

Ingmar Glauche

From binary switches to continuous landscapes:

Challenges in modeling hematopoietic stem cell
dynamics and clonal progression

Mephistopheles: Blut ist ein ganz besondrer Saft.

Mephistopheles: Blood is a very special juice.

Johann Wolfgang von Goethe, Faust 1

Stem cell behaviour

Development 110, 1001–1020 (1990)
 Printed in Great Britain © The Company of Biologists Limited 1990

Review Article 1001

Stem cells: attributes, cycles, spirals, pitfalls and uncertainties

Lessons for and from the Crypt

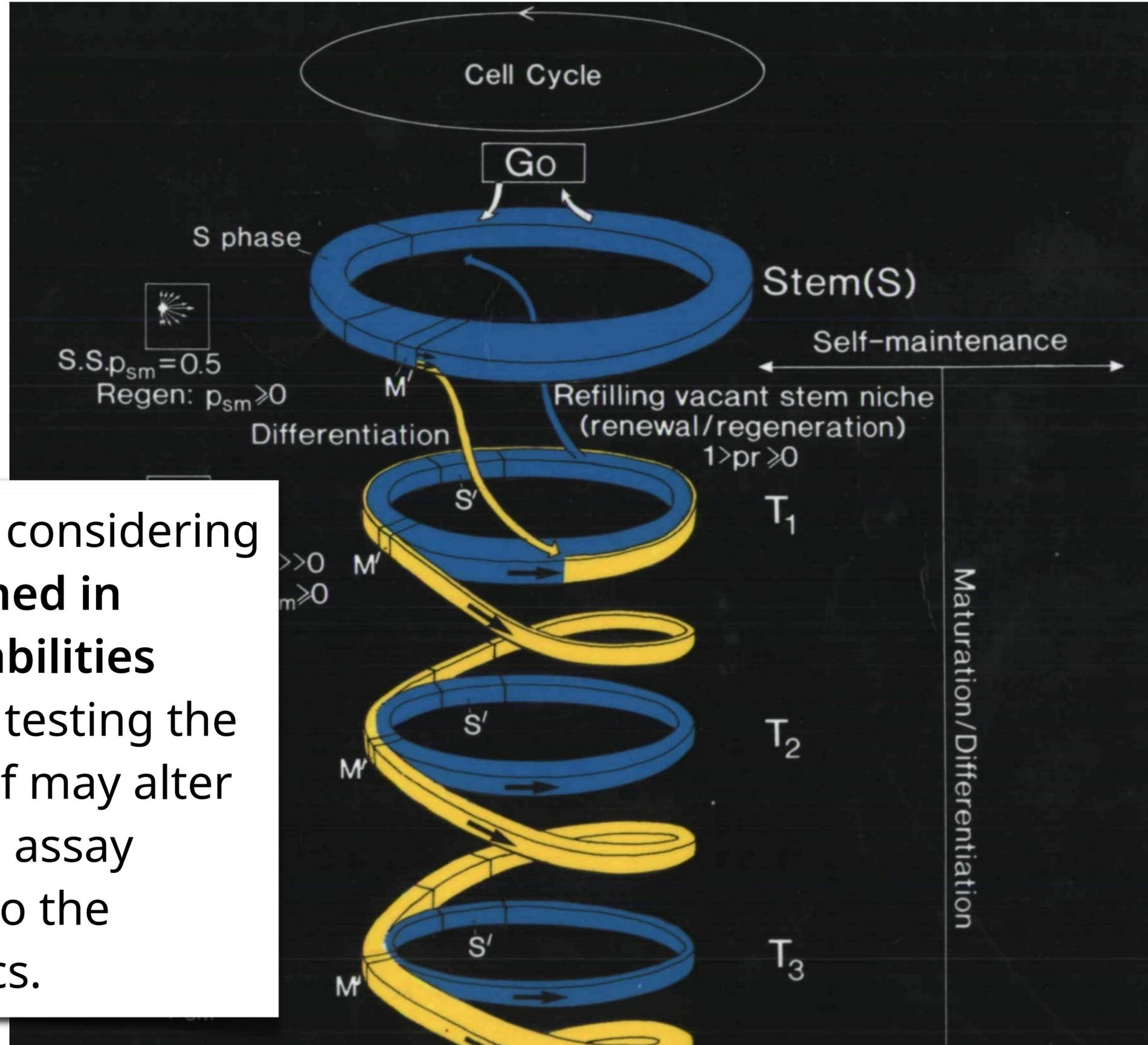
C. S. POTTEN^{1,*} and M. LOEFFLER²

¹CRC Department of Epithelial Cell Biology, Paterson Institute for Cancer Research, Christie Hospital & Holt Radium Institute, Manchester M20 9BX, UK

²Department of Biometry, Medizinische Universitaetsklinik, LFI-02, Joseph-Stelzmann Strasse 9, D5000 Koeln 41, West Germany

* Author for correspondence

One of the major difficulties in considering stem cells is that they are **defined in terms of their functional capabilities** which can only be assessed by testing the abilities of the cells, which itself may alter their characteristics during the assay procedure: a situation similar to the **uncertainty principle in physics**.



HSCs: self-renewal and multipotency

Cells
Tissues
Organs

Cells Tissues Organs 2002;171:8-26

Tissue Stem Cells: Definition, Plasticity, Heterogeneity, Self-Organization and Models – A Conceptual Approach

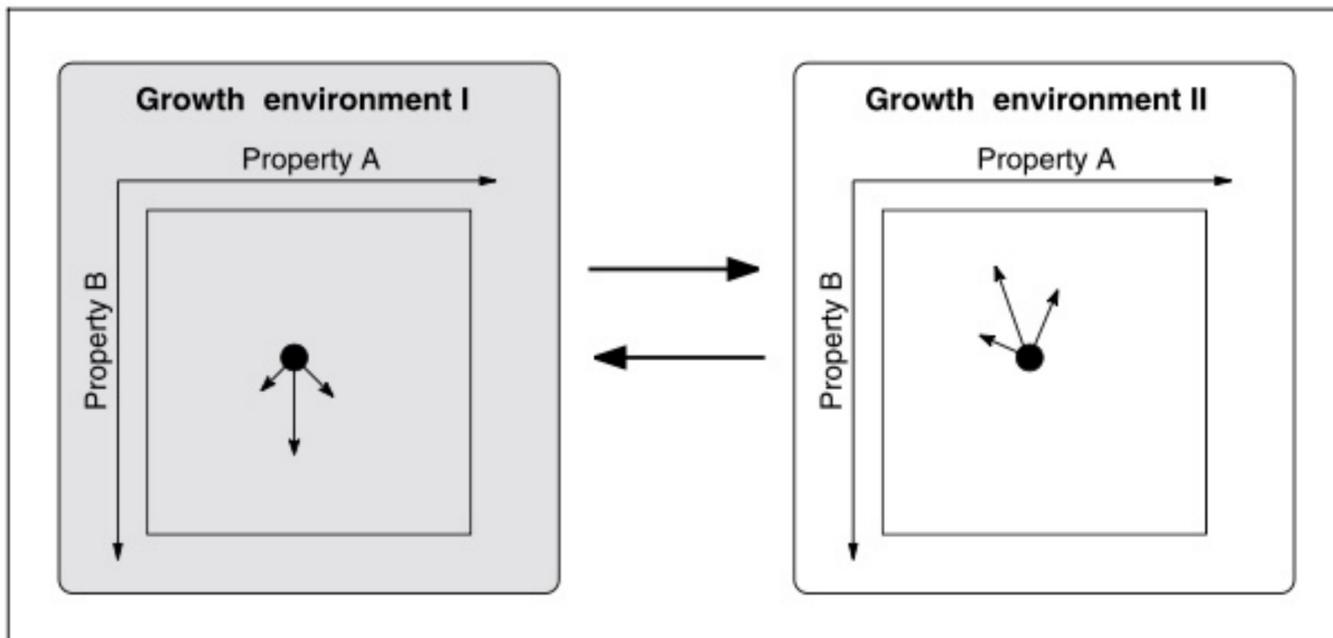
Markus Loeffler Ingo Roeder

Institute for Medical Informatics, Statistics and Epidemiology, University of Leipzig, Leipzig, Germany

Amended Definition of Tissue Stem Cells

Stem cells of a particular tissue are:

- (S1) a potentially heterogeneous population of functionally undifferentiated cells, capable of:
- (S2) homing to an appropriate growth environment;
- (S3) proliferation;
- (S4) production of a large number of differentiated progeny;
- (S5) self-renewing or self-maintaining their population;
- (S6) regenerating the functional tissue after injury with
- (S7) flexibility and reversibility in the use of these options.



HSCs: self-renewal and multipotency

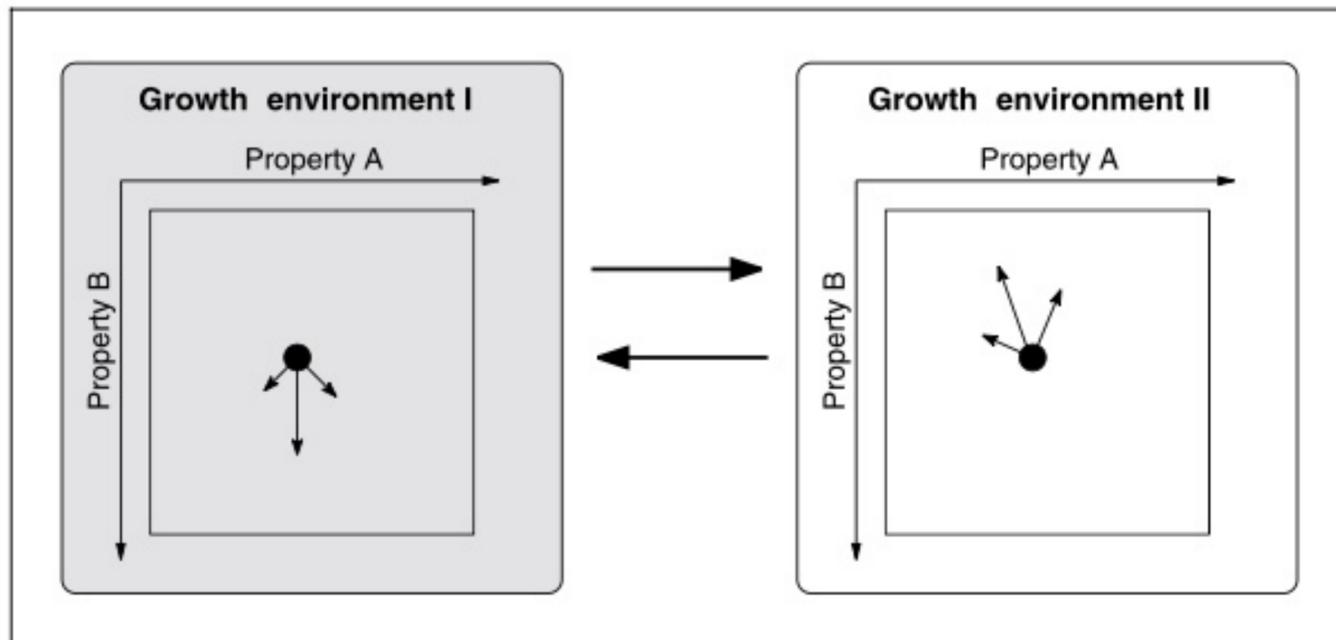
Cells
Tissues
Organs

Cells Tissues Organs 2002;171:8-26

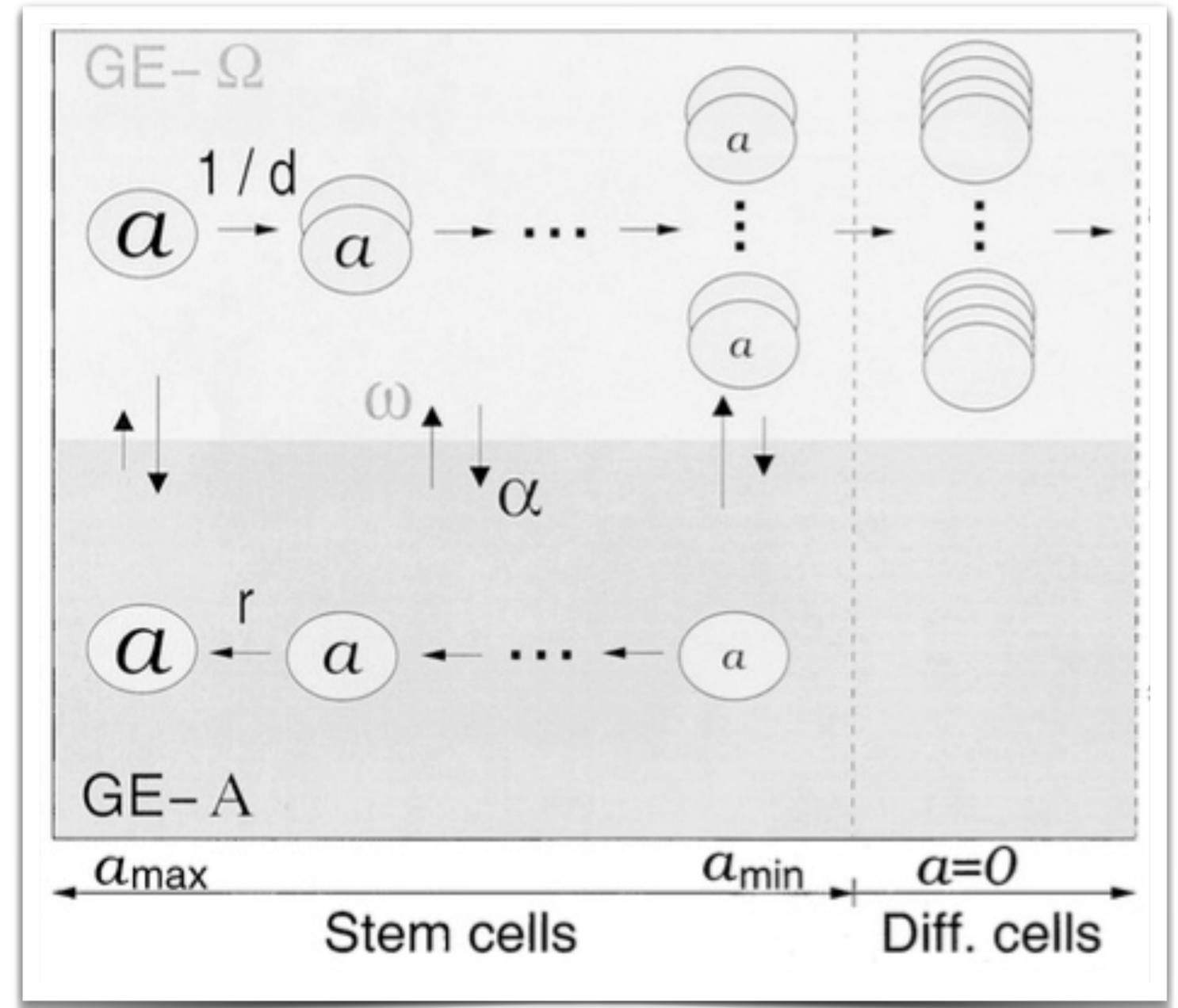
Tissue Stem Cells: Definition, Plasticity, Heterogeneity, Self-Organization and Models – A Conceptual Approach

