

A MATHEMATICAL MODEL FOR ALLOGENEIC BONE MARROW TRANSPLANTATION

Radu Precup

Babeş-Bolyai University of Cluj-Napoca, Romania

Poitiers, August 26-31, 2010

- ▶ S. Arghirescu, A. Cucuianu, R. Precup, M. Serban, *Mathematical modeling of cell dynamics after allogeneic bone marrow transplantation in acute myeloid leukemia*, to appear.
- ▶ A. Cucuianu, R. Precup, *A hypothetical-mathematical model of acute myeloid leukemia pathogenesis*, *Comput. Math. Methods Med.* **11** (2010), 49–65.
- ▶ A. Cucuianu, R. Precup, *Mathematical models of the leukemic hematopoiesis*, *Ann. Tiberiu Popoviciu Semin.* **7** (2009), 169-181.
- ▶ R. Precup, M.-A. Serban, D. Trif, *Asymptotic stability for a model of cellular dynamics after allogeneic bone marrow transplantation*, to appear.
- ▶ R. Precup, D. Trif, M.-A. Serban, A. Cucuianu, *Mathematical understanding of some correction therapies after allogeneic bone marrow transplantation*, in preparation.

- ▶ S. Arghirescu, A. Cucuianu, R. Precup, M. Serban, *Mathematical modeling of cell dynamics after allogeneic bone marrow transplantation in acute myeloid leukemia*, to appear.
- ▶ A. Cucuianu, R. Precup, *A hypothetical-mathematical model of acute myeloid leukemia pathogenesis*, *Comput. Math. Methods Med.* **11** (2010), 49–65.
- ▶ A. Cucuianu, R. Precup, *Mathematical models of the leukemic hematopoiesis*, *Ann. Tiberiu Popoviciu Semin.* **7** (2009), 169-181.
- ▶ R. Precup, M.-A. Serban, D. Trif, *Asymptotic stability for a model of cellular dynamics after allogeneic bone marrow transplantation*, to appear.
- ▶ R. Precup, D. Trif, M.-A. Serban, A. Cucuianu, *Mathematical understanding of some correction therapies after allogeneic bone marrow transplantation*, in preparation.

- ▶ S. Arghirescu, A. Cucuianu, R. Precup, M. Serban, *Mathematical modeling of cell dynamics after allogeneic bone marrow transplantation in acute myeloid leukemia*, to appear.
- ▶ A. Cucuianu, R. Precup, *A hypothetical-mathematical model of acute myeloid leukemia pathogenesis*, *Comput. Math. Methods Med.* **11** (2010), 49–65.
- ▶ A. Cucuianu, R. Precup, *Mathematical models of the leukemic hematopoiesis*, *Ann. Tiberiu Popoviciu Semin.* **7** (2009), 169-181.
- ▶ R. Precup, M.-A. Serban, D. Trif, *Asymptotic stability for a model of cellular dynamics after allogeneic bone marrow transplantation*, to appear.
- ▶ R. Precup, D. Trif, M.-A. Serban, A. Cucuianu, *Mathematical understanding of some correction therapies after allogeneic bone marrow transplantation*, in preparation.

- ▶ S. Arghirescu, A. Cucuianu, R. Precup, M. Serban, *Mathematical modeling of cell dynamics after allogeneic bone marrow transplantation in acute myeloid leukemia*, to appear.
- ▶ A. Cucuianu, R. Precup, *A hypothetical-mathematical model of acute myeloid leukemia pathogenesis*, *Comput. Math. Methods Med.* **11** (2010), 49–65.
- ▶ A. Cucuianu, R. Precup, *Mathematical models of the leukemic hematopoiesis*, *Ann. Tiberiu Popoviciu Semin.* **7** (2009), 169-181.
- ▶ R. Precup, M.-A. Serban, D. Trif, *Asymptotic stability for a model of cellular dynamics after allogeneic bone marrow transplantation*, to appear.
- ▶ R. Precup, D. Trif, M.-A. Serban, A. Cucuianu, *Mathematical understanding of some correction therapies after allogeneic bone marrow transplantation*, in preparation.

