

10-year jubilee
of the European
Research
Council's ERC
Starting and
Advanced Grant
program

2017.03.03.

Engineering methods for cancer treatment

Dr. Johanna Sájevicsné Sági

Óbuda University
Research and Innovation Center of Óbuda University
Physiological Controls Research Center



1. Physiological and pathophysiological background
2. Previously investigated tumor growth model (Hahnfeldt model)
3. Controller design and simulations for Hahnfeldt model
4. Animal experiments
5. Tumor growth model identification
6. Controller design and simulations for new tumor growth model

Concept of the research



Physiological and pathophysiological knowledge

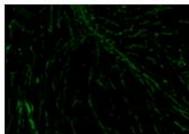
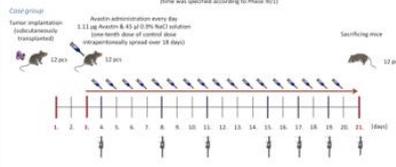
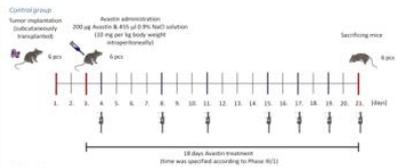
Hahnfeldt model

$$V' = -\lambda_1 V \cdot \ln\left(\frac{V}{K}\right)$$

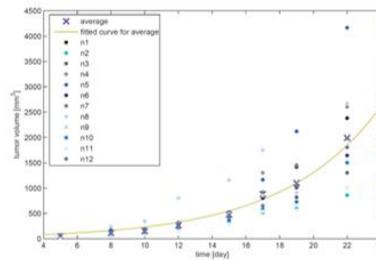
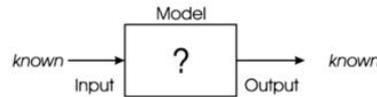
$$K' = -\lambda_2 K + bV - dKV^{2/3} - eKg(t)$$

$$g(t) = \int_0^t c(t') \exp(-clr(t-t')) dt'$$

Animal experiments



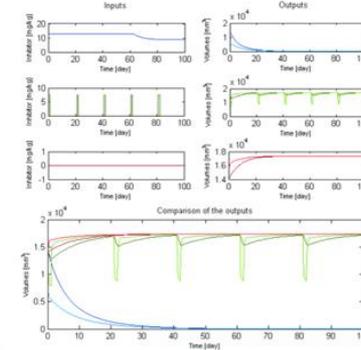
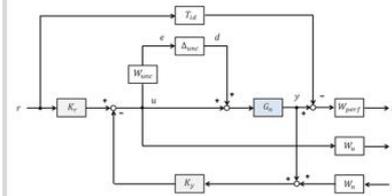
Tumor growth model identification



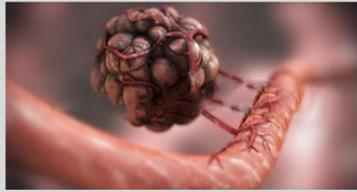
$$W_{p111/2case}(t) = \frac{-61.79s + 14.33}{s^2 - 0.1409s + 0.004963}$$

$$W_{p111/2control}(t) = \frac{-12.34s + 3.764}{s^2 - 0.2292s + 0.01313}$$

Controller design and simulations



Concept of the research



Physiological and pathophysiological knowledge

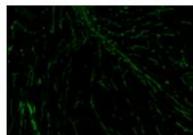
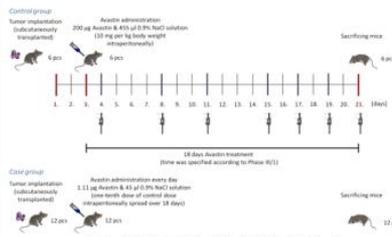
Hahnfeldt model

$$V' = -\lambda_1 V \cdot \ln\left(\frac{V}{K}\right)$$

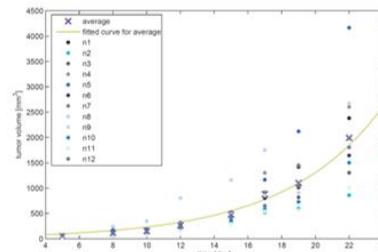
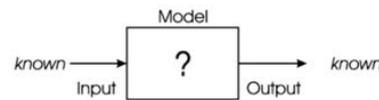
$$K' = -\lambda_2 K + bV - dKV^2/3 - eKg(t)$$

$$g(t) = \int_0^t c(t') \exp(-clr(t-t')) dt'$$

Animal experiments



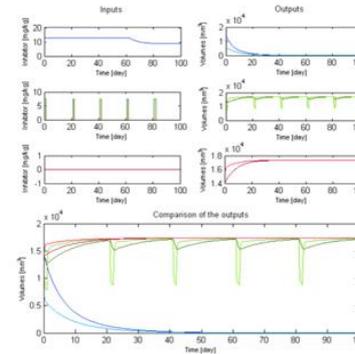
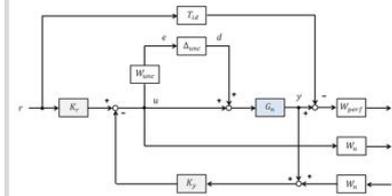
Tumor growth model identification



$$W_{p111/2case}(t) = \frac{-61.79s + 14.33}{s^2 - 0.1409s + 0.004963}$$

$$W_{p111/2control}(t) = \frac{-12.34s + 3.764}{s^2 - 0.2292s + 0.01313}$$

Controller design and simulations



1. Physiological and pathophysiological knowledge

2. Previously investigated tumor growth model (Hahnfeldt model)

3. Controller design and simulations for Hahnfeldt model

4. Animal experiments

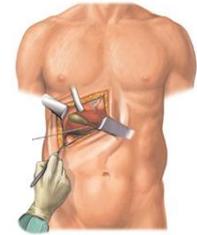
5. Tumor growth model identification

6. Controller design and simulations for the new tumor growth model



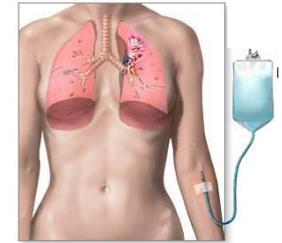
Surgical oncology

- the tumor cells can be totally removed (zero-order kinetics)
- tumor can be recurrent in many cases



Chemotherapy

- uses drugs to destroy cancer cells
- acts in general ways (by killing rapidly dividing cells)
- have many side effects
- tumor cells can become resistant to chemotherapy drugs



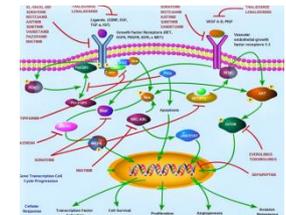
Radiotherapy

- destroy cancer cells with radiation
- acts in general ways (by killing rapidly dividing cells)
- have many side effects



Targeted molecular therapies (TMTs)

- fight specifically against different cancer mechanisms
- can be more effective and have limited side effects

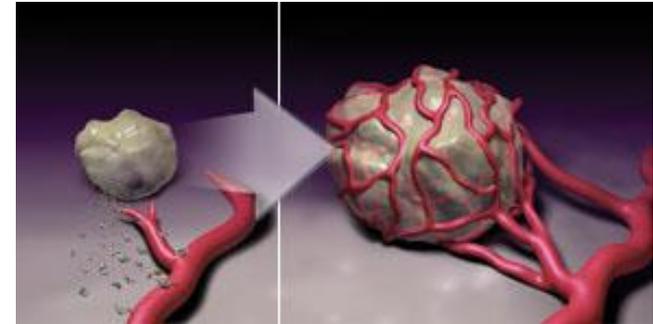


1. Physiological and pathophysiological knowledge
2. Previously investigated tumor growth model (Hahnfeldt model)
3. Controller design and simulations for Hahnfeldt model
4. Animal experiments
5. Tumor growth model identification
6. Controller design and simulations for the new tumor growth model



Tumor vasculogenesis

- start of the proliferation → avascular nodule (dormant)
- limitation of oxygen and nutrients → tumor development stops
- angiogenic switch → exponential tumor growth



Antiangiogenic therapy

- prevent tumors from forming new blood vessels
- without angiogenesis tumor growth is inhibited



