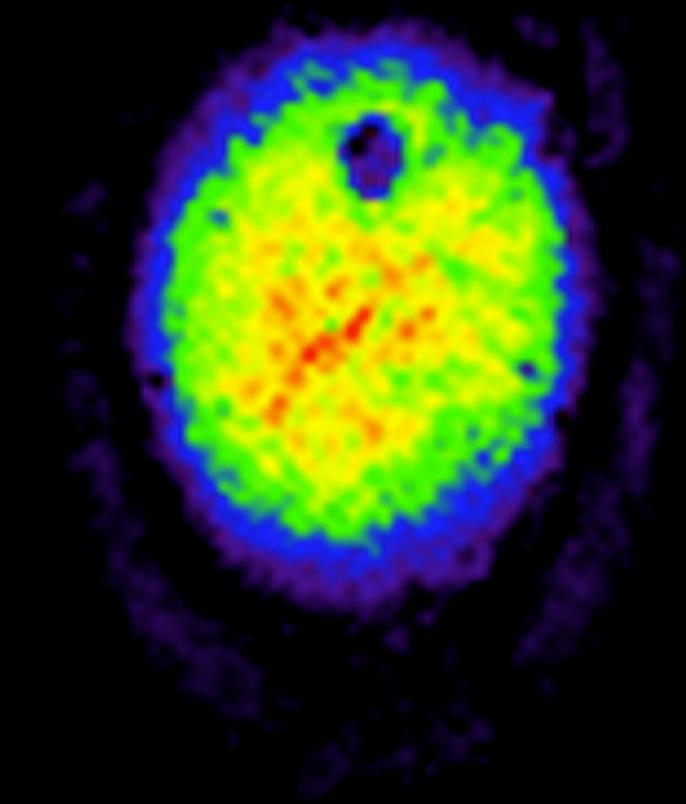


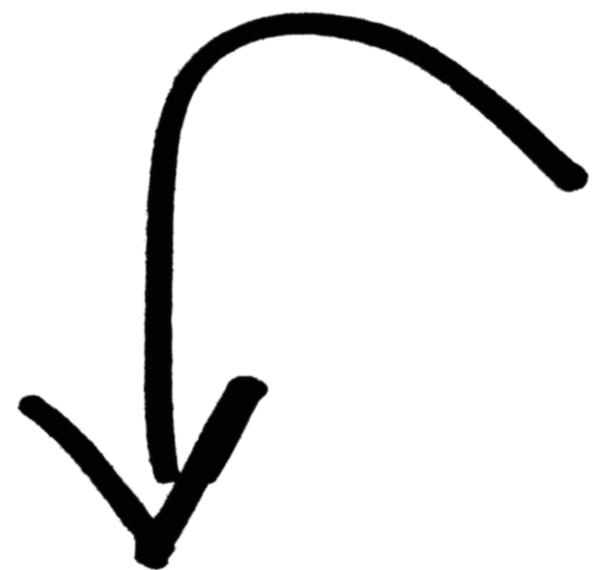
Biomarcadores avanzados de imagen en tumores cerebrales



Víctor M. Pérez-García



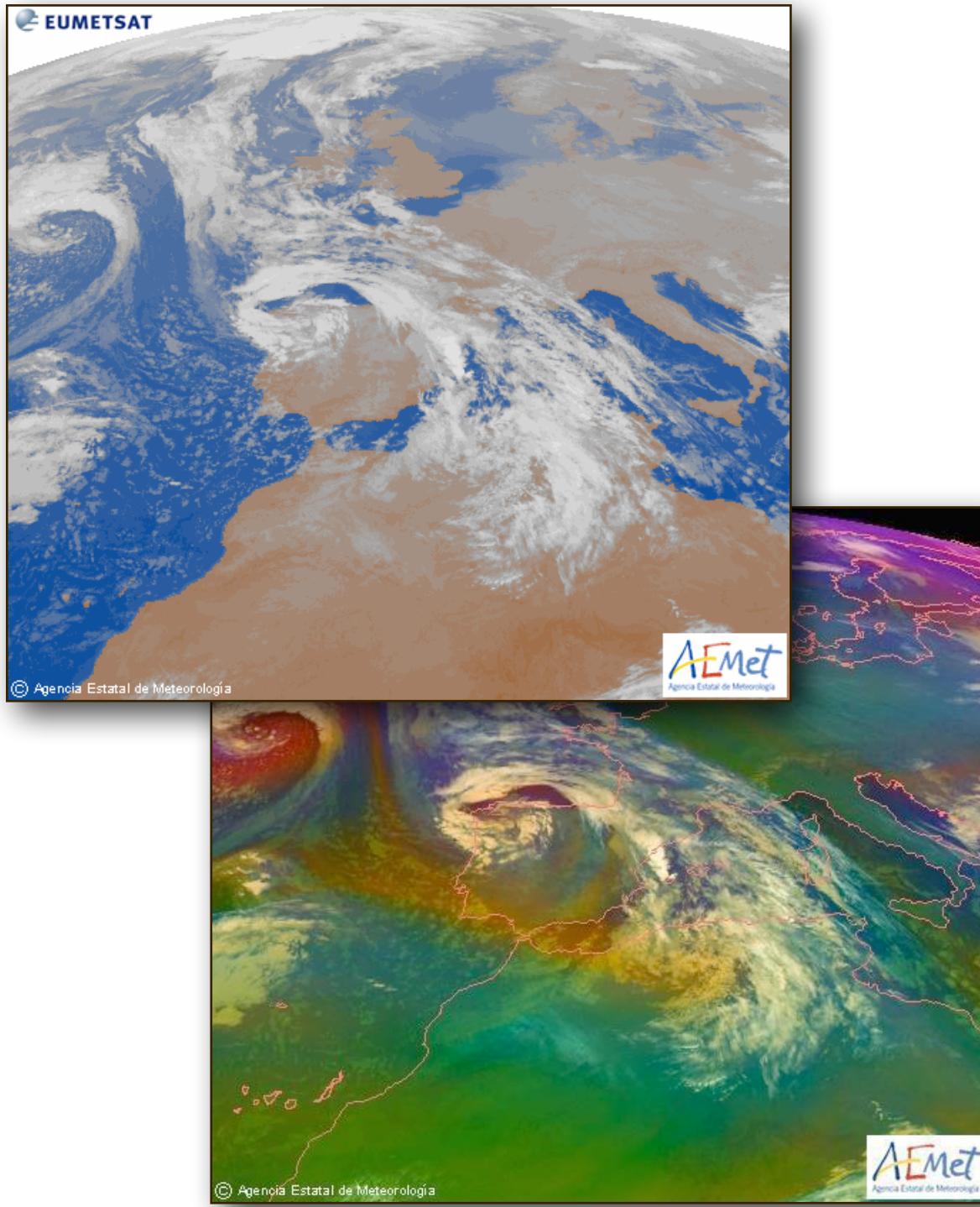
¿Cómo encontrar biomarcadores
con matemáticas?



**Modelos
matemáticos
'mecanísticos'**



**Radiómica
Inteligencia
artificial**



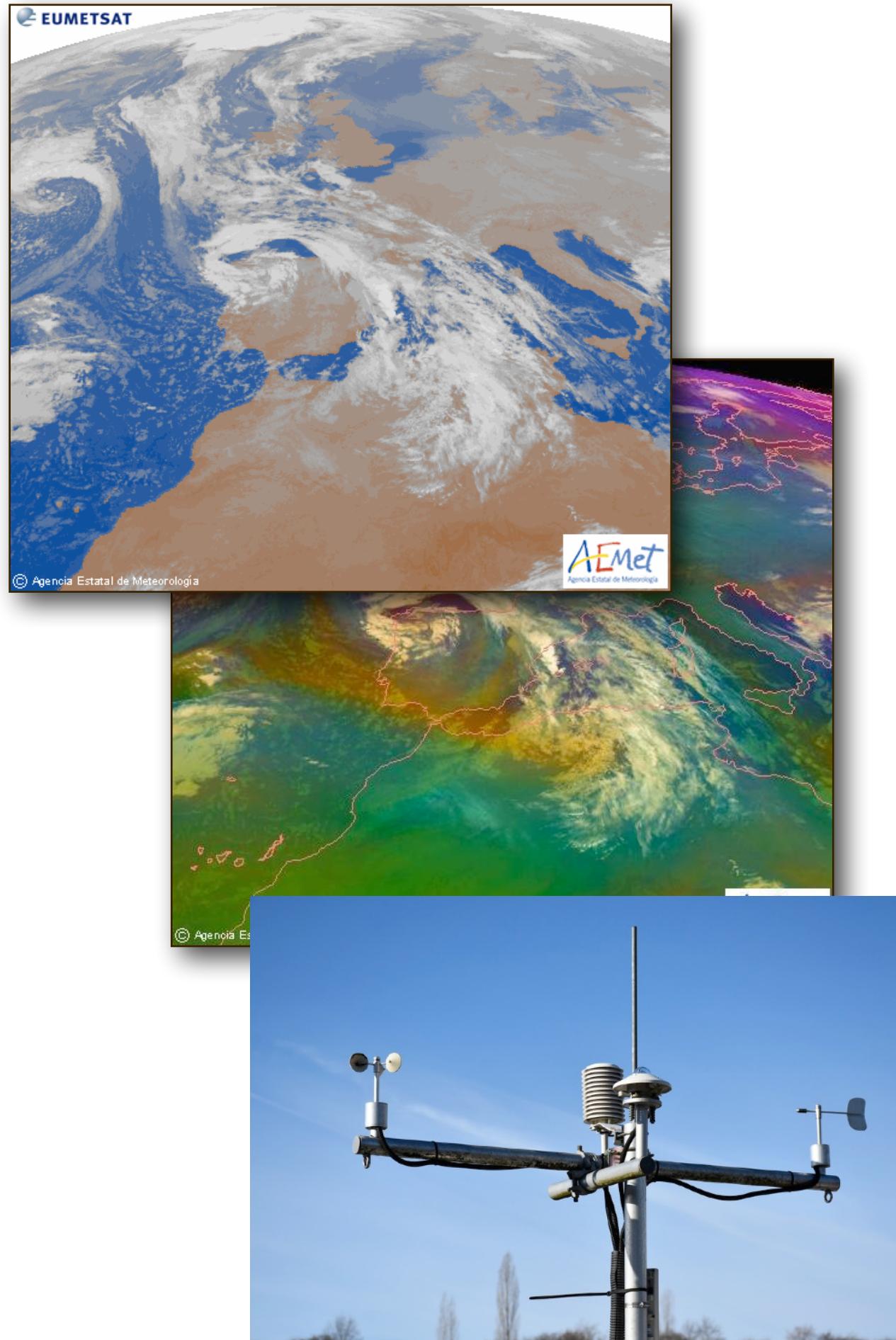
sáb. 26/10		22º / 12º	Mucho sol y agradable	Precip. 0 %
dom. 27/10		20º / 15º	Intervalos de nubes y sol	Precip. 2 %
lun. 28/10		21º / 14º	Parcialmente soleado	Precip. 14 %
mar. 29/10		20º / 14º	Nubosidad variable	Precip. 40 %
mié. 30/10		17º / 12º	Intervalos de nubes y sol	Precip. 3 %
jue. 31/10		15º / 12º	Algo de lluvia más tarde	Precip. 69 %
vie. 1/11		20º / 13º	Algo de lluvia; más cálido	Precip. 57 %
sáb. 2/11		18º / 13º	Algo de lluvia más tarde	Precip. 64 %
dom. 3/11		17º / 11º	Algunos chubascos en la tarde	Precip. 69 %

$$\bigg(\frac{d_H}{dt}+D\bigg)\frac{\partial p}{\partial \eta}+\frac{\partial}{\partial \eta}\bigg(\dot{\eta}\frac{\partial p}{\partial \eta}\bigg)=0$$

$$\frac{dT_k}{dt_k}=\left[\frac{\kappa T_v}{1+(\delta-1)q}\right]_k\left(\frac{\omega}{p}\right)_k+(P_T+K_T)_k,$$

$$\begin{aligned}\frac{\partial ln p_s}{\partial t}&=-\frac{1}{p_s}\sum_{j=1}^N\nabla_H.\{(\mathbf{v}_H)_j\Delta p_j\}\\ \frac{d\mathbf{v}_k}{dt_k}&=[-f\mathbf{k}\times\mathbf{v}-\nabla\Phi-R_dT_v\nabla ln p]_k+(\mathbf{P_u}+\mathbf{K_u})_k.\end{aligned}$$

$$\begin{aligned}\left(\frac{dq}{dt}\right)_k&=(P_q+K_q)_k\\\left(\frac{dm}{dt}\right)_k&=(P_m+K_m)_k\\ \Phi_k&=\Phi_s+R_d\sum_{j=k+1}^N(T_v\Delta ln p)_j+R_d(\alpha T_v)_k,\end{aligned}$$



$$\left(\frac{d_H}{dt} + D \right) \frac{\partial p}{\partial \eta} + \frac{\partial}{\partial \eta} \left(\dot{\eta} \frac{\partial p}{\partial \eta} \right) = 0$$

$$\frac{dT_k}{dt_k} = \left[\frac{\kappa T_v}{1 + (\delta - 1)q} \right]_k \left(\frac{\omega}{p} \right)_k + (P_T + K_T)_k,$$

$$\frac{\partial \ln p_s}{\partial t} = -\frac{1}{p_s} \sum_{j=1}^N \nabla_{H_j} \cdot \{(\mathbf{v}_H)_j \Delta p_j\}$$

$$\frac{d\mathbf{v}_k}{dt_k} = [-f\mathbf{k} \times \mathbf{v} - \nabla \Phi - R_d T_v \nabla \ln p]_k + (\mathbf{P}_u + \mathbf{K}_u)_k.$$

$$\left(\frac{dq}{dt} \right)_k = (P_q + K_q)_k$$

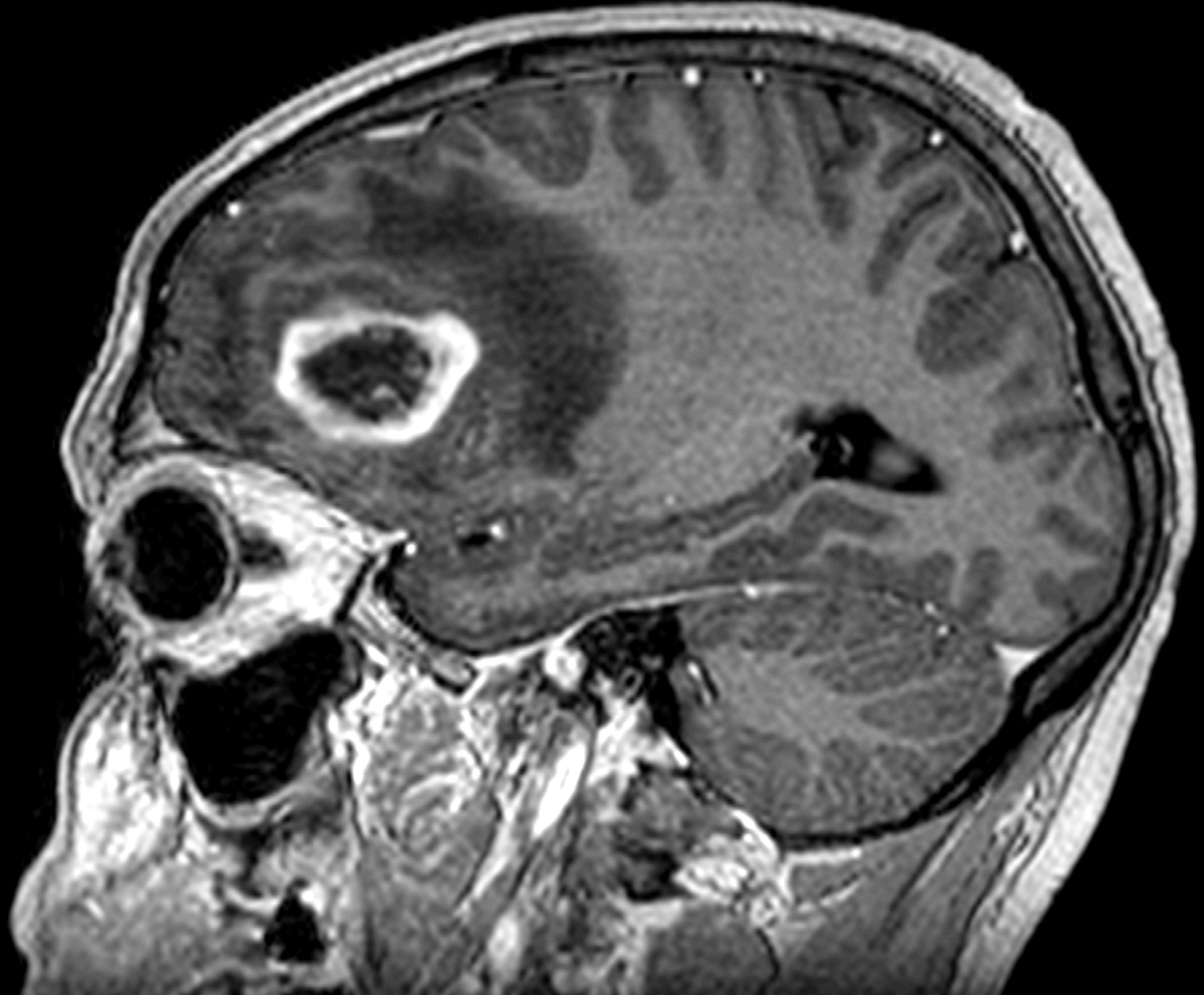
$$\left(\frac{dm}{dt} \right)_k = (P_m + K_m)_k$$

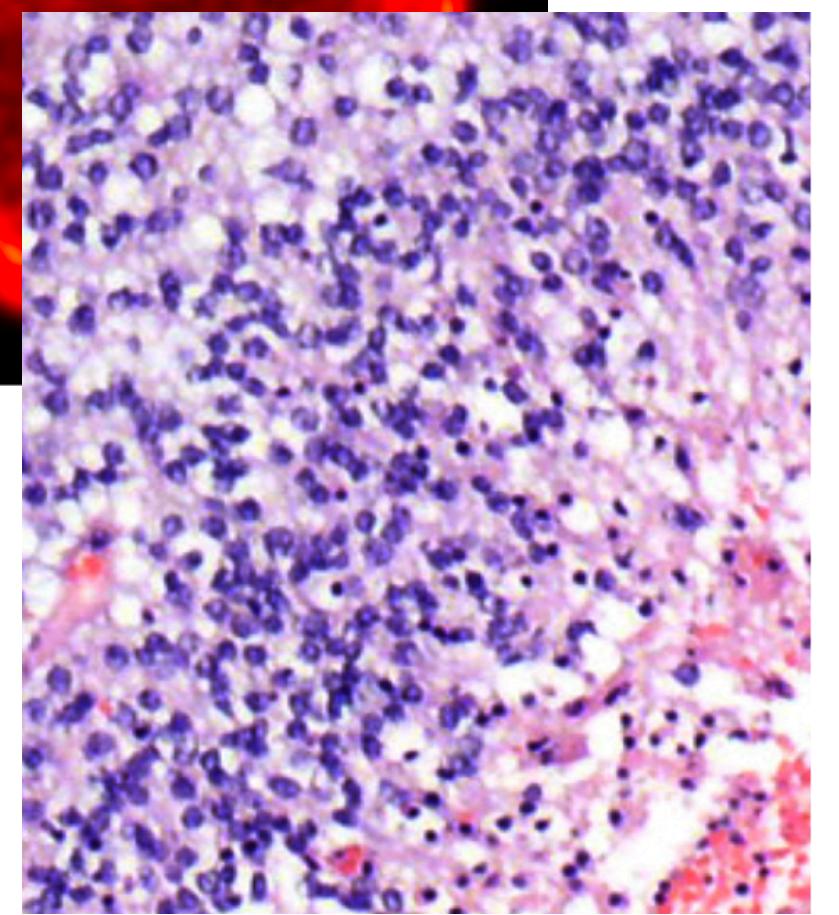
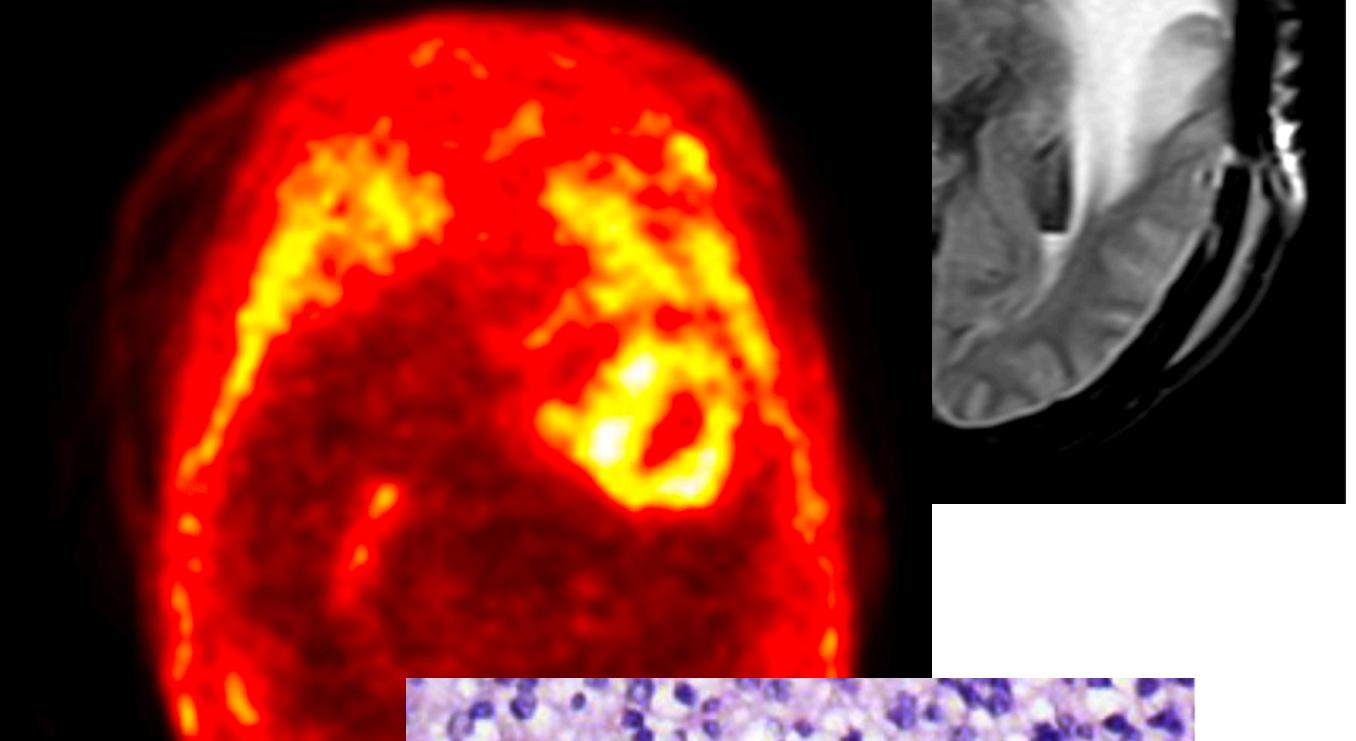
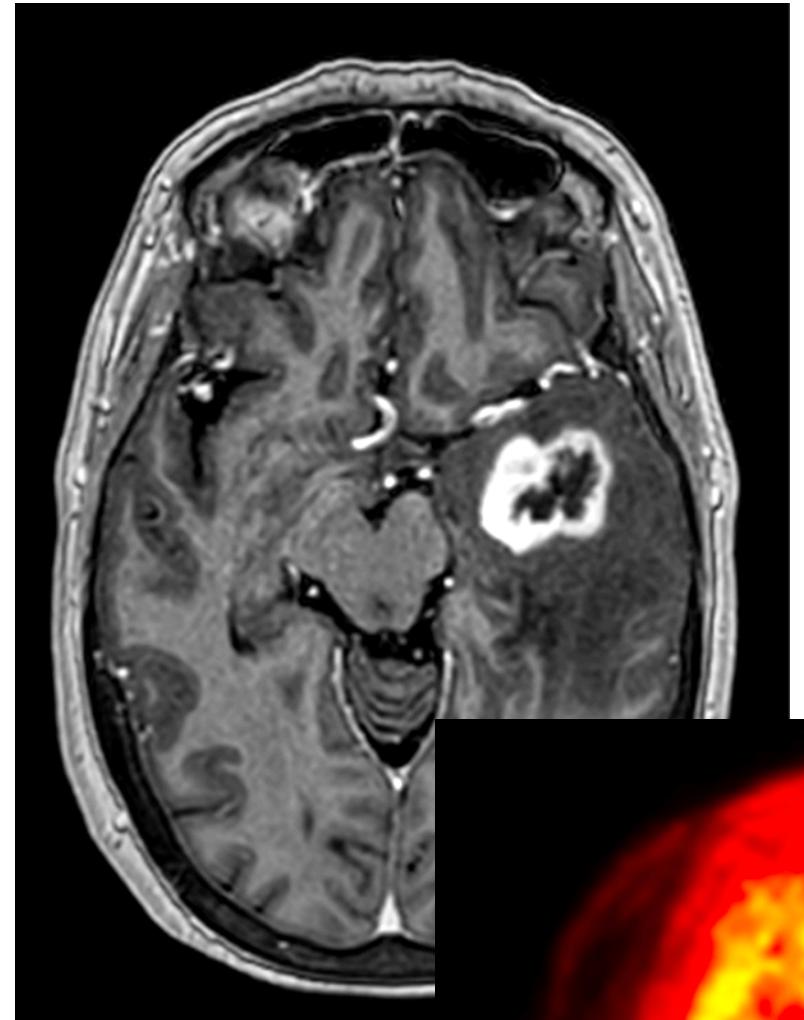
$$\Phi_k = \Phi_s + R_d \sum_{j=k+1}^N (T_v \Delta \ln p)_j + R_d (\alpha T_v)_k,$$

sáb. 26/10		22° / 12°	Mucho sol y agradable	Precip. 0 %
dom. 27/10		20° / 15°	Intervalos de nubes y sol	Precip. 2 %
lun. 28/10		21° / 14°	Parcialmente soleado	Precip. 14 %
mar. 29/10		20° / 14°	Nubosidad variable	Precip. 40 %
mié. 30/10		17° / 12°	Intervalos de nubes y sol	Precip. 3 %
jue. 31/10		15° / 12°	Algo de lluvia más tarde	Precip. 69 %
vie. 1/11		20° / 13°	Algo de lluvia; más cálido	Precip. 57 %
sáb. 2/11		18° / 13°	Algo de lluvia más tarde	Precip. 64 %
dom. 3/11		17° / 11°	Algunos chubascos en la tarde	Precip. 69 %