- ▶ S. Arghirescu, A. Cucuianu, R. Precup, M. Serban, *Mathematical modeling of cell dynamics after allogeneic bone marrow transplantation in acute myeloid leukemia*, to appear.
- ▶ A. Cucuianu, R. Precup, *A hypothetical-mathematical model of acute myeloid leukemia pathogenesis*, *Comput. Math. Methods Med.* **11** (2010), 49–65.
- ▶ A. Cucuianu, R. Precup, *Mathematical models of the leukemic hematopoiesis*, *Ann. Tiberiu Popoviciu Semin.* **7** (2009), 169-181.
- ▶ R. Precup, M.-A. Serban, D. Trif, *Asymptotic stability for a model of cellular dynamics after allogeneic bone marrow transplantation*, to appear.
- ▶ R. Precup, D. Trif, M.-A. Serban, A. Cucuianu, *Mathematical understanding of some correction therapies after allogeneic bone marrow transplantation*, in preparation.

AIMS: - propose simple models for mathematical understanding of cell dynamics in acute leukemia, before and after allogeneic bone marrow transplantation;

- give mathematical understanding and support to some clinical post-transplant therapies.

Leukemia = abnormal expansion of mutated hematopoietic clones associated with the inhibition of the surrounding normal cells
= evolutionary process of interaction and competition between normal and abnormal (leukemic) hematopoietic cells.

Modeling of leukemia: S.I. Rubinow & J.L. Lebowitz (1976), M.C. Mackey & L. Glass (1977), B. Djulbegovic & S. Svetina (1985), A.S. Fokas, J.B. Keller & B.D. Clarkson (1991: non-delay model), ...

recent contributions: D. Dingli, F. Michor, V. Volpert, L. Pujo-Menjouet, F. Crauste, M. Adimy, A. El Abdllaoui, ...

modeling of bone marrow transplantation: R. DeConde, P.S. Kim, D. Levy & P.P. Lee (2005)

Normal-leukemic system

Dingli & Michor 2006:

$$\begin{cases} x' = \frac{a}{1+b(x+y)}x - cx \\ y' = \frac{A}{1+B(x+y)}y - Cy \end{cases}$$

$x(t)$ = normal cell population

$y(t)$ = leukemic cell population

a, A = growth rates

b, B = microenvironment sensitivity rates

c, C = cell death rates

Natural assumption: $a > c$, $A > C$

Steady-states (equilibria): $[d, 0]$, $[0, D]$

$d := \frac{1}{b} \left(\frac{a}{c} - 1 \right)$ maximal size of **normal** cell population

$D := \frac{1}{B} \left(\frac{A}{C} - 1 \right)$ maximal size of **leukemic** cell population

Asymptotic stability:

$d > D$ (**normal** hematopoietic state)
 $\implies [d, 0]$ is asymptotically stable

$d < D$ (**leukemic** hematopoietic state)
 $\implies [0, D]$ is asymptotically stable

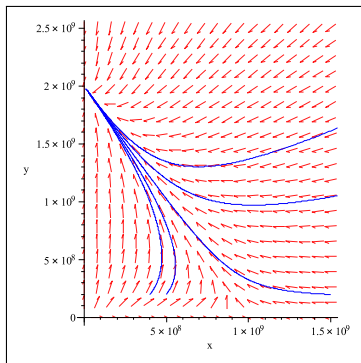


Figure 1: The **phase portrait** for the leukemic case $d < D$, where $d = 10^9$, $D = 2 \times 10^9$.

The **orbits** $[x(t), y(t)]$ approach the unique asymptotically stable equilibrium $[0, D]$. Hence:

$x(t)$ tends to 0 (no normal cells)
 $y(t)$ tends to D (leukemic cells only)

Therapies should reverse inequality $d < D$ by:

- ▶ decreasing growth rate A or/and increasing sensitivity rate B and death rate C , when acting against malignant cells, and by
- ▶ increasing rate a or/and decreasing parameters b and c , when therapy is directed at normal cells.

If chemotherapy fails and the relation $d < D$ can not be reversed, the much more radical therapy of **bone marrow transplantation** could be recommended.

Therapies should reverse inequality $d < D$ by:

- ▶ decreasing growth rate A or/and increasing sensitivity rate B and death rate C , when acting against malignant cells, and by
- ▶ increasing rate a or/and decreasing parameters b and c , when therapy is directed at normal cells.

If chemotherapy fails and the relation $d < D$ can not be reversed, the much more radical therapy of **bone marrow transplantation** could be recommended.