Markus Loeffler Ingo Roeder

Institute for Medical Informatics, Statistics and Epidemiology, University of Leipzig, Leipzig, Germany



agent-based model

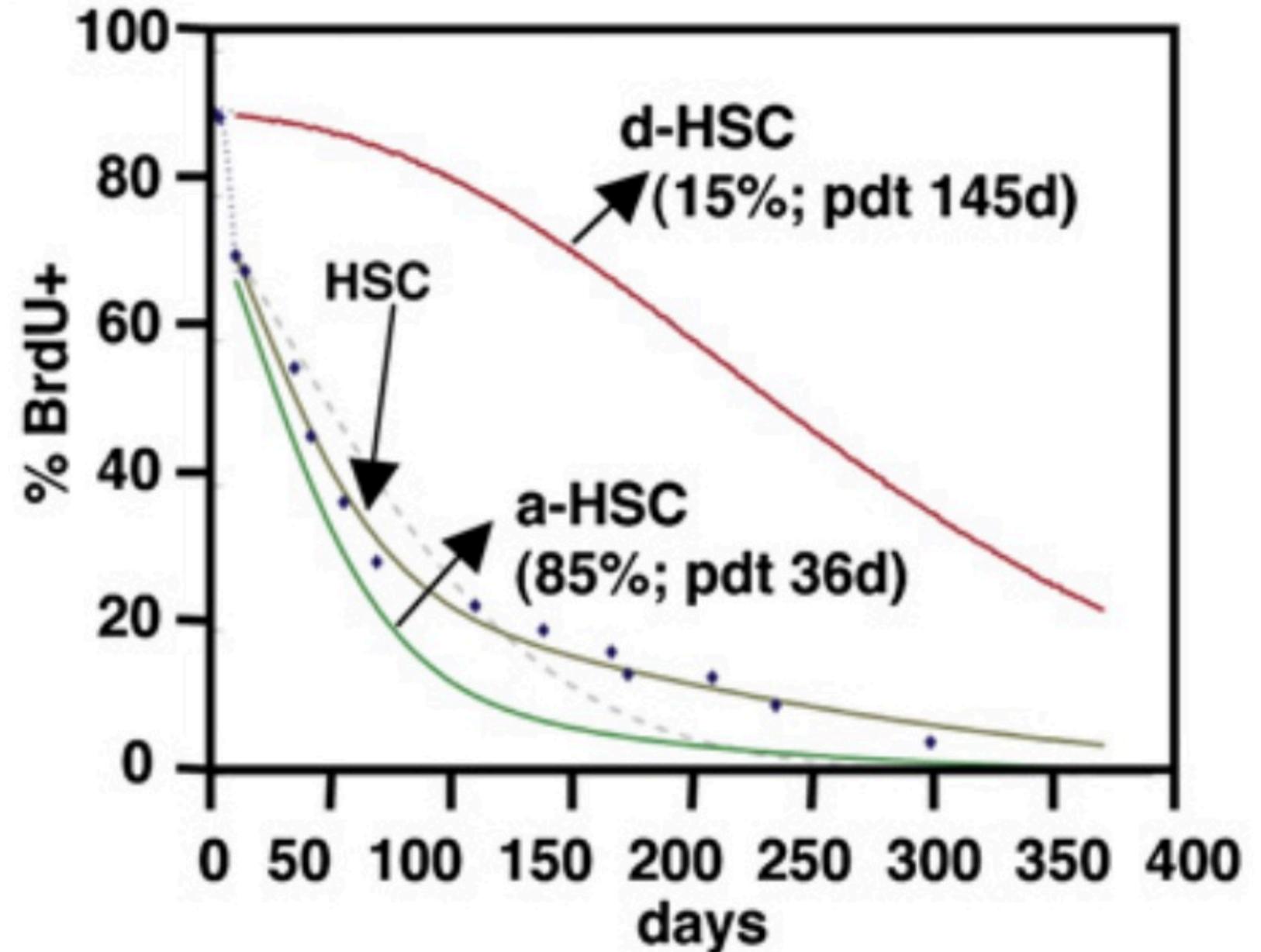
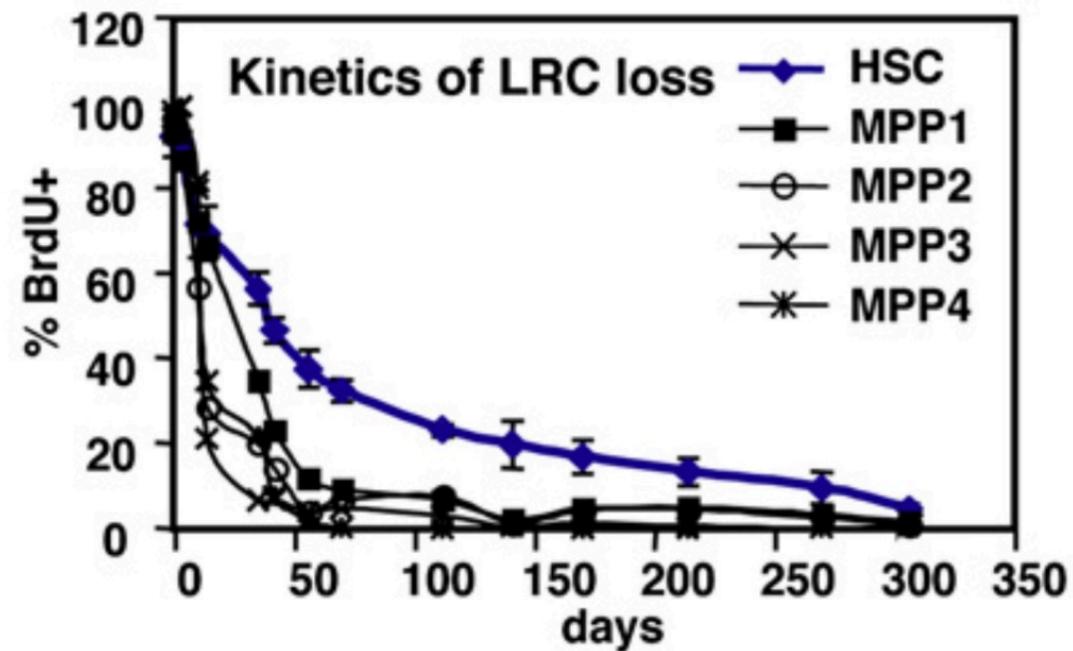


HSCs: reversible activation

Cell

Hematopoietic Stem Cells Reversibly Switch from Dormancy to Self-Renewal during Homeostasis and Repair

Anne Wilson,³ Elisa Laurenti,^{1,8} Gabriela Oser,^{1,8} Richard C. van der Wath,^{4,8} William Blanco-Bose,^{1,8} Maike Jaworski,¹ Sandra Offner,¹ Cyrille F. Dunant,⁶ Leonid Eshkind,⁵ Ernesto Bockamp,⁵ Pietro Lió,⁴ H. Robson MacDonald,³ and Andreas Trumpp^{1,2,7,*}

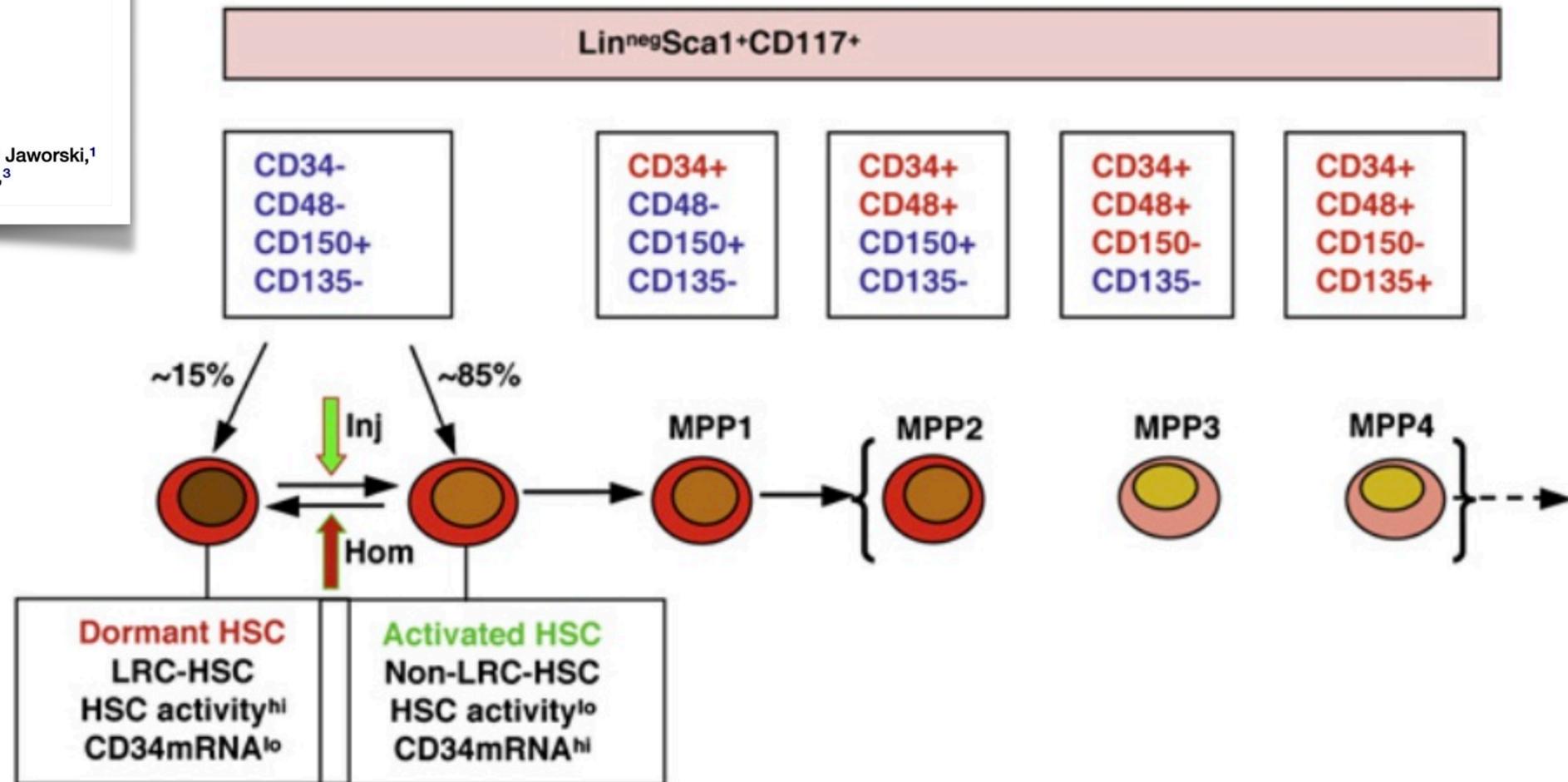
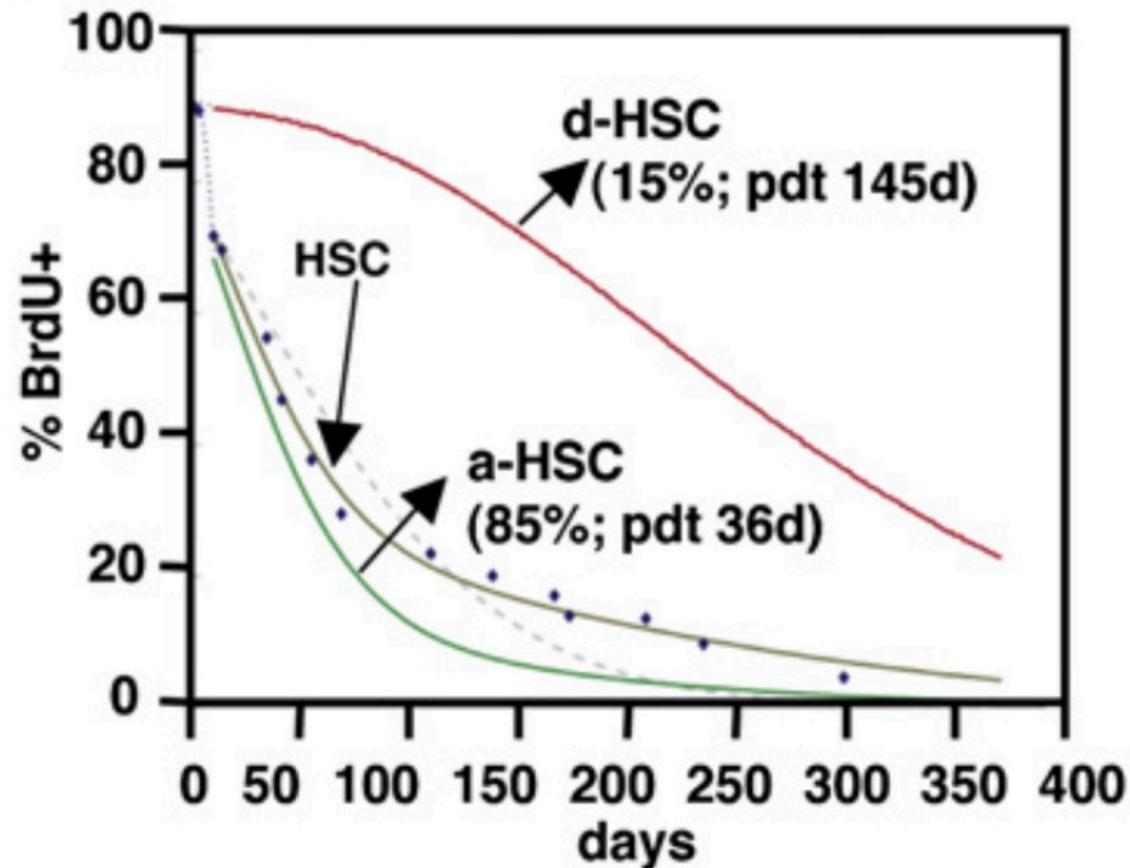


HSCs: reversible activation

Cell

Hematopoietic Stem Cells Reversibly Switch from Dormancy to Self-Renewal during Homeostasis and Repair

Anne Wilson,³ Elisa Laurenti,^{1,8} Gabriela Oser,^{1,8} Richard C. van der Wath,^{4,8} William Blanco-Bose,^{1,8} Maike Jaworski,¹ Sandra Offner,¹ Cyrille F. Dunant,⁶ Leonid Eshkind,⁵ Ernesto Bockamp,⁵ Pietro Lió,⁴ H. Robson MacDonald,³ and Andreas Trumpp^{1,2,7,*}