Glioblastoma

Tumor cerebral primario
más frecuente y maligno

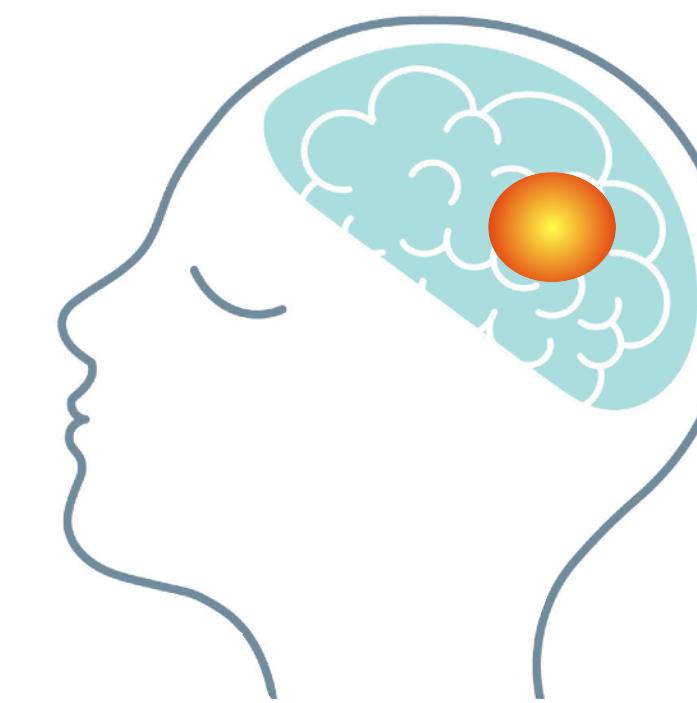




Pronóstico
Predicción
Personalización



OCT
26



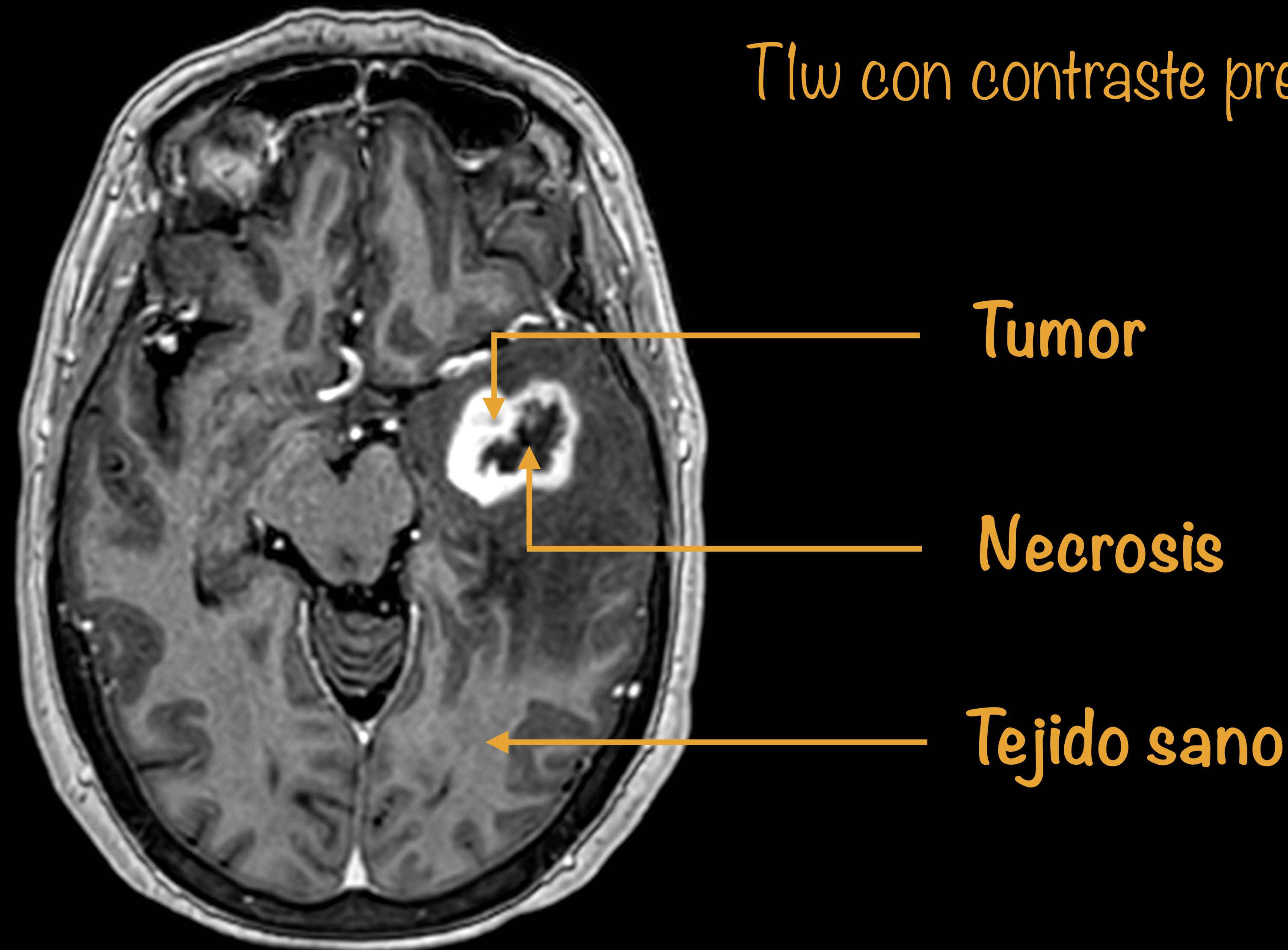
NOV
26



DIC
26

Estudio(s) retrospectivo(s) con 1400 pacientes (500 útiles)



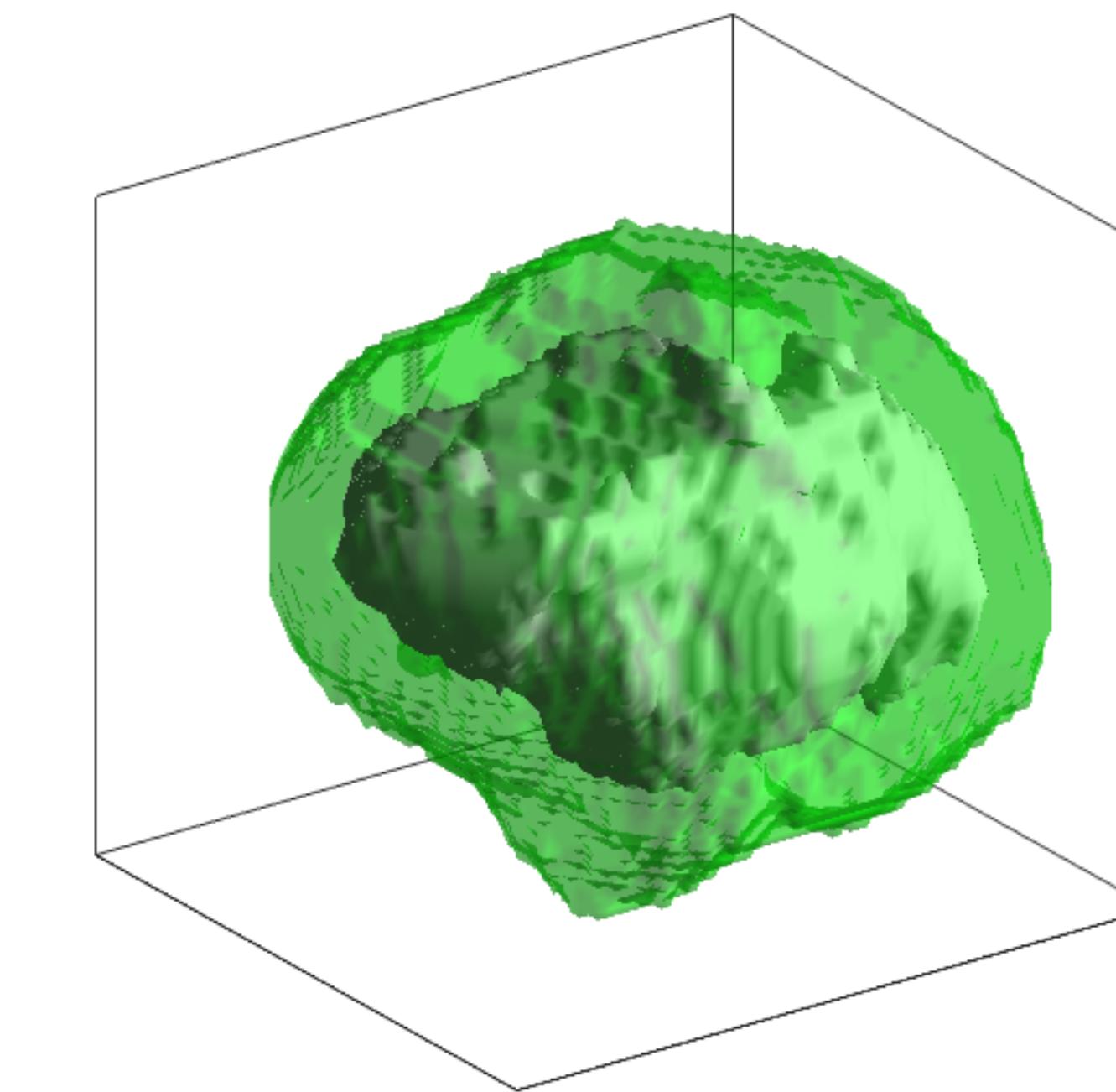
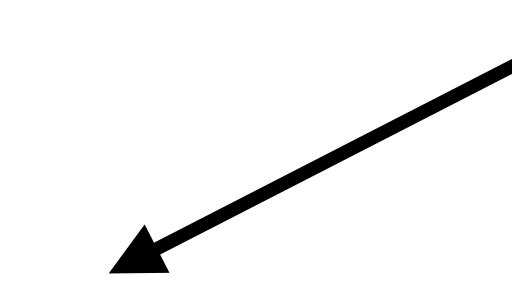
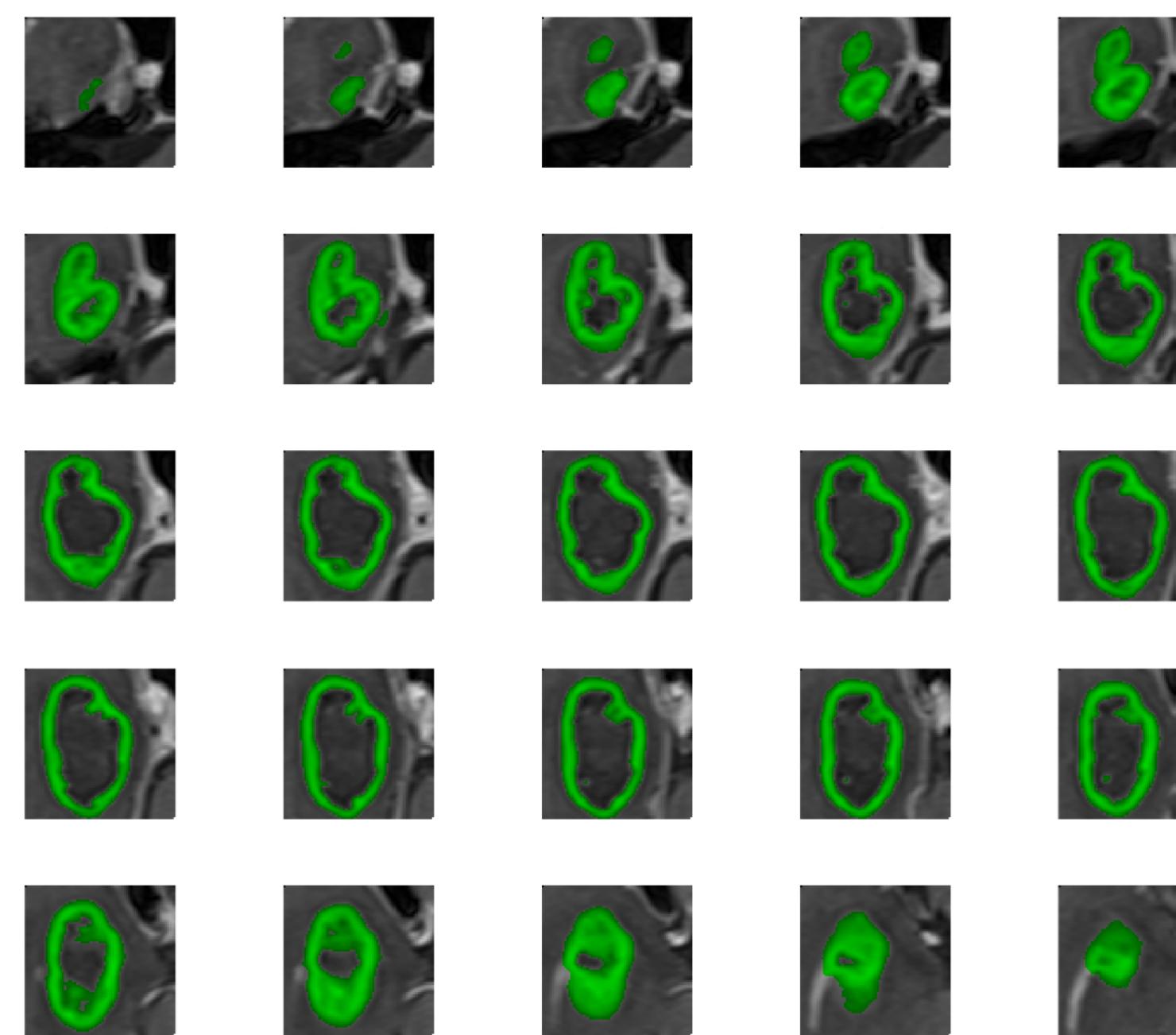
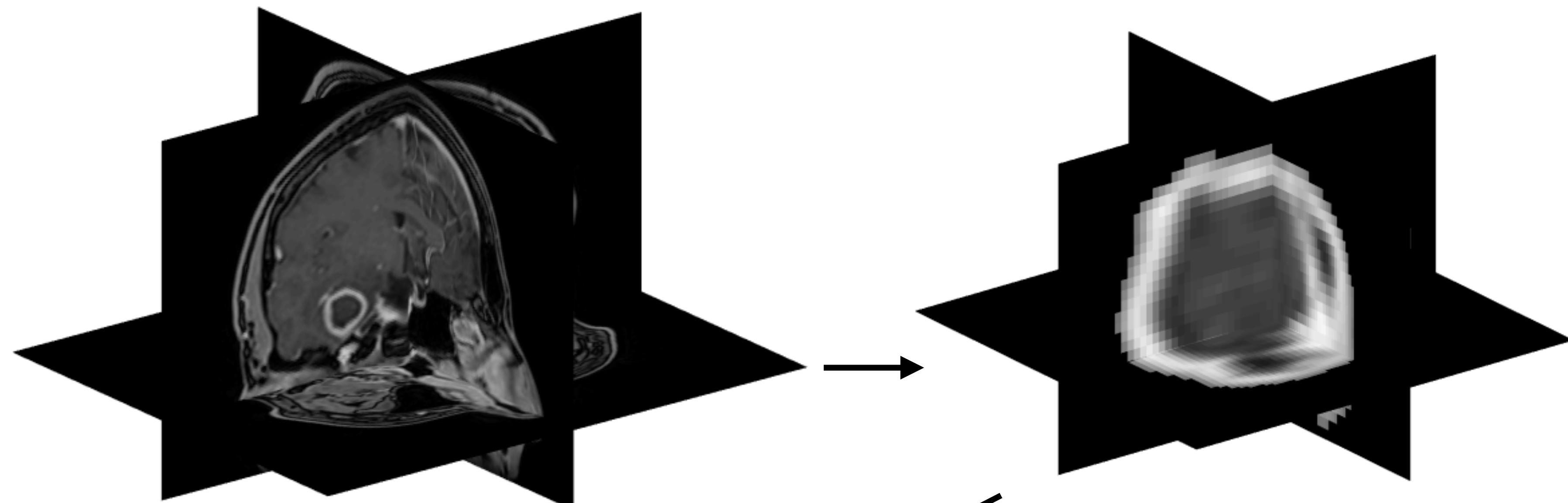


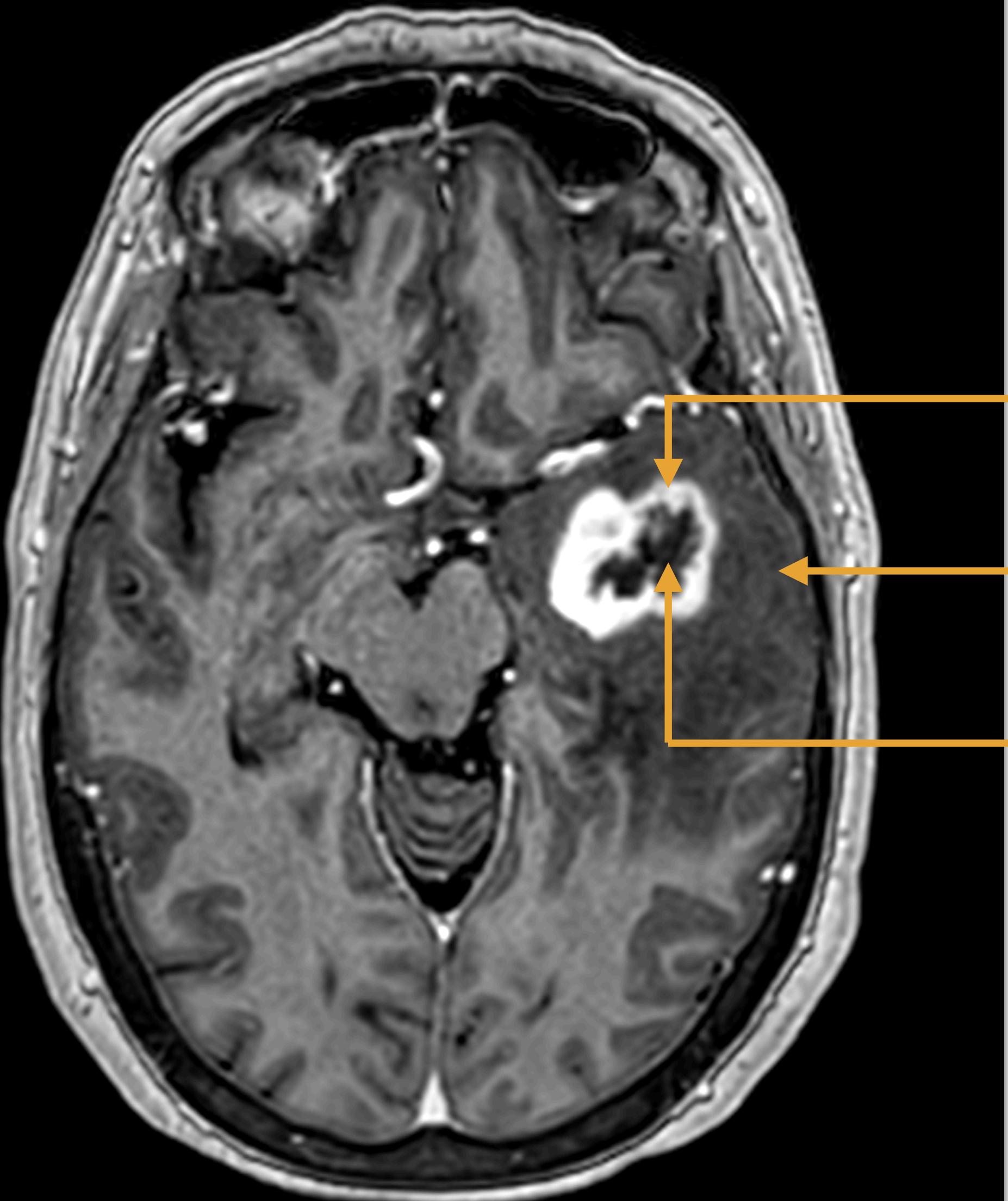
T1w con contraste pretratamiento

Tumor

Necrosis

Tejido sano

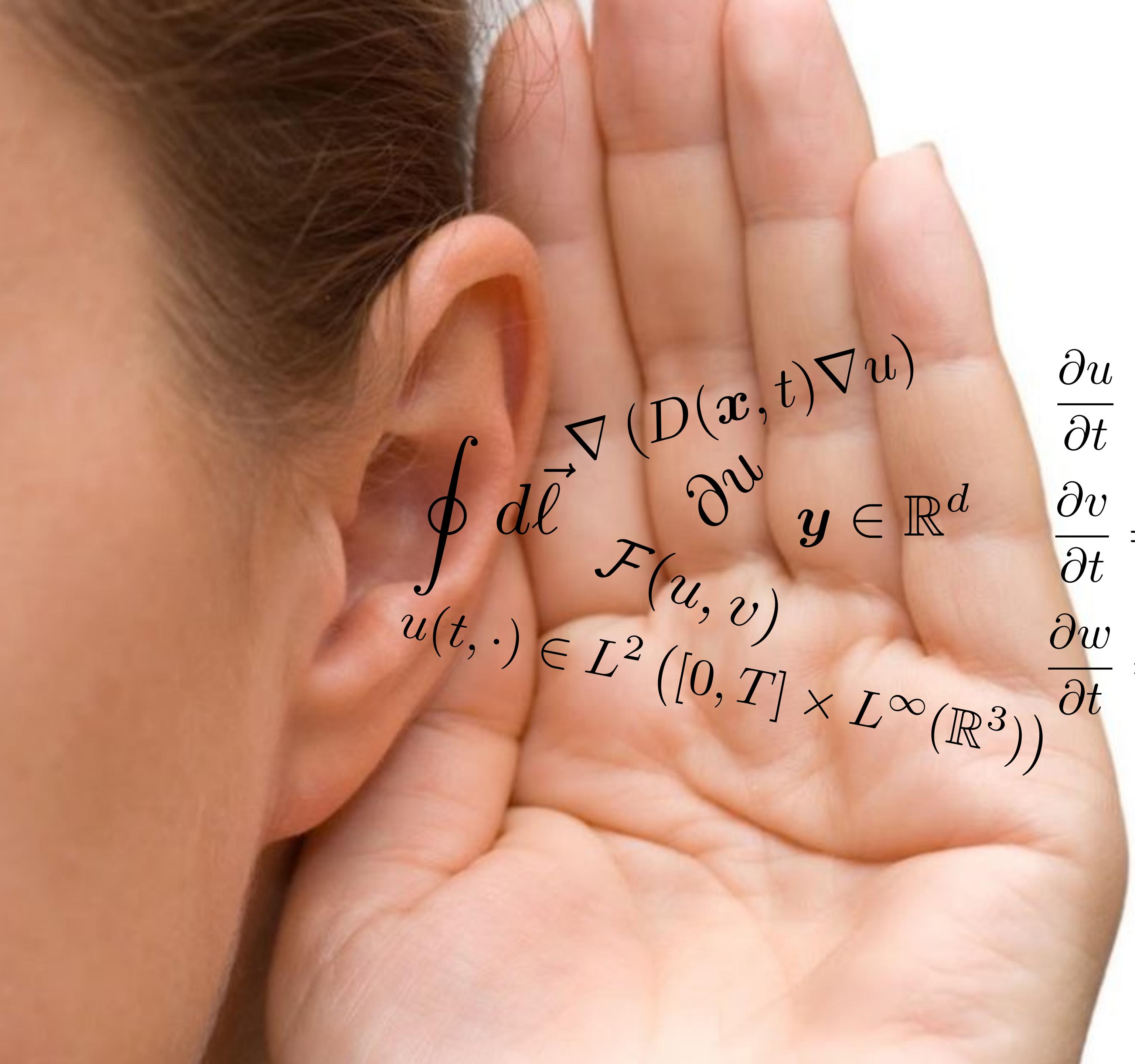




$$\frac{\partial u}{\partial t} = D \Delta u - \alpha u + \rho(u_* - u - v - w)u$$