1. Physiological and pathophysiological knowledge

2. Previously investigated tumor growth model (Hahnfeldt model)

3. Controller design and simulations for Hahnfeldt model

4. Animal experiments

5. Tumor growth model identification

6. Controller design and simulations for the new tumor growth model



Cancer protocols in the light of the dosage problem

1. intermittent bolus doses administration

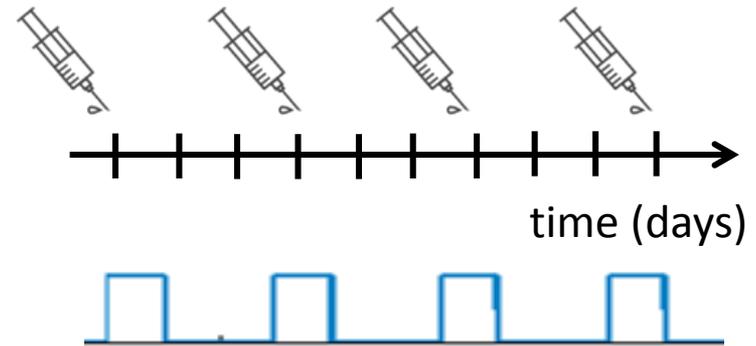
- ✓ patient receives drug on given days
- ✓ therapy has rest periods
- ✓ injected amount of boluses can be

a) maximum tolerated dose (MTD)

- ✓ length of the rest periods depends on the amount of boluses
- ✓ disadvantage:
 - a) it involves **re-growth of tumor cells**
 - b) resistant to the therapy

b) low-dose metronomic (LDM) regimen

- ✓ low doses over prolonged periods without extended rest periods
- ✓ advantages: antitumor efficacy, reduced acute toxicities
- ✓ disadvantage: **empiricism** associated with determining the *optimal biologic dose (OBD)*



1. Physiological and pathophysiological knowledge

2. Previously investigated tumor growth model (Hahnfeldt model)

3. Controller design and simulations for Hahnfeldt model

4. Animal experiments

5. Tumor growth model identification

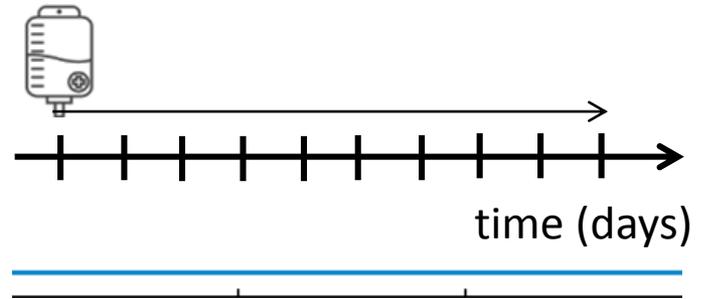
6. Controller design and simulations for the new tumor growth model



Cancer protocols in the light of the dosage problem

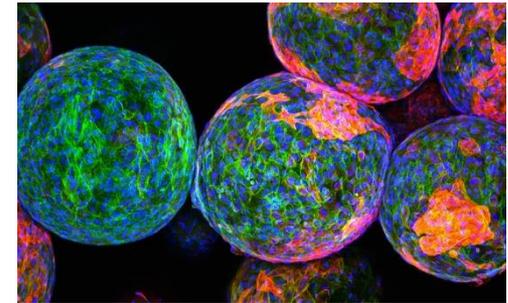
2. continuous infusion therapy

- ✓ applicable within clinical environment
- ✓ not yet as a portable device
- ✓ prolonged delivery



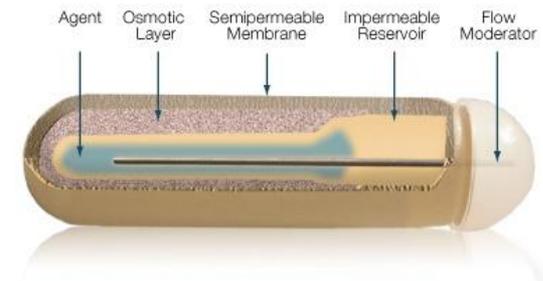
a) cell encapsulation systems

- microencapsulated **in vivo releasing** endostatin was biologically active and significantly inhibited the migration of endothelial cells



b) mini-osmotic pumps

- continuous administration was **more effective** (97% inhibition of tumor growth) than daily bolus doses (66%), using the same dosage



1. Physiological and pathophysiological knowledge

2. Previously investigated tumor growth model (Hahnfeldt model)

3. Controller design and simulations for Hahnfeldt model

4. Animal experiments

5. Tumor growth model identification

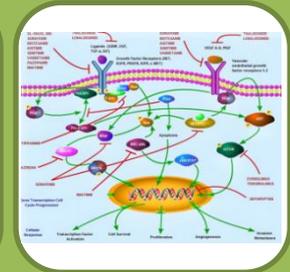
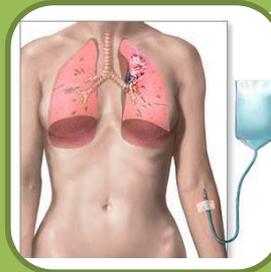
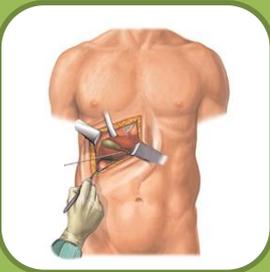
6. Controller design and simulations for the new tumor growth model



Interdisciplinary design



Medical knowledge



cancer treatments

general protocols



Healing of the patient

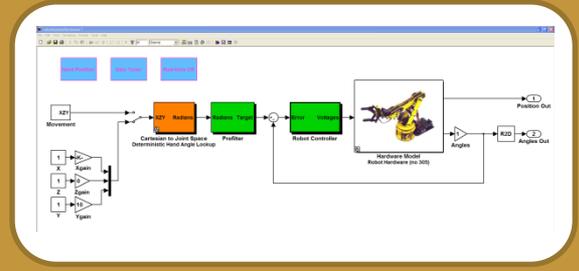
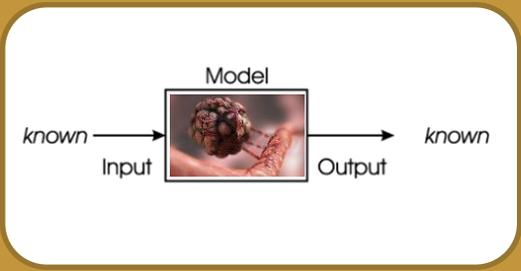
find more effective solutions in healing individual treatment for the patient

model identification

model-based protocols



Engineering knowledge



1. Physiological and pathophysiological knowledge
2. Previously investigated tumor growth model (Hahnfeldt model)
3. Controller design and simulations for Hahnfeldt model
4. Animal experiments
5. Tumor growth model identification
6. Controller design and simulations for the new tumor growth model



The (control) problem

Antiangiogenic therapy

Protocols for medical treatment

Therapy with a controller

often unknown efficacy

aim:
low tumor volume

controller design for appropriately-low tumor volume

constant drug dosage

dosage

minimizes the input signal as far as possible

→ less side effects
greater cost-effectiveness

individual therapy is not possible

difficulties

model uncertainties and measurement noise

?