HSCs: modeling reversibility

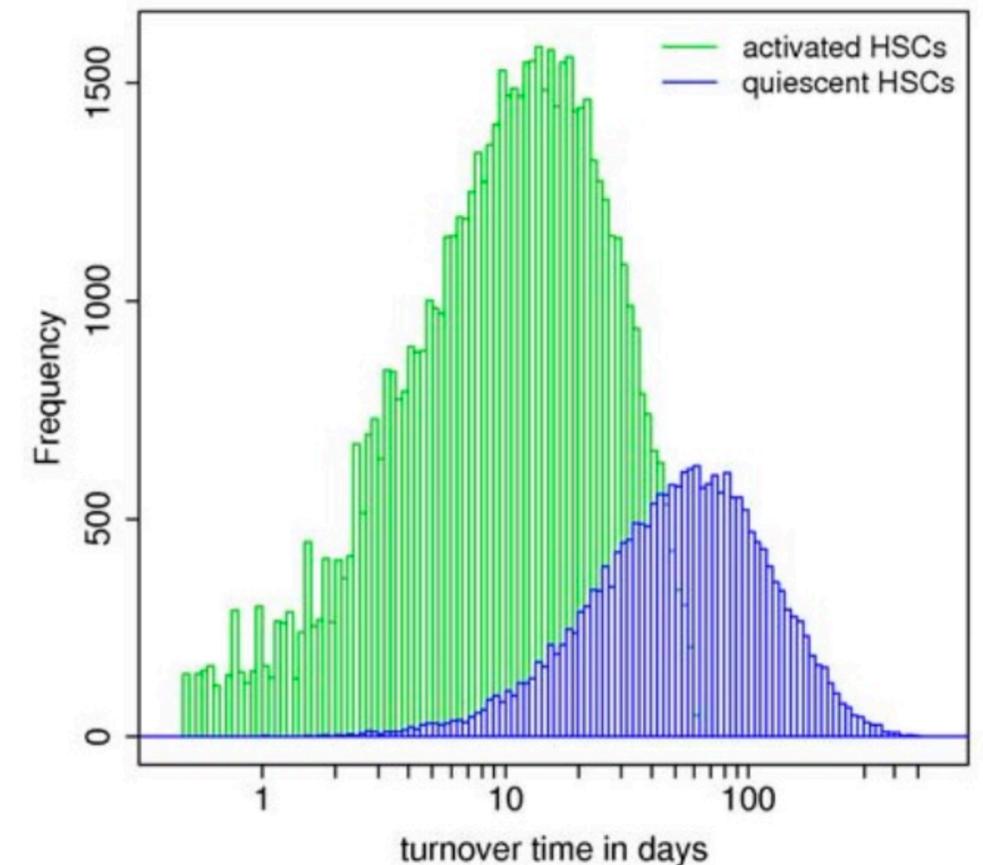
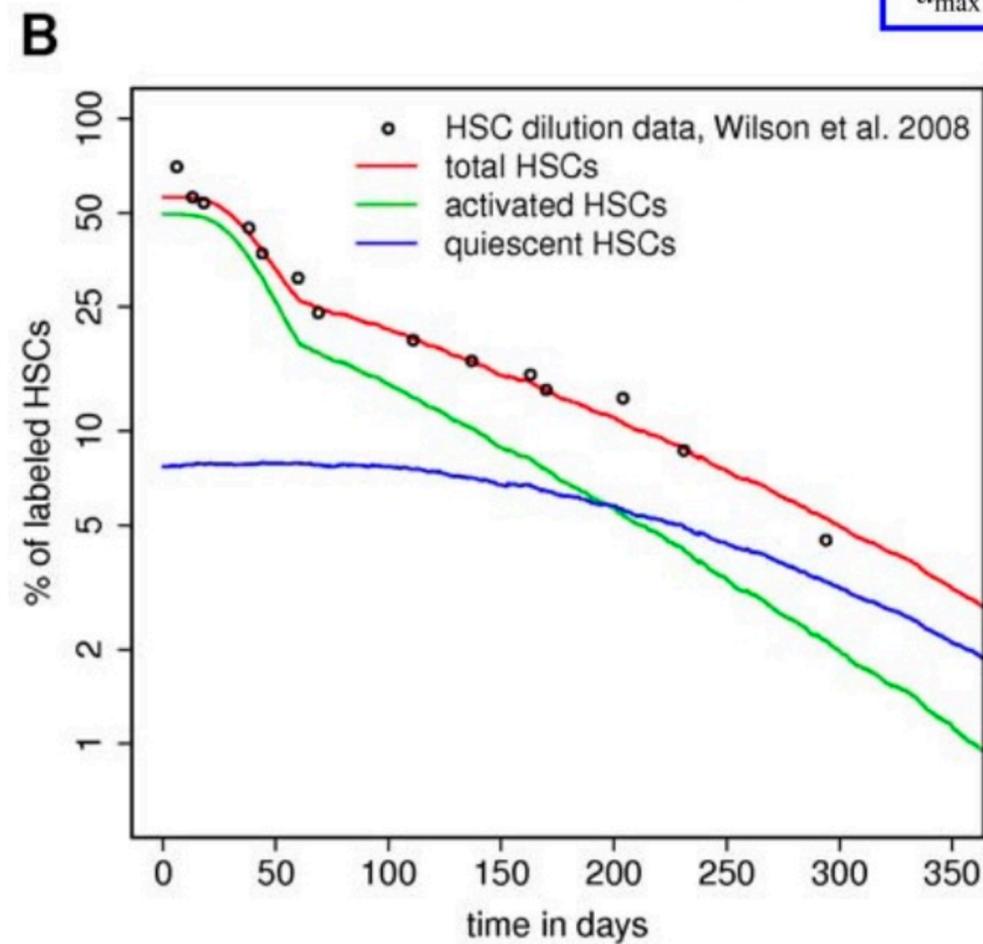
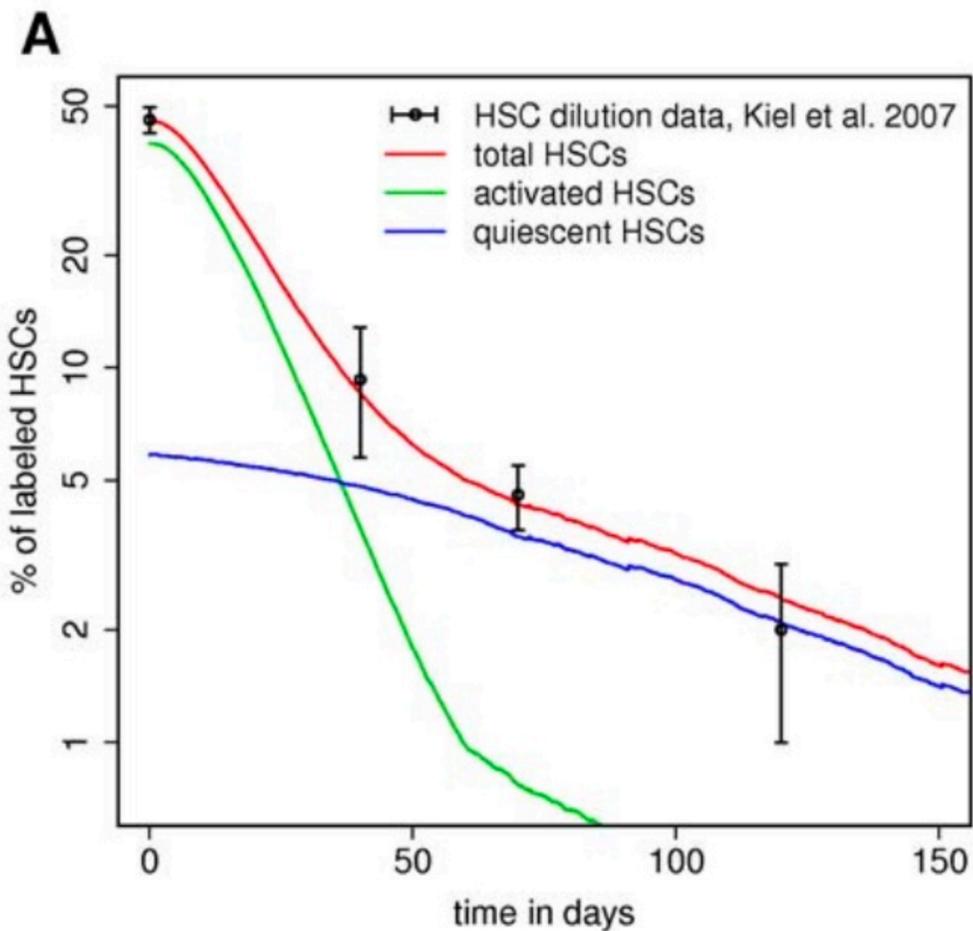
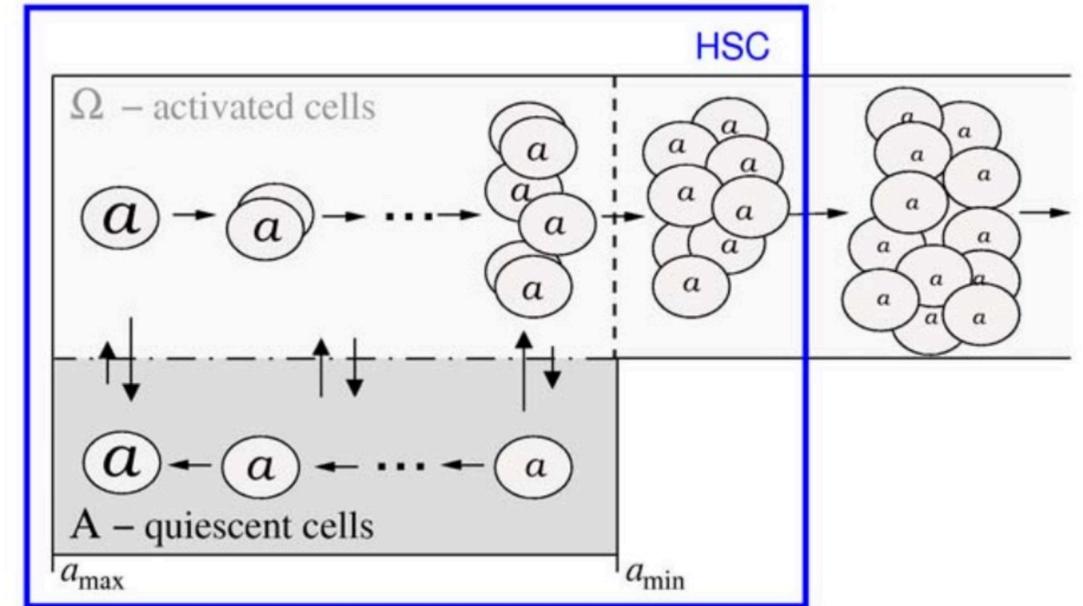
OPEN ACCESS Freely available online

PLoS COMPUTATIONAL BIOLOGY

Stem Cell Proliferation and Quiescence—Two Sides of the Same Coin

Ingmar Glauche^{1*}, Kateri Moore², Lars Thielecke¹, Katrin Horn¹, Markus Loeffler¹, Ingo Roeder^{1,3}

¹Institute for Medical Informatics, Statistics and Epidemiology, University of Leipzig, Leipzig, Germany, ²Department of Gene and Cell Medicine, Mount Sinai School of Medicine, New York, New York, United States of America, ³Department of Computing, Goldsmiths, University of London, London, United Kingdom

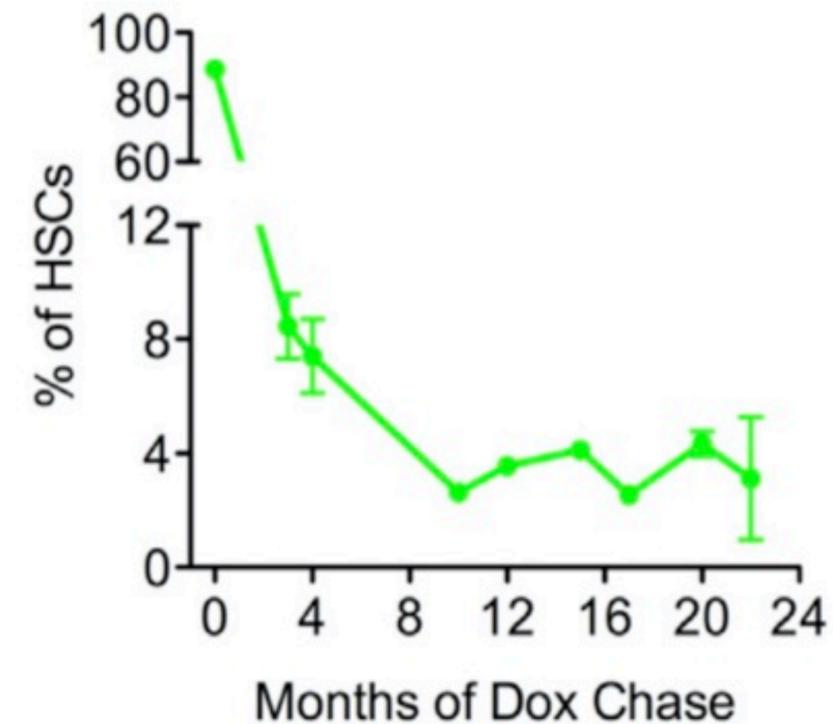
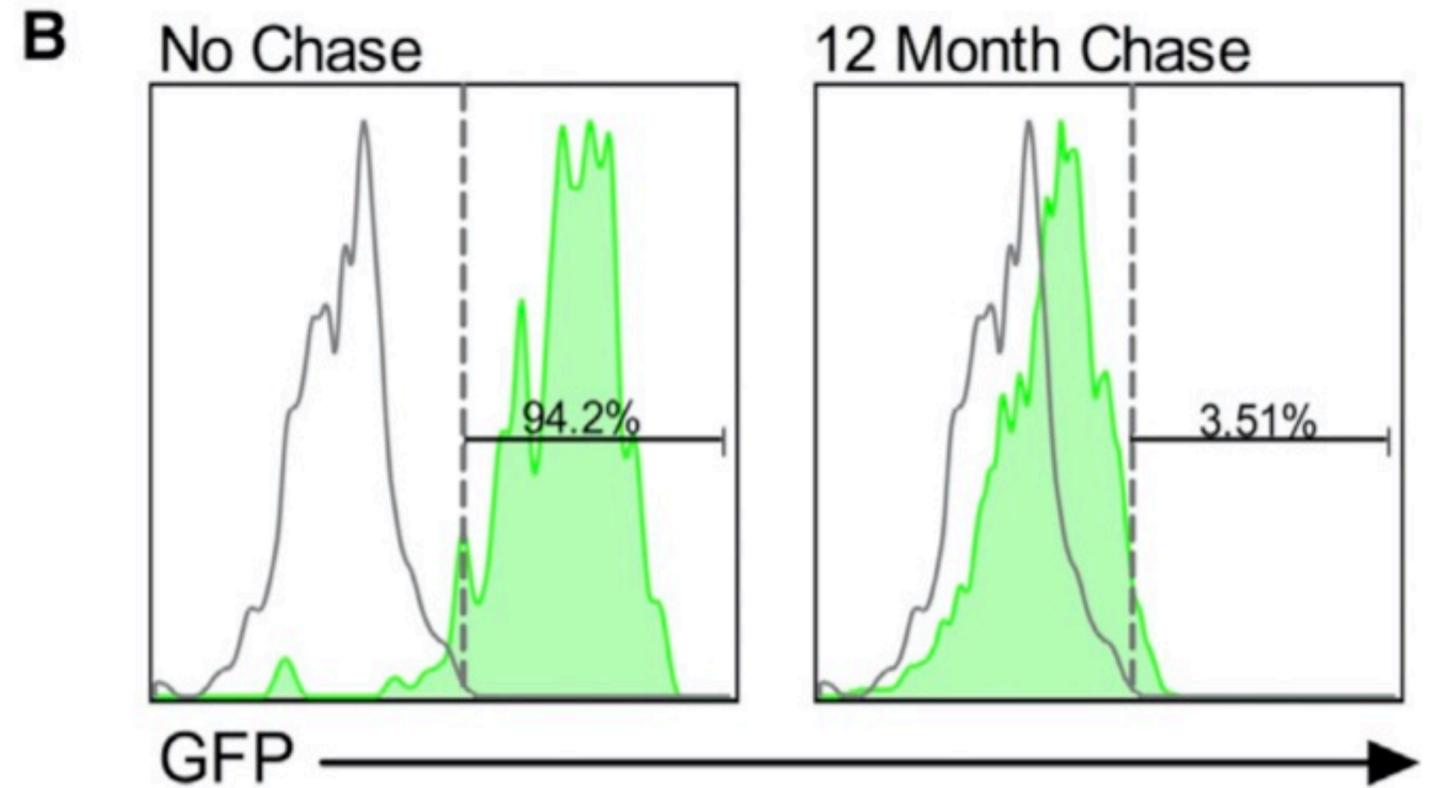
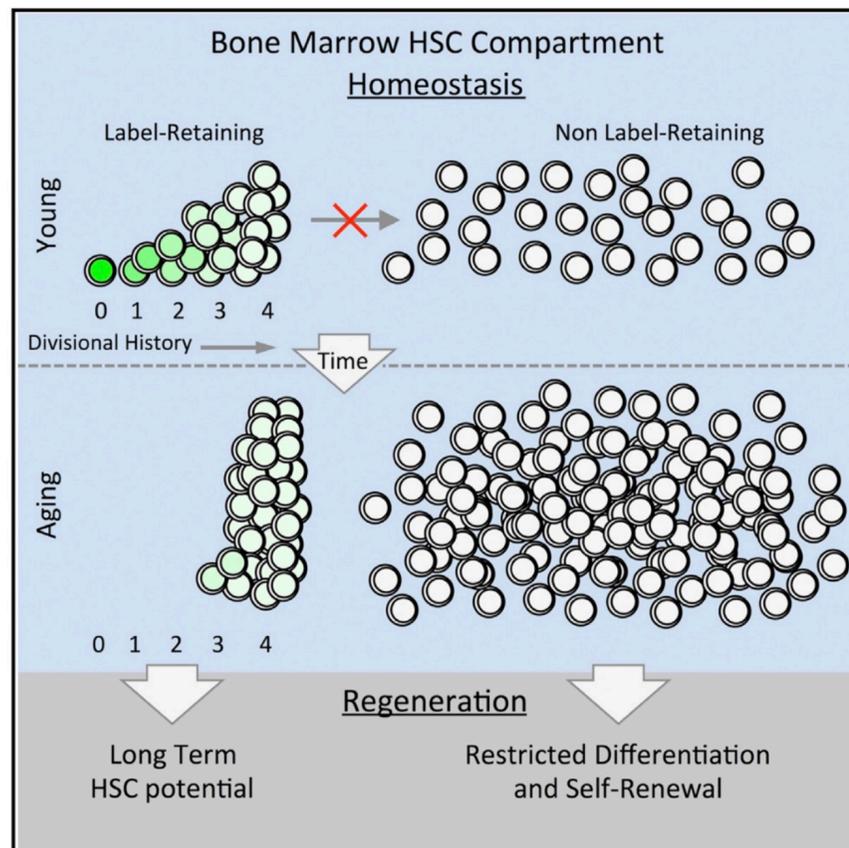


HSCs: understanding dormancy

Cell
Article

Hematopoietic Stem Cells Count and Remember Self-Renewal Divisions

Jeffrey M. Bernitz,^{1,2,3} Huen Suk Kim,^{1,2,3} Ben MacArthur,^{4,5,6} Hans Sieburg,⁷ and Kateri Moore^{1,2,8,*}