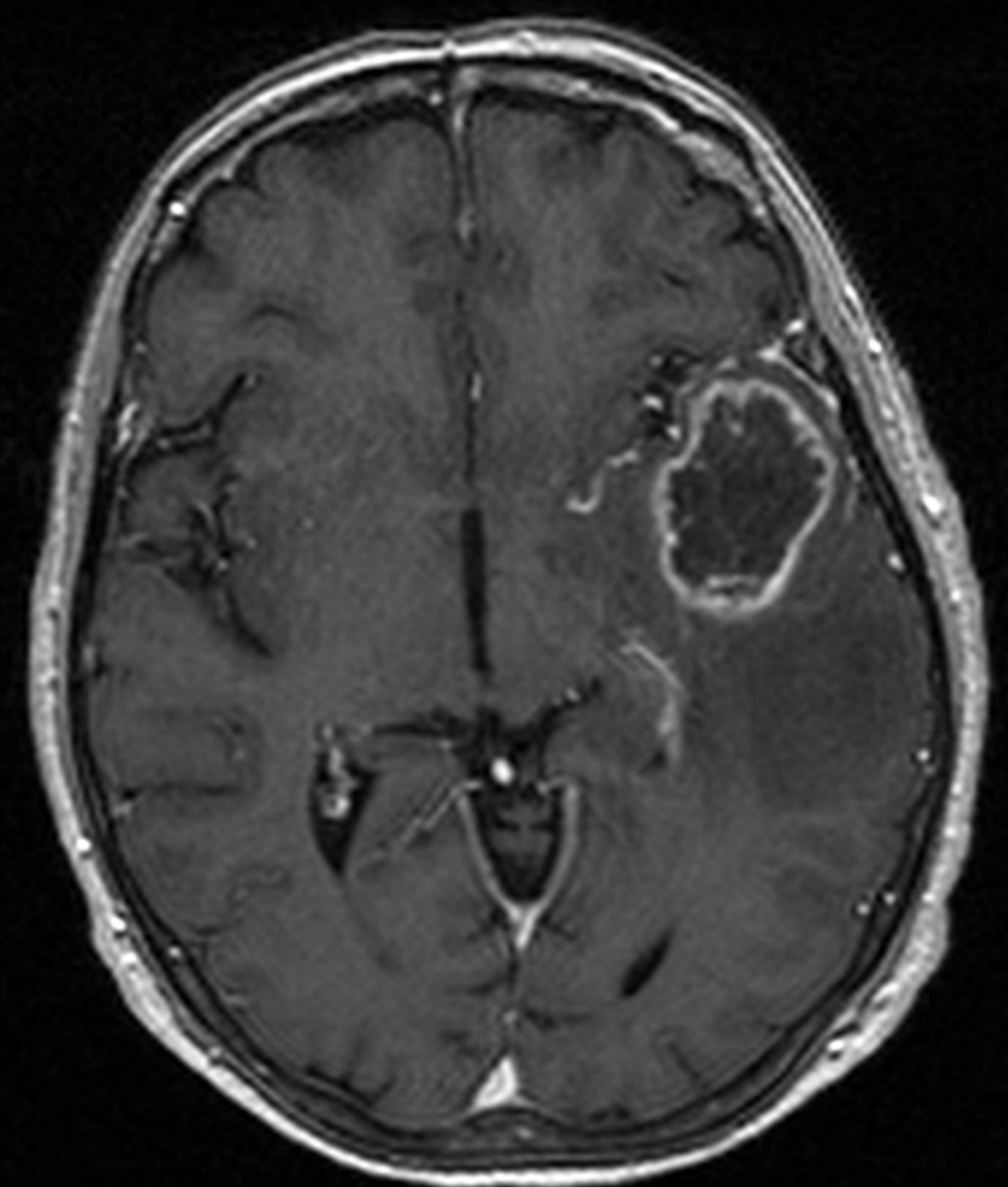
$$\frac{\partial v}{\partial t} = -\mathcal{F}(u, v)$$

$$\frac{\partial w}{\partial t} = \alpha u + \mathcal{F}(u, v)$$



$$\frac{\partial u}{\partial t} = D\Delta u - \alpha u + \rho(u_* - u - v - w)u$$
$$\frac{\partial v}{\partial t} = -\mathcal{F}(u, v)$$
$$\frac{\partial w}{\partial t} = \alpha u + \mathcal{F}(u, v)$$

Hipótesis basada en el modelo matemático



Estrecho
‘Lento’



Ancho
‘Rápido’



Morphological MRI-based features provide pretreatment survival prediction in glioblastoma

Julián Pérez-Beteta¹ · David Molina-García¹ · Alicia Martínez-González¹ · Araceli Henares-Molina¹ · Mariano Amo-Salas¹ · Belén Luque¹ · Elena Arregui² · Manuel Calvo² · José M. Borrás³ · Juan Martino⁴ · Carlos Velásquez⁴ · Bárbara Meléndez-Asensio⁵ · Ángel Rodríguez de Lope⁶ · Raquel Moreno⁷ · Juan A. Barcia⁸ · Beatriz Asenjo⁹ · Manuel Benavides¹⁰ · Ismael Herruzo¹¹ · Pedro C. Lara¹² · Raquel Cabrera¹² · David Albillo¹³ · Miguel Navarro¹⁴ · Luis A. Pérez-Romasanta¹⁵ · Antonio Revert¹⁶ · Estanislao Arana¹⁷ · Víctor M. Pérez-García¹

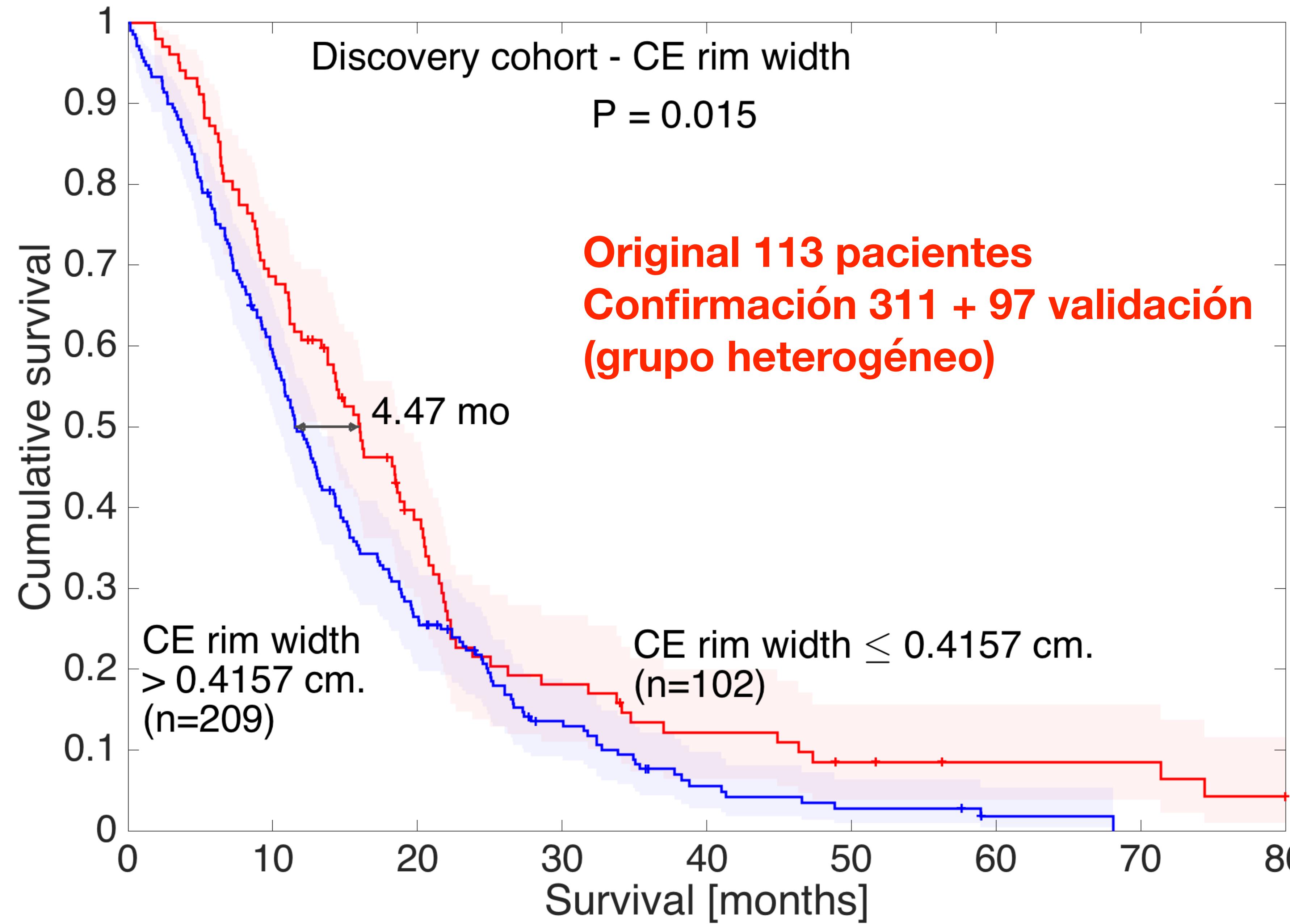
Received: 23 May 2018 / Revised: 19 August 2018 / Accepted: 12 September 2018 / Published online: 15 October 2018

© European Society of Radiology 2018, corrected publication November 2018

Abstract

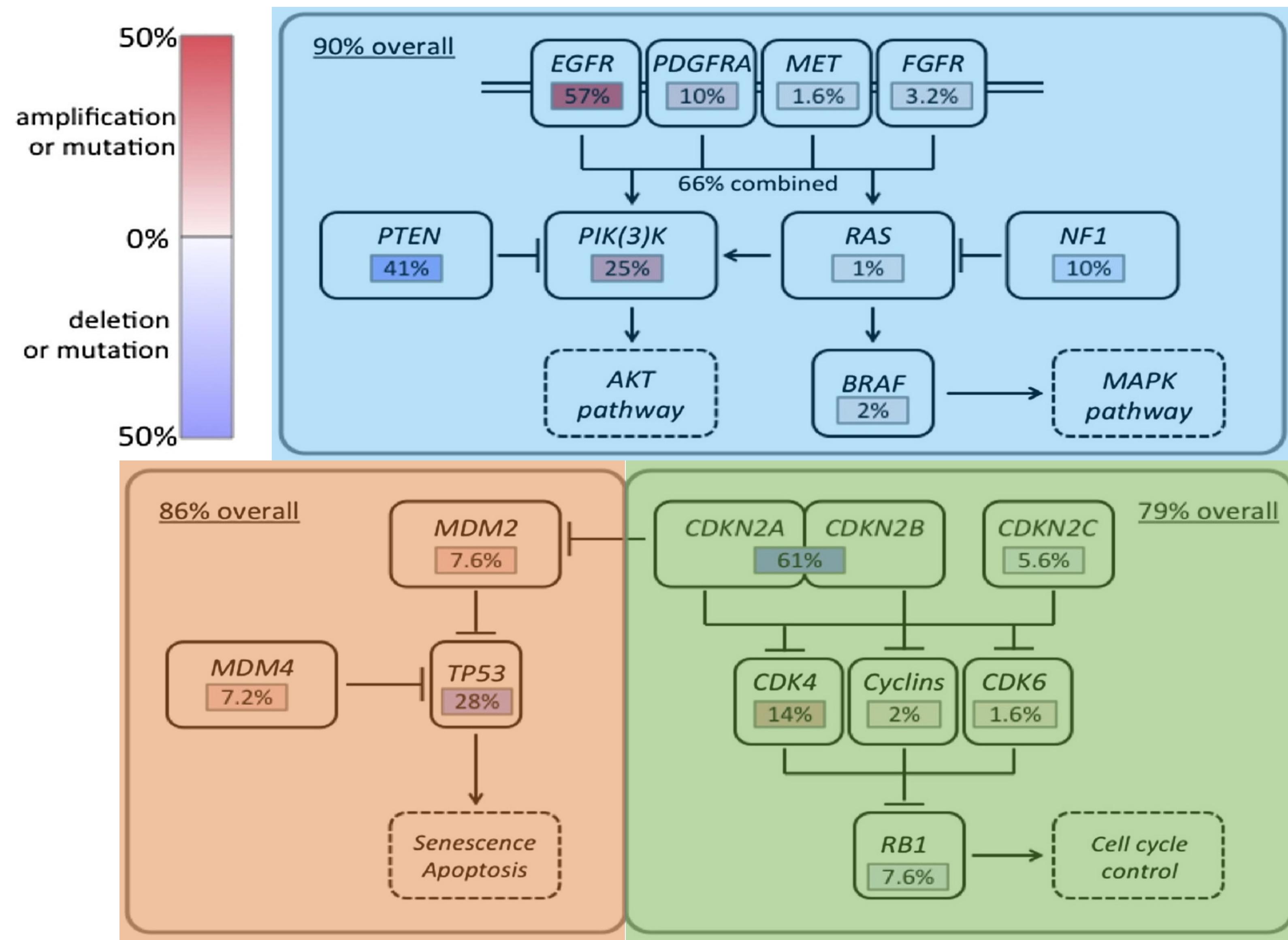
Objectives We wished to determine whether tumor morphology descriptors obtained from pretreatment magnetic resonance images and clinical variables could predict survival for glioblastoma patients.

Methods A cohort of 404 glioblastoma patients (311 discoveries and 93 validations) was used in the study. Pretreatment



El tamaño
sólo importa en los biopsiados

Volumen · Volumen captación · Necrosis · Diámetro · Superficie

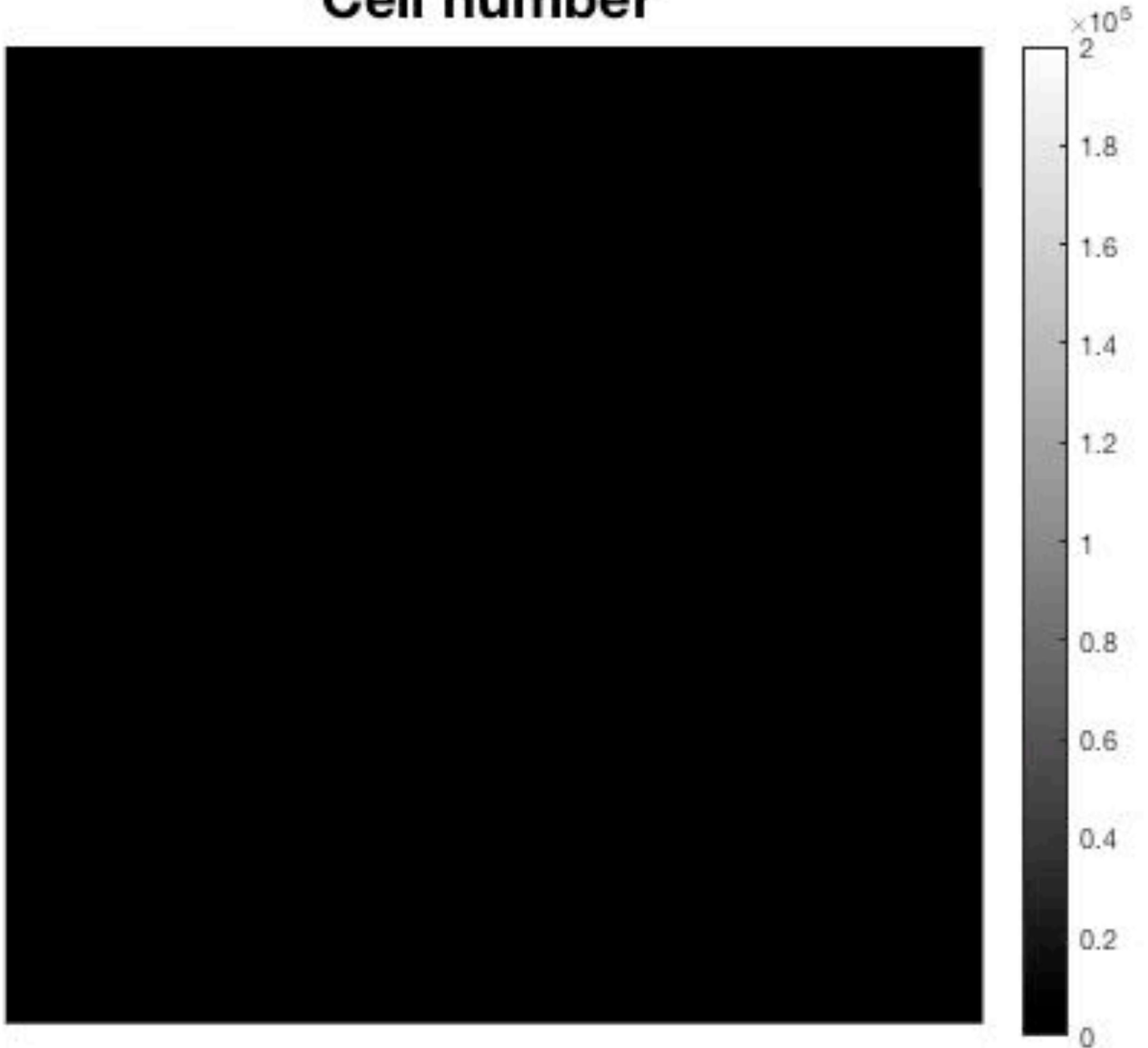


Brennan, C. W. et al. (2013) The somatic genomic landscape of glioblastoma. Cell 155(2), 462–477.