solution for difficulties

modern robust control

1. Physiological and pathophysiological knowledge

2. Previously investigated tumor growth model (Hahnfeldt model)

3. Controller design and simulations for Hahnfeldt model

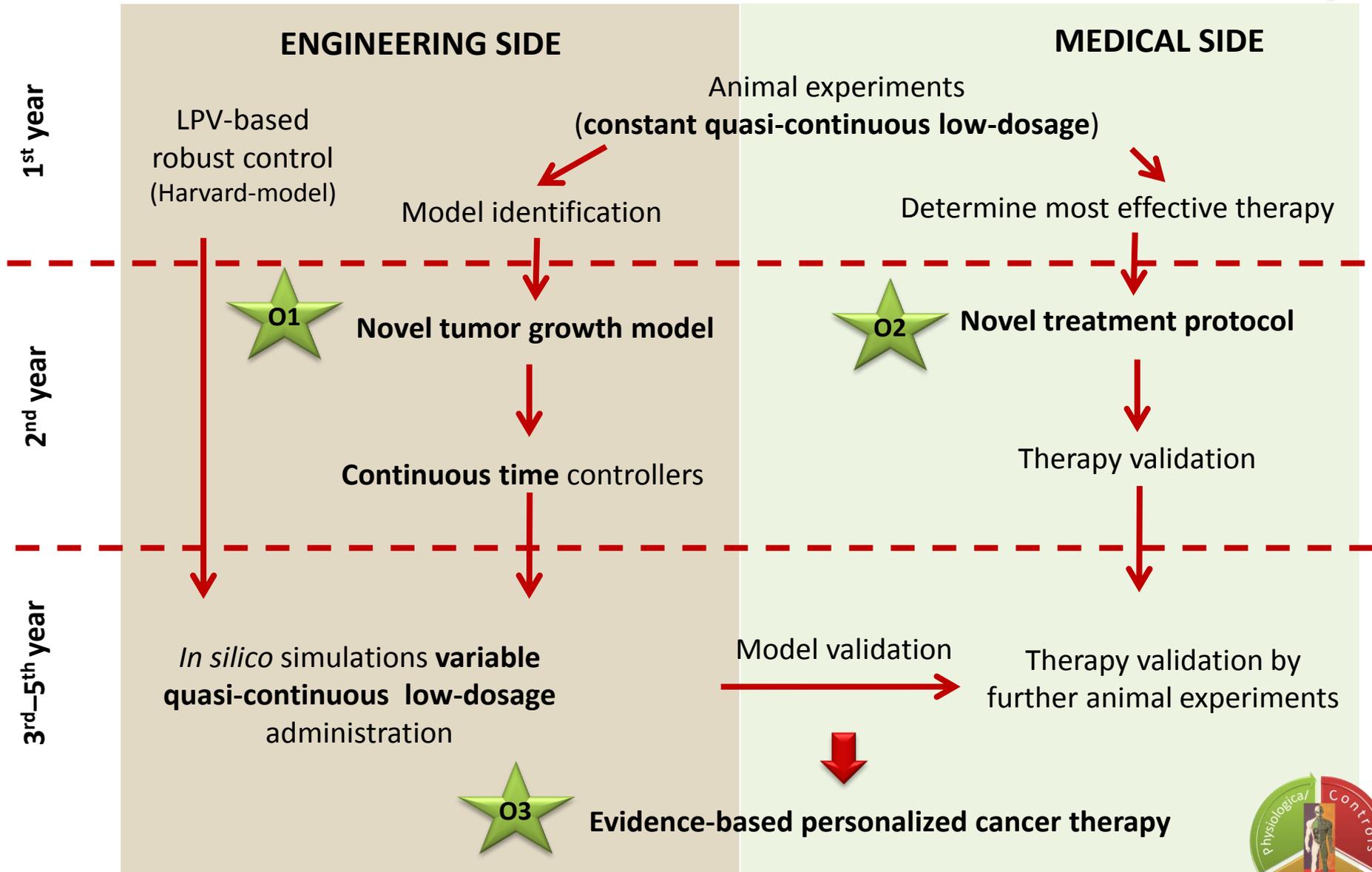
4. Animal experiments

5. Tumor growth model identification

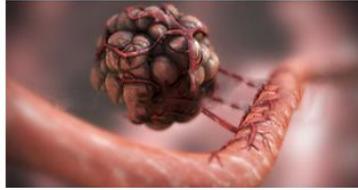
6. Controller design and simulations for the new tumor growth model



Methodology



Concept of the research



Physiological and pathophysiological knowledge

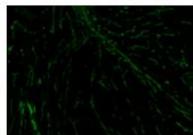
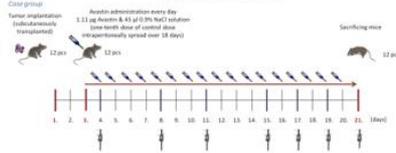
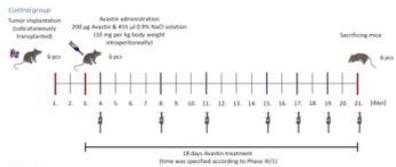
Hahnfeldt model

$$V' = -\lambda_1 V \cdot \ln\left(\frac{V}{K}\right)$$

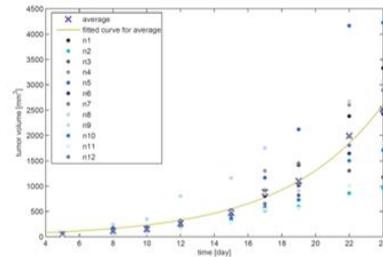
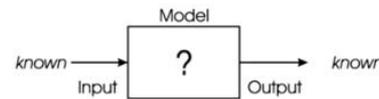
$$K' = -\lambda_2 K + bV - dKV^2/3 - eKg(t)$$

$$g(t) = \int_0^t c(t') \exp(-clr(t-t')) dt'$$

Animal experiments



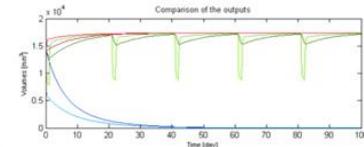
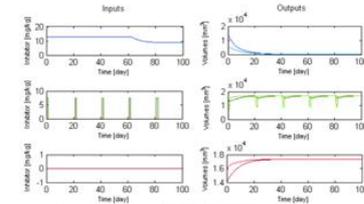
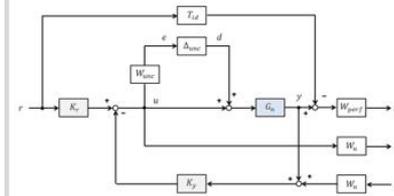
Tumor growth model identification



$$W_{pIII/2case}(t) = \frac{-61.79s + 14.33}{s^2 - 0.1409s + 0.004963}$$

$$W_{pIII/2control}(t) = \frac{-12.34s + 3.764}{s^2 - 0.2292s + 0.01313}$$

Controller design and simulations



1. Physiological and pathophysiological knowledge
2. Previously investigated tumor growth model (Hahnfeldt model)
3. Controller design and simulations for Hahnfeldt model
4. Animal experiments
5. Tumor growth model identification
6. Controller design and simulations for the new tumor growth model



Previously investigated tumor growth model

- P. Hahnfeldt et al. (1999)

$$\dot{x}_1 = -\lambda_1 x_1 \cdot \ln\left(\frac{x_1}{x_2}\right)$$

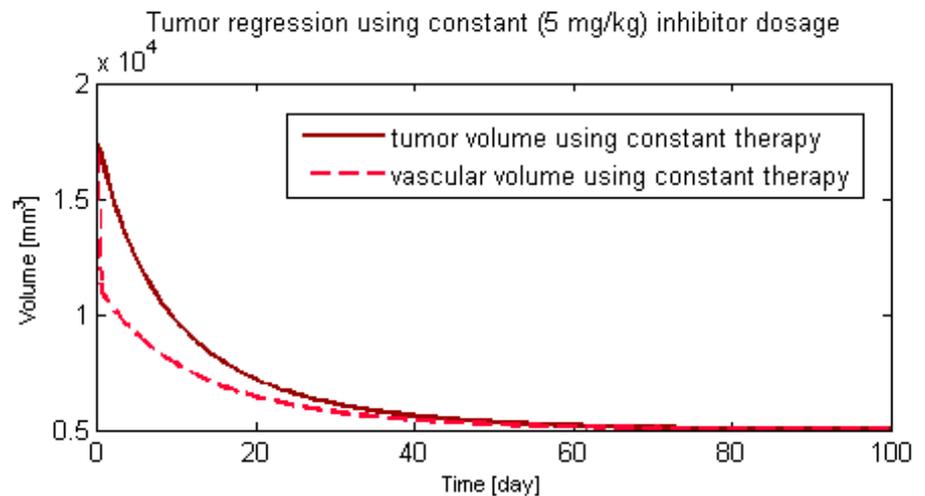
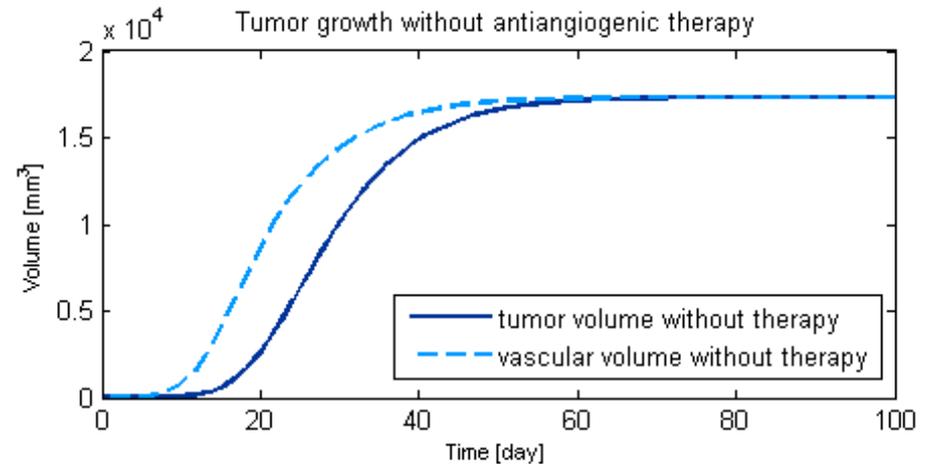
$$\dot{x}_2 = bx_1 - d \cdot x_1^{2/3} \cdot x_2 - ex_2g$$

$$y = x_1$$

x_1 : tumor volume (mm^3)

x_2 : endothelial volume (mm^3)

g : concentration of the administered inhibitor (mg/kg).