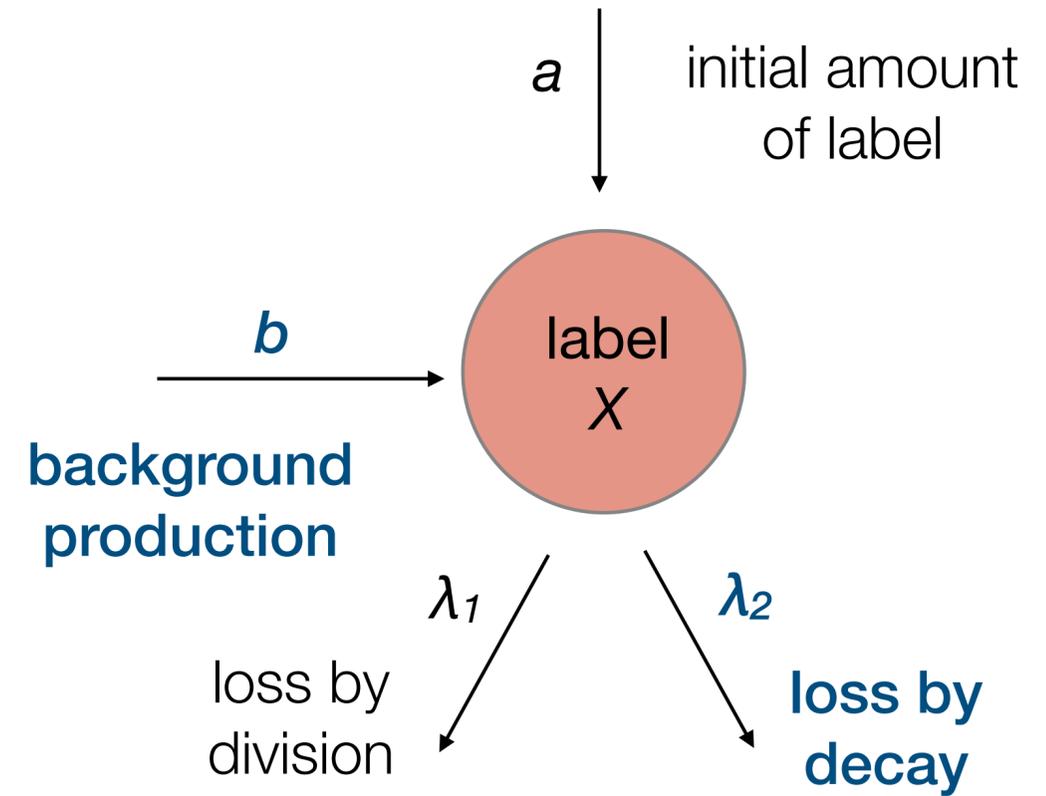
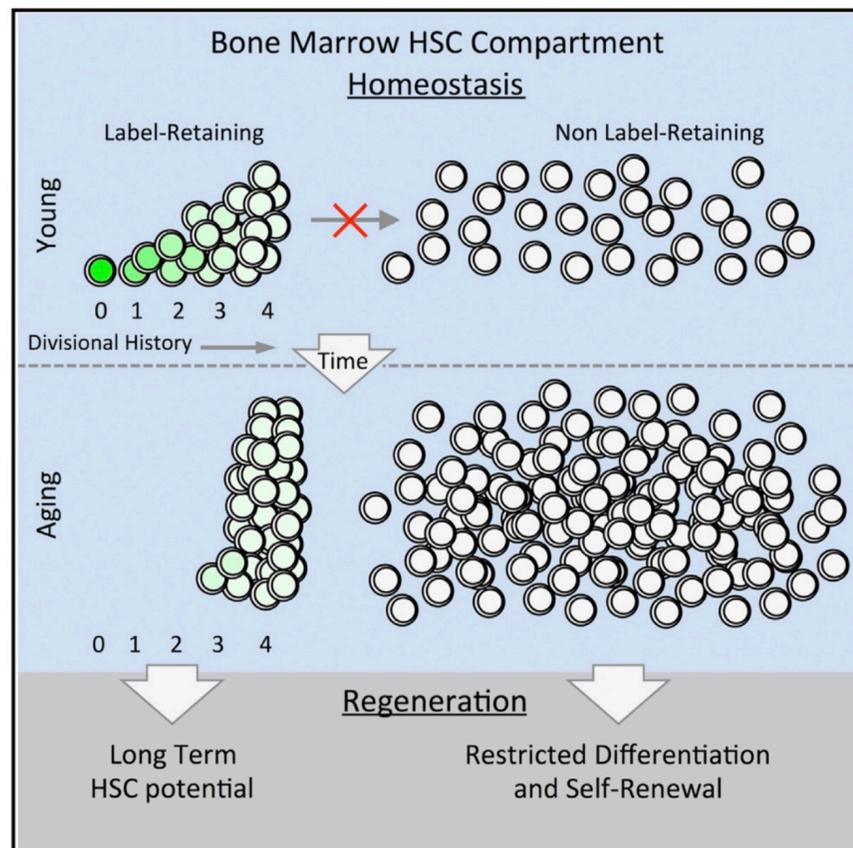
HSCs: understanding dormancy

Cell

Article

Hematopoietic Stem Cells Count and Remember Self-Renewal Divisions

Jeffrey M. Bernitz,^{1,2,3} Huen Suk Kim,^{1,2,3} Ben MacArthur,^{4,5,6} Hans Sieburg,⁷ and Kateri Moore^{1,2,8,*}



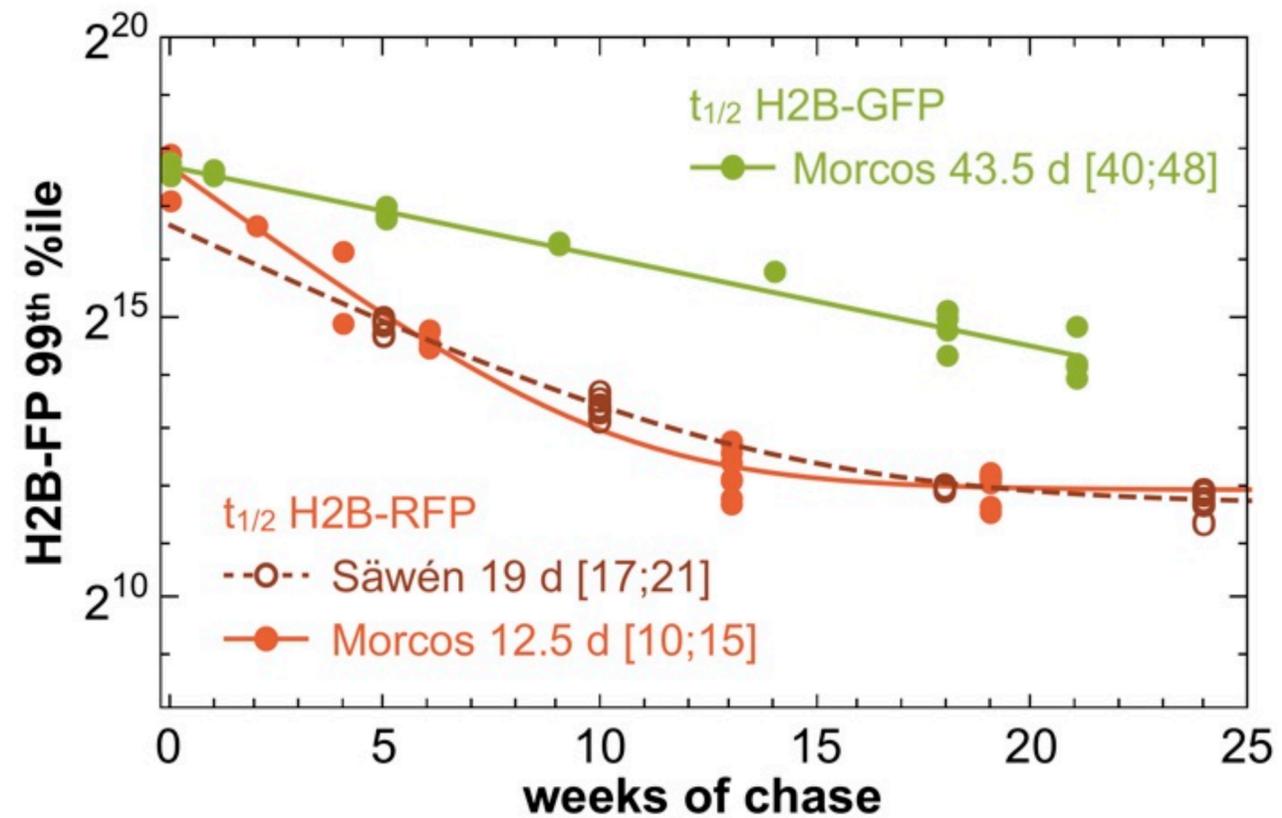
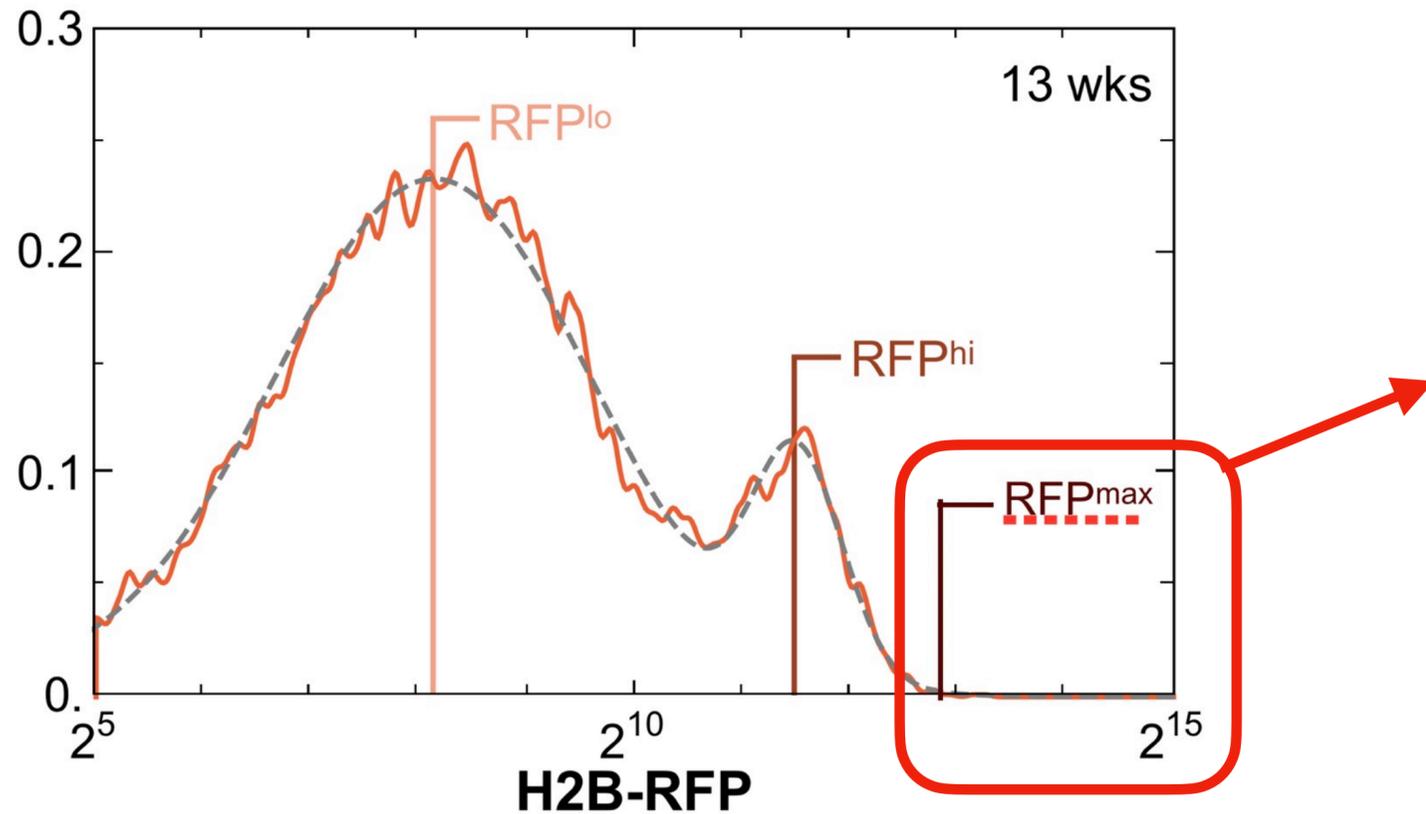
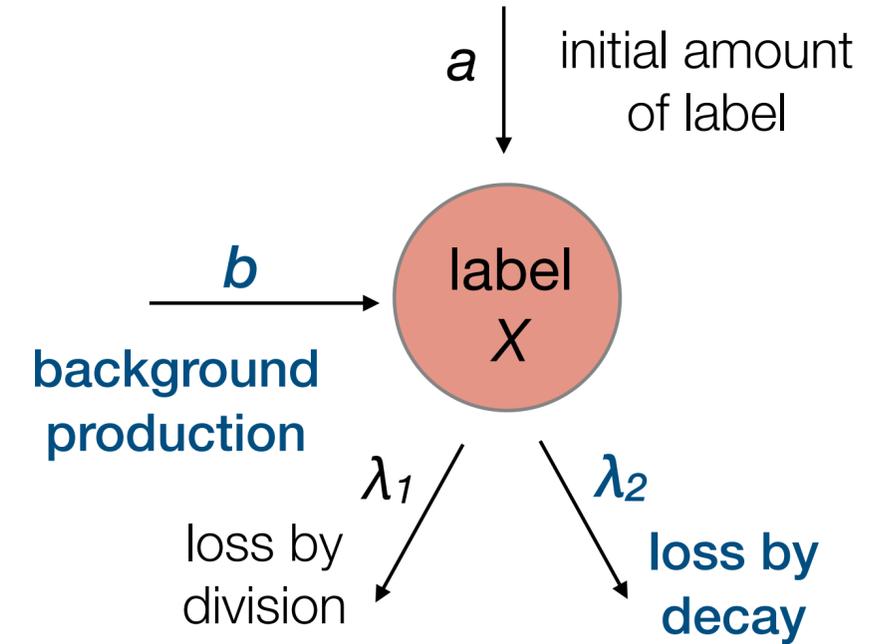
HSCs: understanding dormancy



ARTICLE

Continuous mitotic activity of primitive hematopoietic stem cells in adult mice

Mina N.F. Morcos¹, Thomas Zerjatke², Ingmar Glauche², Clara M. Munz¹, Yan Ge¹, Andreas Petzold³, Susanne Reinhardt³, Andreas Dahl³, Natasha S. Anstee⁴, Ruzhica Bogeska⁴, Michael D. Milsom⁴, Petter Säwén⁵, Haixia Wan⁵, David Bryder^{5,6}, Axel Roers¹, and Alexander Gerbault¹



-> estimated loss by decay:

12.5 days for RFP (6 weeks for GFP)