Bone marrow transplantation (BMT) system:

The normal-leukemic system is modified and completed by a third equation corresponding to the infusion of donor's cells:

$$\begin{cases} x' = \frac{a}{1+b(x+y+z)} \frac{x+y}{x+y+gz} x - cx \\ y' = \frac{A}{1+B(x+y+z)} \frac{x+y}{x+y+Gz} y - Cy \\ z' = \frac{a}{1+b(x+y+z)} \frac{z}{z+h(x+y)} z - cz \end{cases}$$

$z(t)$ = new population of **donor cells**

Here the growth inhibitory factors

$$\frac{1}{1+g\frac{z}{x+y}}, \quad \frac{1}{1+G\frac{z}{x+y}}, \quad \frac{1}{1+h\frac{x+y}{z}}$$

take into account the cell-cell interactions,

- **quantitatively** by ratios $\frac{z}{x+y}$ and $\frac{x+y}{z}$, and
- **qualitatively** by parameters h, g, G standing for the intensity of *anti-graft*, *anti-host* and *anti-leukemia* effects

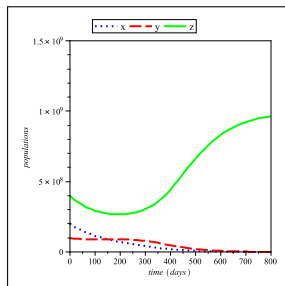
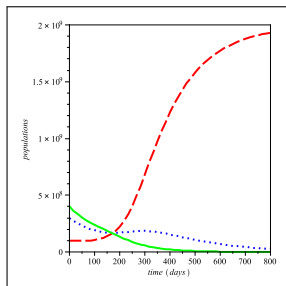
Numerical simulations:

The post-transplant evolution ultimately lead either to:

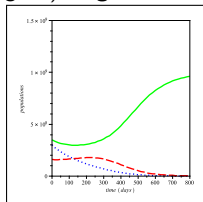
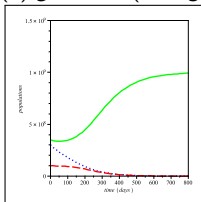
- **normal** homeostatic equilibrium $[0, 0, d]$ achieved by the expansion of the donor cells and the elimination of the host cells, or to
- **leukemic** homeostatic equilibrium $[0, D, 0]$ characterized by the proliferation of the cancer line and the suppression of the other cell lines.

One state or the other is reached depending on

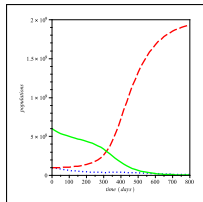
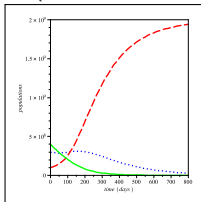
- **cell-cell interactions** (anti-host, anti-leukemia and anti-graft effects) and
- **initial cell concentrations** at transplantation.



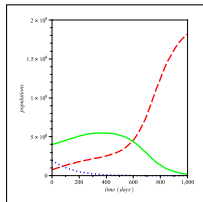
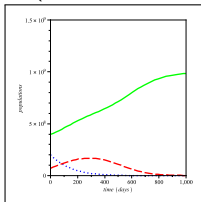
Cases: (2) $g, G \gg h$ (strong anti-cancer, weak anti-graft) \Rightarrow **good chances:**



(3) $g, G \ll h$ (weak anti-cancer, strong anti-graft) \Rightarrow **bad chances:**



(4) $g \gg G, h$ (weak anti-cancer and anti-graft) \Rightarrow chances **sensitive** to initial concentration:



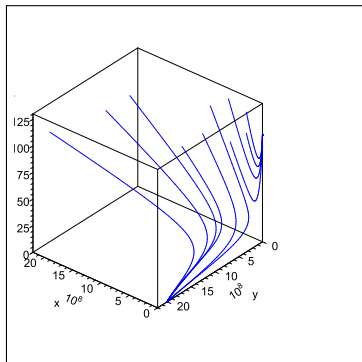


Figure 2: Phase portrait for leukemic case $d < D$, $d = 10^9$, $D = 2 \times 10^9$.

Two attractors exist:
 the bad one $[0, D, 0]$ and
 the good one $[0, 0, d]$.

Thus the orbits $[x(t), y(t), z(t)]$
 approach either the good equilibrium
 $[0, 0, d]$, or the bad one $[0, D, 0]$
 depending on initial concentrations
 $[x(0), y(0), z(0)]$.