1. Physiological and pathophysiological knowledge
2. Previously investigated tumor growth model (Hahnfeldt model)
3. Controller design and simulations for Hahnfeldt model
4. Animal experiments
5. Tumor growth model identification
6. Controller design and simulations for the new tumor growth model



Concept of the research



Physiological and pathophysiological knowledge

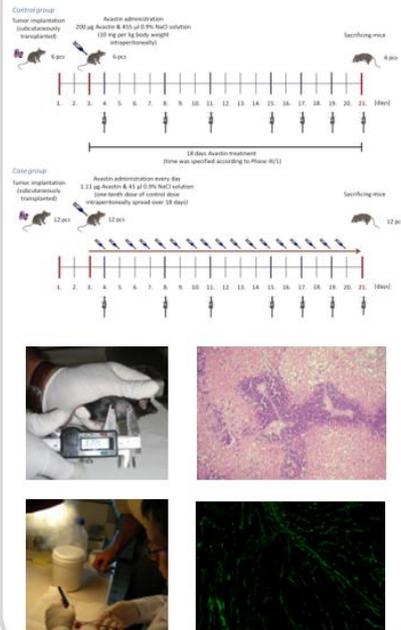
Hahnfeldt model

$$V' = -\lambda_1 V \cdot \ln\left(\frac{V}{K}\right)$$

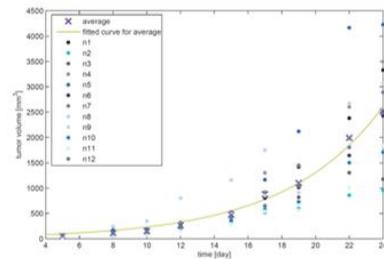
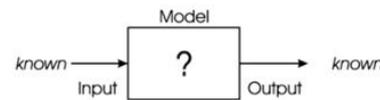
$$K' = -\lambda_2 K + bV - dKV^2/s - eKg(t)$$

$$g(t) = \int_0^t c(t') \exp(-clr(t-t')) dt'$$

Animal experiments



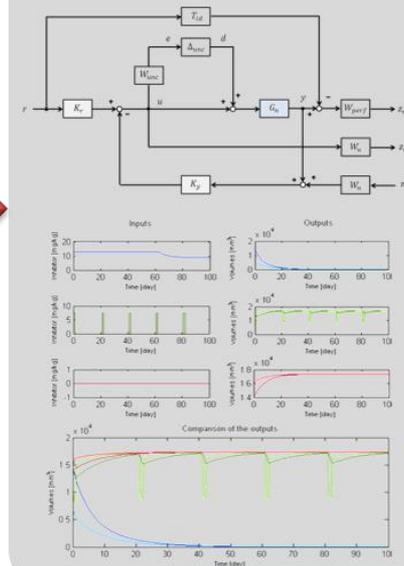
Tumor growth model identification



$$W_{pIII/2case}(t) = \frac{-61.79s + 14.33}{s^2 - 0.1409s + 0.004963}$$

$$W_{pIII/2control}(t) = \frac{-12.34s + 3.764}{s^2 - 0.2292s + 0.01313}$$

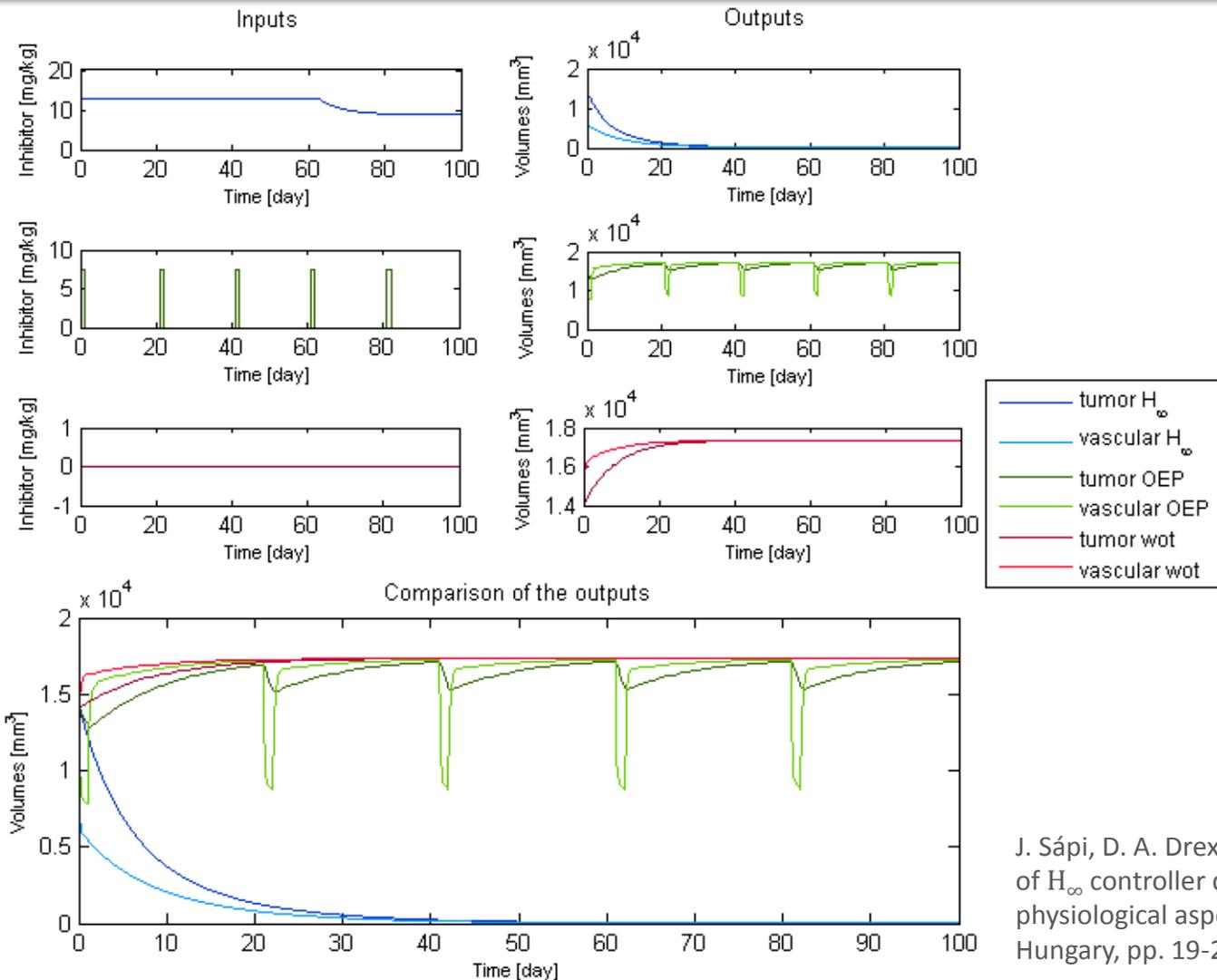
Controller design and simulations



1. Physiological and pathophysiological knowledge
2. Previously investigated tumor growth model (Hahnfeldt model)
3. Controller design and simulations for Hahnfeldt model
4. Animal experiments
5. Tumor growth model identification
6. Controller design and simulations for the new tumor growth model



Simulation results of robust control



Comparison of changes in tumor volume using different therapies

- a) therapy using the controller which was designed using the Robust Control method
- b) therapy based on the Hungarian OEP protocol for antiangiogenic monotherapy
- c) without therapy

J. Sápi, D. A. Drexler, L. Kovács, "Parameter optimization of H_{∞} controller designed for tumor growth in the light of physiological aspects", in *Proc. CINTI 2013 Budapest*, Hungary, pp. 19-24.