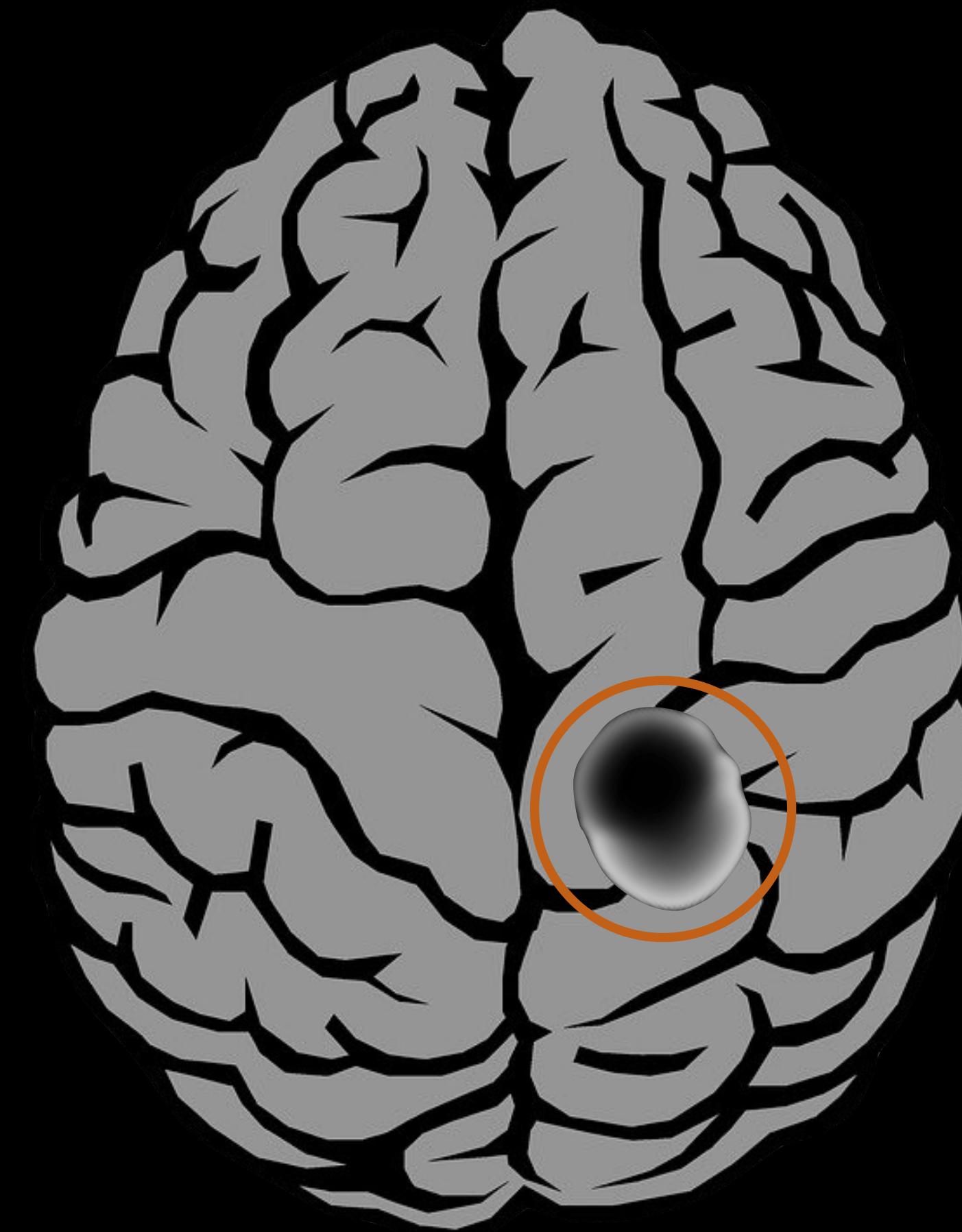
Time = 1 days
Volume = 0.004 cm³

Cell number



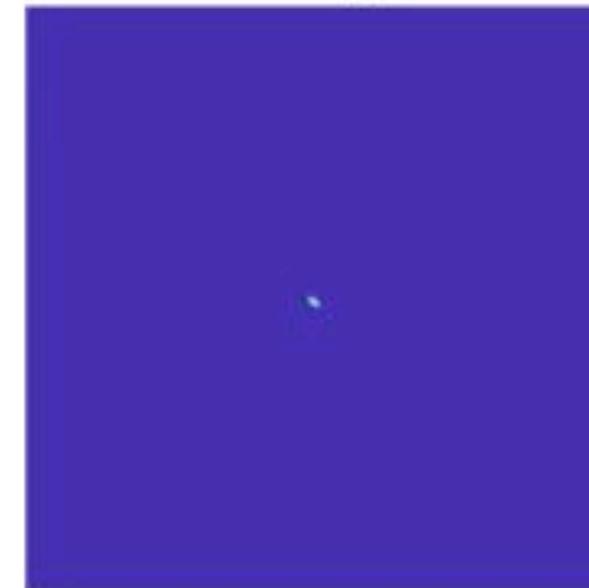


Real tumor

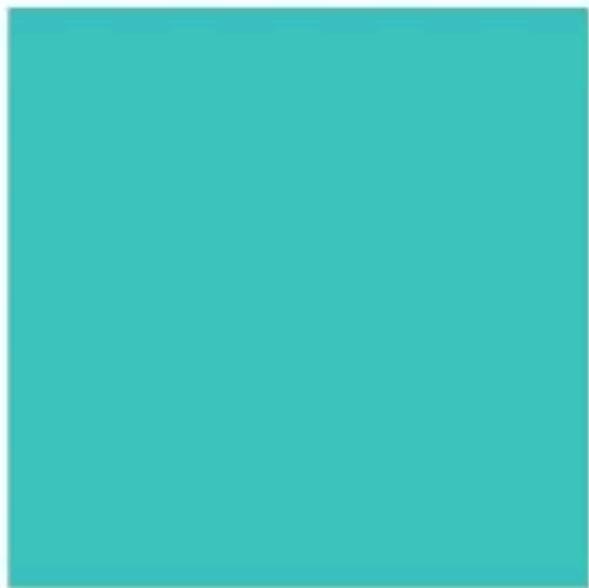


Simulation

Wild-type



P53



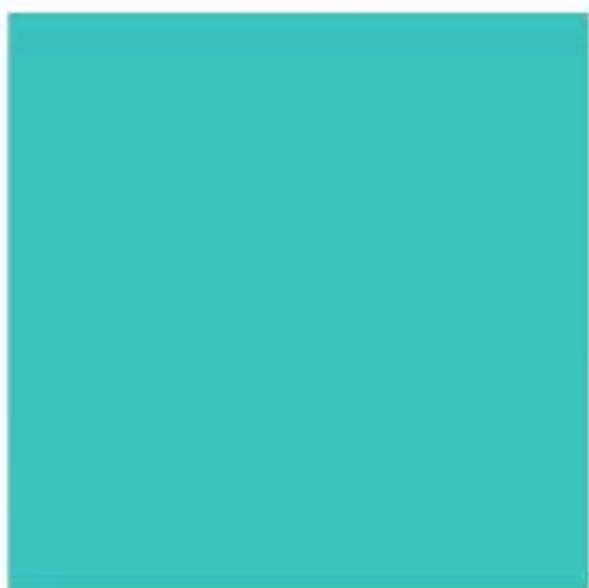
Rb



P53+Rb



RTK



P53+RTK



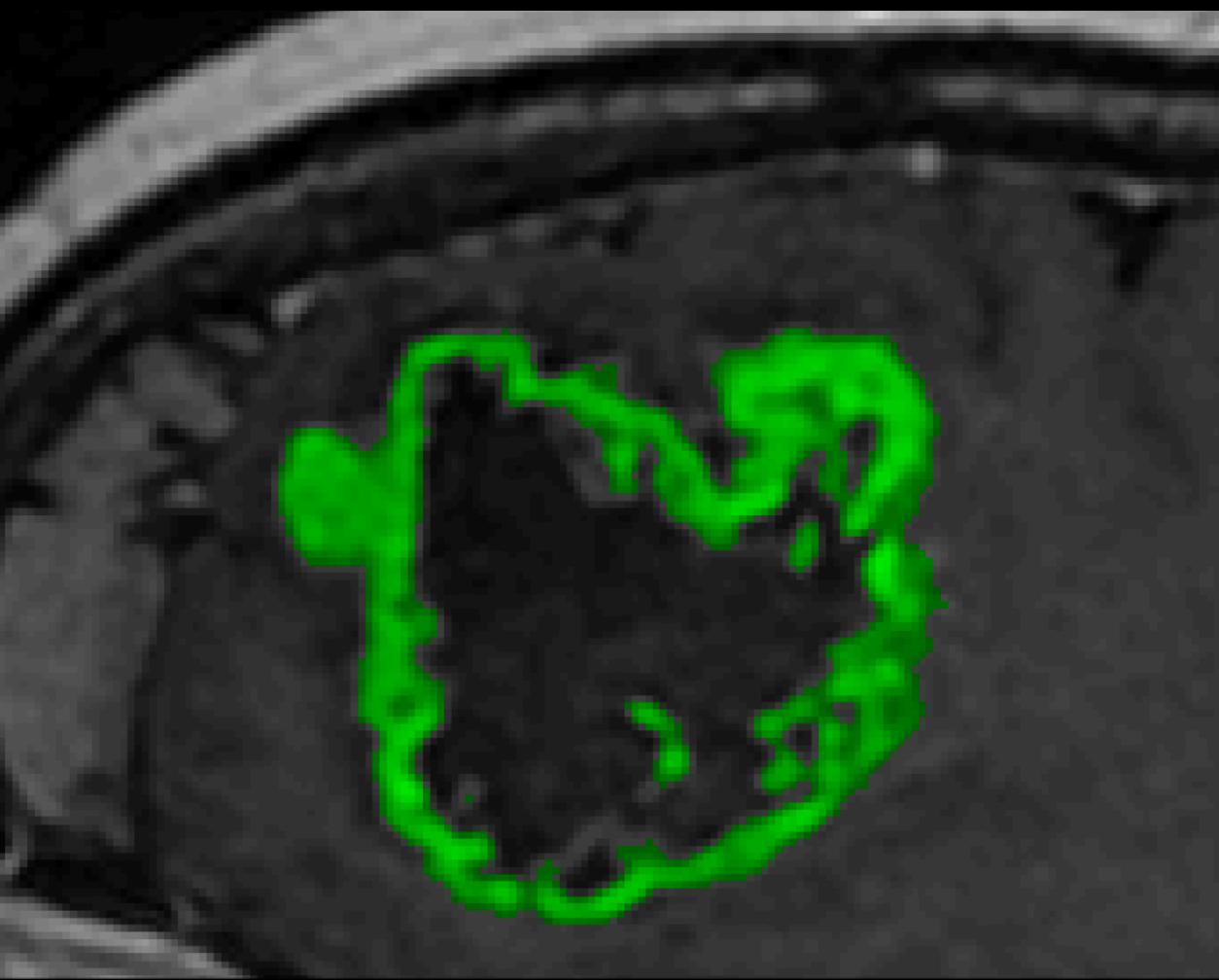
Rb+RTK



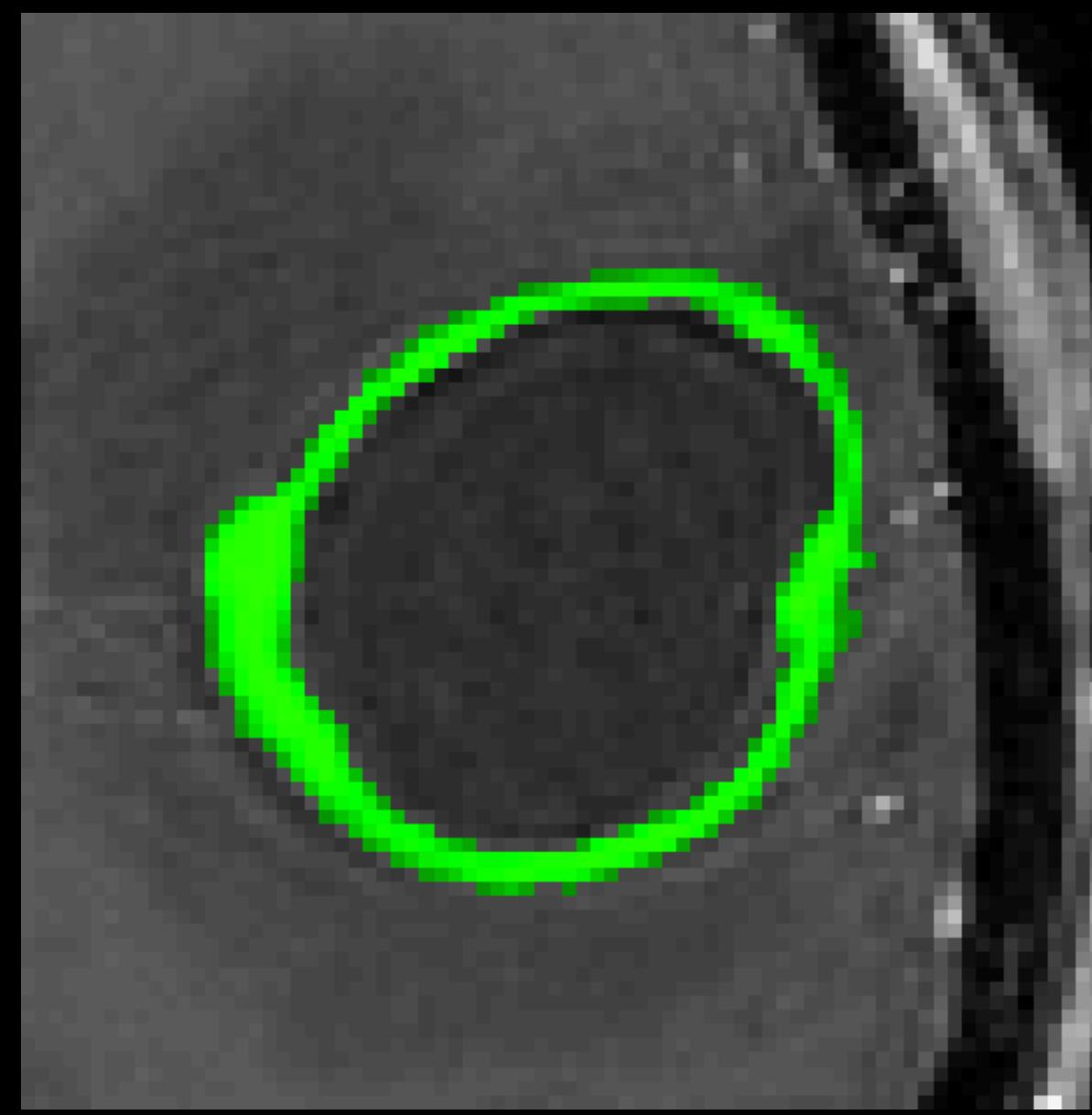
P53+Rb+RTK



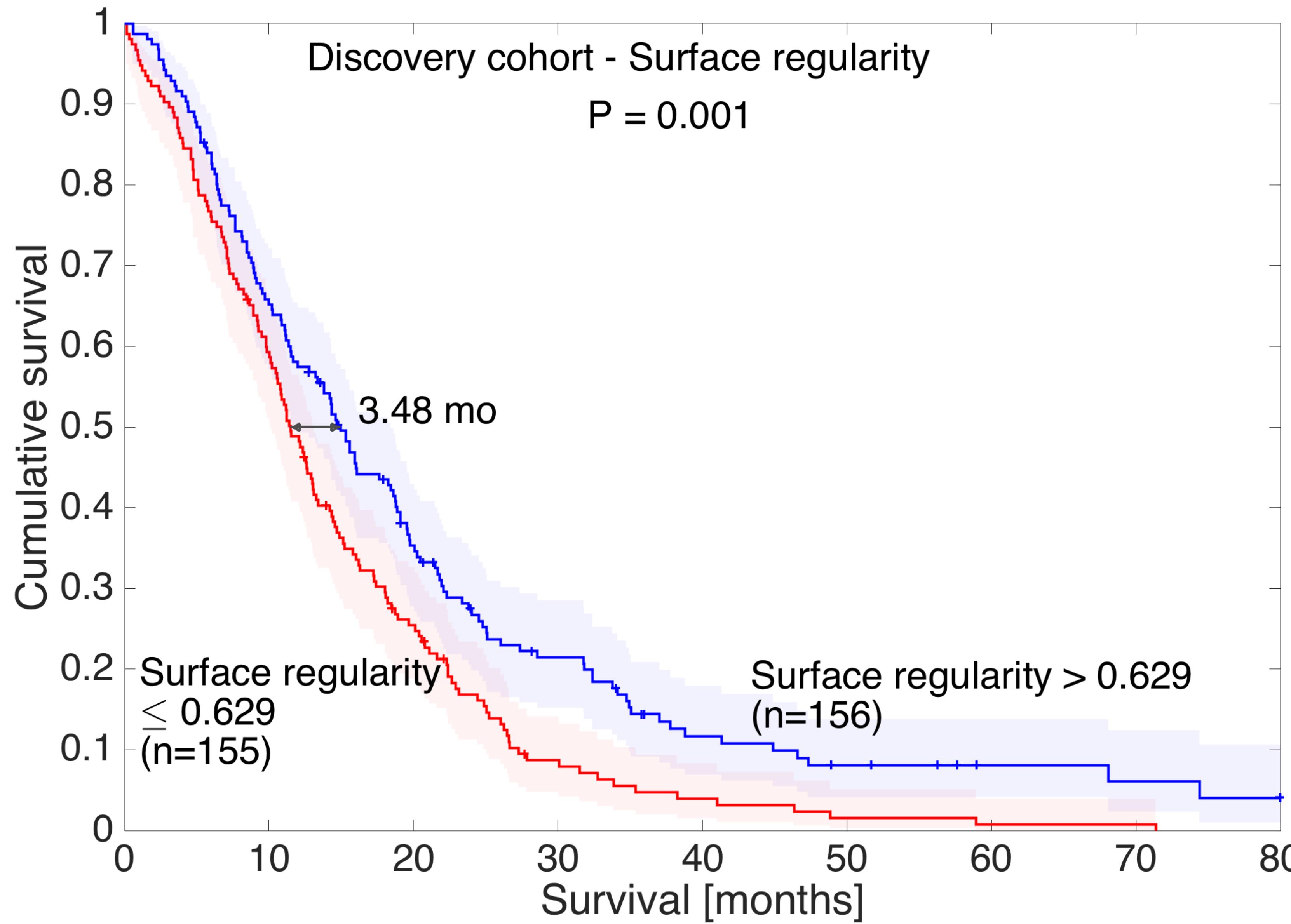
Otra hipótesis basada en modelos matemáticos



Irregular
‘Infiltrativo-Agresivo’



Regular
‘Nodular’



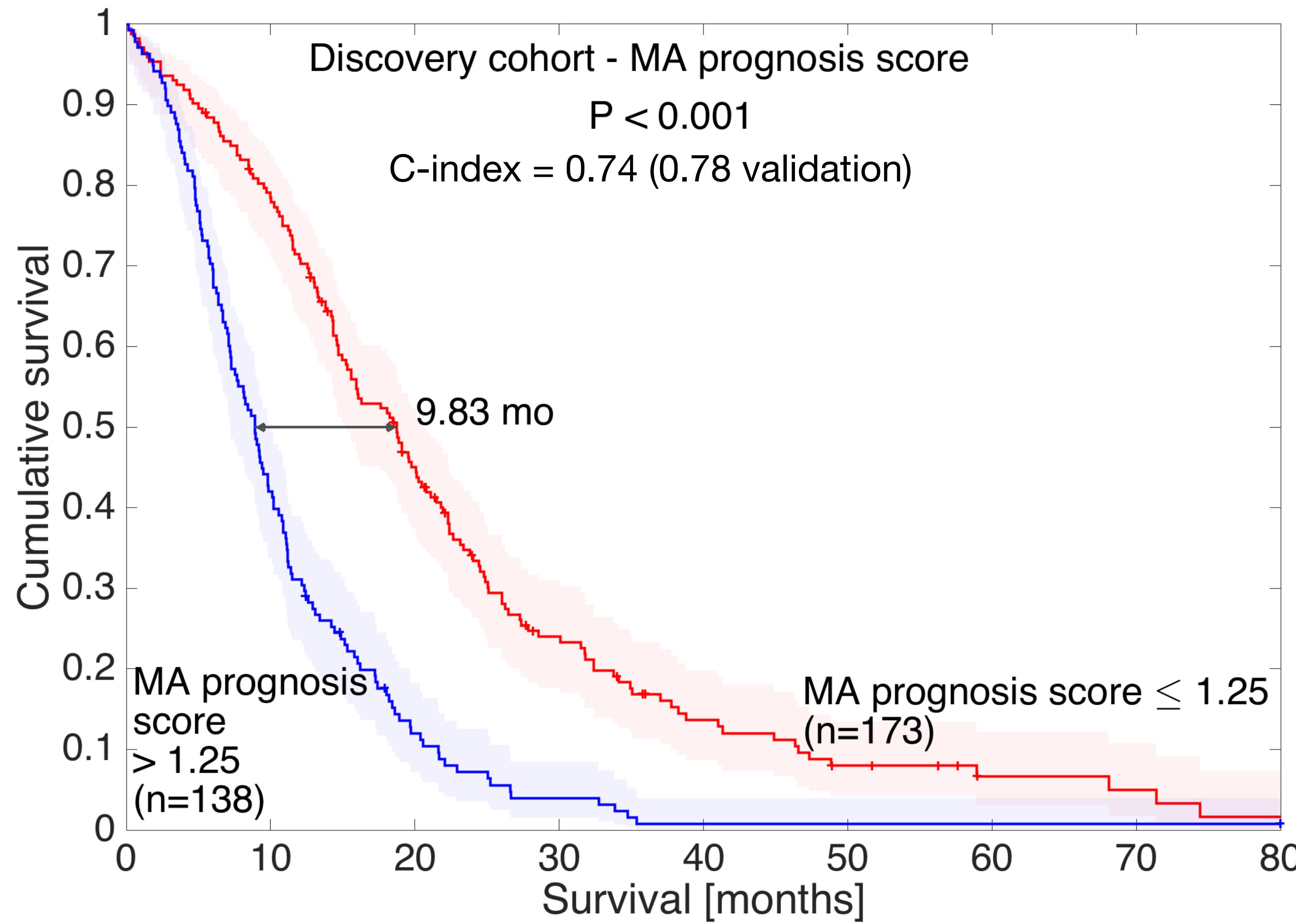
Edad

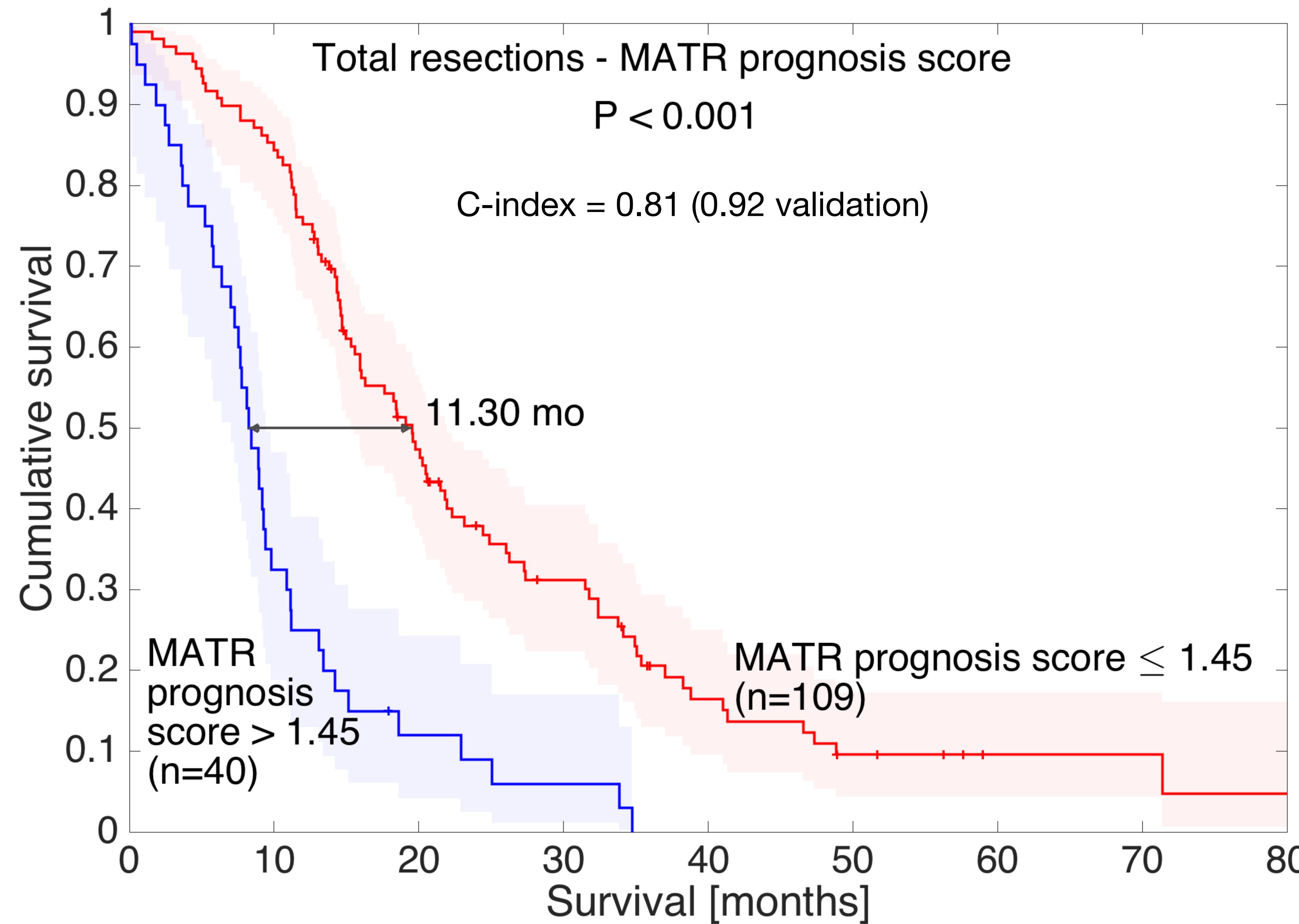


Ahora, ¡todos juntos!