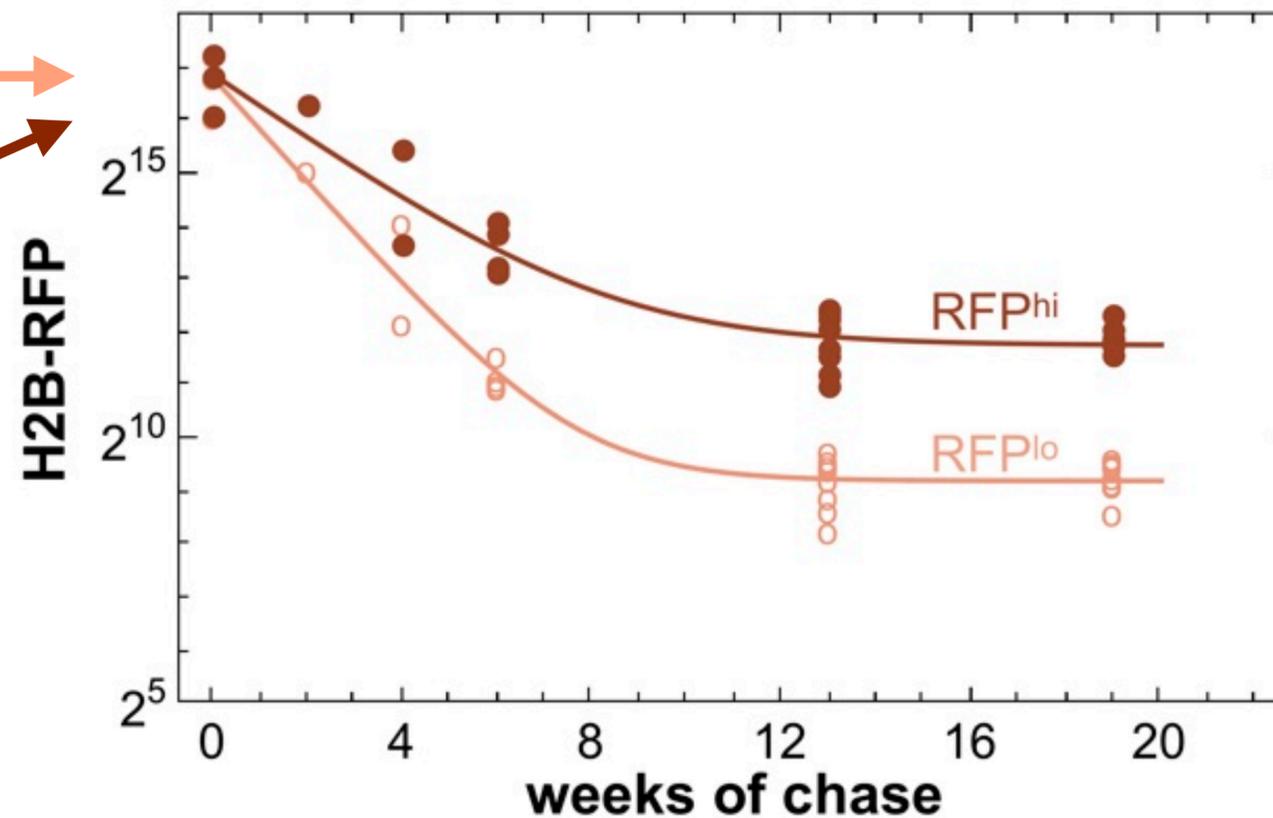
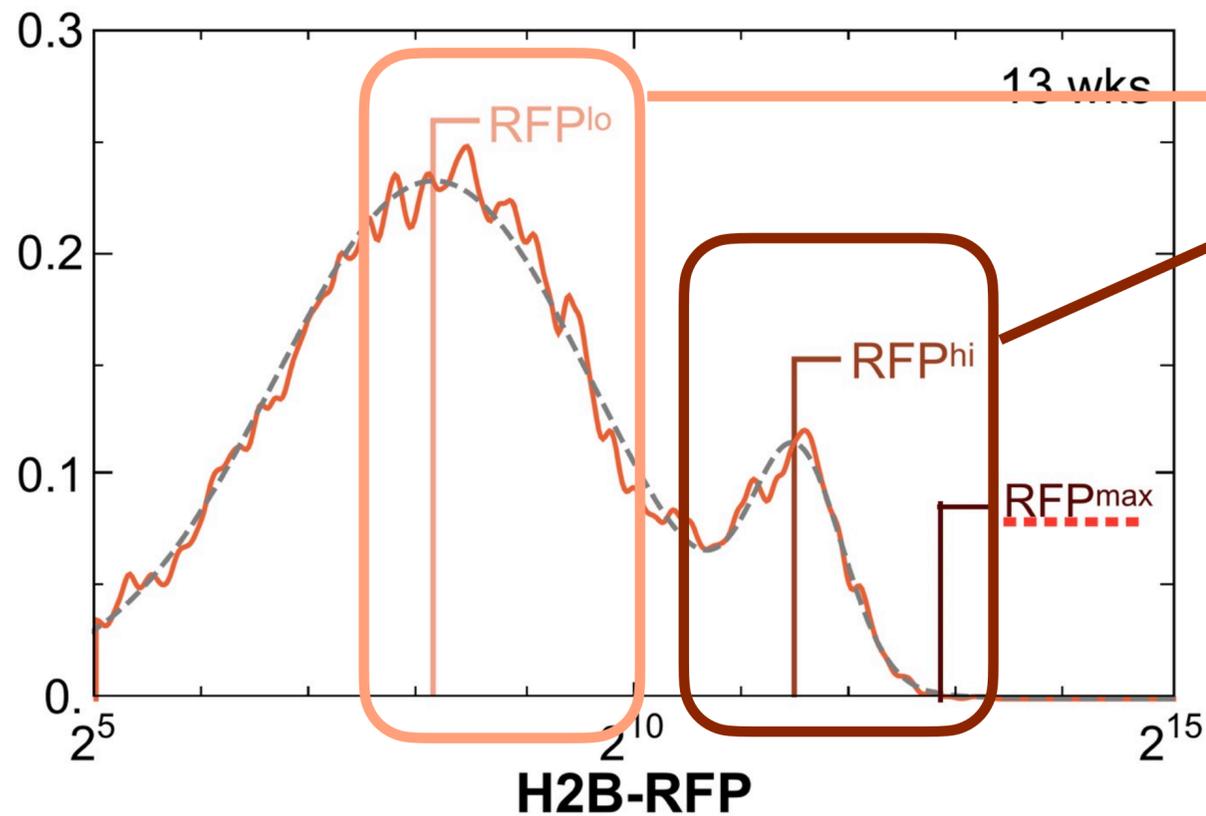
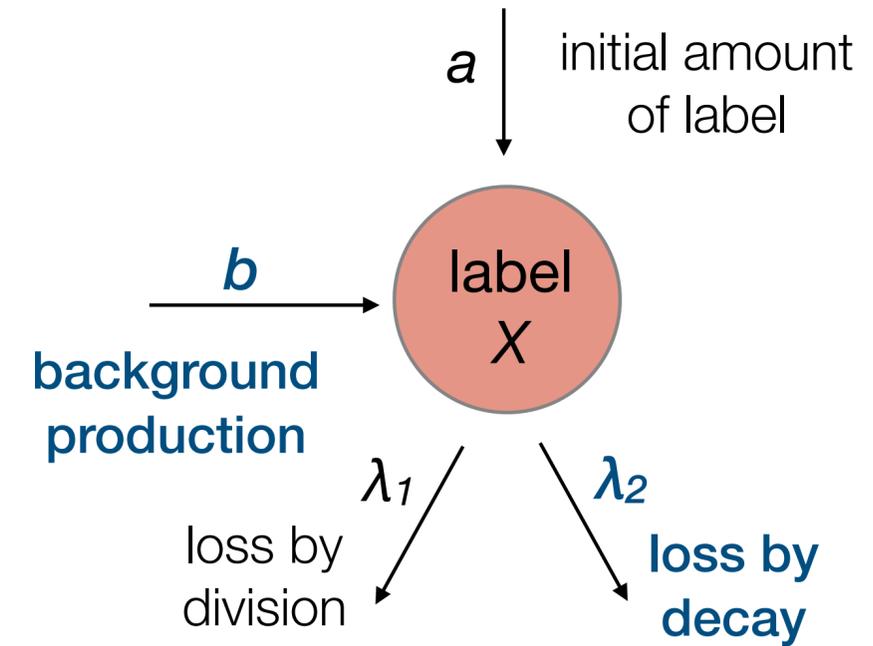
HSCs: understanding dormancy



ARTICLE

Continuous mitotic activity of primitive hematopoietic stem cells in adult mice

Mina N.F. Morcos¹, Thomas Zerjatke², Ingmar Glauche², Clara M. Munz¹, Yan Ge¹, Andreas Petzold³, Susanne Reinhardt³, Andreas Dahl³, Natasha S. Anstee⁴, Ruzhica Bogeska⁴, Michael D. Milsom⁴, Petter Säwén⁵, Haixia Wan⁵, David Bryder^{5,6}, Axel Roers¹, and Alexander Gerbault¹



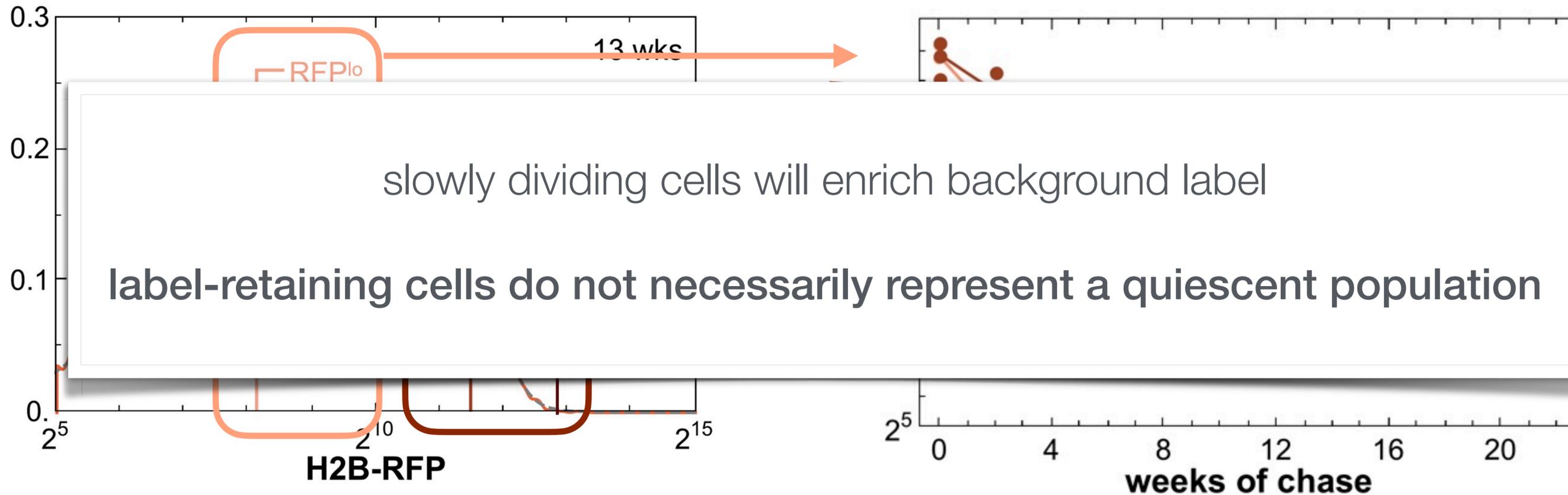
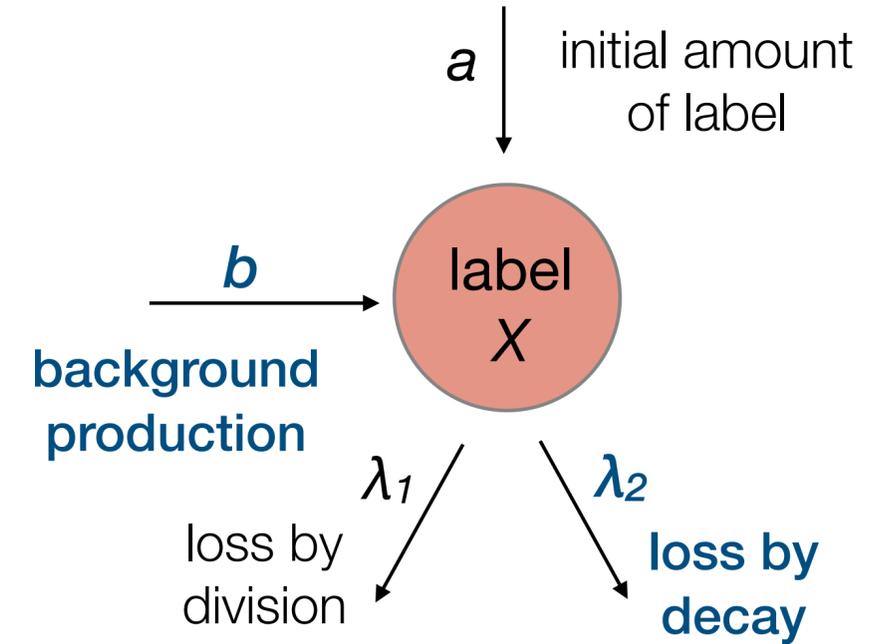
HSCs: understanding dormancy



ARTICLE

Continuous mitotic activity of primitive hematopoietic stem cells in adult mice

Mina N.F. Morcos¹, Thomas Zerjatke², Ingmar Glauche², Clara M. Munz¹, Yan Ge¹, Andreas Petzold³, Susanne Reinhardt³, Andreas Dahl³, Natasha S. Anstee⁴, Ruzhica Bogeska⁴, Michael D. Milsom⁴, Petter Säwén⁵, Haixia Wan⁵, David Bryder^{5,6}, Axel Roers¹, and Alexander Gerbault¹

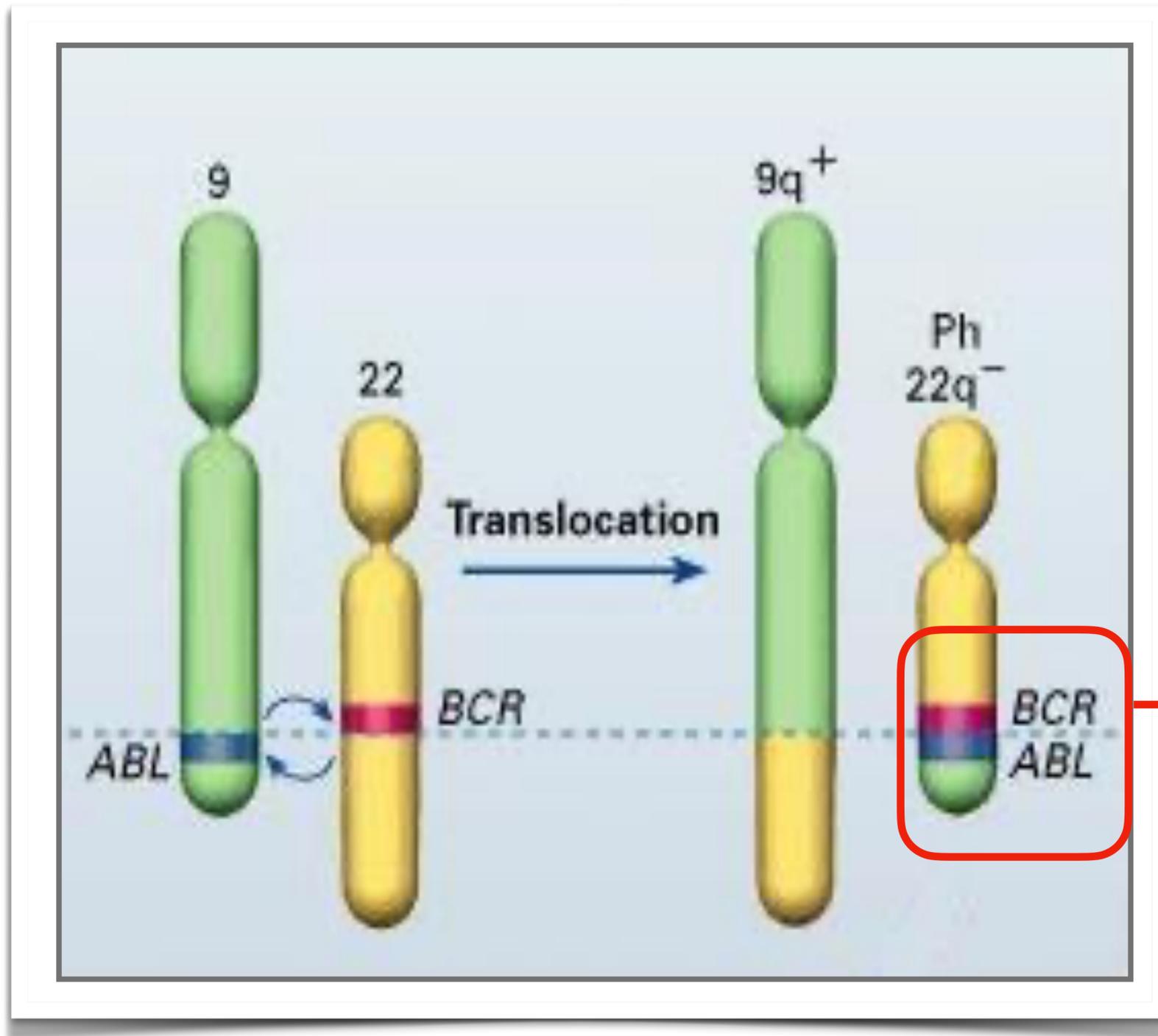


-> estimated division times:

2 weeks for proliferating cells

15 weeks for dormant cells

Leukemia treatment response



Chronic Myeloid Leukemia (CML)