1. Physiological and pathophysiological knowledge
2. Previously investigated tumor growth model (Hahnfeldt model)
3. **Controller design and simulations for Hahnfeldt model**
4. Animal experiments
5. Tumor growth model identification
6. Controller design and simulations for the new tumor growth model



Concept of the research



Physiological and pathophysiological knowledge

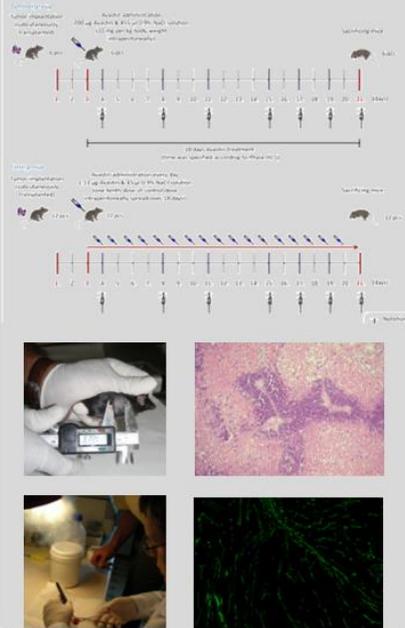
Hahnfeldt model

$$V' = -\lambda_1 V \cdot \ln\left(\frac{V}{K}\right)$$

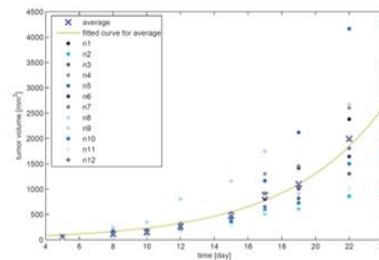
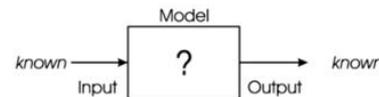
$$K' = -\lambda_2 K + bV - dKV^2/3 - eKg(t)$$

$$g(t) = \int_0^t c(t') \exp(-clr(t-t')) dt'$$

Animal experiments



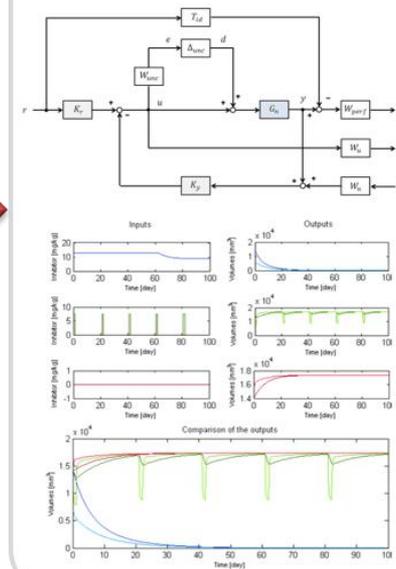
Tumor growth model identification



$$W_{p111/2case}(t) = \frac{-61.79s + 14.33}{s^2 - 0.1409s + 0.004963}$$

$$W_{p111/2control}(t) = \frac{-12.34s + 3.764}{s^2 - 0.2292s + 0.01313}$$

Controller design and simulations



1. Physiological and pathophysiological knowledge
2. Previously investigated tumor growth model (Hahnfeldt model)
3. Controller design and simulations for Hahnfeldt model
- 4. Animal experiments**
5. Tumor growth model identification
6. Controller design and simulations for the new tumor growth model

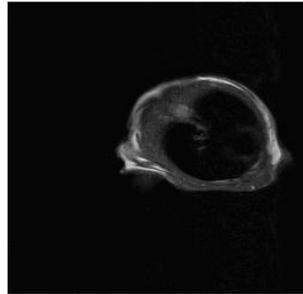


Animal experiments

Tumor implantation/ Bevacizumab administration



Tumor volume measurement

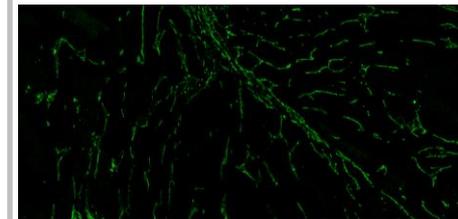
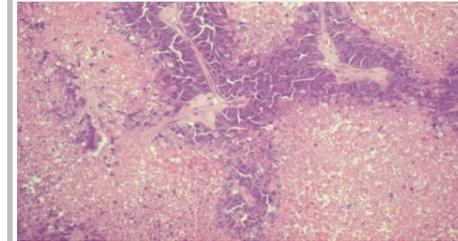


Sacrificing mice, remove tumor



Tumor sample processing

H&E staining



*Immunohistochemistry
staining*

J. Sápi, D. A. Drexler, I. Harmati, A. Szeles, B. Kiss, Z. Sápi, and L. Kovács, "Tumor growth model identification and analysis in case of C38 colon adenocarcinoma and B16 melanoma", in *Proc. SACI 2013 Timisoara, Romania*, pp. 303-308

1. Physiological and pathophysiological knowledge
2. Previously investigated tumor growth model (Hahnfeldt model)
3. Controller design and simulations for Hahnfeldt model
- 4. Animal experiments**
5. Tumor growth model identification
6. Controller design and simulations for the new tumor growth model

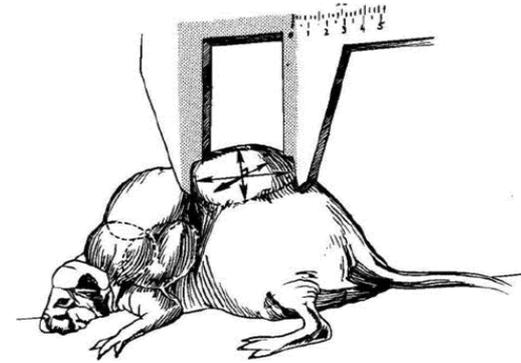


The importance of accurate tumor volume estimation

- measurement of volume is necessary to monitor
 - ✓ the progression of the disease
 - ✓ the efficiency of the given therapy

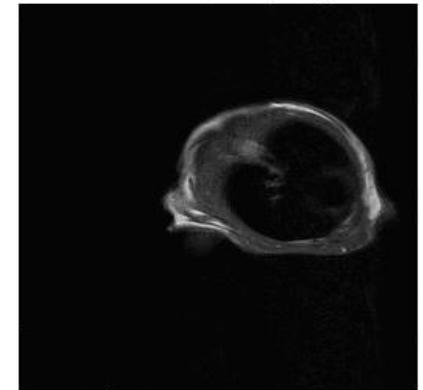
Caliper

- ✓ width and length can be measured, but the third dimension is estimated
- ✓ tumor volume is approximated assuming a shape (e.g. ellipsoid)
- ✓ in the case of irregular tumor structure, it may result in significant error in tumor volume



Magnetic Resonance Imaging (MRI)

- ✓ non-invasive, does not use ionizing radiation
- ✓ computes the precise location, shape and orientation of the tumor mass
- ✓ expensive



1. Physiological and pathophysiological knowledge
2. Previously investigated tumor growth model (Hahnfeldt model)
3. Controller design and simulations for Hahnfeldt model

4. Animal experiments

5. Tumor growth model identification
6. Controller design and simulations for the new tumor growth model



The importance of accurate tumor volume estimation

Models estimating tumor volume based on caliper measurements

- three dimensions: length (l), width (w), height (h)