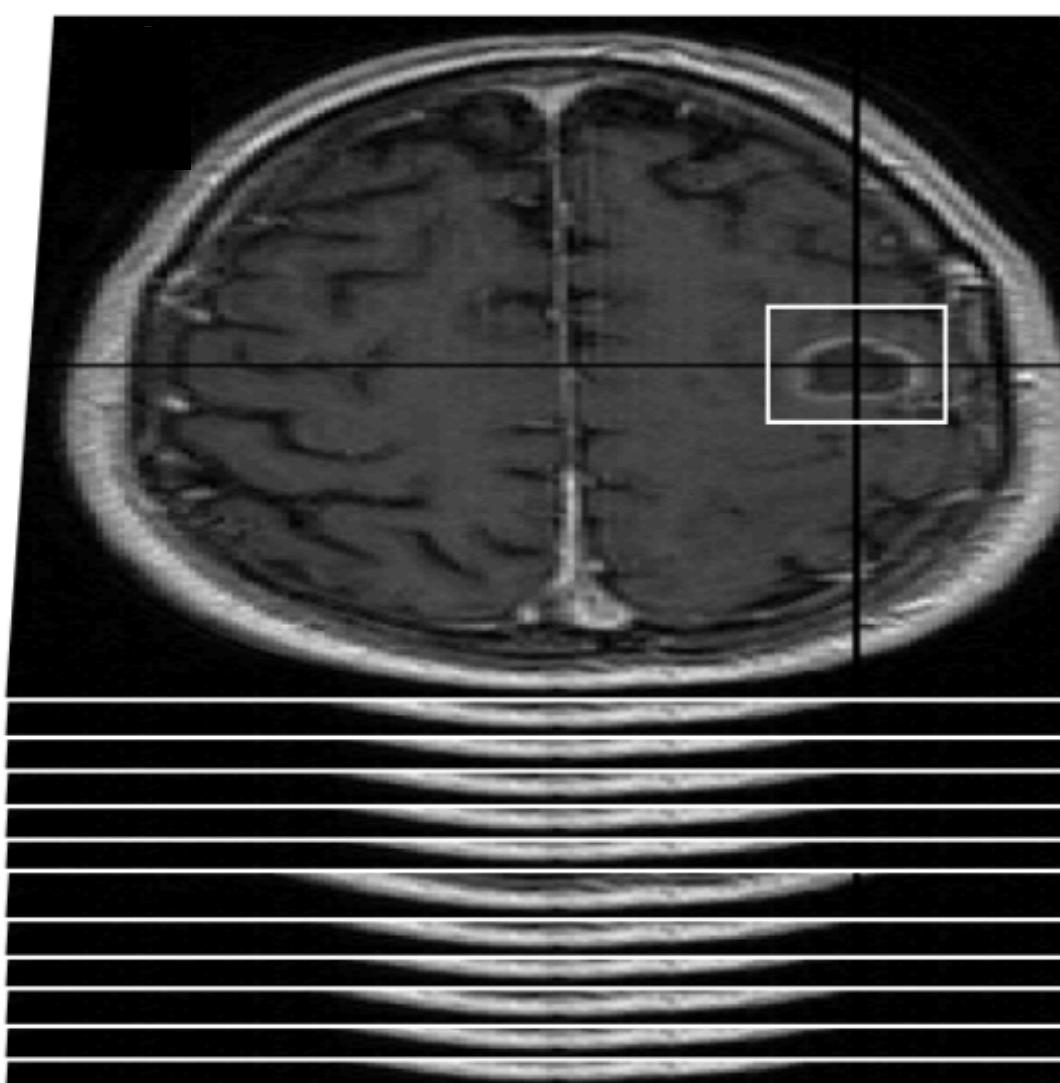
**Anchura
Captación**

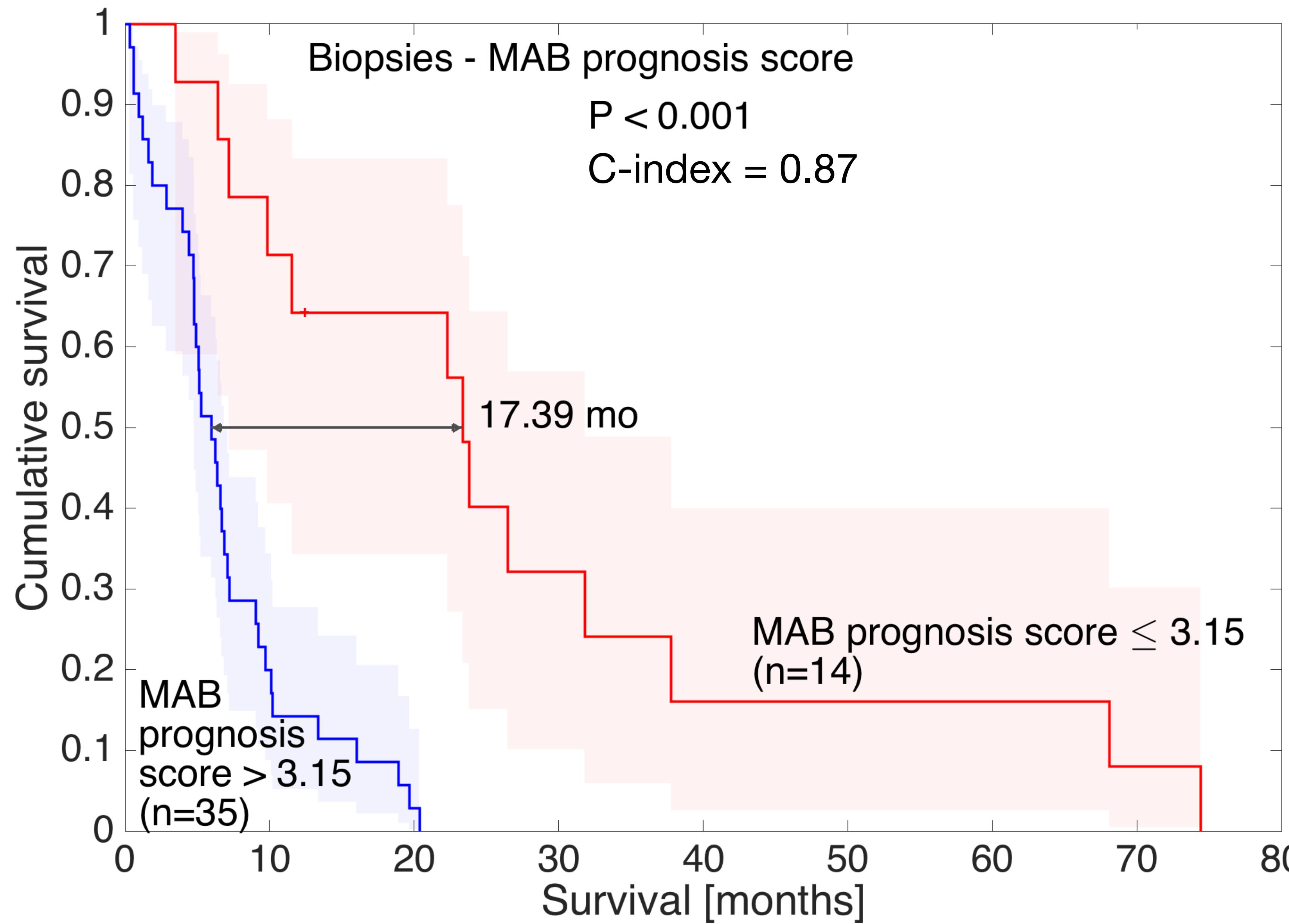
**Regularidad
Superficie**



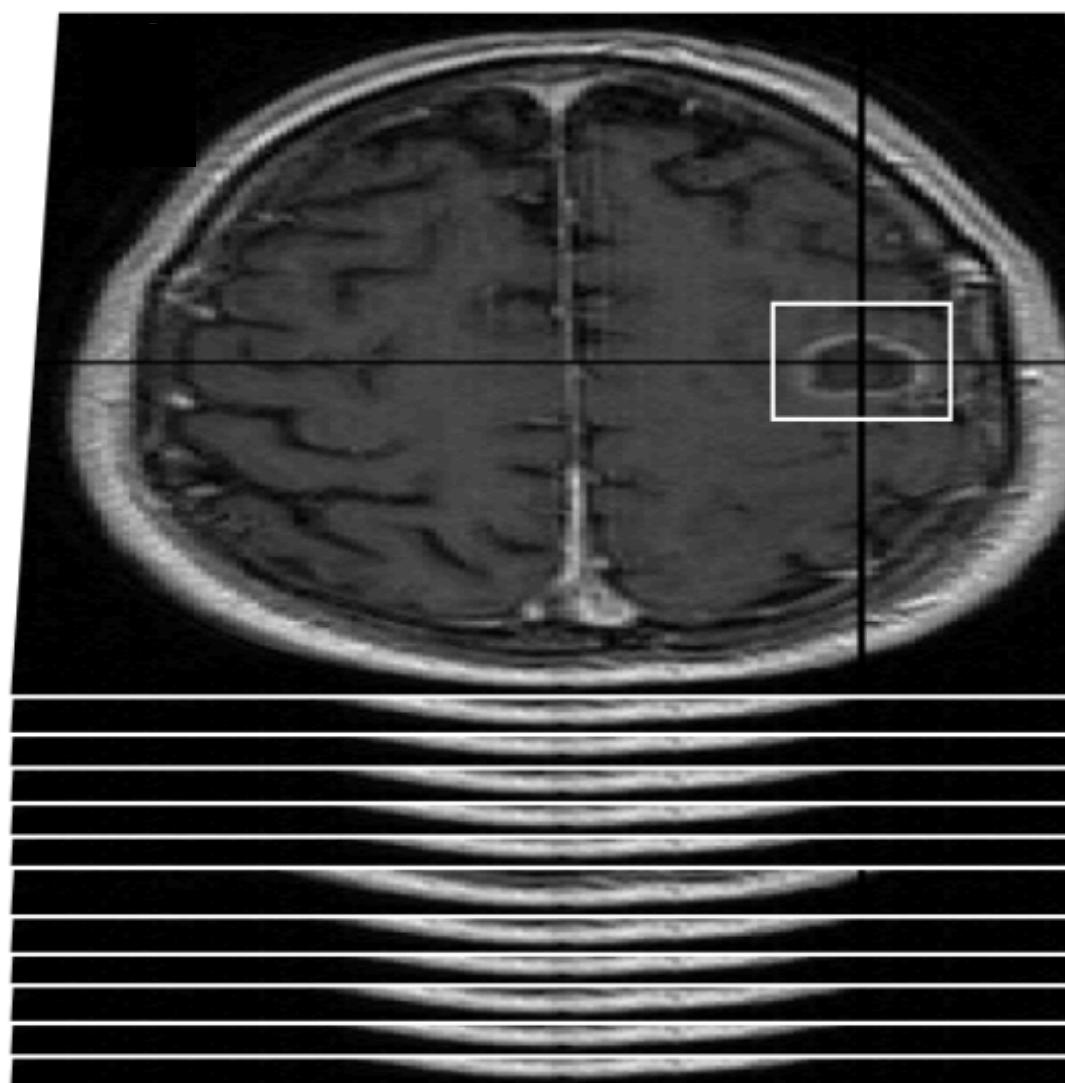


Edad
Ancho anillo
Regularidad
Cirugía completa

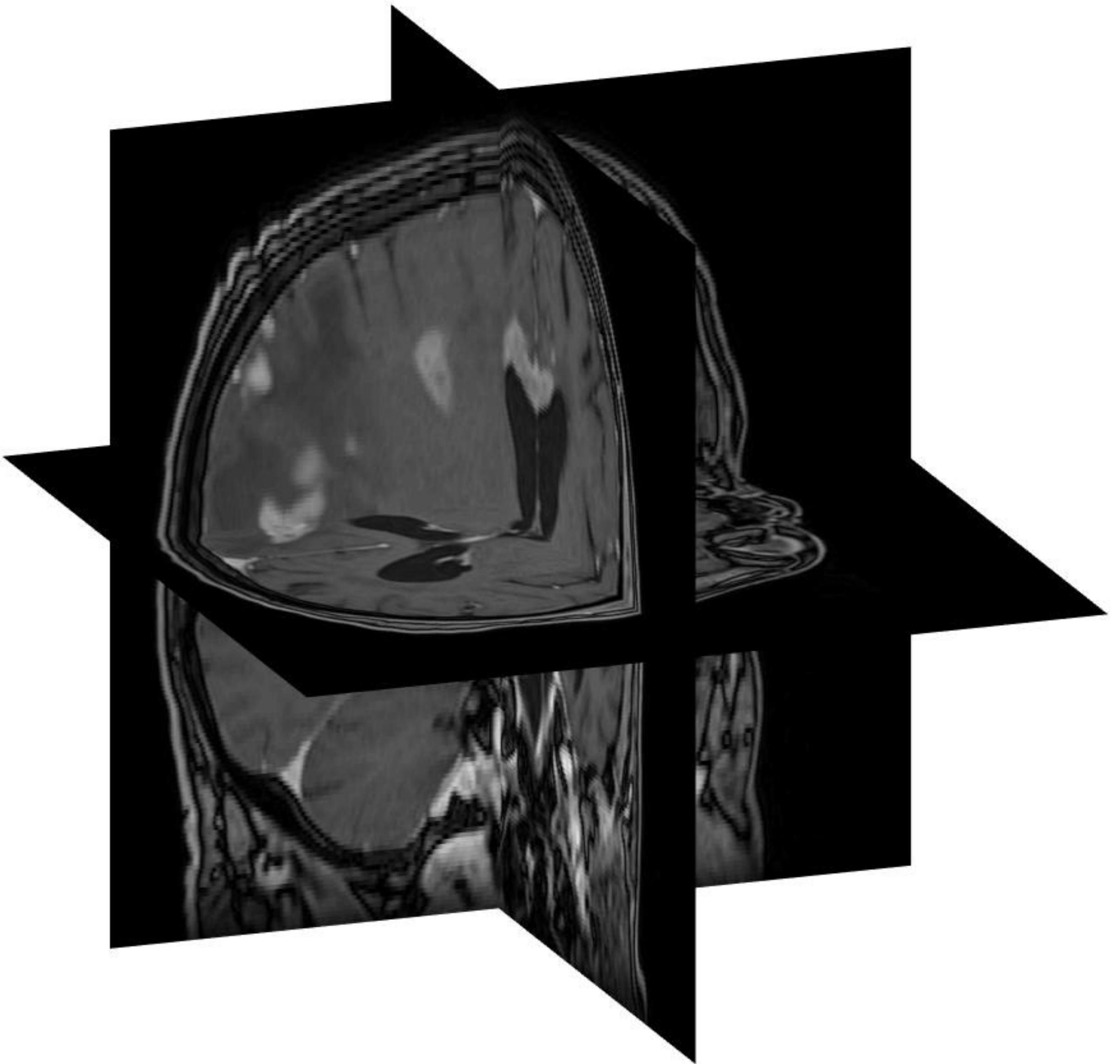


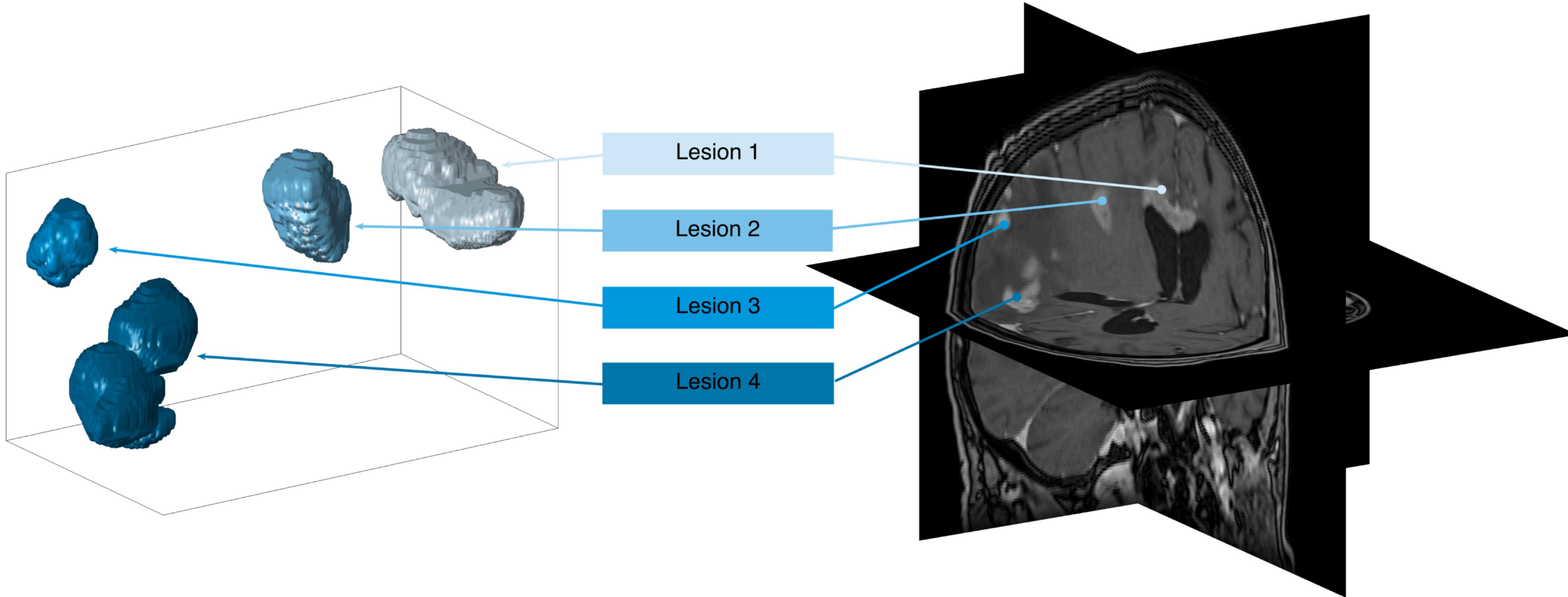


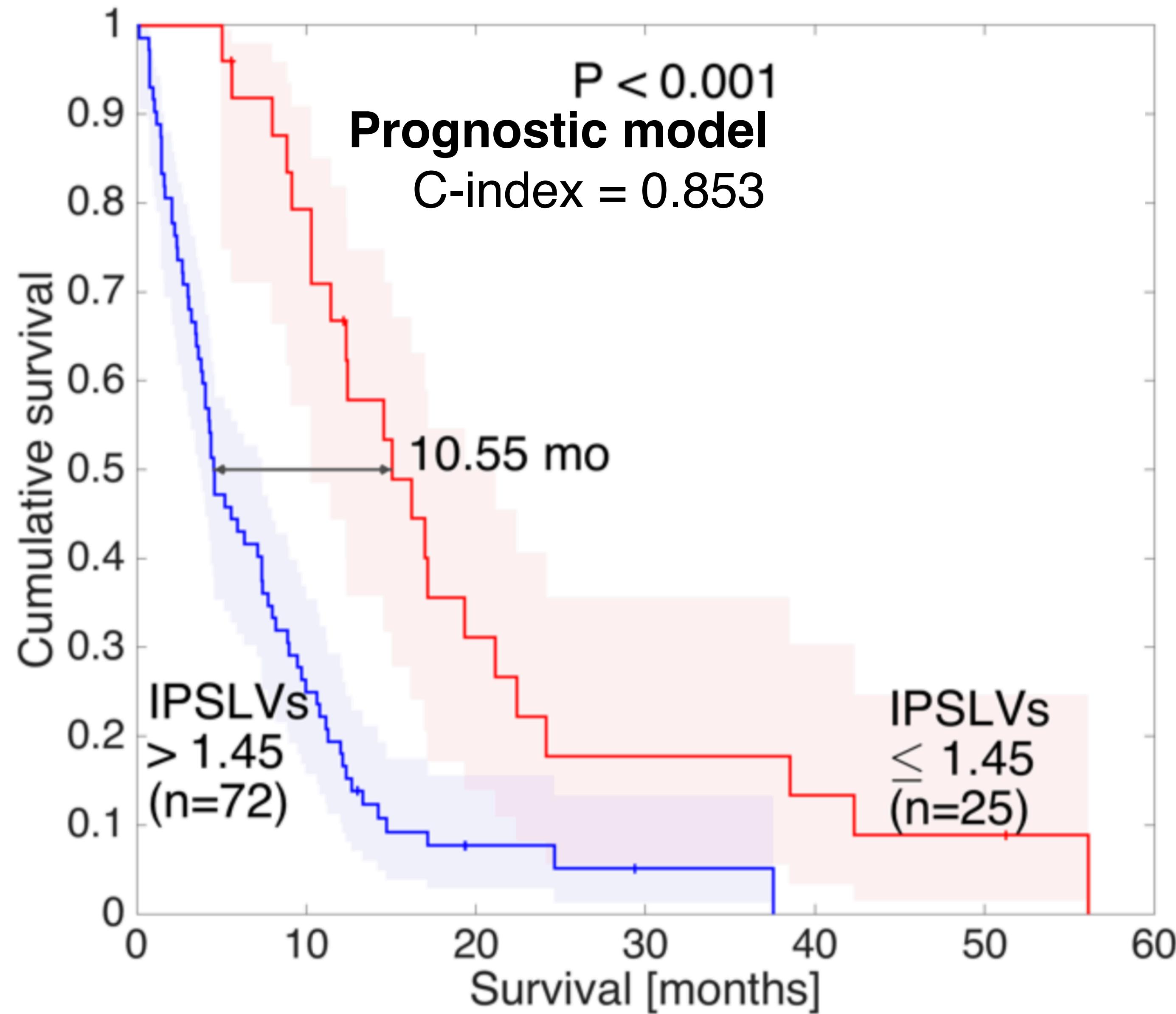
Edad Volumen de captación Biopsia

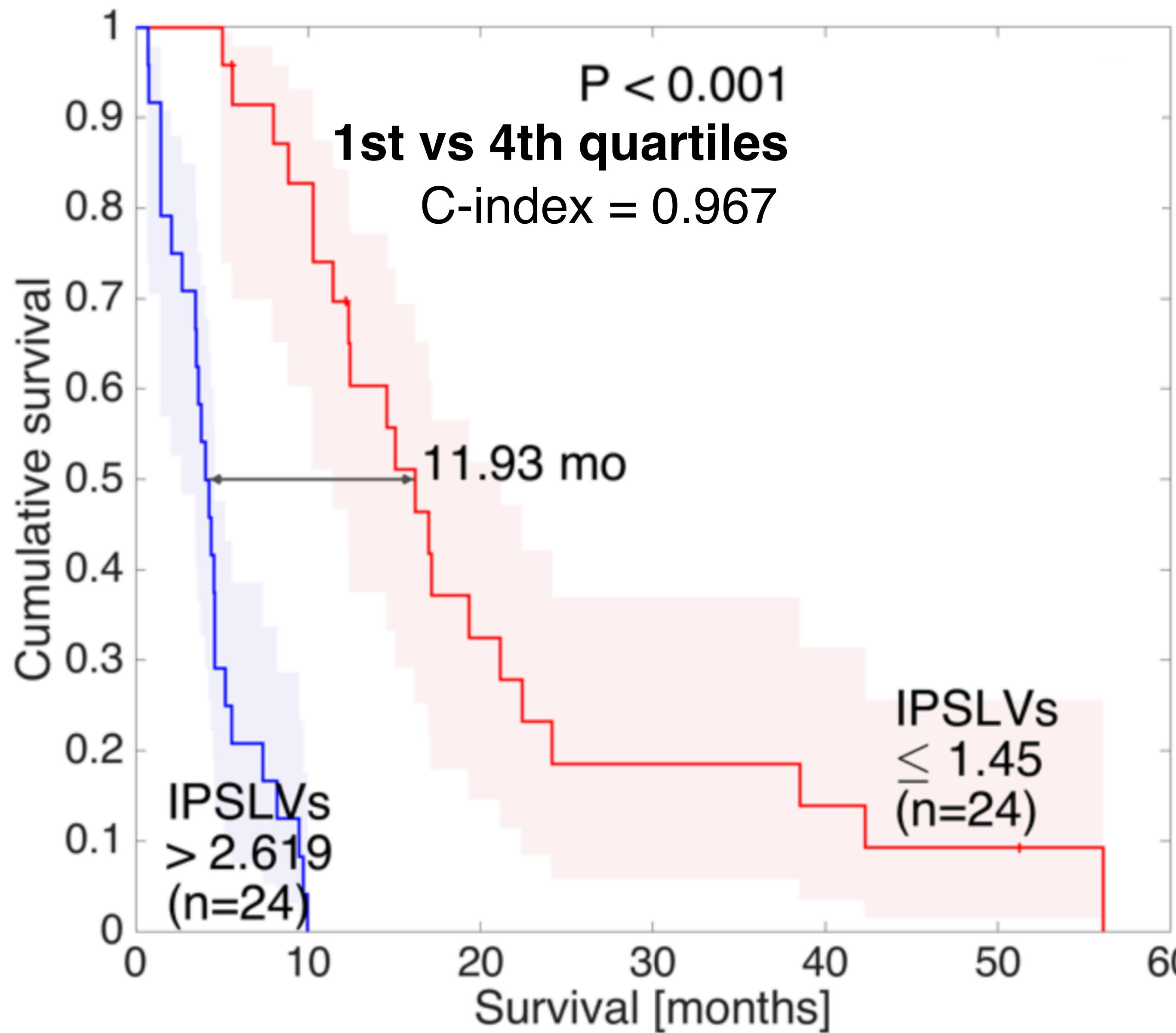


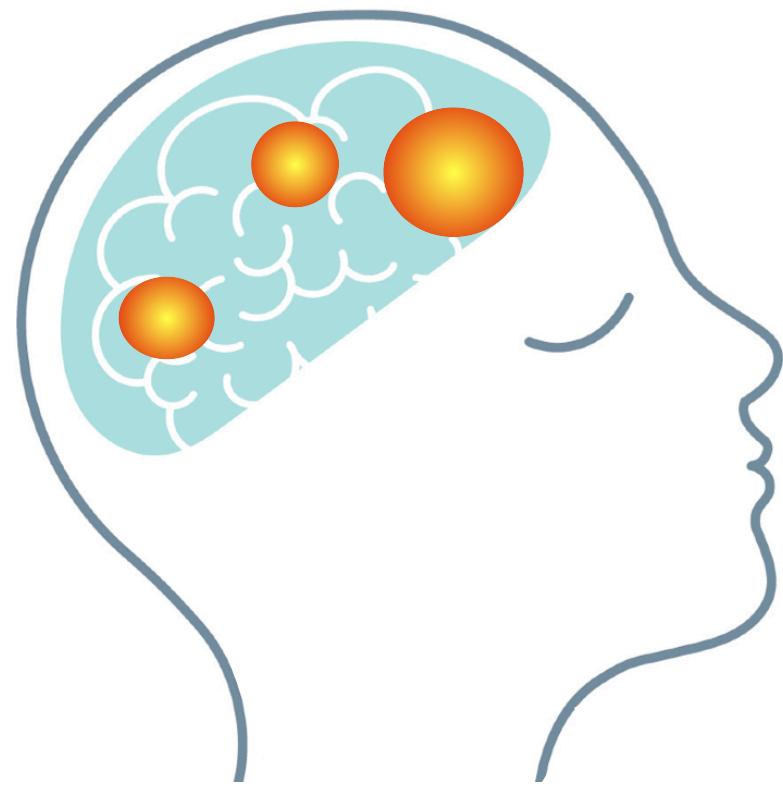
Glioblastoma multifocal
Supervivencia 8 meses



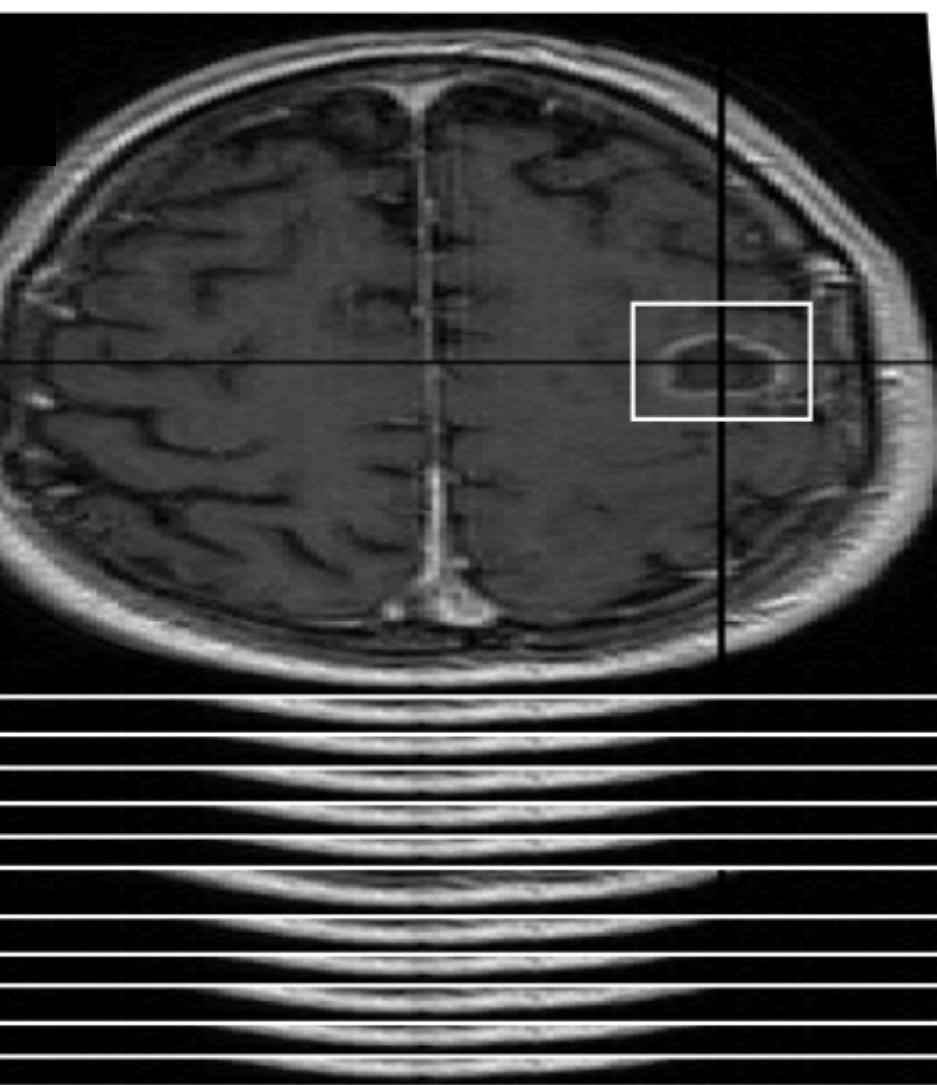




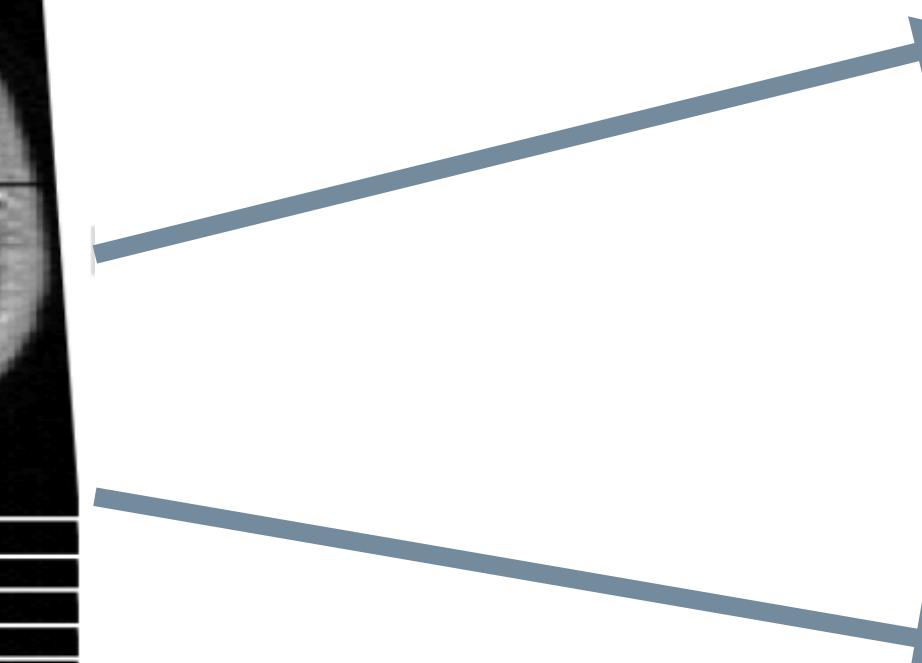




8 months



Age
Rim width
Surgery



**Standard
prognosis**

15 months

High risk

4 months

Morphologic Features on MR Imaging Classify Multifocal Glioblastomas in Different Prognostic Groups

J. Pérez-Beteta, D. Molina-García, M. Villena, M.J. Rodríguez, C. Velásquez, J. Martino, B. Meléndez-Asensio, Á. Rodríguez de Lope, R. Morcillo, J.M. Sepúlveda, A. Hernández-Laín, A. Ramos, J.A. Barcia, P.C. Lara, D. Albillo, A. Revert, E. Arana, and V.M. Pérez-García



ABSTRACT

BACKGROUND AND PURPOSE: Multifocal glioblastomas (ie, glioblastomas with multiple foci, unconnected in postcontrast pretreatment T1-weighted images) represent a challenge in clinical practice due to their poor prognosis. We wished to obtain imaging biomarkers with prognostic value that have not been found previously.