enhanced production of differentiated
BCR-ABL⁺ myeloid cells

displacement of normal hematopoiesis

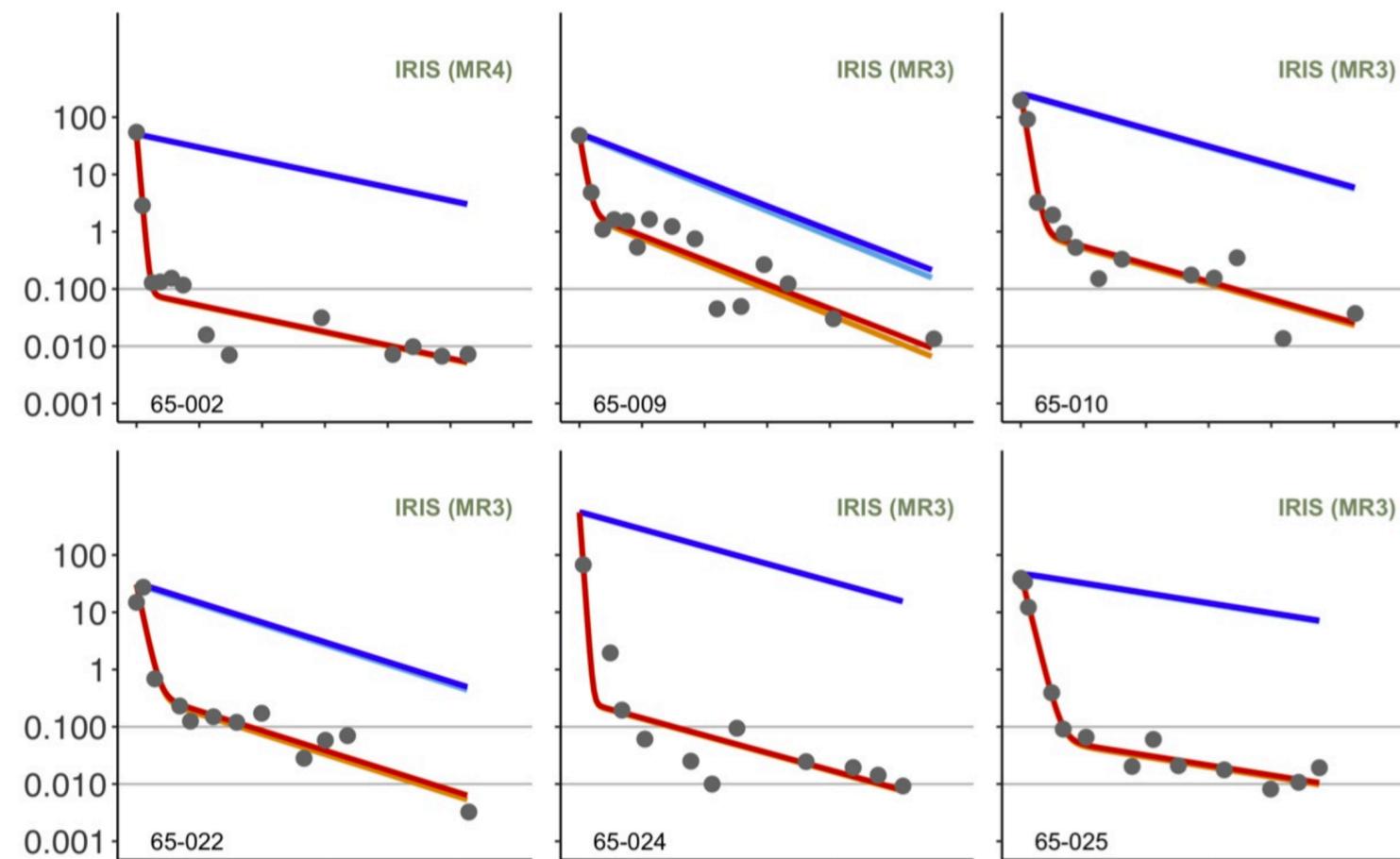
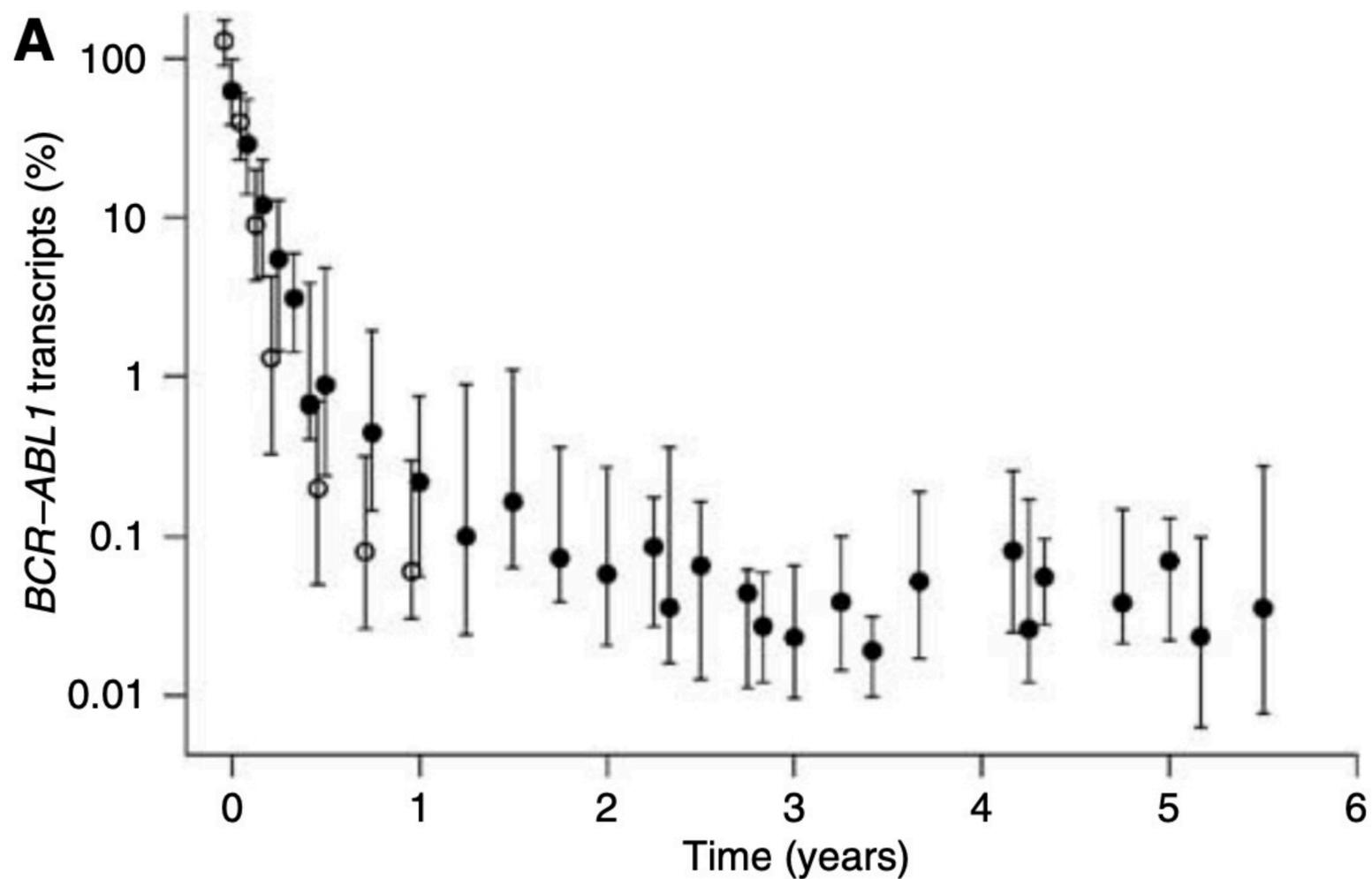
transit into (mostly lethal) blast crisis

Unique

Measurable

Targetable

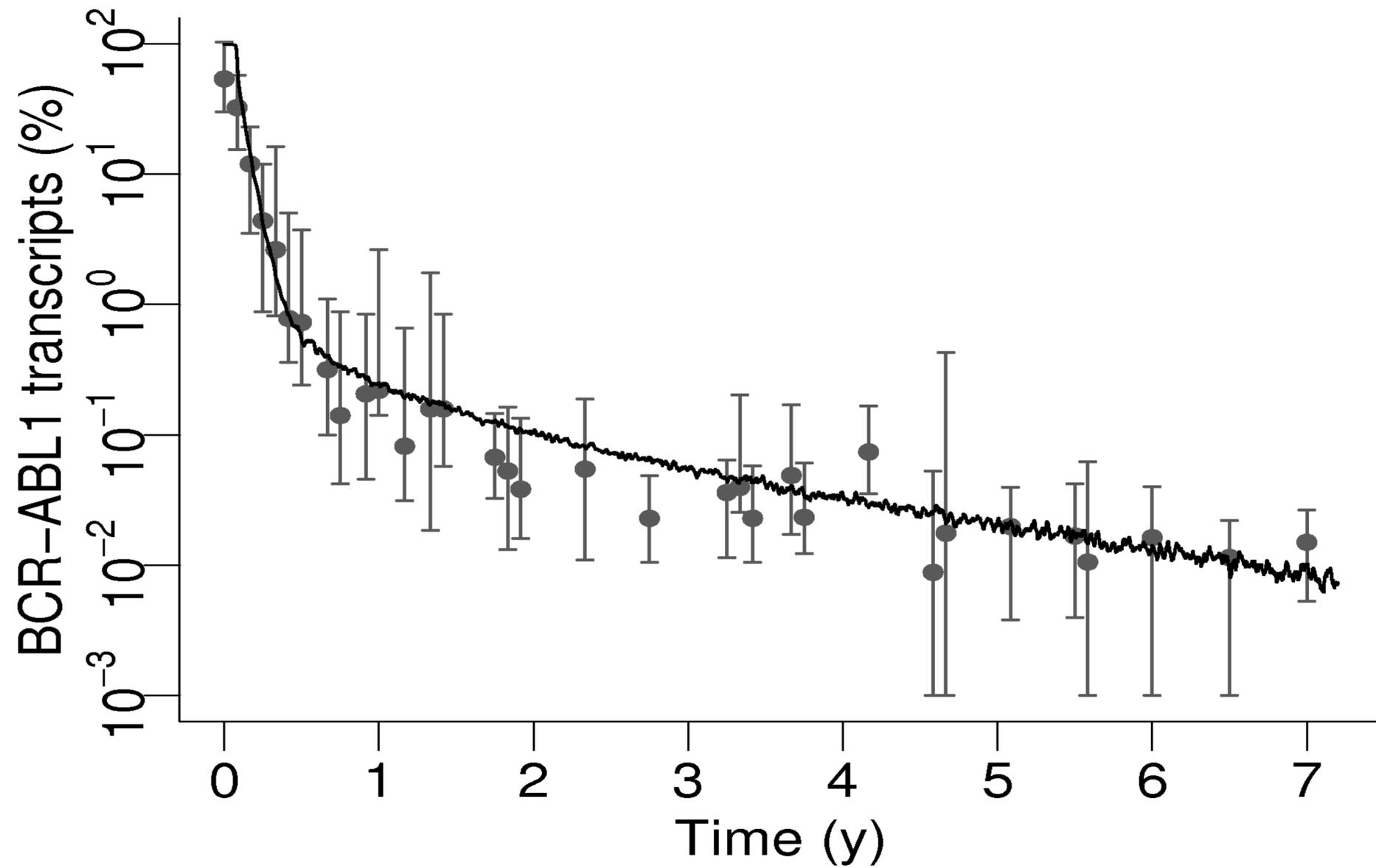
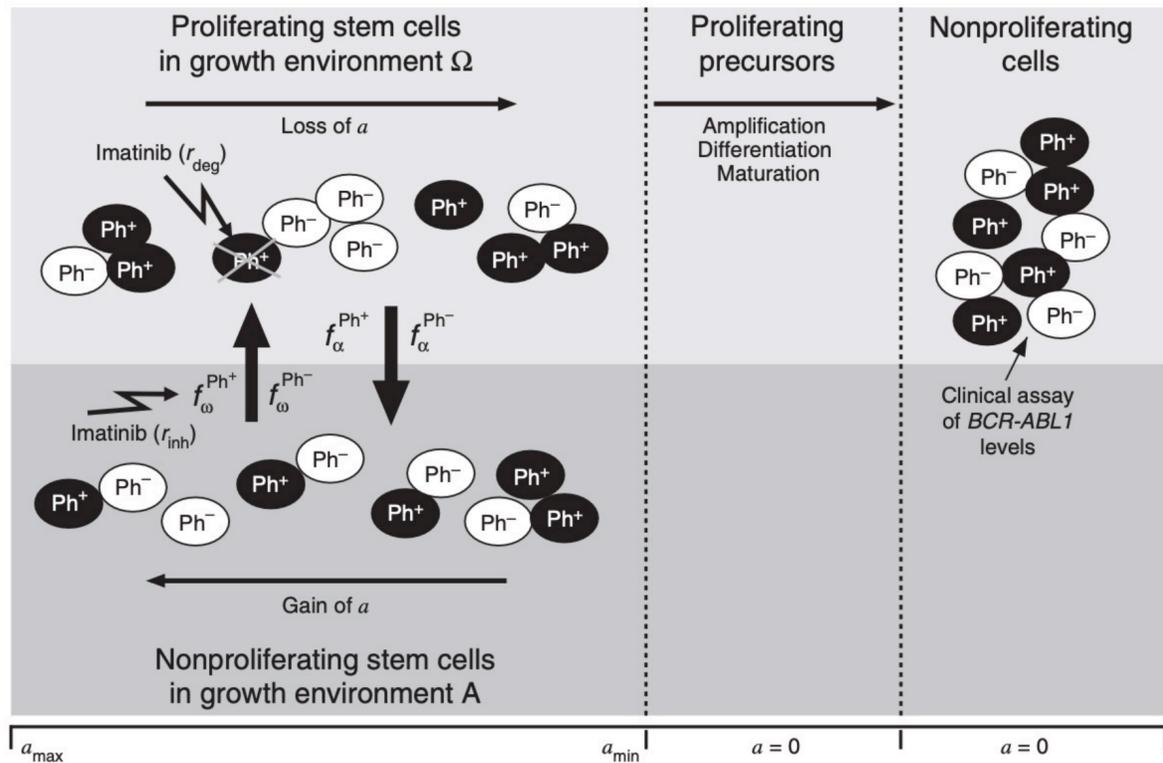
Leukemia treatment response



biphasic response pattern

Leukemia treatment response

biphasic response pattern



Leukemia treatment response

Chronic Myeloid Leukemia

ARTICLE

Reduced tyrosine kinase inhibitor dose is predicted to be as effective as standard dose in chronic myeloid leukemia: a simulation study based on phase III trial data



EUROPEAN HEMATOLOGY ASSOCIATION

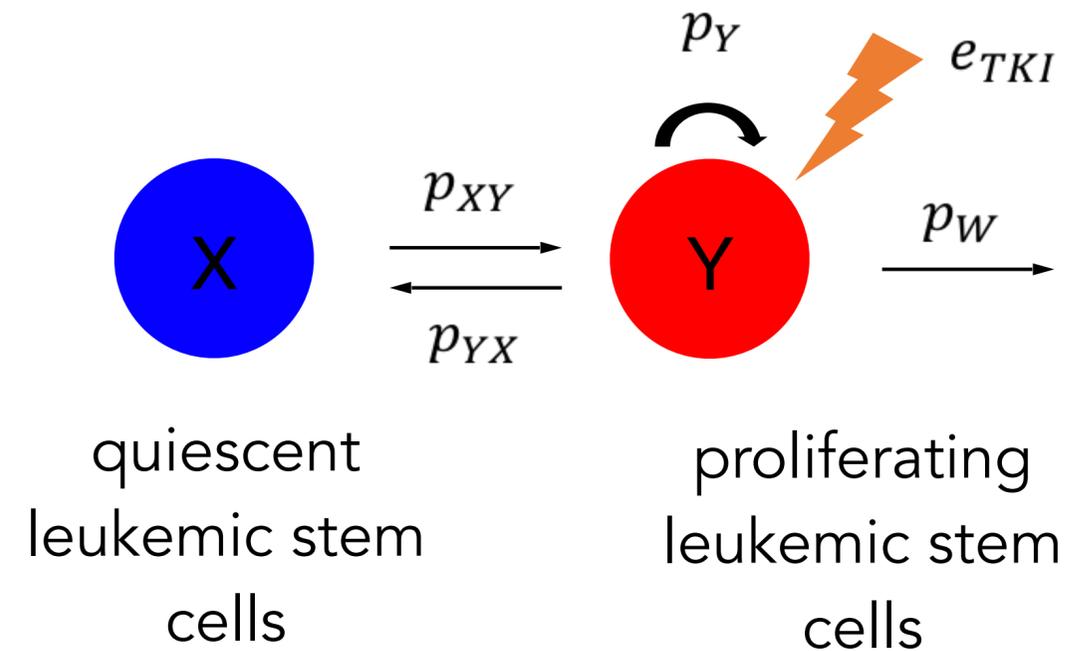


Artur C. Fassoni,^{1,2} Christoph Baldow,² Ingo Roeder^{2,3*} and Ingmar Glauche^{2*}

¹Instituto de Matemática e Computação, Universidade Federal de Itajubá, Brazil; ²Institute for Medical Informatics and Biometry, Faculty of Medicine Carl Gustav Carus, Technische Universität Dresden, Germany and ³National Center for Tumor Diseases (NCT), Partner Site Dresden, Germany

*IR and IG contributed equally to this work.