Stability analysis:

Theorem: Assume the leukemic case $d < D$. Then system (BMT) has the following steady-states:

- a) $O[0, 0, 0]$ and $P_1[d, 0, 0]$ as **unstable** equilibria,
- b) $P_2[0, D, 0]$ and $P_3[0, 0, d]$ as **asymptotically stable** equilibria,
- c) $P_4[x^+, 0, z^+]$, if $hg < \left(\frac{a}{c} - 1\right)^2$, where

$$x^+ = \frac{\frac{a}{c(1 + \sqrt{hg})} - 1}{b\left(1 + \sqrt{\frac{h}{g}}\right)}, \quad z^+ = \sqrt{h/g}x^+$$

and d) $P_5[0, y^*, z^*]$, if $hG < \left(\frac{a}{c} - 1\right) \left(\frac{A}{C} - 1\right)$, where y^*, z^* solve

$$\begin{cases} \frac{A}{1 + B\left(\frac{y}{a} + z\right)} \frac{y}{y + Gz} = C \\ \frac{1}{1 + b(y + z)} \frac{z}{z + hy} = c \end{cases}$$

as **unstable** equilibria. Only one of P_4 or P_5 has a two-dimensional stable invariant manifold which is the **border between attraction basins** of P_2, P_3 .

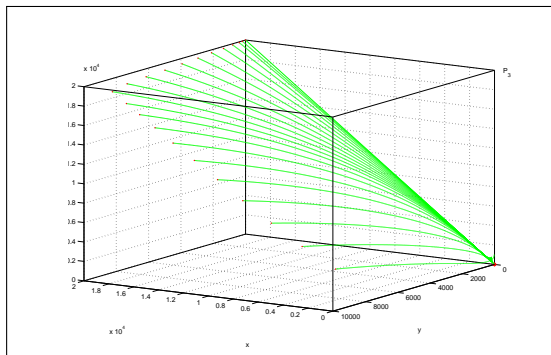


Figure 3: Border between the basins of attraction of the two asymptotically stable equilibria.

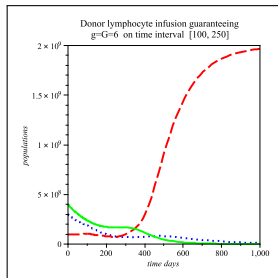
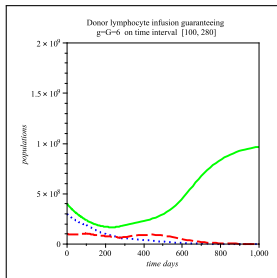
The basin of attraction of the good equilibrium increases (the border goes down) if A/C decreases; g, G increase and/or h decreases, explaining and suggesting **post-transplant therapies**.

Post-transplant therapeutic scenarios

Numerical simulations with parameter values: $a = 0.23$, $A = 0.45$, $b = B = 2.2 \times 10^{-8}$, $c = C = 0.01$, $g = G = h = 2$ and initial data $x_0 = 3 \times 10^8$, $y_0 = 10^8$, $z_0 = 4 \times 10^8$

(unsuccessful transplant)

- ▶ **Scenario 1:** - donor lymphocyte infusions guaranteeing the increasing of parameters g , G from 2 to 6 on time interval after transplant $[100,280]$ (6 months): **Therapy successful.**
- ▶ **Scenario 2:** - the same therapy as in Scenario 1 on time interval $[100,250]$ (only 5 months): **Therapy unsuccessful.**

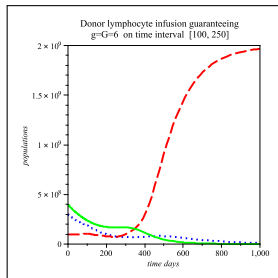
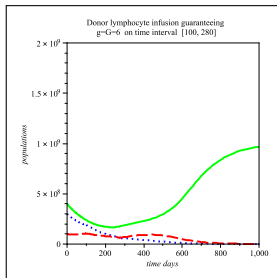


Post-transplant therapeutic scenarios

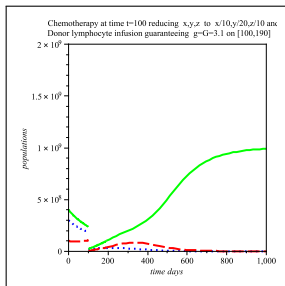
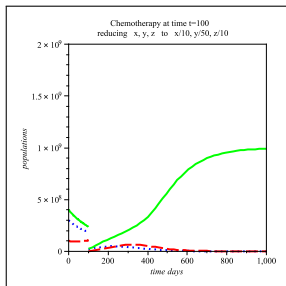
Numerical simulations with parameter values: $a = 0.23$, $A = 0.45$, $b = B = 2.2 \times 10^{-8}$, $c = C = 0.01$, $g = G = h = 2$ and initial data $x_0 = 3 \times 10^8$, $y_0 = 10^8$, $z_0 = 4 \times 10^8$

(unsuccessful transplant)

