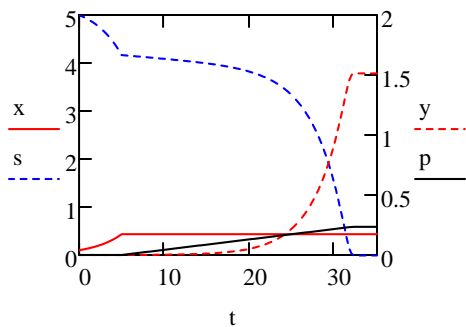
Fraction of plasmid-free cells at end of the run

$$\frac{y_{\text{final}}}{x_{\text{final}} + y_{\text{final}}} = 0.119$$

Sub optimal profile $t_{f1} := 5$ $t_{f2} := 35$

$$\text{profile} := \text{txysp}(t_{f1}, t_{f2}) \quad (t \ x \ y \ s \ p) := (\text{profile}^{(0)} \ \text{profile}^{(1)} \ \text{profile}^{(2)} \ \text{profile}^{(3)} \ \text{profile}^{(4)})$$

Induction at 5h



product concentration at end of the run

$$p_f := \text{profile}_{\text{final}, 4} = 0.235 \text{ g/L}$$

Fraction of plasmid-free cells at end of the run

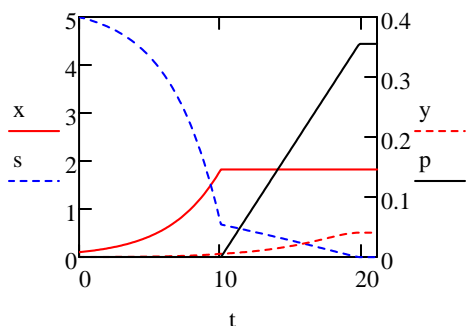
$$\frac{y_{\text{final}}}{x_{\text{final}} + y_{\text{final}}} = 0.777$$

Fermentation time for 5-h induction was longer than that for 10-h induction (~32h versus ~20h). Product concentration for 5-h induction was lower than that for 10-h induction (0.235 g/L versus 0.355 g/L). 5-h induction led to a fermentor full of nonproductive plasmid-free cells, the fraction of nonproductive plasmid-free cells being 0.777 for 5-h induction versus 0.022 for 10-h induction.

Sub optimal profile $t_{f1} := 10$ $t_{f2} := 21$

$$\text{profile} := \text{txysp}(t_{f1}, t_{f2}) \quad (t \ x \ y \ s \ p) := (\text{profile}^{(0)} \ \text{profile}^{(1)} \ \text{profile}^{(2)} \ \text{profile}^{(3)} \ \text{profile}^{(4)})$$

Induction at 10h



product concentration at end of the run

$$p_f := \text{profile}_{\text{final}, 4} = 0.355 \text{ g/L}$$

Fraction of plasmid-free cells at end of the run

$$\frac{y_{\text{final}}}{x_{\text{final}} + y_{\text{final}}} = 0.022$$