Haematologica 2018
 Volume 103(11):1825-1834

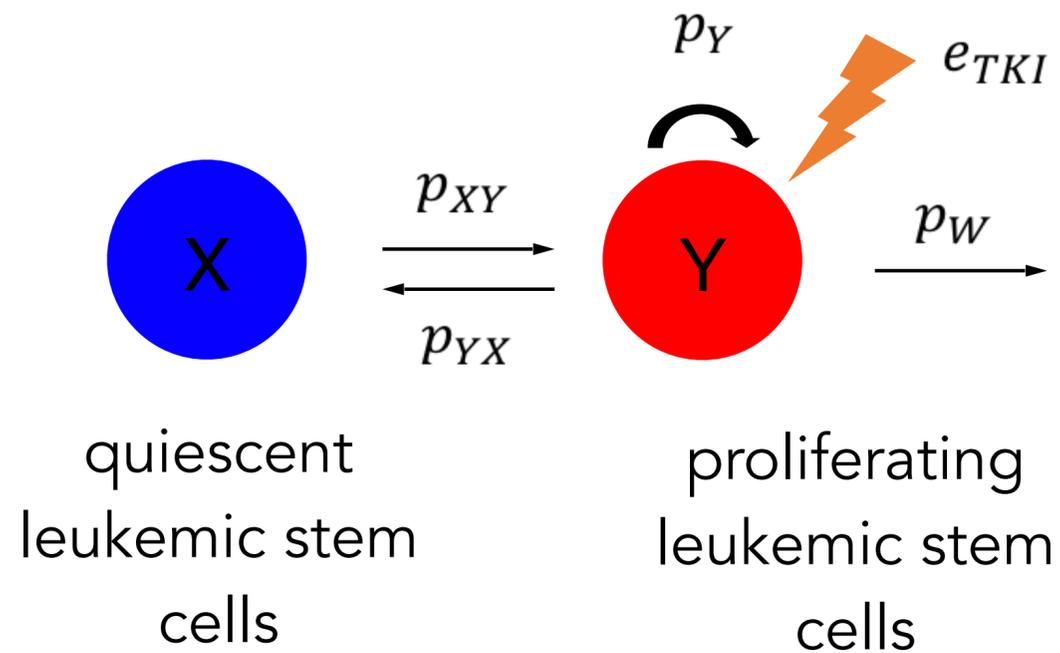


translation into a mathematical formulation:

$$\frac{dX}{dt} = -p_{XY}X + p_{YX}Y$$

$$\frac{dY}{dt} = p_{XY}X - p_{YX}Y + p_Y Y - e_{TKI}Y$$

Leukemia treatment response



$$\frac{d}{dt} \begin{bmatrix} X \\ Y \end{bmatrix} = \begin{bmatrix} p_{XY} & -p_{YX} - q \\ -p_{XY} & p_{YX} \end{bmatrix} \begin{bmatrix} X \\ Y \end{bmatrix} \quad \text{with effective toxicity } q = e_{TKI} - p_Y$$

Yielding the following solution

$$Y(t) = Y_0 \left(C_1 e^{\lambda_1 t} + C_2 e^{\lambda_2 t} \right) \quad \text{and} \quad X(t) = Y_0 \left(C_3 e^{\lambda_1 t} + C_4 e^{\lambda_2 t} \right)$$

With eigenvalues

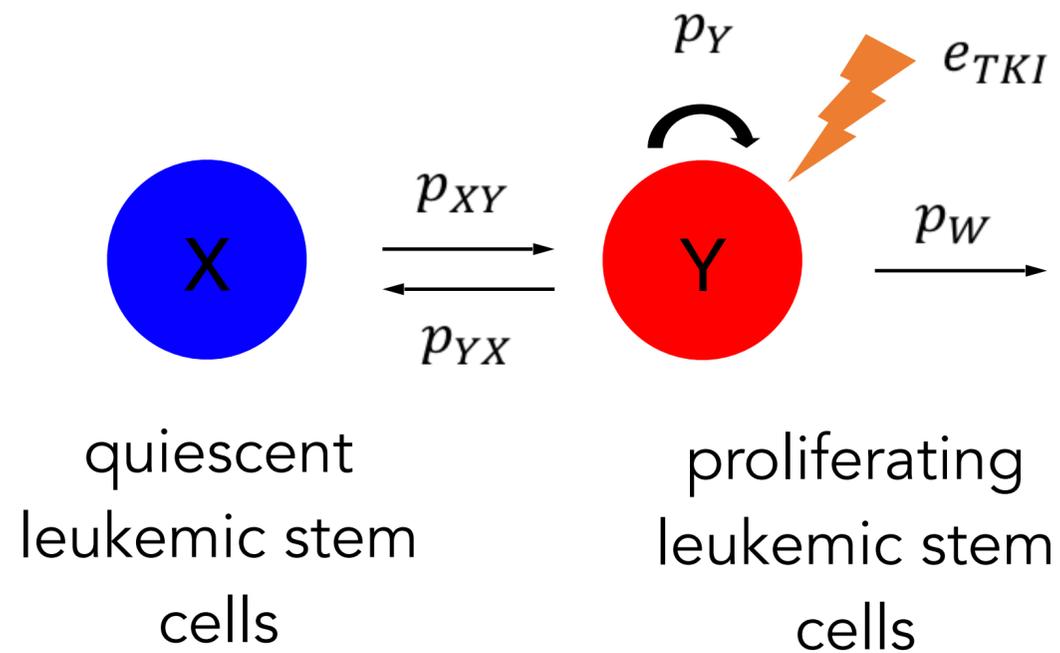
$$\lambda_1 = \frac{1}{2} \left(-p_{XY} - p_{YX} - q - \sqrt{(p_{XY} + p_{YX} + q)^2 - 4p_{XY}q} \right)$$

$$\lambda_2 = \frac{1}{2} \left(-p_{XY} - p_{YX} - q + \sqrt{(p_{XY} + p_{YX} + q)^2 - 4p_{XY}q} \right)$$

$$\frac{dX}{dt} = -p_{XY}X + p_{YX}Y$$

$$\frac{dY}{dt} = p_{XY}X - p_{YX}Y + p_Y Y - e_{TKI}Y$$

Leukemia treatment response



$$\frac{dX}{dt} = -p_{XY}X + p_{YX}Y$$

$$\frac{dY}{dt} = p_{XY}X - p_{YX}Y + p_Y Y - e_{TKI}Y$$

$$\frac{d}{dt} \begin{bmatrix} X \\ Y \end{bmatrix} = \begin{bmatrix} p_{XY} & -p_{YX} - q \\ -p_{XY} & p_{YX} \end{bmatrix} \begin{bmatrix} X \\ Y \end{bmatrix}$$

with effective toxicity
 $q = e_{TKI} - p_Y$

Yielding the following solution

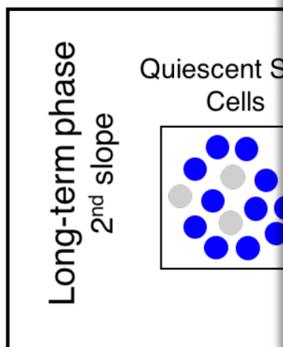
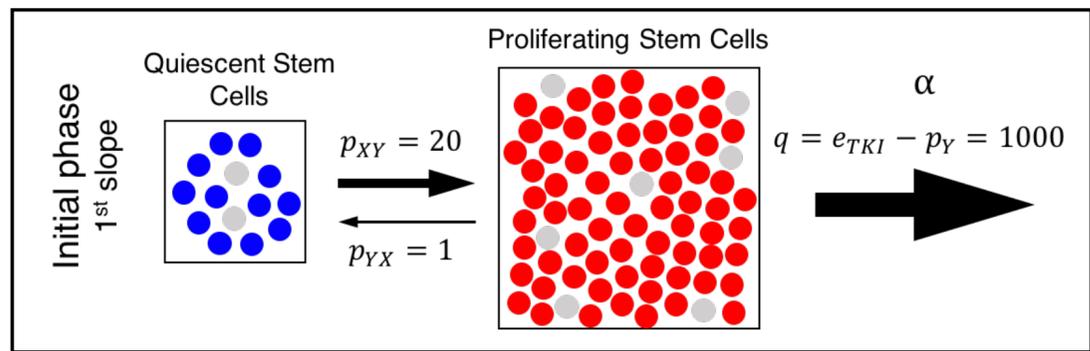
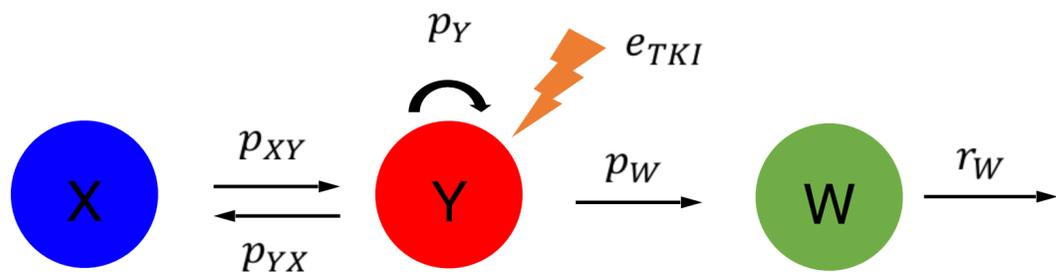
$$Y(t) = Y_0 \left(C_1 e^{\lambda_1 t} + C_2 e^{\lambda_2 t} \right) \quad \text{and} \quad X(t) = Y_0 \left(C_3 e^{\lambda_1 t} + C_4 e^{\lambda_2 t} \right)$$

With eigenvalues

$$\lambda_1 = -q \left(1 + \varepsilon_1 \varepsilon_2 + \varepsilon_1 O(\varepsilon_2^2) \right) = -q \left(1 + O(\varepsilon_3) \right)$$

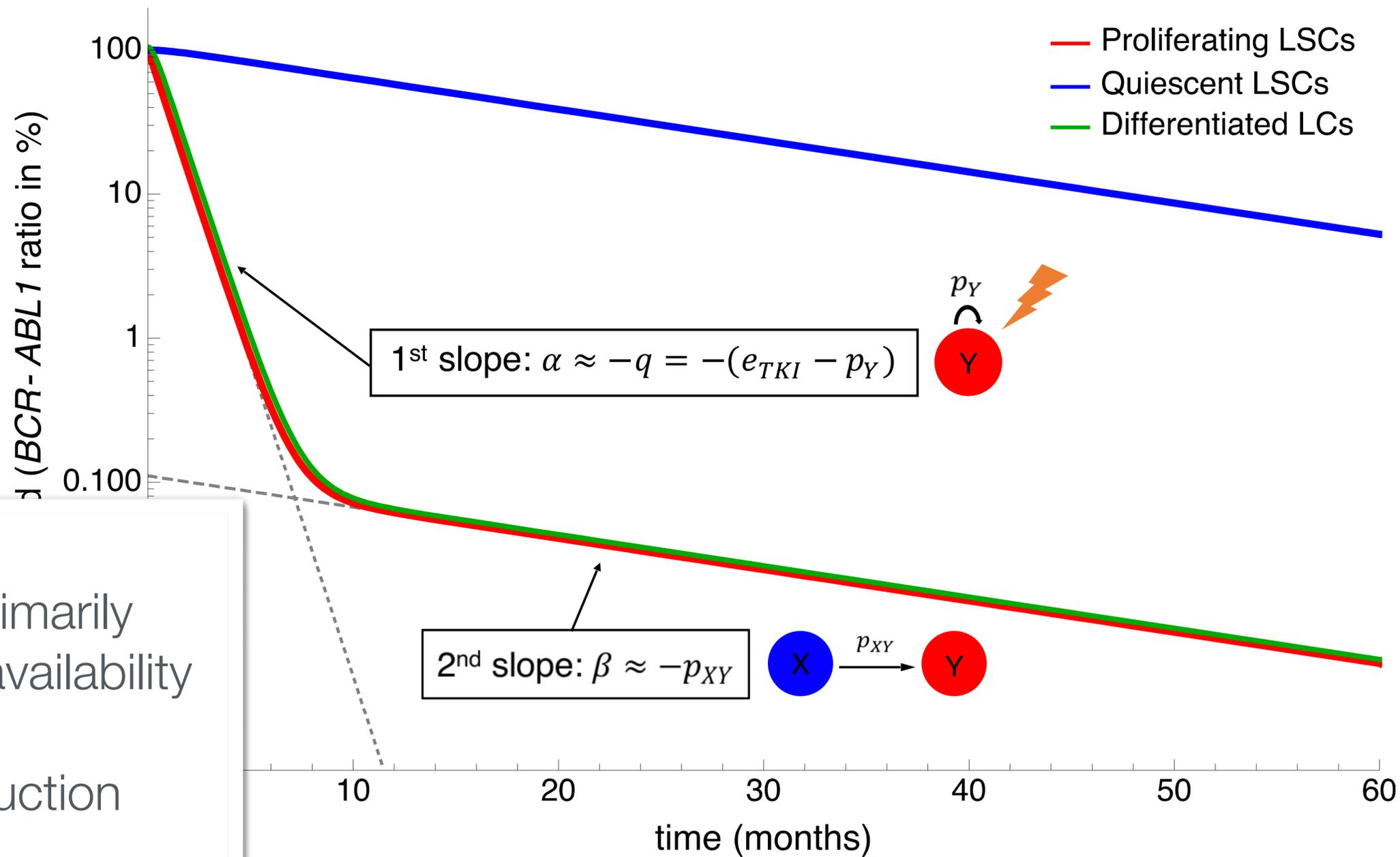
$$\lambda_2 = -p_{XY} \left(1 - \varepsilon_1 \varepsilon_2 + \varepsilon_1 O(\varepsilon_2^2) \right) = -p_{XY} \left(1 + O(\varepsilon_3) \right)$$

Leukemia treatment response



second slope is not primarily determined by the drug availability

potential for dose reduction



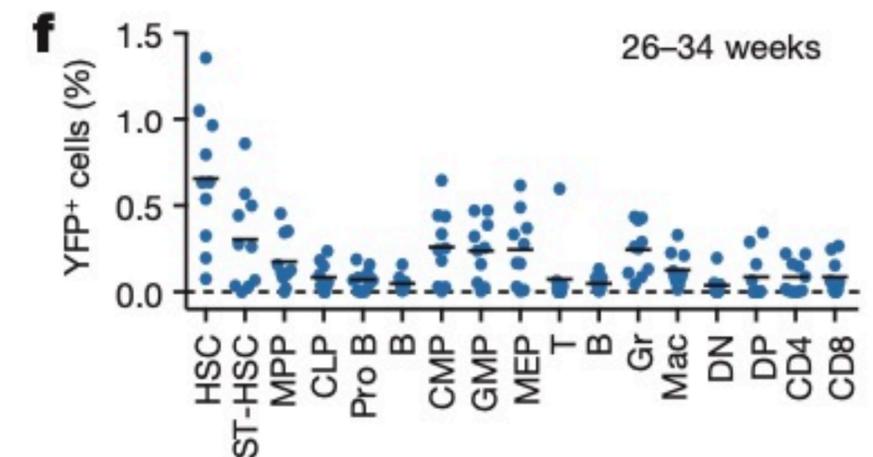
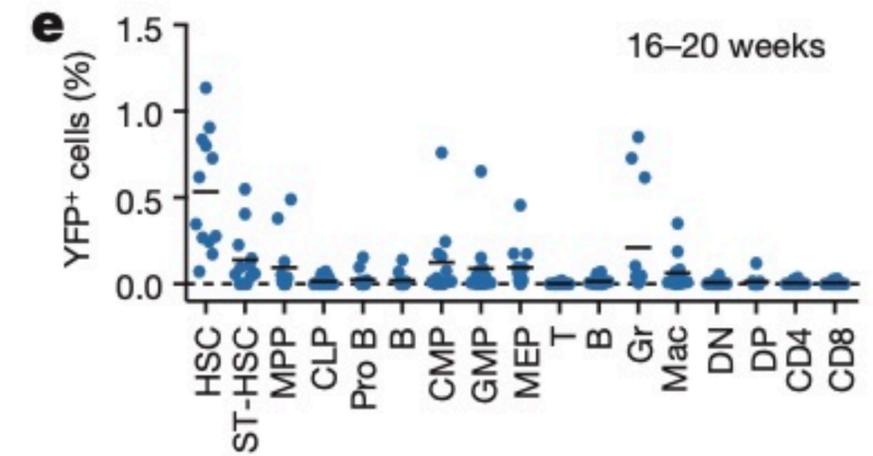
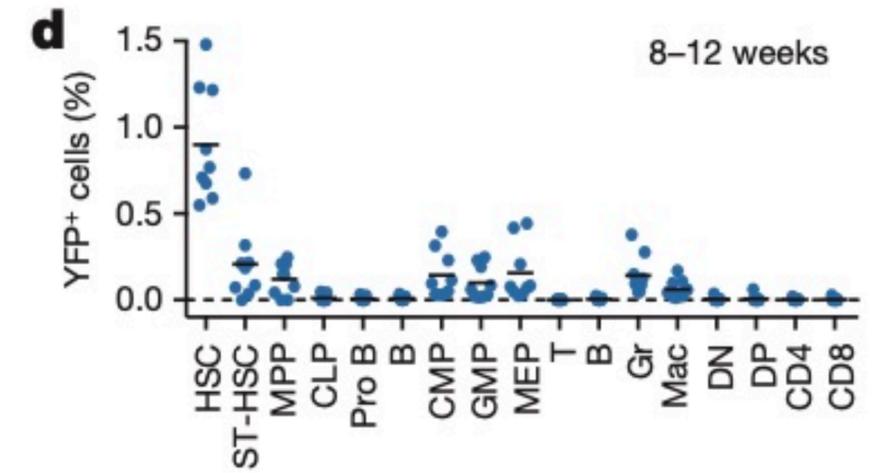
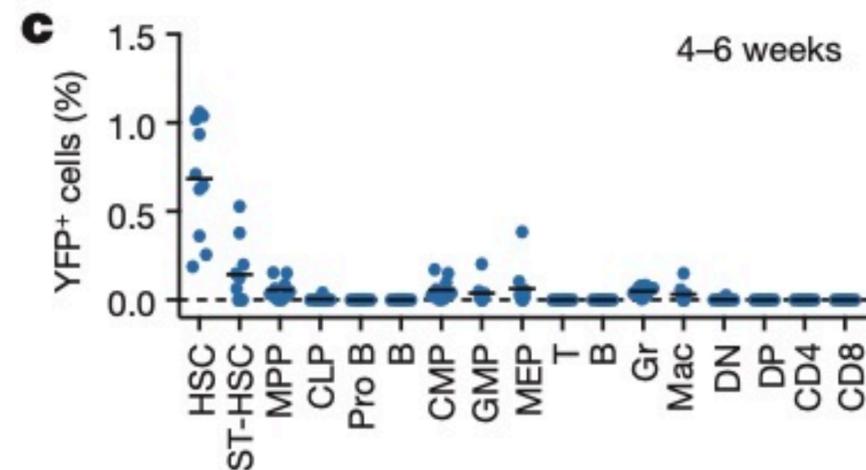
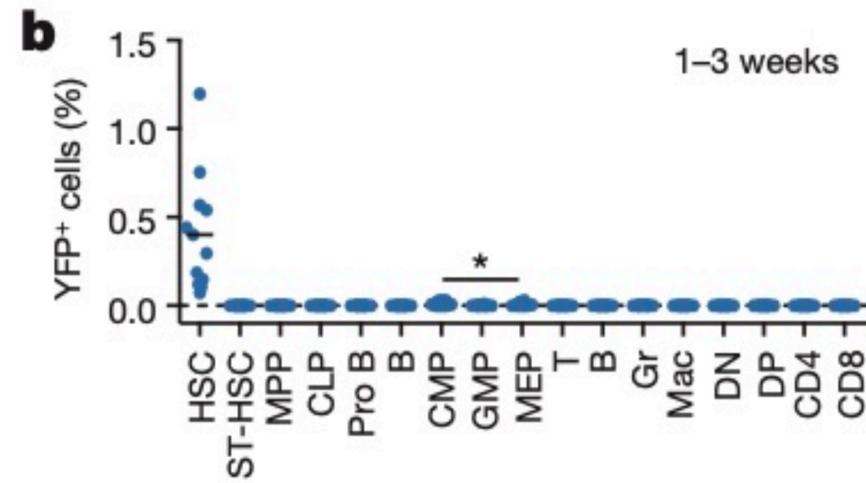
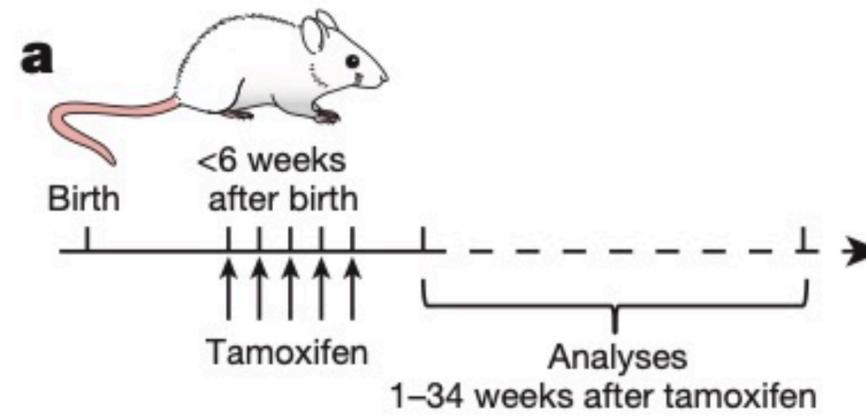
HSC heterogeneity