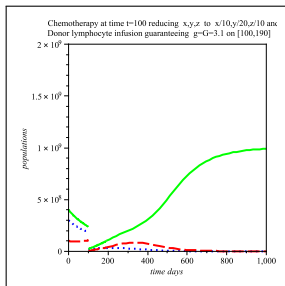
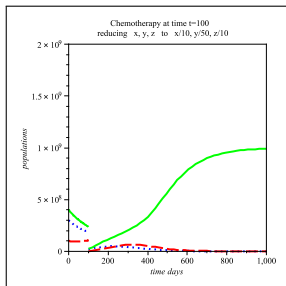
- ▶ **Scenario 1:** - donor lymphocyte infusions guaranteeing the increasing of parameters g , G from 2 to 6 on time interval after transplant $[100,280]$ (6 months): **Therapy successful.**
- ▶ **Scenario 2:** - the same therapy as in Scenario 1 on time interval $[100,250]$ (only 5 months): **Therapy unsuccessful.**



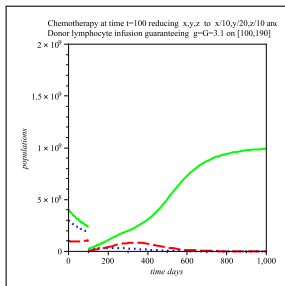
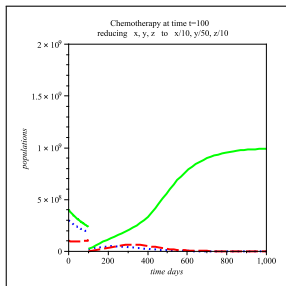
- ▶ **Scenario 3:** - chemotherapy at time $t = 100$ guaranteeing differential reduction of cell lines: from x, y, z to $x/10, y/50, z/10$:
Therapy successful.
- ▶ **Scenario 4:** - chemotherapy at time $t = 100$ guaranteeing differential reduction of x, y, z to $x/10, y/20, z/10$ and additional - donor lymphocyte infusions guaranteeing the increasing of parameters g, G from 2 to 3.1 on time interval $[100, 190]$: Therapy successful.



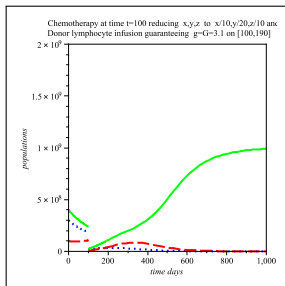
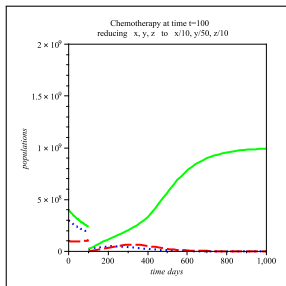
- ▶ **Scenario 3:** - chemotherapy at time $t = 100$ guaranteeing differential reduction of cell lines: from x, y, z to $x/10, y/50, z/10$:
Therapy successful.
- ▶ **Scenario 4:** - chemotherapy at time $t = 100$ guaranteeing differential reduction of x, y, z to $x/10, y/20, z/10$ and additional - donor lymphocyte infusions guaranteeing the increasing of parameters g, G from 2 to 3.1 on time interval $[100, 190]$: Therapy successful.



- ▶ **Scenario 3:** - chemotherapy at time $t = 100$ guaranteeing differential reduction of cell lines: from x, y, z to $x/10, y/50, z/10$:
Therapy successful.
- ▶ **Scenario 4:** - chemotherapy at time $t = 100$ guaranteeing differential reduction of x, y, z to $x/10, y/20, z/10$ and additional - donor lymphocyte infusions guaranteeing the increasing of parameters g, G from 2 to 3.1 on time interval $[100, 190]$: Therapy successful.



- ▶ **Scenario 3:** - chemotherapy at time $t = 100$ guaranteeing differential reduction of cell lines: from x, y, z to $x/10, y/50, z/10$:
Therapy successful.
- ▶ **Scenario 4:** - chemotherapy at time $t = 100$ guaranteeing differential reduction of x, y, z to $x/10, y/20, z/10$ and additional - donor lymphocyte infusions guaranteeing the increasing of parameters g, G from 2 to 3.1 on time interval $[100, 190]$: Therapy successful.



- ▶ **Scenario 3:** - chemotherapy at time $t = 100$ guaranteeing differential reduction of cell lines: from x, y, z to $x/10, y/50, z/10$:
Therapy successful.
- ▶ **Scenario 4:** - chemotherapy at time $t = 100$ guaranteeing differential reduction of x, y, z to $x/10, y/20, z/10$ and additional - donor lymphocyte infusions guaranteeing the increasing of parameters g, G from 2 to 3.1 on time interval $[100, 190]$: Therapy successful.