MATERIALS AND METHODS: A retrospective review of 1155 patients with glioblastomas from 10 local institutions during 2006–2017 provided 97 patients satisfying the inclusion criteria of the study and classified as having multifocal glioblastomas. Tumors were segmented and morphologic features were computed using different methodologies: 1) measured on the largest focus, 2) aggregating the different foci as a whole, and 3) recording the extreme value obtained for each focus. Kaplan-Meier, Cox proportional hazards, correlations, and

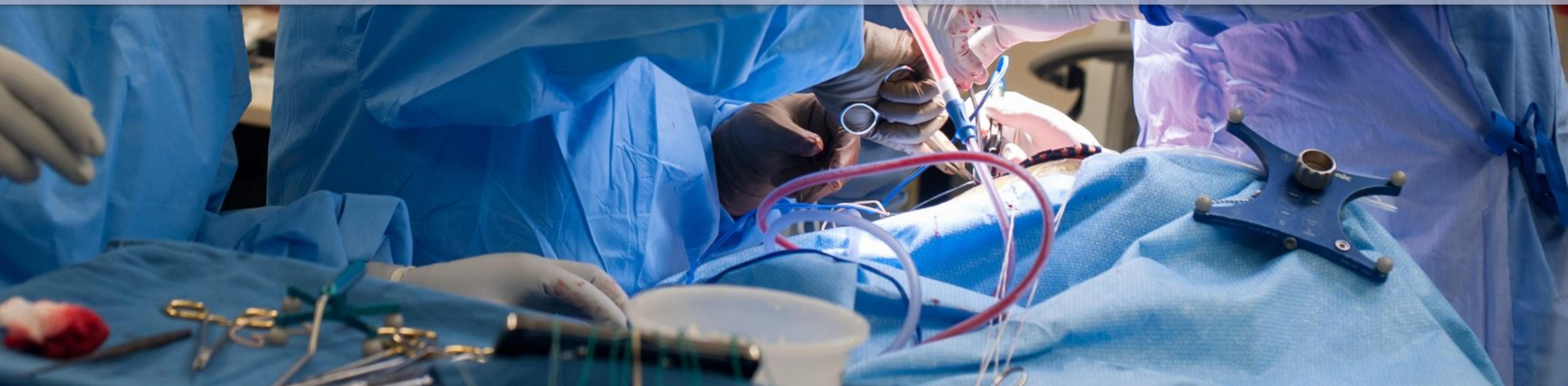


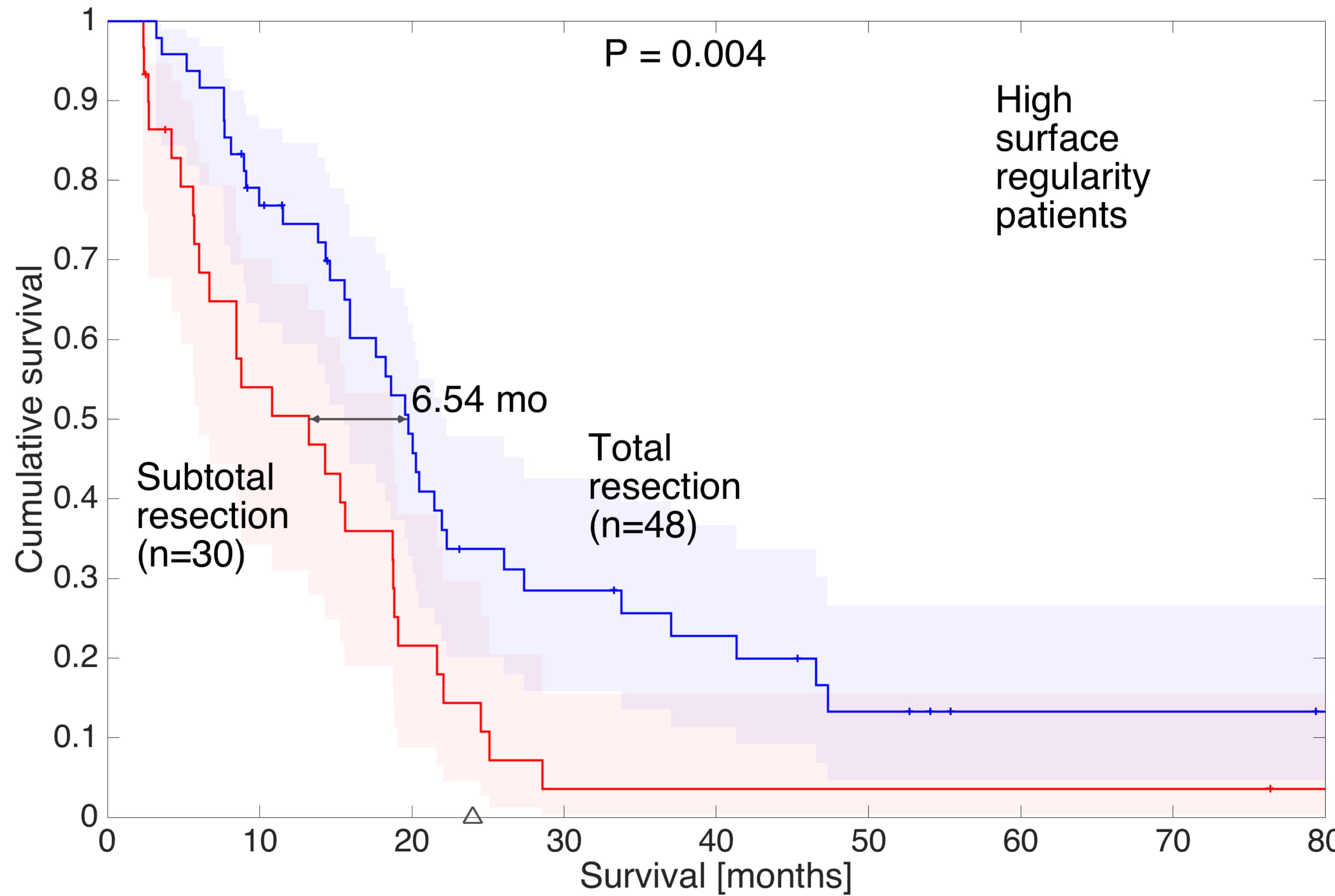
A hand holds a glowing white sphere against a black background. Inside the sphere is a stylized profile of a human head facing right. The head is filled with a light blue color, representing the brain. Three orange spheres, representing neurons or activity centers, are located in the frontal lobe area. Below the head, three mathematical equations are displayed in a light gray font:

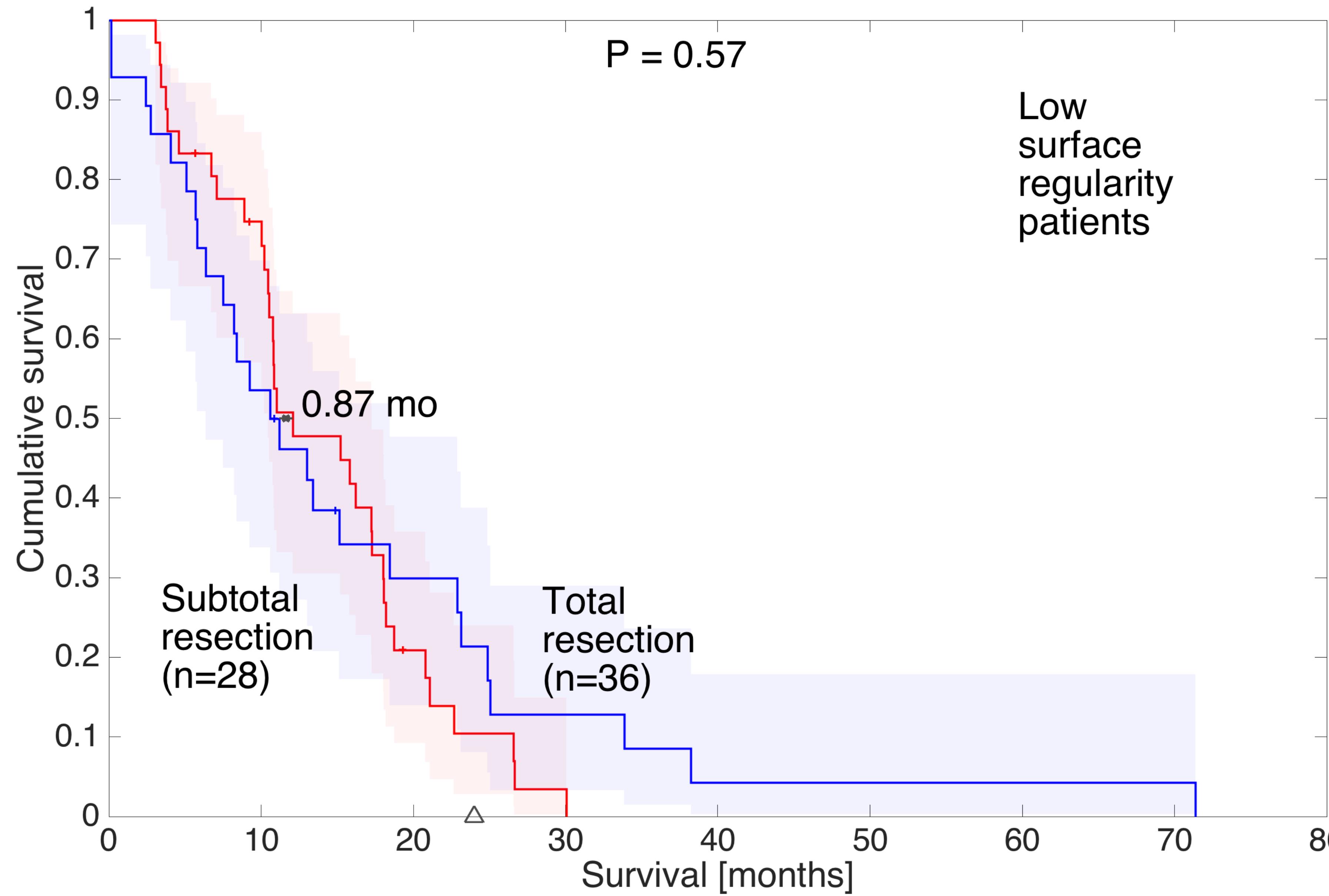
$$\frac{\partial u}{\partial t} = D \Delta u - \alpha u + \rho(u_* - u - v - w)u$$
$$\frac{\partial v}{\partial t} = -\mathcal{F}(u, v)$$
$$\frac{\partial w}{\partial t} = \alpha u + \mathcal{F}(u, v)$$

A photograph of a surgical team in an operating room. Several surgeons wearing blue surgical caps and masks are focused on a patient lying on an operating table. The surgeon in the center foreground is wearing purple safety glasses. The background shows medical equipment and a control panel with various colored buttons.

Predictión de respuesta a cirugía







**¿Intentar cirugía
(macroscópica)
completa?**

No

Sí



Tumor Surface Regularity at MR Imaging Predicts Survival and Response to Surgery in Patients with Glioblastoma

Julián Pérez-Beteta, MSc* • David Molina-García, PhD* • José A. Ortiz-Alhambra, MSc • Antonio Fernández-Romero, MSc • Belén Luque, MSc • Elena Arregui, MD • Manuel Calvo, MD • José M. Borrás, MD • Bárbara Meléndez, PhD • Ángel Rodríguez de Lope, MD, PhD • Raquel Moreno de la Presa, MD • Lidia Iglesias Bayo, PhD • Juan A. Barcia, MD, PhD • Juan Martino, MD, PhD • Carlos Velásquez, MD • Beatriz Asenjo, MD, PhD • Manuel Benavides, MD, PhD • Ismael Herruzo, MD, PhD • Antonio Revert, MD, PhD • Estanislao Arana, MD, MHE, PhD • Víctor M. Pérez-García, PhD

From the Mathematical Oncology Laboratory, Instituto de Matemática Aplicada a la Ciencia y la Ingeniería, Universidad de Castilla-La Mancha, Avenida de Camilo Jose Cela 3, 13071 Ciudad Real, Spain (J.P., D.M., J.A.O., A.F., B.L., V.M.P.); Departments of Radiology and Neurosurgery, Hospital General de Ciudad Real, Ciudad Real, Spain (E. Arregui, M.C., J.M.B.); Departments of Pathology, Radiology, and Neurosurgery, Hospital Virgen de la Salud, Toledo, Spain (B.M., Á.R.d.L., R.M.d.I.P.); Department of Neurosurgery, Hospital Clínico San Carlos, Madrid, Spain (L.I.B., J.A.B.); Department of Neurosurgery, Hospital Marqués de Valdecilla, Santander, Spain (J.M., C.V.); Department of Radiology, Complejo Hospitalario Universitario de Granada, Granada, Spain (B.A.); Department of Radiology, Hospital Carlos Haya, Málaga, Spain (M.B., I.H.); Department of Radiology, Hospital de Manises, Valencia, Spain (A.R.); and Department of Radiology, Instituto Valenciano de Oncología, Valencia, Spain (E. Arana). Received May 21, 2017; revision requested July 6; revision received December 27; final version accepted January 5, 2018. **Address correspondence to** V.M.P. (e-mail: *Victor.perezgarcia@uclm.es*).

Study supported by Junta de Comunidades de Castilla-La Mancha (Spain) (PEII-2014-031-P), Secretaría de Estado de Investigación, Desarrollo e Innovación (MTM2015-71200R), and the James S. McDonnell Foundation (Collaborative award 220020450, Planning Grant 220020420).

*J.P., and D.M. contributed equally to this work.

Conflicts of interest are listed at the end of this article.

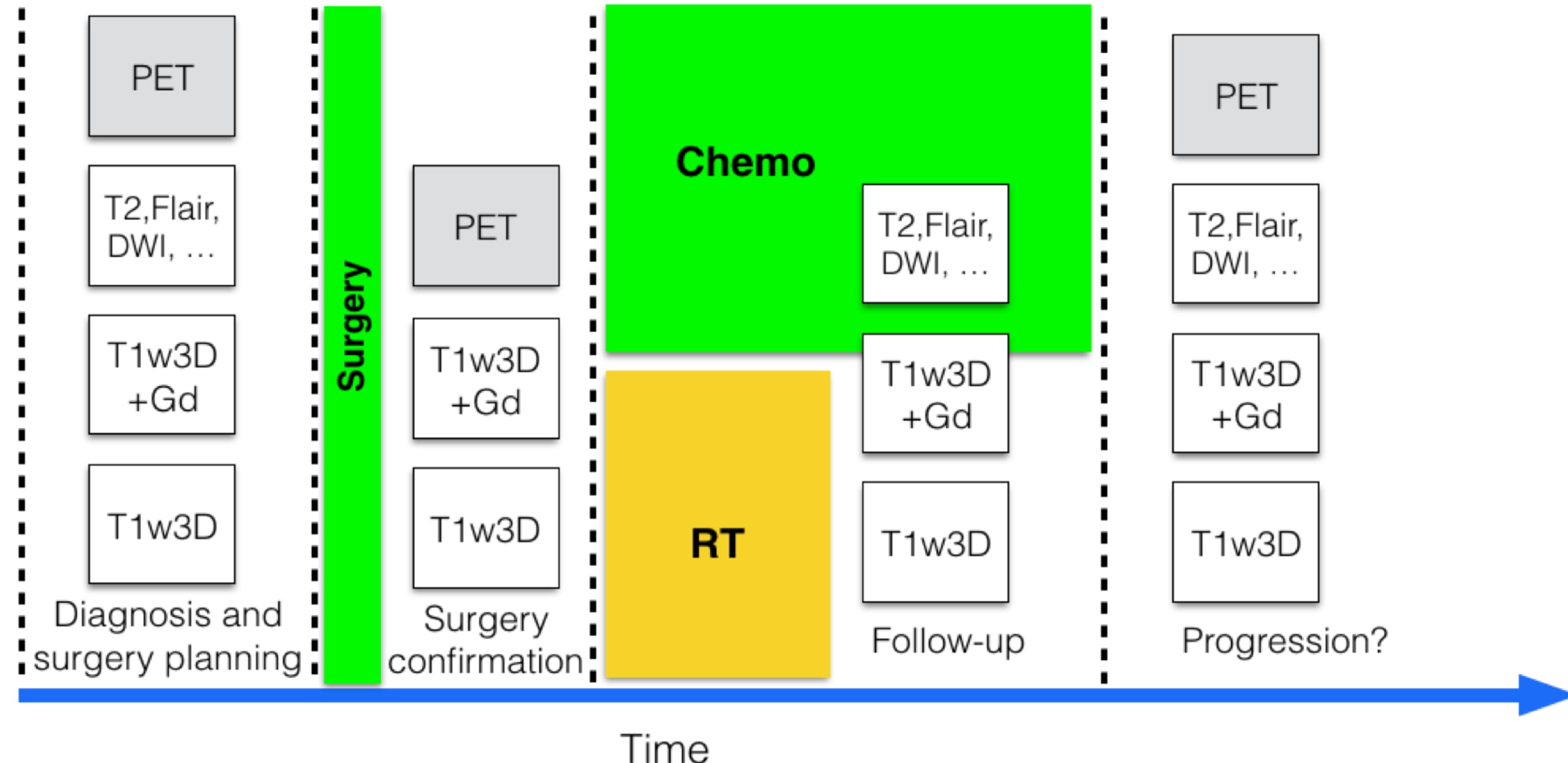
T1+Gd

pretratamiento

GBM

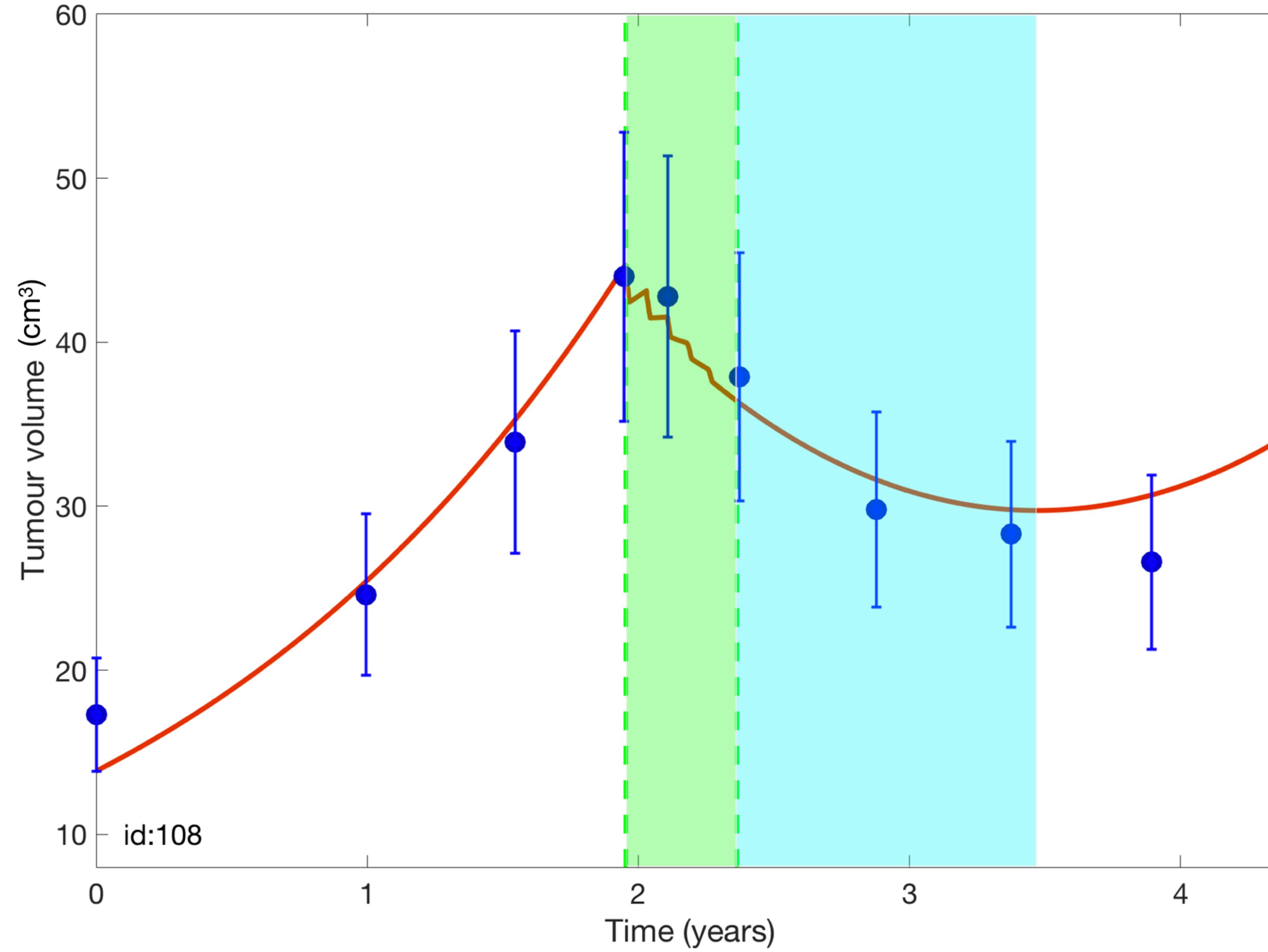


“Therapy optimization in glioblastoma: An integrative human-data based approach using mathematical models”
(James S. Mc. Donnell Foundation, USA)



Oligodendroglioma





07

JULY
2019

SUN	MON	TUE	WED	THU	FRI	SAT
	1	2	3	4	5	6
7	8	9	10	11	12	13
14	15	16	17	18	19	20
21	22	23	24	25	26	27
28	29	30	31			

08

AUGUST
2019

SUN	MON	TUE	WED	THU	FRI	SAT
				1	2	3
4	5	6	7	8	9	10
11	12	13	14	15	16	17
18	19	20	21	22	23	24
25	26	27	28	29	30	31

09

SEPTEMBER
2019

SUN	MON	TUE	WED	THU	FRI	SAT
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8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30					

10

OCTOBER
2019

SUN	MON	TUE	WED	THU	FRI	SAT
	1	2	3	4	5	
6	7	8	9	10	11	12
13	14	15	16	17	18	19
20	21	22	23	24	25	26
27	28	29	30	31		

11

NOVEMBER
2019

SUN	MON	TUE	WED	THU	FRI	SAT
				1	2	
3	4	5	6	7	8	9
10	11	12	13	14	15	16
17	18	19	20	21	22	23
24	25	26	27	28	29	30

12

DECEMBER
2019

SUN	MON	TUE	WED	THU	FRI	SAT
1	2	3	4	5	6	7
8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28
29	30	31				

07

JULY
2019

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AUGUST
2019

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SEPTEMBER
2019

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OCTOBER
2019

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NOVEMBER
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DECEMBER
2019

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JULY
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SEPTEMBER
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OCTOBER
2019

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DECEMBER
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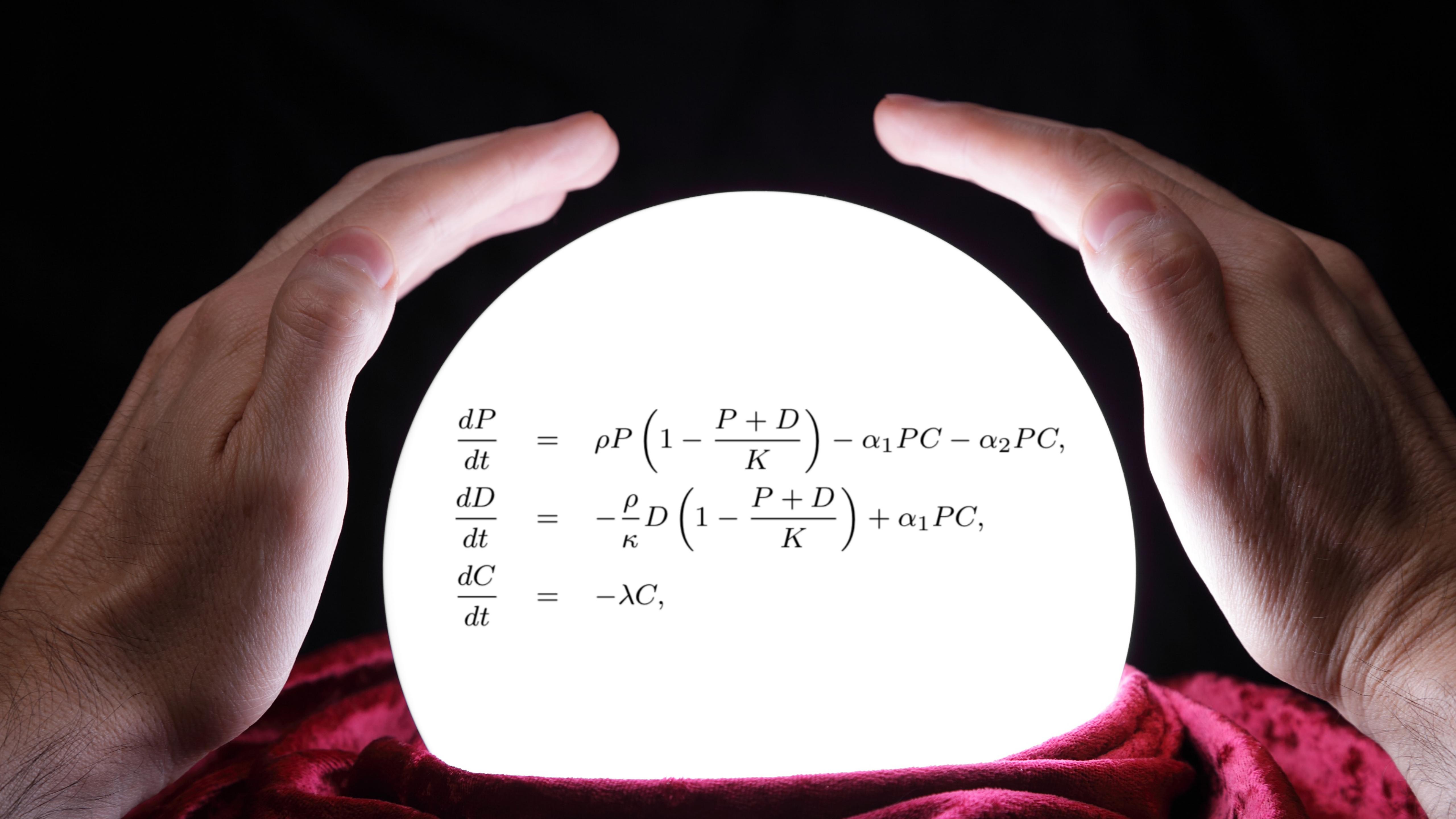


How can you find the best ...

for all patients?
for each individual patient?