Xenograft tumor model protocol

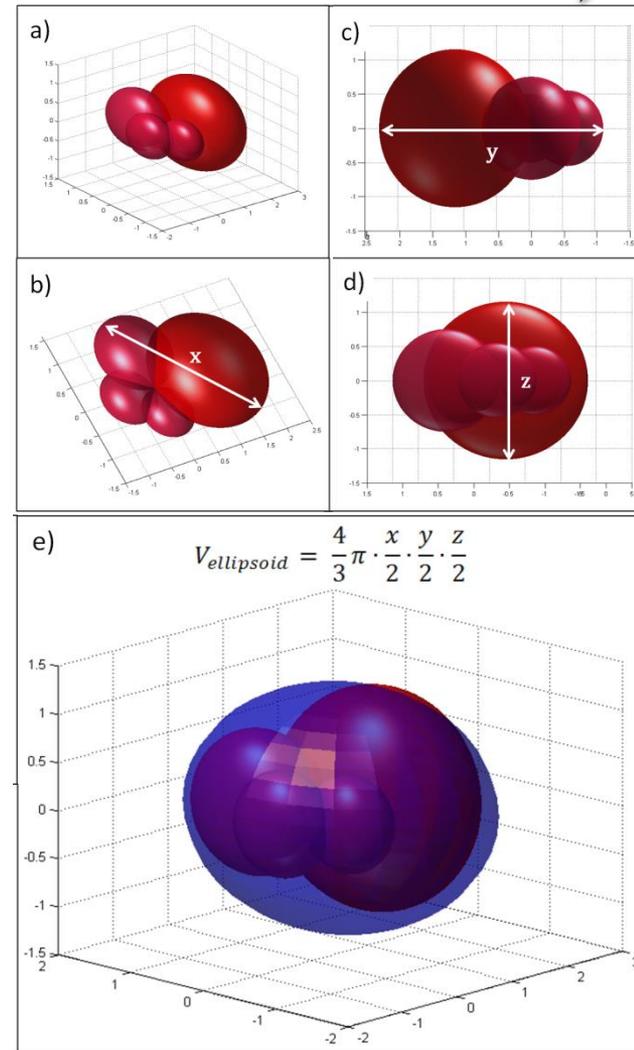
$$V = w^2 \cdot \frac{l}{2}$$

Ellipsoid shape

$$V = \frac{4}{3} \cdot \pi \cdot \frac{l}{2} \cdot \frac{w}{2} \cdot \frac{h}{2}$$

Two-dimensional model $V = \frac{\pi}{6} \cdot f \cdot (l \cdot w)^{3/2}$

J Sápi, L Kovács, D A Drexler, P Kocsis, D. Gajári, and Z Sápi (2015). "Tumor Volume Estimation and Quasi-Continuous Administration for Most Effective Bevacizumab Therapy" *PLoS ONE 10:(11) PAPER E0142190. 20 P. (2015)*



1. Physiological and pathophysiological knowledge
2. Previously investigated tumor growth model (Hahnfeldt model)
3. Controller design and simulations for Hahnfeldt model

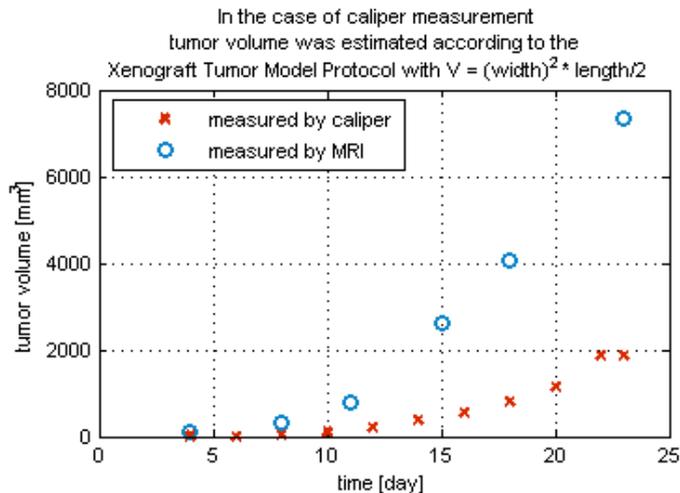
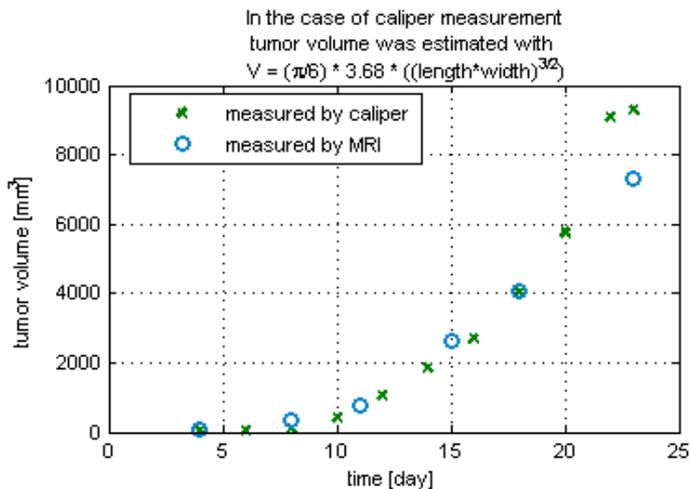
4. Animal experiments

5. Tumor growth model identification
6. Controller design and simulations for the new tumor growth model

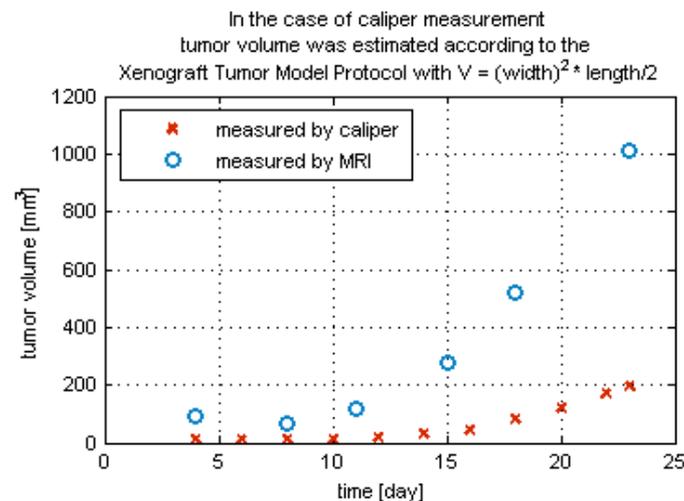
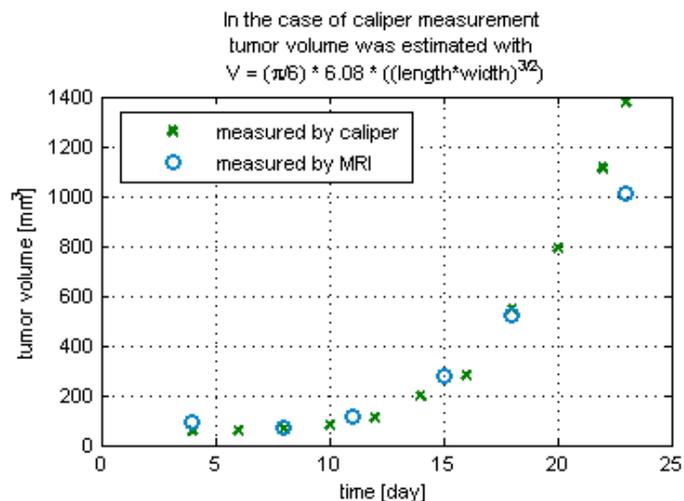


The importance of accurate tumor volume estimation

Control group (C4)



Case group (E9)

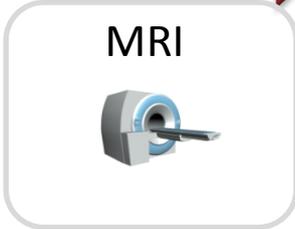


our new model estimates tumor volume similarly accurate as MRI, using only caliper measurement

1. Physiological and pathophysiological knowledge
2. Previously investigated tumor growth model (Hahnfeldt model)
3. Controller design and simulations for Hahnfeldt model
- 4. Animal experiments**
5. Tumor growth model identification
6. Controller design and simulations for the new tumor growth model



Finding the effective dosage for optimal therapy



Phase I
without therapy

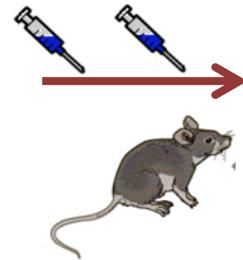
$p = 0.572$

$p = 0.002$

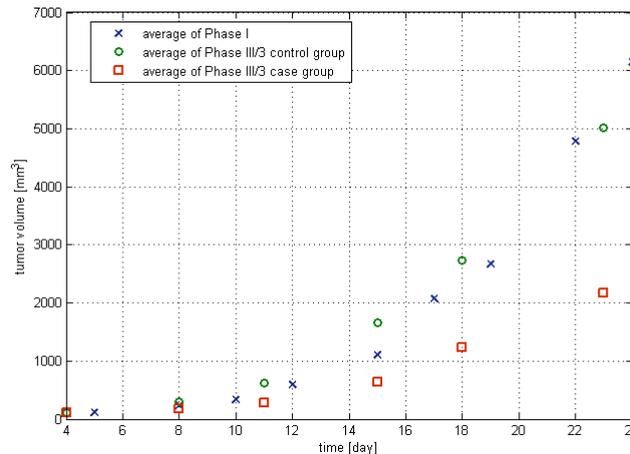
daily 1/180 dosage
is more effective
than one large dose



Phase III/3 control group
therapy based on
the protocol
(200 μg)



Phase III/3 case group
therapy with daily
administration
(1.11 μg)



1. Physiological and pathophysiological knowledge
2. Previously investigated tumor growth model (Hahnfeldt model)
3. Controller design and simulations for Hahnfeldt model
- 4. Animal experiments**
5. Tumor growth model identification
6. Controller design and simulations for the new tumor growth model



Concept of the research



Physiological and pathophysiological knowledge

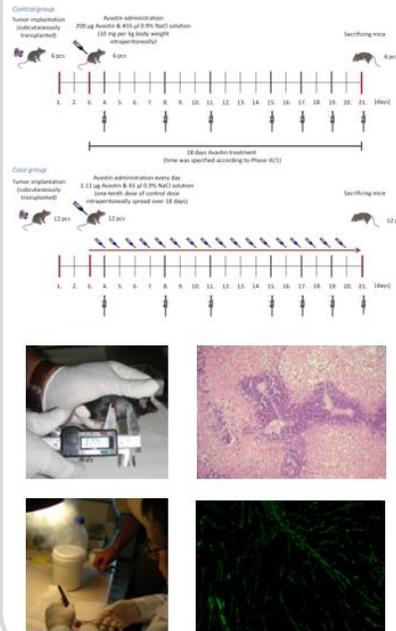
Hahnfeldt model

$$V' = -\lambda_1 V \cdot \ln\left(\frac{V}{K}\right)$$

$$K' = -\lambda_2 K + bV - dKV^2/3 - eKg(t)$$

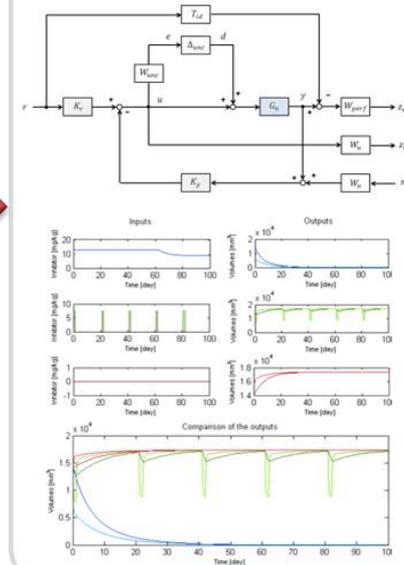
$$g(t) = \int_0^t c(t') \exp(-clr(t-t')) dt'$$

Animal experiments



More details in Dr. Dávid Csercsik's presentation

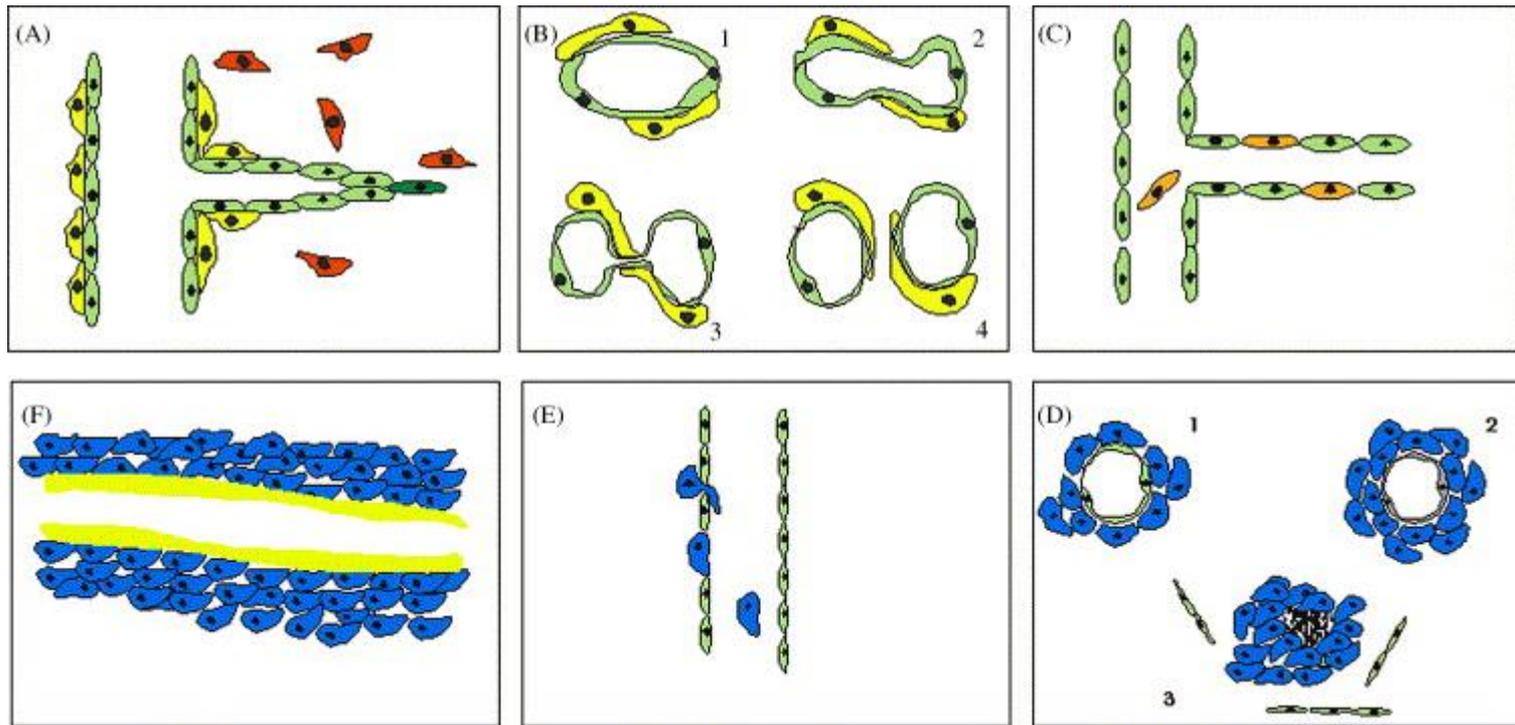
Controller design and simulations



1. Physiological and pathophysiological knowledge
2. Previously investigated tumor growth model (Hahnfeldt model)
3. Controller design and simulations for Hahnfeldt model
4. Animal experiments
5. Tumor growth model identification
6. Controller design and simulations for the new tumor growth model



Motivation of new tumor growth model identification



Tumor vascularization

- Endothelial cell
- Apoptotic endothelial cell
- CEP
- Tip cell
- Pericyte - SMC
- Fibroblast
- Tumor cell
- PAS - Laminin
- Necrotic area

Auguste P, Lemiere S, Larrieu-Lahargue F, Bikfalvi A, Molecular mechanisms of tumor vascularization. Crit Rev Oncol Hematol. 2005 Apr;54(1):53-61.

(A) Endothelial Sprouting; (B) Intussusceptive Microvascular Growth (IMG); (C) Postnatal Vasculogenesis; (D) Vessel Co-Option; (E) Mosaic vessels; (F) Vasculogenic Mimicry.