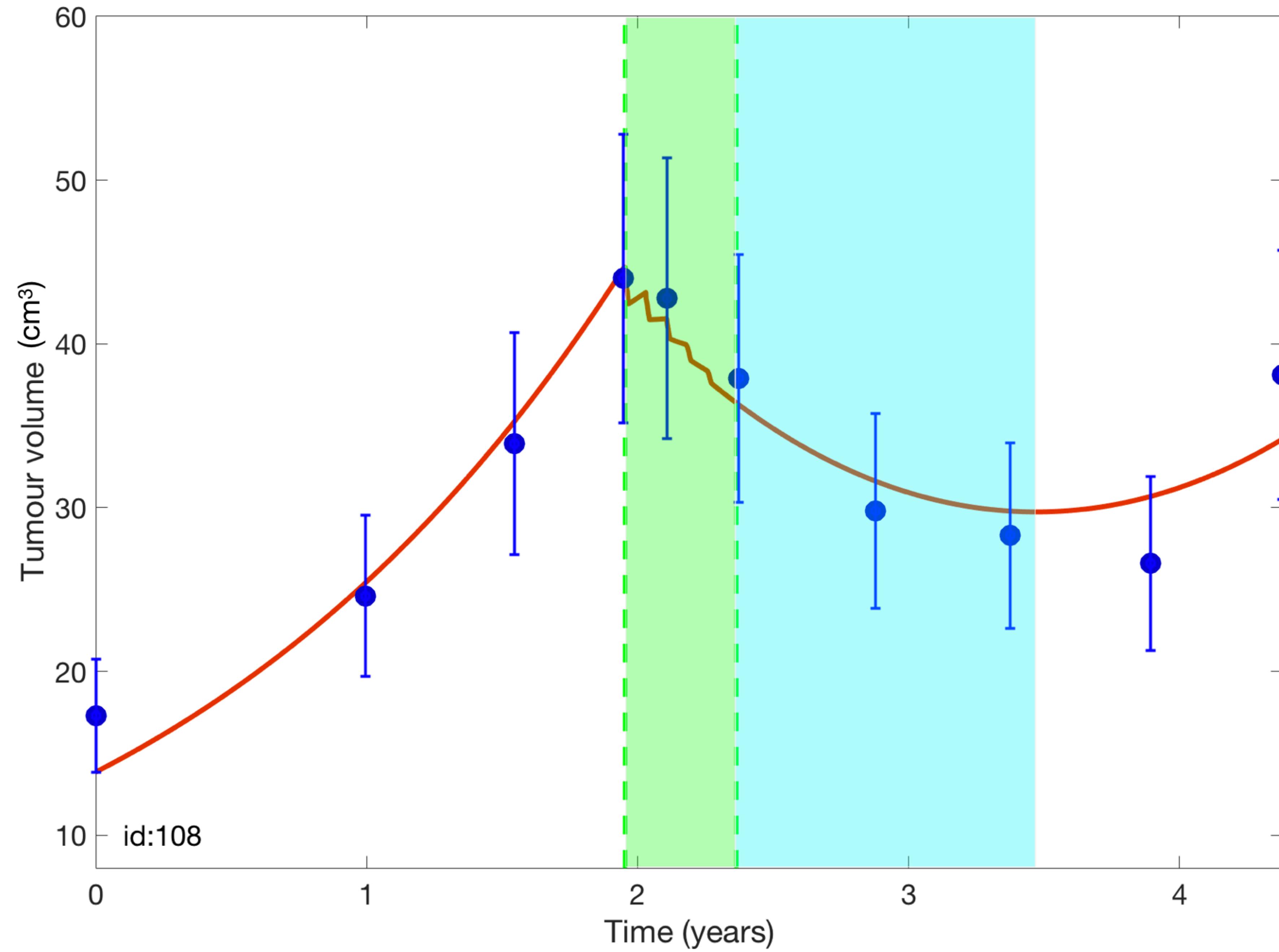


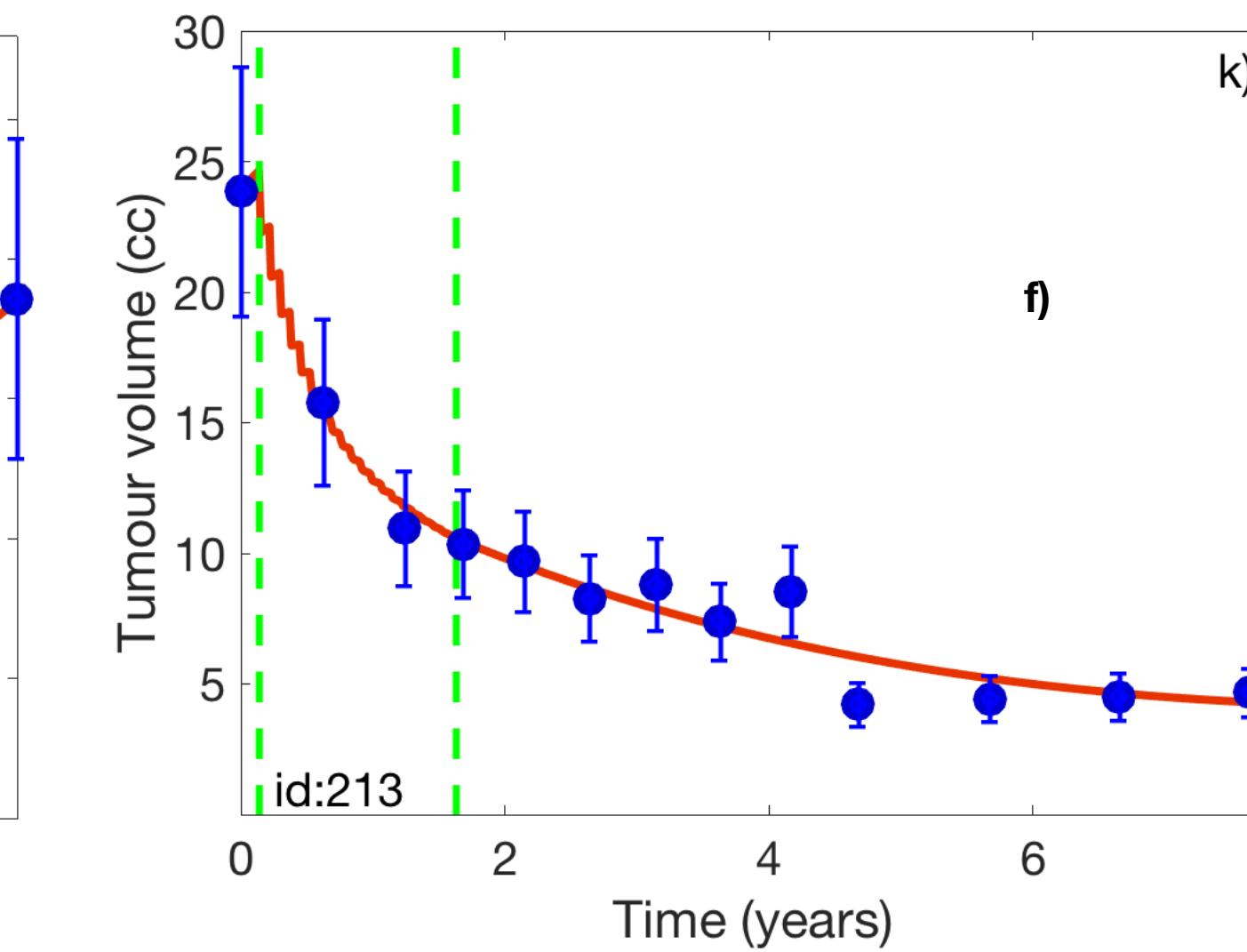
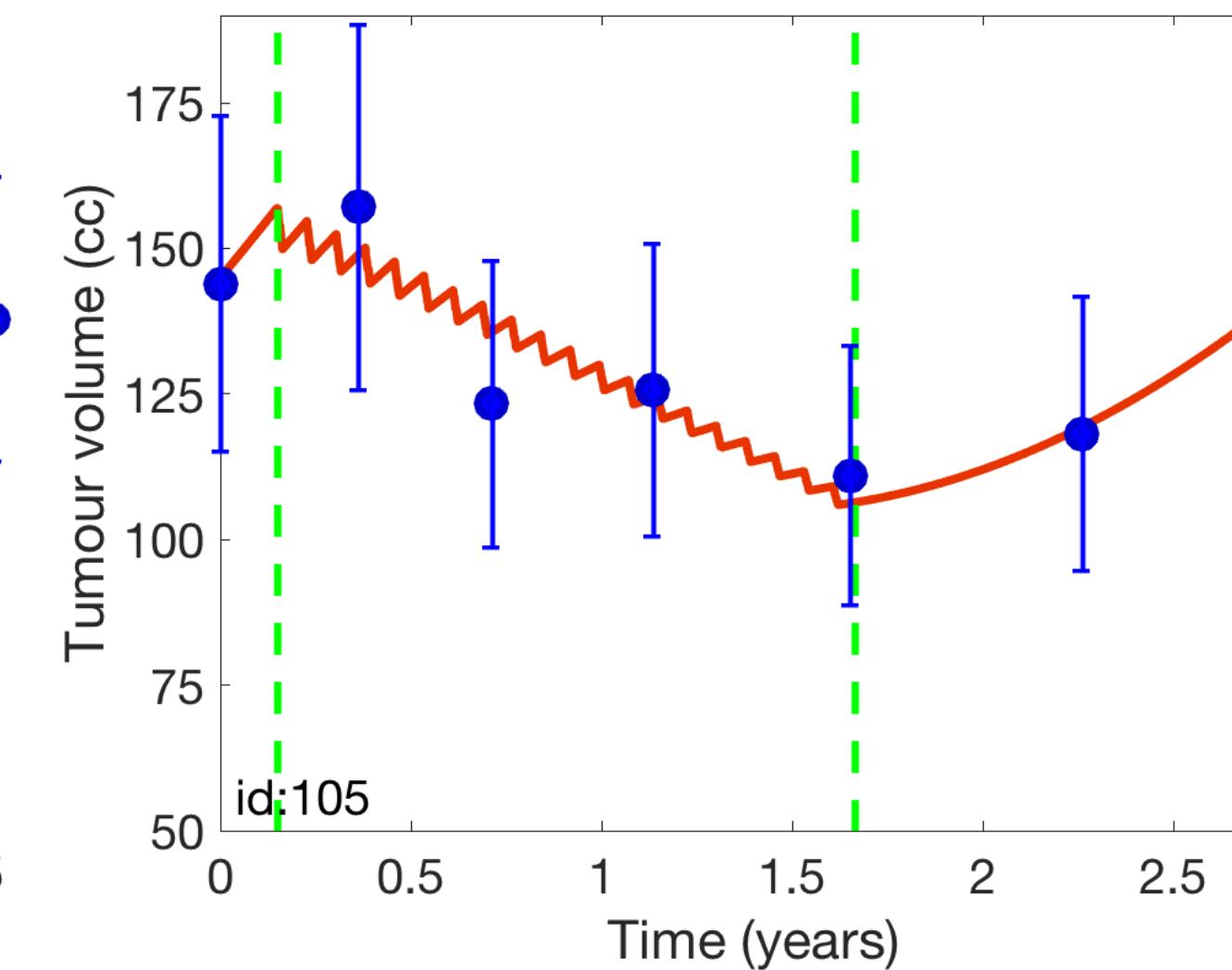
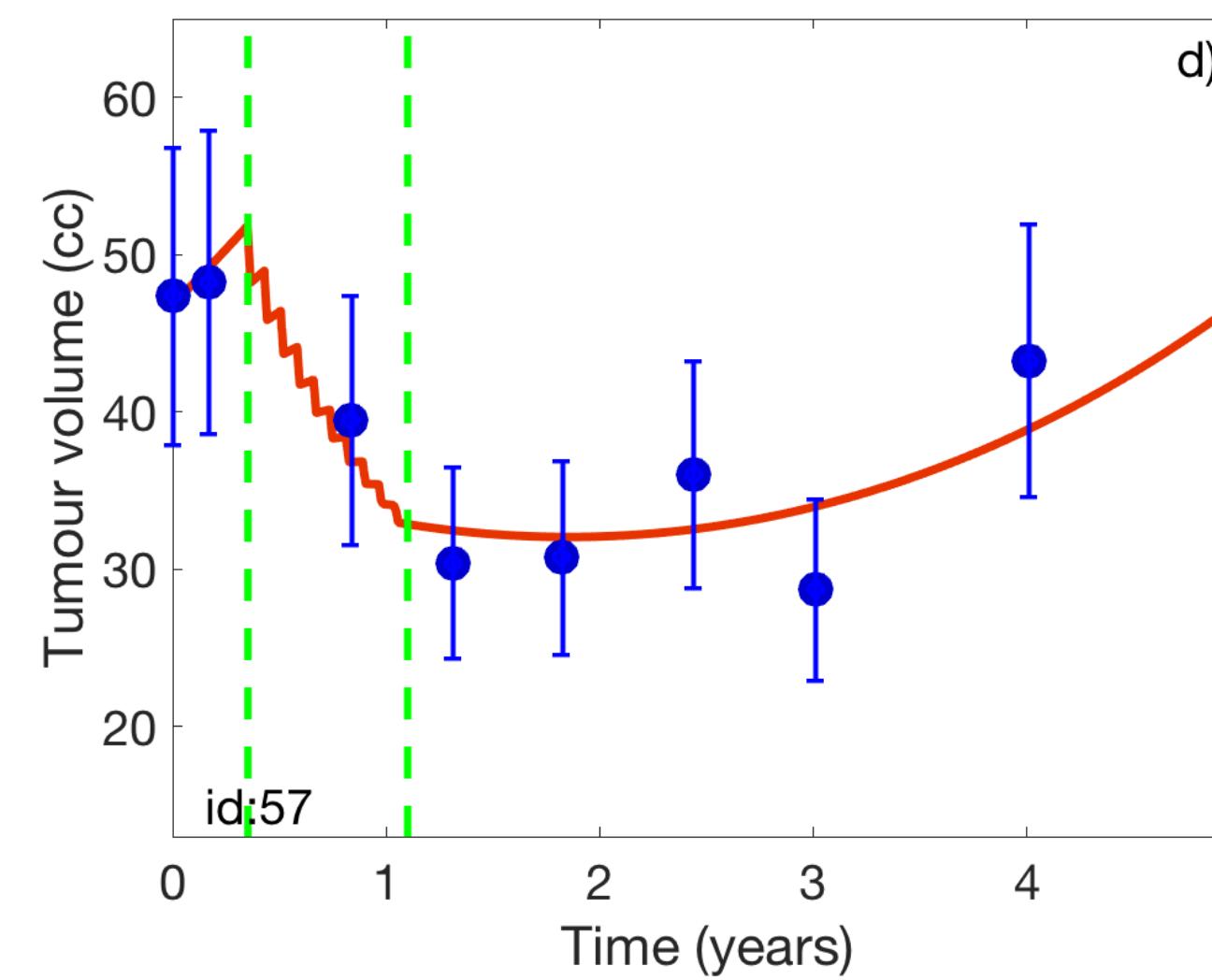
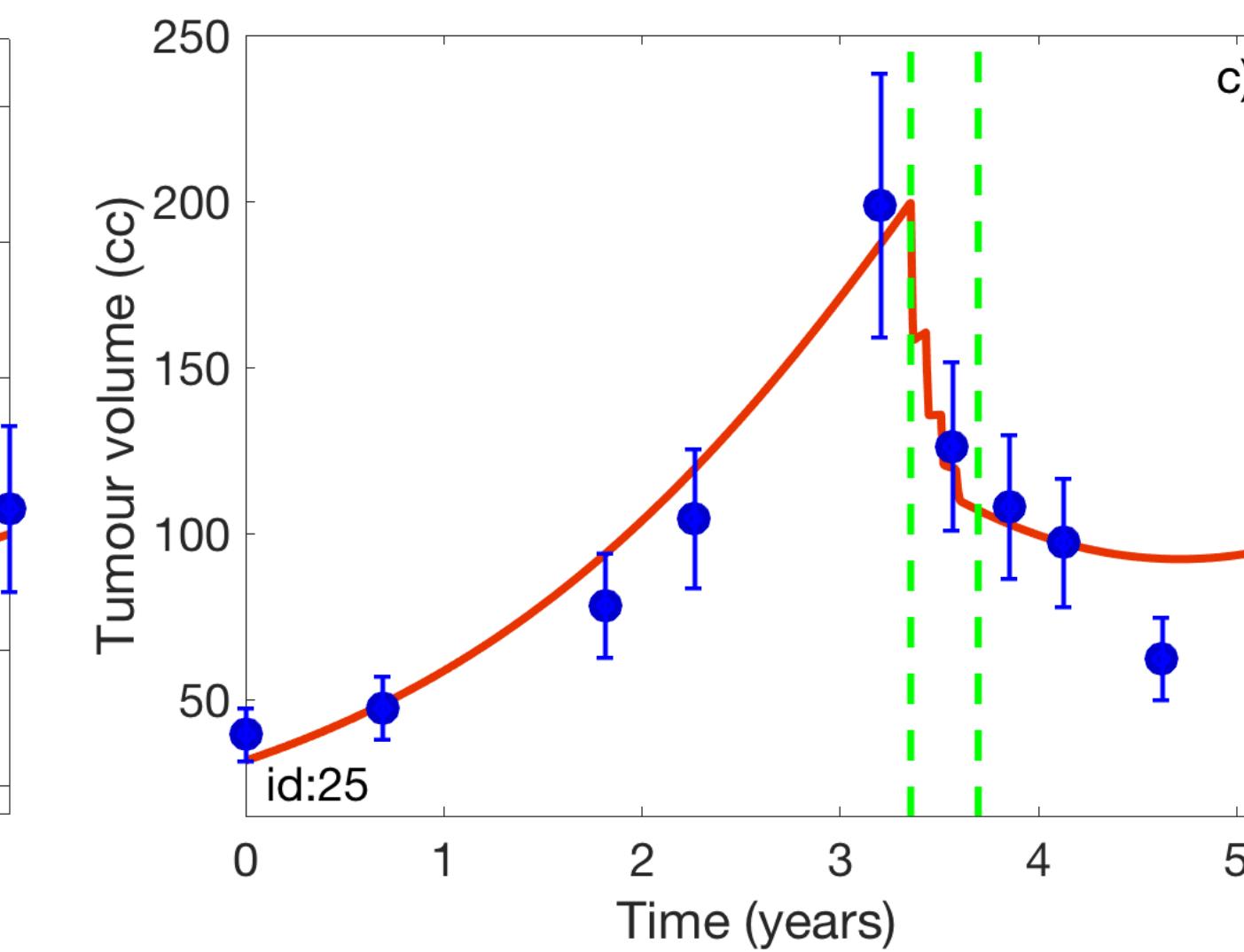
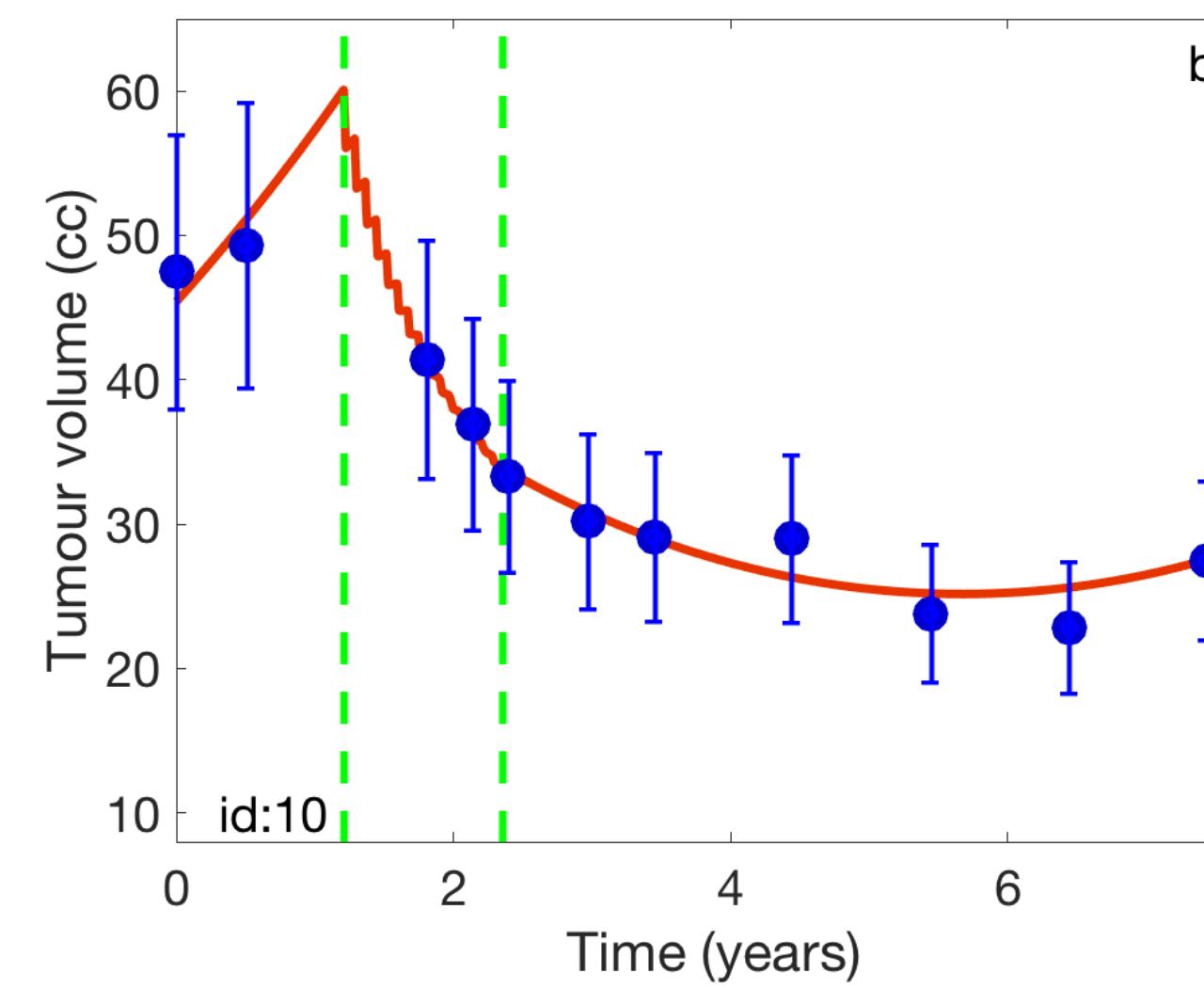
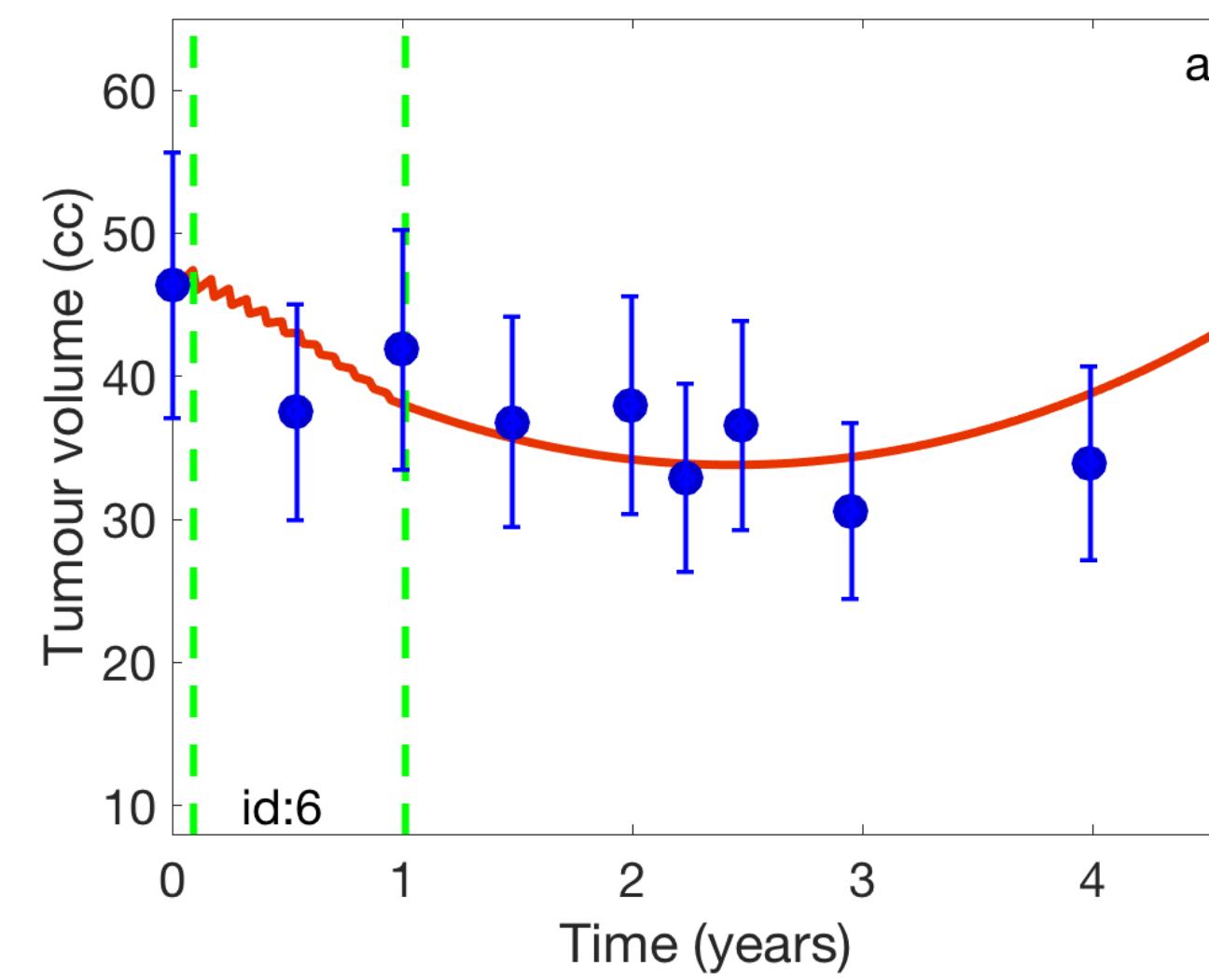
Technical limitations – Ethical considerations – Time constraints



A close-up photograph of a person's hands against a black background. A bright white sphere is held between the thumb and forefinger of each hand. The hands are positioned such that the spheres appear to be touching at their top points. The skin tone is light, and the spheres are perfectly white and luminous.

$$\begin{aligned}\frac{dP}{dt} &= \rho P \left(1 - \frac{P+D}{K}\right) - \alpha_1 PC - \alpha_2 PC, \\ \frac{dD}{dt} &= -\frac{\rho}{\kappa} D \left(1 - \frac{P+D}{K}\right) + \alpha_1 PC, \\ \frac{dC}{dt} &= -\lambda C,\end{aligned}$$





Worked for 11 patients of Bern Hospital

A clone made out of equations living in a computer

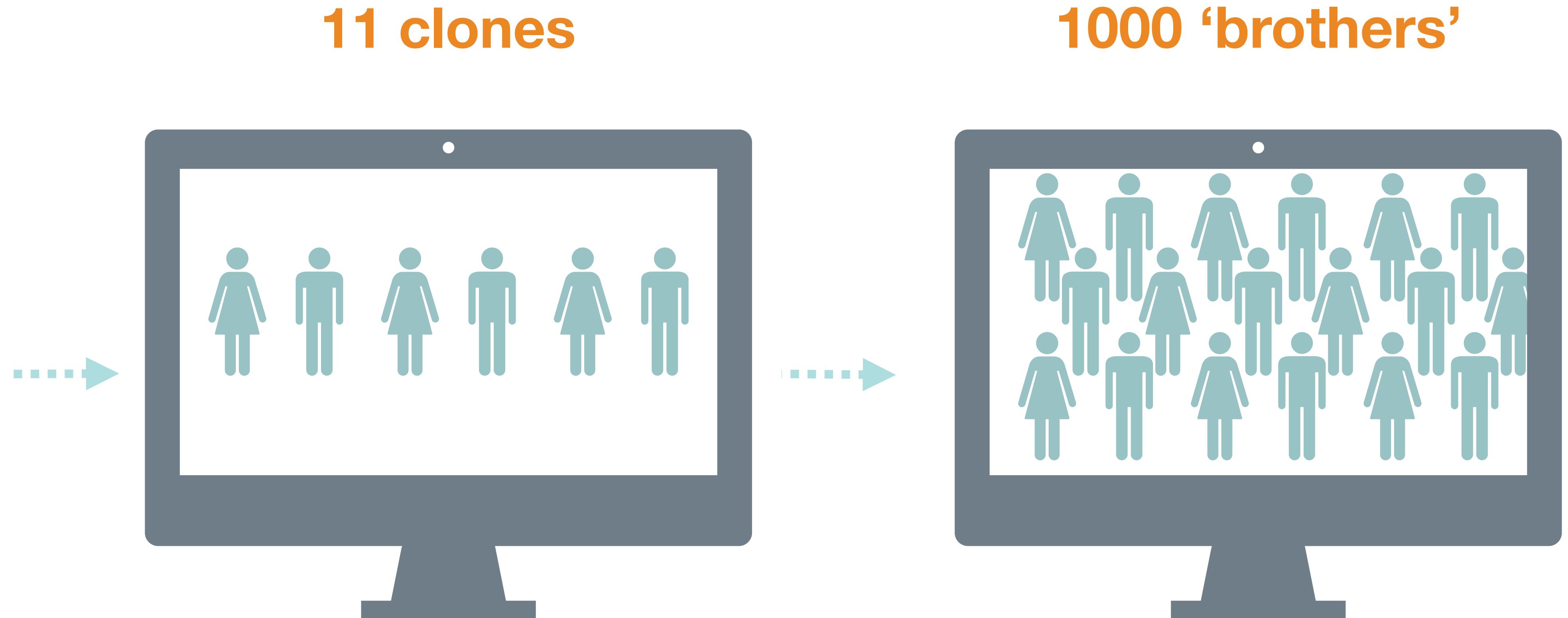


Therapy Personalization

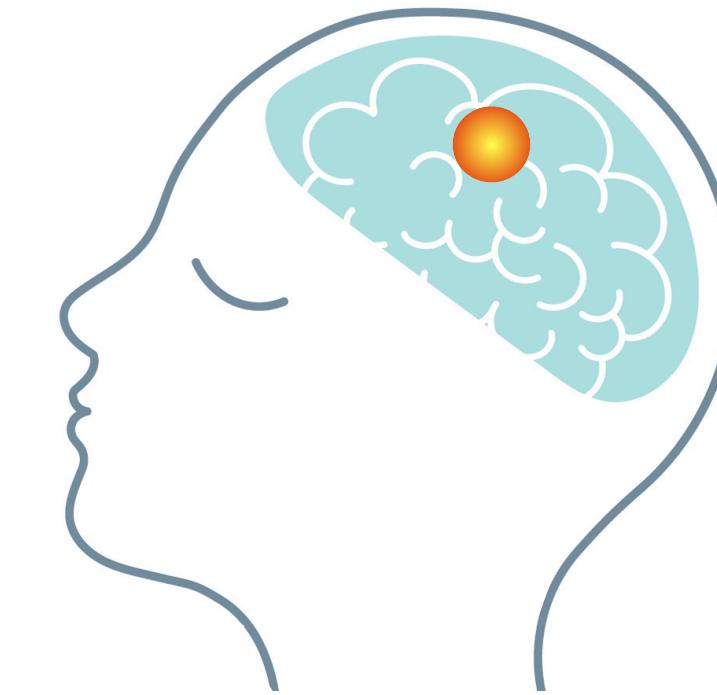


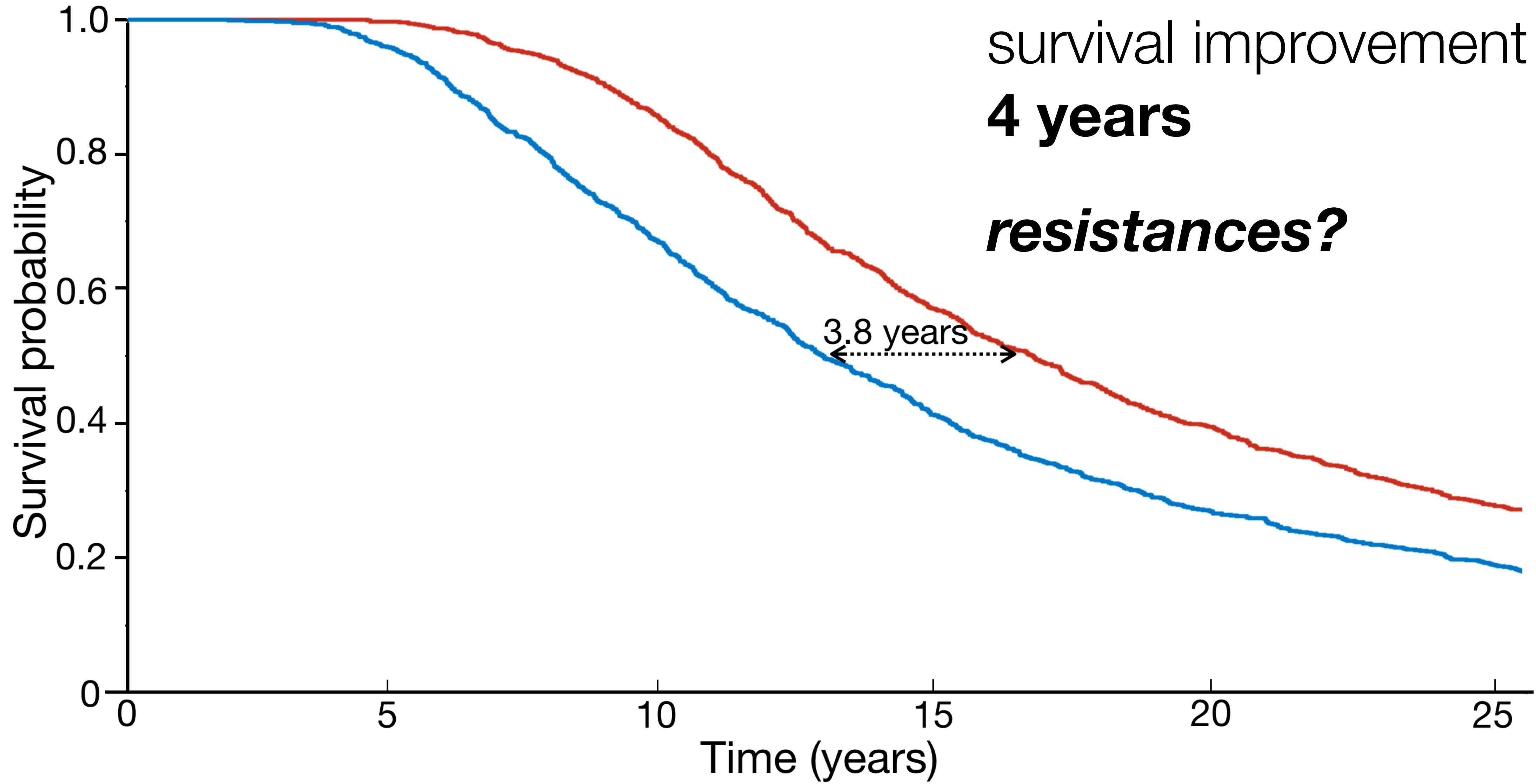
Finding better protocols using clones





5
1 month + 12
3 months





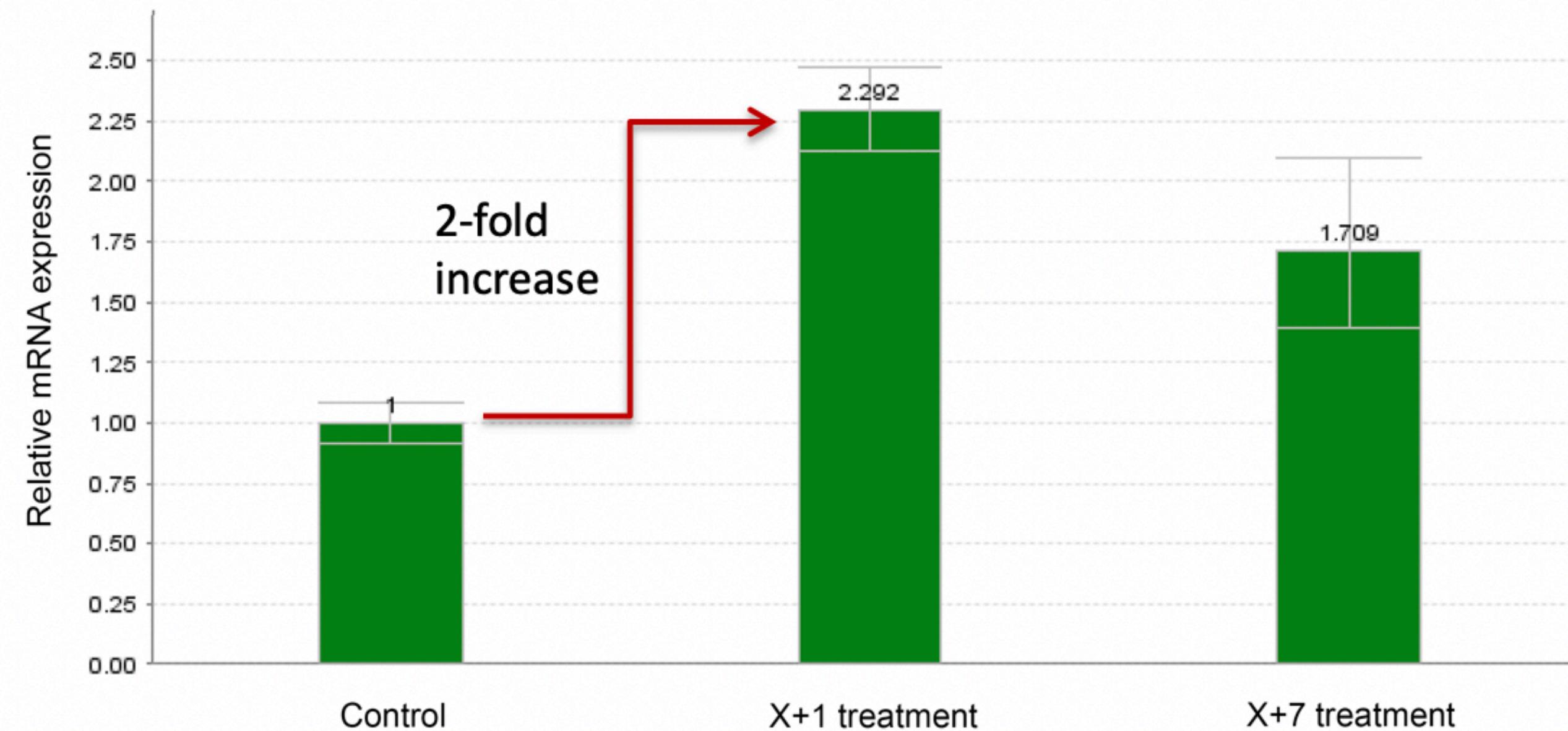


Current approach
Shoot everything you've got

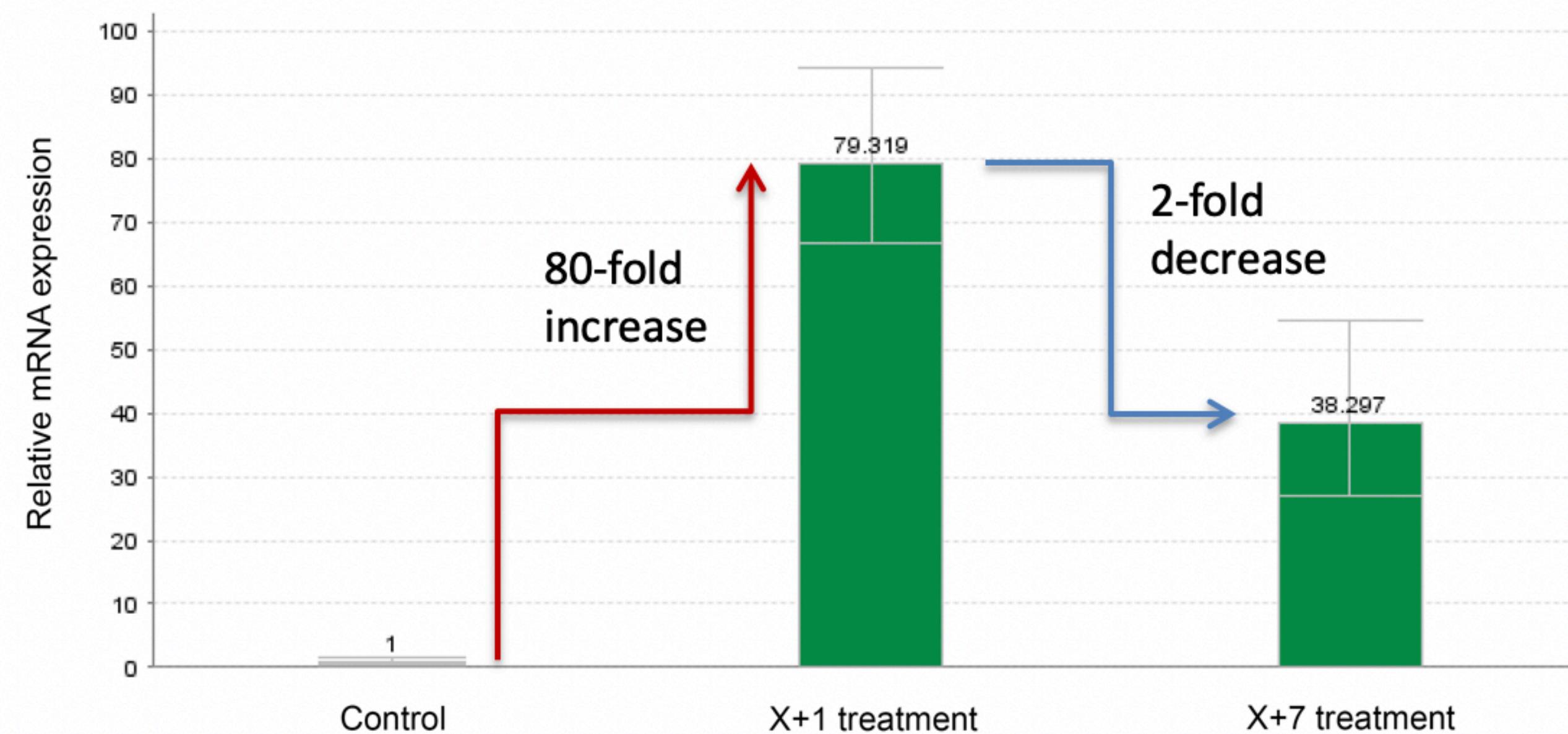
New one: wait till they are on target

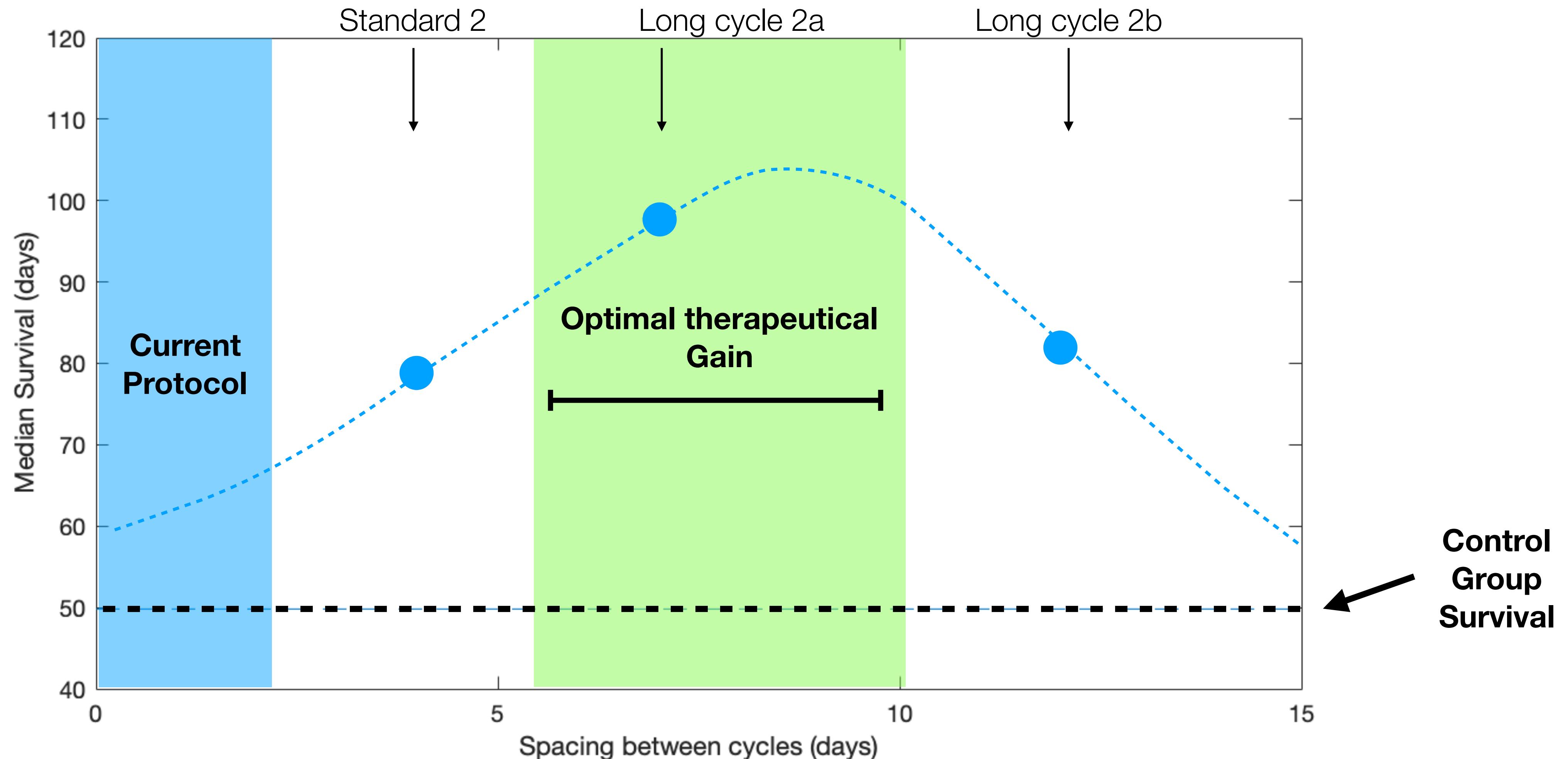


MGMT



MGMT





Three “cycles” of treatment



Image-based Biomarkers

Brain metastasis

Maths for personalized treatment

Prostate cancer

**Acute lymphoblastic
leukemia**

**Novel
administration protocols**

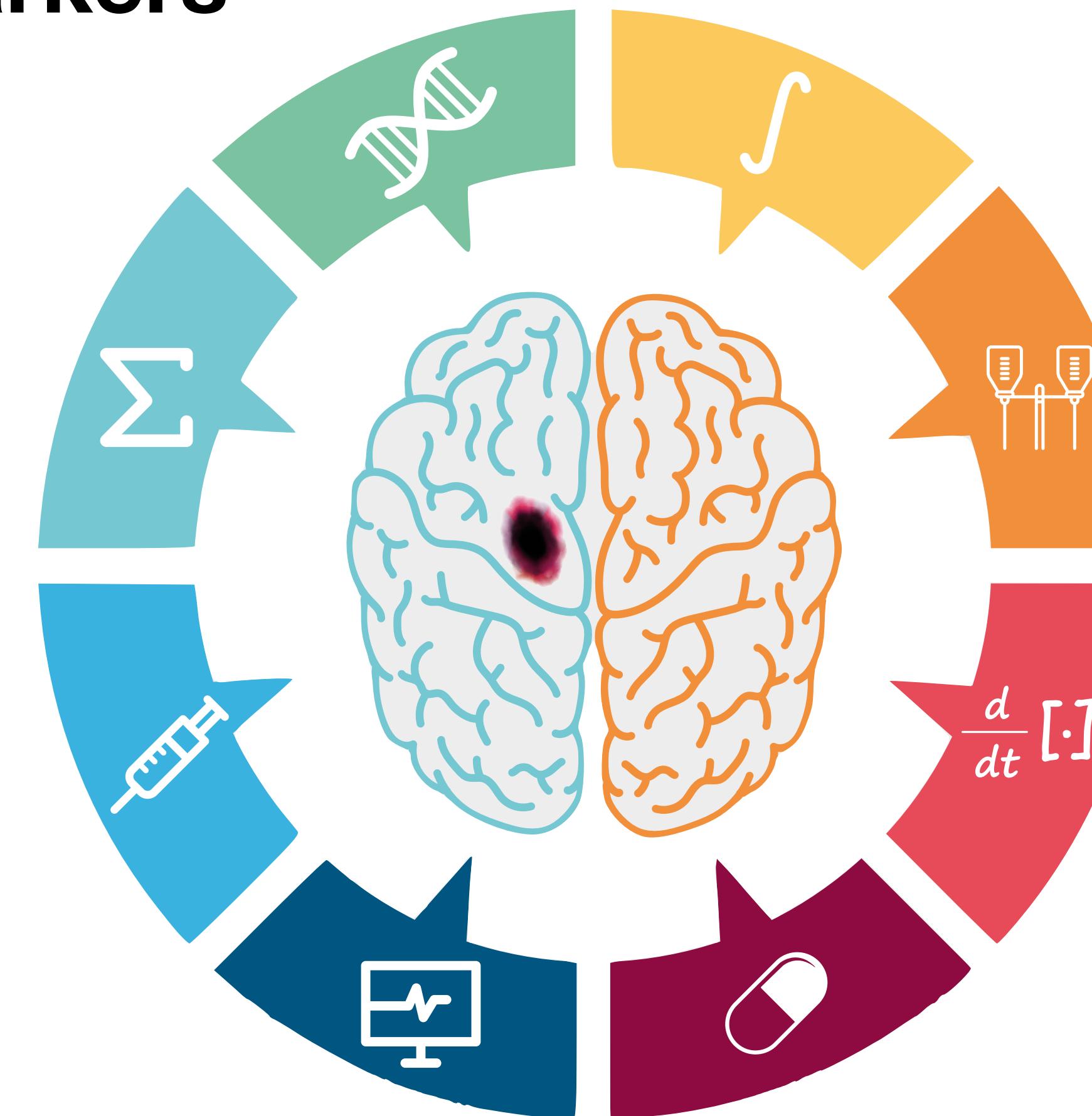
PET imaging

Immunotherapy

Hyperthermia

**Evolutionary
dynamics**

Scaling laws



A sepia-toned portrait of Jules Verne, an elderly man with a full, bushy white beard and receding hairline, looking slightly to his left. He is wearing a dark suit jacket over a white collared shirt.

“Todo lo que uno puede imaginar
otros pueden hacerlo realidad”

Julio Verne



MATHEMATICAL
ONCOLOGY
LABORATORY



MATHEMATICAL
ONCOLOGY
LABORATORY

<http://matematicas.uclm.es/molab>



Universidad de
Castilla-La Mancha



JAMES S. McDONNELL FOUNDATION



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European Regional Development Fund



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