New, non-sprouting vascularization methods which are not taken into account in Hahnfeldt model → outdated model

1. Physiological and pathophysiological knowledge
2. Previously investigated tumor growth model (Hahnfeldt model)
3. Controller design and simulations for Hahnfeldt model
4. Animal experiments

5. Tumor growth model identification

6. Controller design and simulations for the new tumor growth model



Concept of the research



Physiological and pathophysiological knowledge

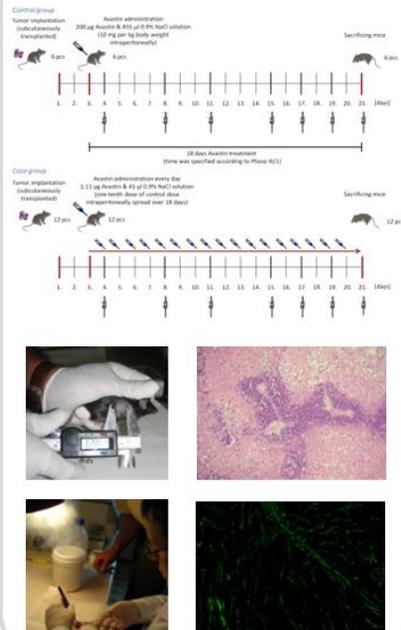
Hahnfeldt model

$$V' = -\lambda_1 V \cdot \ln\left(\frac{V}{K}\right)$$

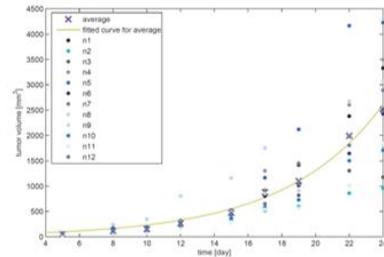
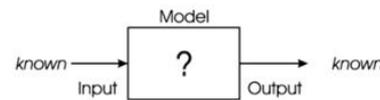
$$K' = -\lambda_2 K + bV - dKV^2/s - eKg(t)$$

$$g(t) = \int_0^t c(t') \exp(-clr(t-t')) dt'$$

Animal experiments



Tumor growth model identification



$$W_{p111/2case}(t) = \frac{-61.79s + 14.33}{s^2 - 0.1409s + 0.004963}$$

$$W_{p111/2control}(t) = \frac{-12.34s + 3.764}{s^2 - 0.2292s + 0.01313}$$

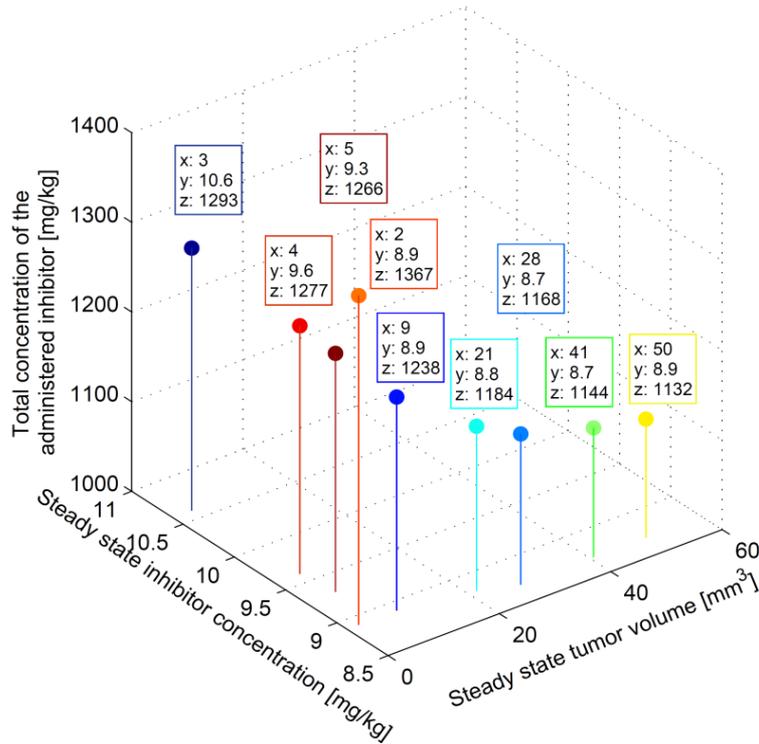
More details in Dr. Drexler Dániel András' presentation

1. Physiological and pathophysiological knowledge
2. Previously investigated tumor growth model (Hahnfeldt model)
3. Controller design and simulations for Hahnfeldt model
4. Animal experiments
5. Tumor growth model identification
6. Controller design and simulations for the new tumor growth model



What can we offer for medical doctors?

- alternatives for optimal, personalized protocols based on multi-criteria



J Sápi, D A Drexler, I Harmati, Z Sápi, and L Kovács (2015). "Qualitative analysis of tumor growth model under antiangiogenic therapy – choosing the effective operating point and design parameters for controller design". *OPTIMAL CONTROL APPLICATIONS AND METHODS* 37:(5) pp. 848-866. (2016)

Evaluated criterion: total concentration of the administered inhibitor during the treatment (mg/kg)	R = 0.1	R = 1	R = 10	R = 100	R = 1000
operating point: 10 mm ³	saturation: 25 mg/kg: 1556	1500	1486	1483	1483
	saturation: 15 mg/kg: 1367	1329	1318	1316	1316
	saturation: 13 mg/kg: 1300	1277	1268	1266	1266
operating point: 100 mm ³	saturation: 25 mg/kg: 1369	1430	1365	1308	1292
	saturation: 15 mg/kg: 1353	1288	1227	1184	1169
	saturation: 13 mg/kg: 1293	1243	1184	1144	1132
operating point: 5000 mm ³	saturation: 25 mg/kg: 1380	1439	1345	1245	1131
	saturation: 15 mg/kg: 1351	1283	1210	1131	1044
	saturation: 13 mg/kg: 1293	1238	1168	1096	1017
operating point: 10000 mm ³	saturation: 25 mg/kg: 1405	1439	1345	1244	1129
	saturation: 15 mg/kg: 1351	1283	1209	1130	1042
	saturation: 13 mg/kg: 1293	1238	1168	1096	1016

Evaluated criterion: steady state inhibitor concentration at the end of the treatment (mg/kg)	R = 0.1	R = 1	R = 10	R = 100	R = 1000
operating point: 10 mm ³	saturation: 25 mg/kg: 8.8	8.8	8.8	8.8	8.8
	saturation: 15 mg/kg: 8.9	8.8	8.8	8.8	8.8
	saturation: 13 mg/kg: 12.3	9.6	9.3	9.3	9.3
operating point: 100 mm ³	saturation: 25 mg/kg: 8.8	8.7	8.7	8.7	8.7
	saturation: 15 mg/kg: 8.8	8.8	8.7	8.7	8.7
	saturation: 13 mg/kg: 10.7	8.9	8.7	8.7	8.7
operating point: 5000 mm ³	saturation: 25 mg/kg: 8.7	8.8	8.7	8.6	8.3
	saturation: 15 mg/kg: 8.9	8.8	8.7	8.6	8.3
	saturation: 13 mg/kg: 10.6	8.9	8.7	8.6	8.3
operating point: 10000 mm ³	saturation: 25 mg/kg: 8.8	8.8	8.7	8.6	8.3
	saturation: 15 mg/kg: 8.9	8.8	8.7	8.6	8.3
	saturation: 13 mg/kg: 10.6	8.9	8.7	8.6	8.3

Evaluated criterion: steady state tumor volume at the end of the treatment (mm ³)	R = 0.1	R = 1	R = 10	R = 100	R = 1000
operating point: 10 mm ³	saturation: 25 mg/kg: 2	4	5	5	5
	saturation: 15 mg/kg: 2	4	5	5	5
	saturation: 13 mg/kg: 3	4	5	5	5
operating point: 100 mm ³	saturation: 25 mg/kg: 3	8	21	41	50
	saturation: 15 mg/kg: 3	8	21	41	50
	saturation: 13 mg/kg: 3	8	21	41	50
operating point: 5000 mm ³	saturation: 25 mg/kg: 3	9	28	86	259
	saturation: 15 mg/kg: 3	9	28	86	259
	saturation: 13 mg/kg: 3	9	28	86	259
operating point: 10000 mm ³	saturation: 25 mg/kg: 3	9	28	86	264
	saturation: 15 mg/kg: 3	9	28	86	264
	saturation: 13 mg/kg: 3	9	28	86	264

- Physiological and pathophysiological knowledge
- Previously investigated tumor growth model (Hahnfeldt model)
- Controller design and simulations for Hahnfeldt model
- Animal experiments
- Tumor growth model identification
- Controller design and simulations for the new tumor growth model



10-year jubilee
of the European
Research
Council's ERC
Starting and
Advanced Grant
program

2017.03.03.

Thank you for your attention!

Contacts:

Dr. Johanna Sájevicsné Sági sapi.johanna@nik.uni-obuda.hu
Óbuda University,
Research and Innovation Center of Óbuda University,
Physiological Controls Group



Prof. Dr. Levente Kovács kovacs.levente@nik.uni-obuda.hu
Óbuda University,
Research and Innovation Center of Óbuda University,
Physiological Controls Group