LETTER

doi:10.1038/nature14242

Fundamental properties of unperturbed haematopoiesis from stem cells *in vivo*

Katrin Busch¹, Kay Klapproth^{1*}, Melania Barile^{2*}, Michael Flossdorf^{2*}, Tim Holland-Letz³, Susan M. Schlenner^{4,5}, Michael Reth^{6,7}, Thomas Höfer² & Hans-Reimer Rodewald¹



Bone marrow Spleen Thymus

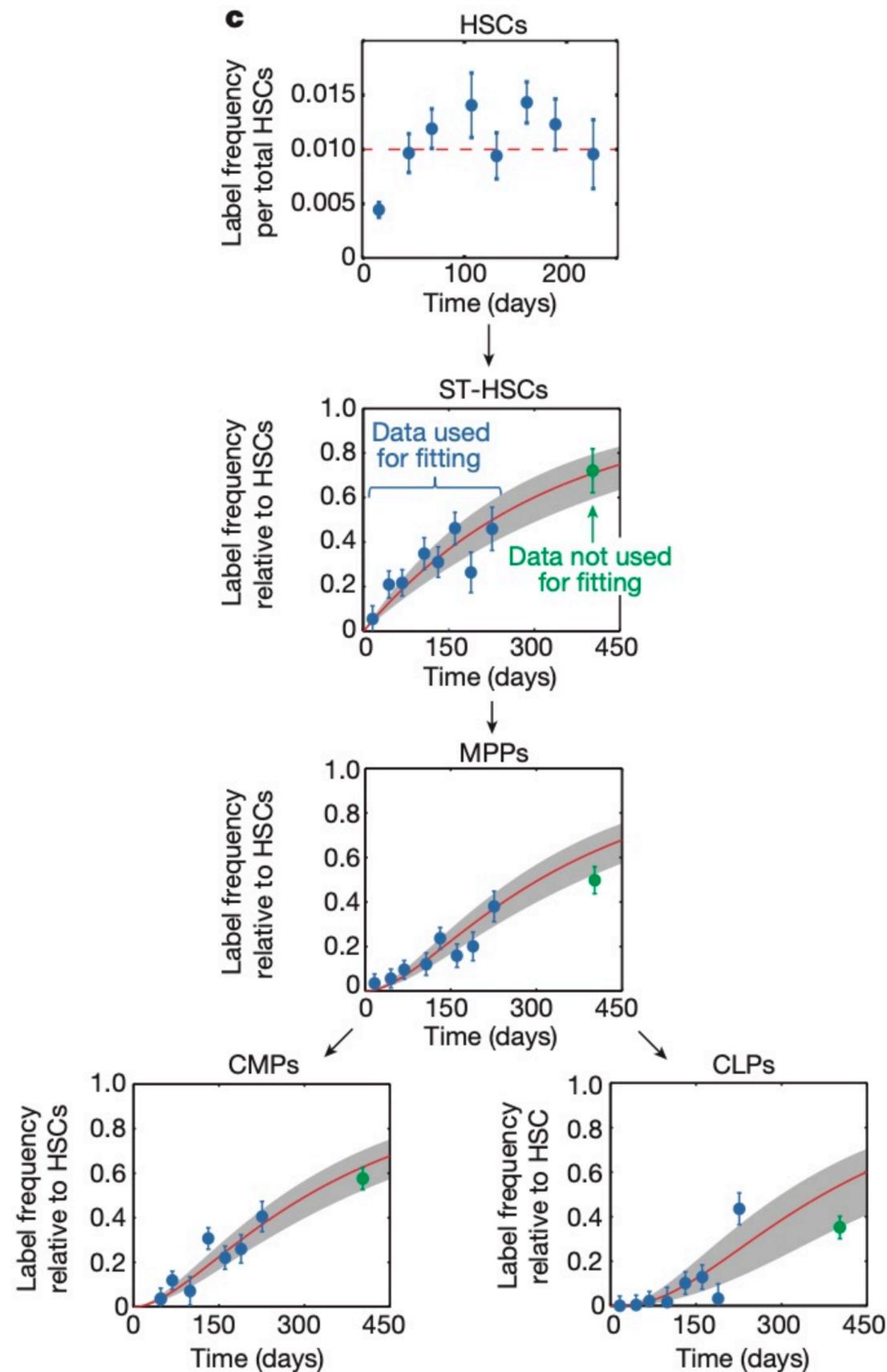
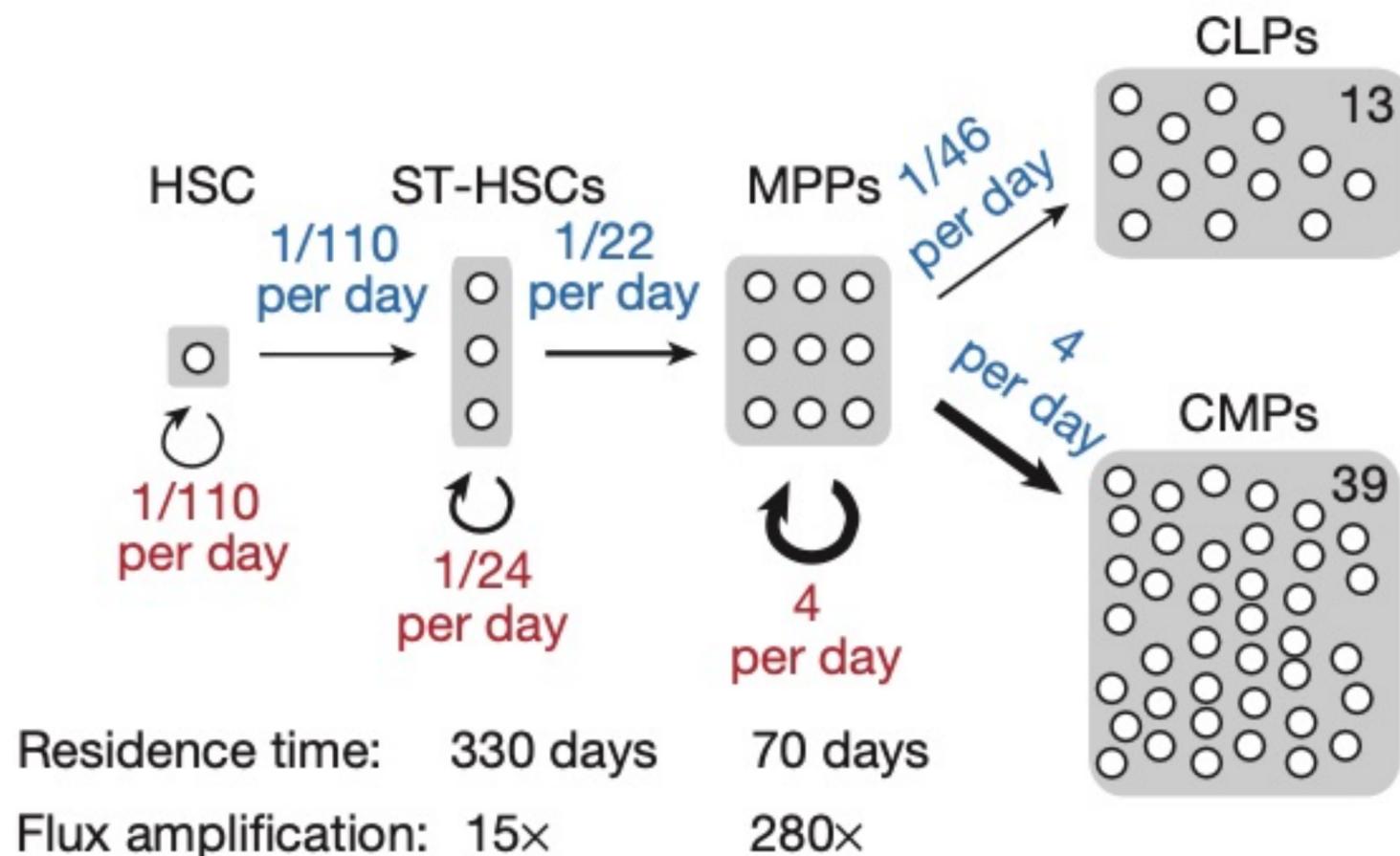
HSC heterogeneity

LETTER

doi:10.1038/nature14242

Fundamental properties of unperturbed haematopoiesis from stem cells *in vivo*

Katrin Busch¹, Kay Klapproth^{1*}, Melania Barile^{2*}, Michael Flossdorf^{2*}, Tim Holland-Letz³, Susan M. Schlenner^{4,5}, Michael Reth^{6,7}, Thomas Höfer² & Hans-Reimer Rodewald¹



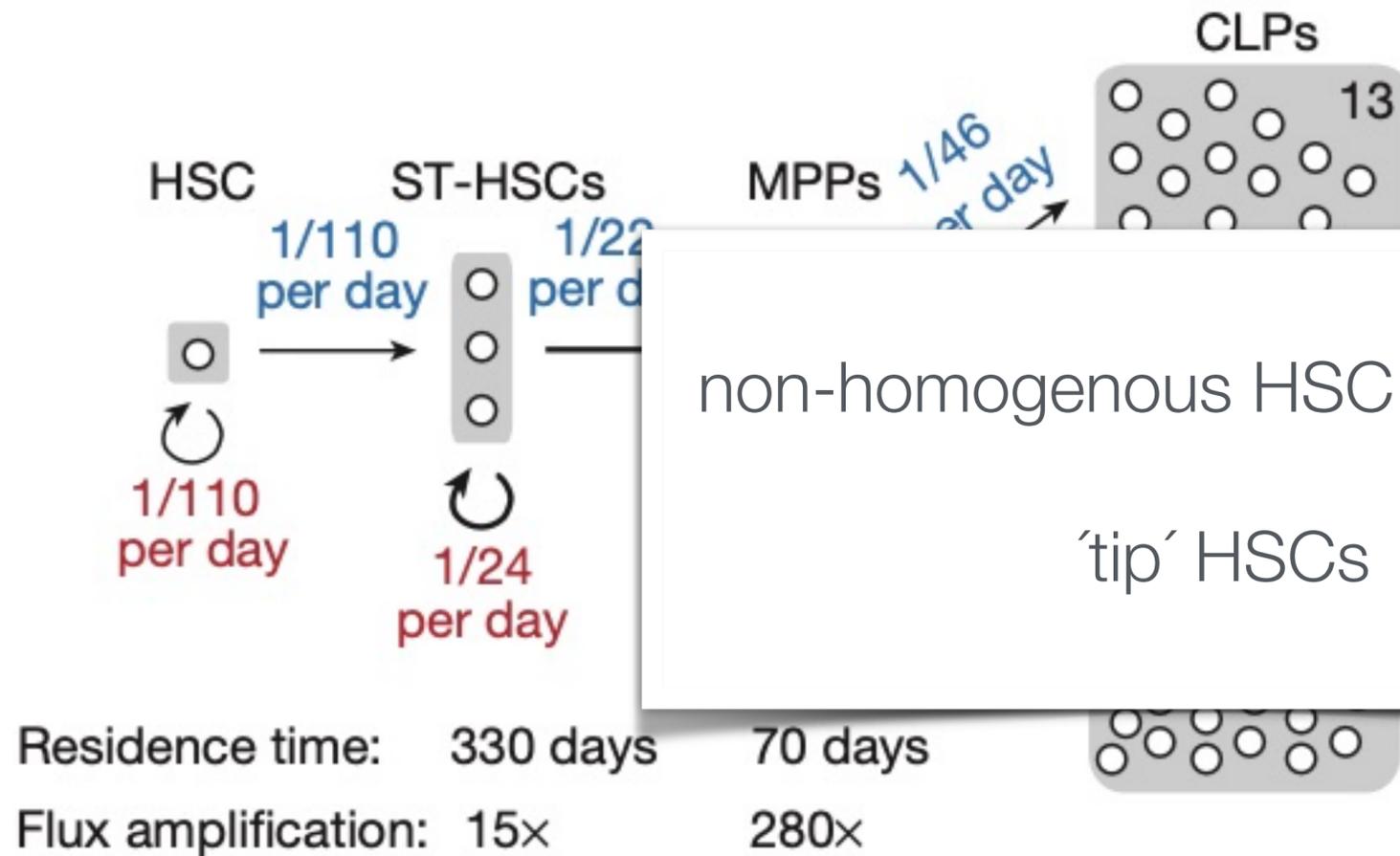
HSC heterogeneity

LETTER

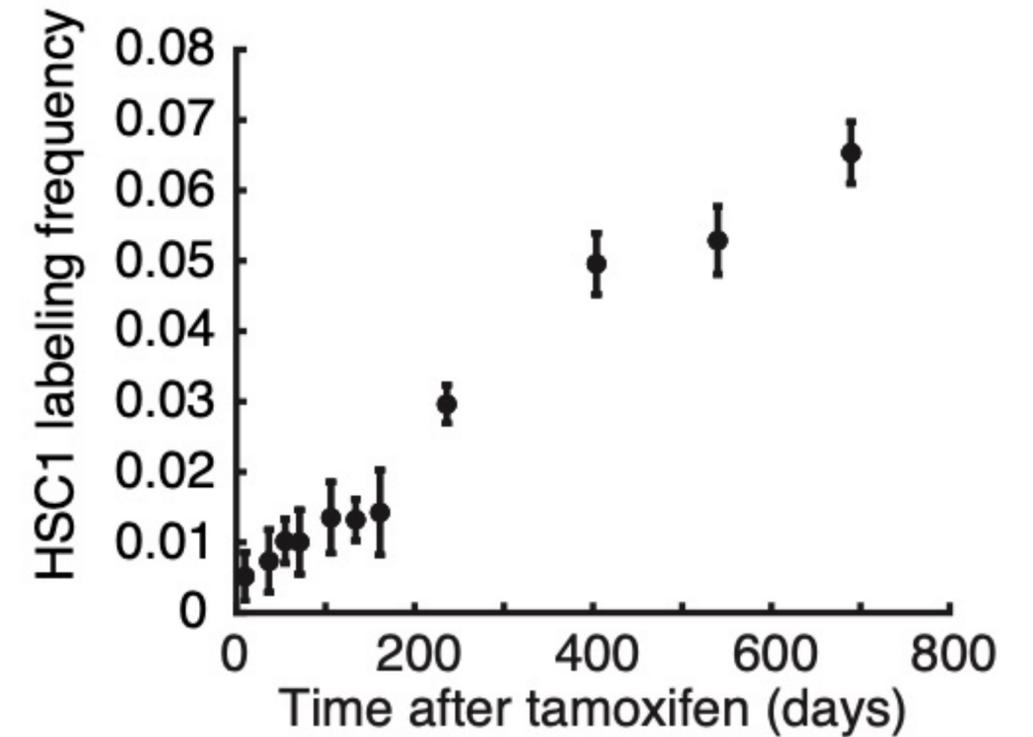
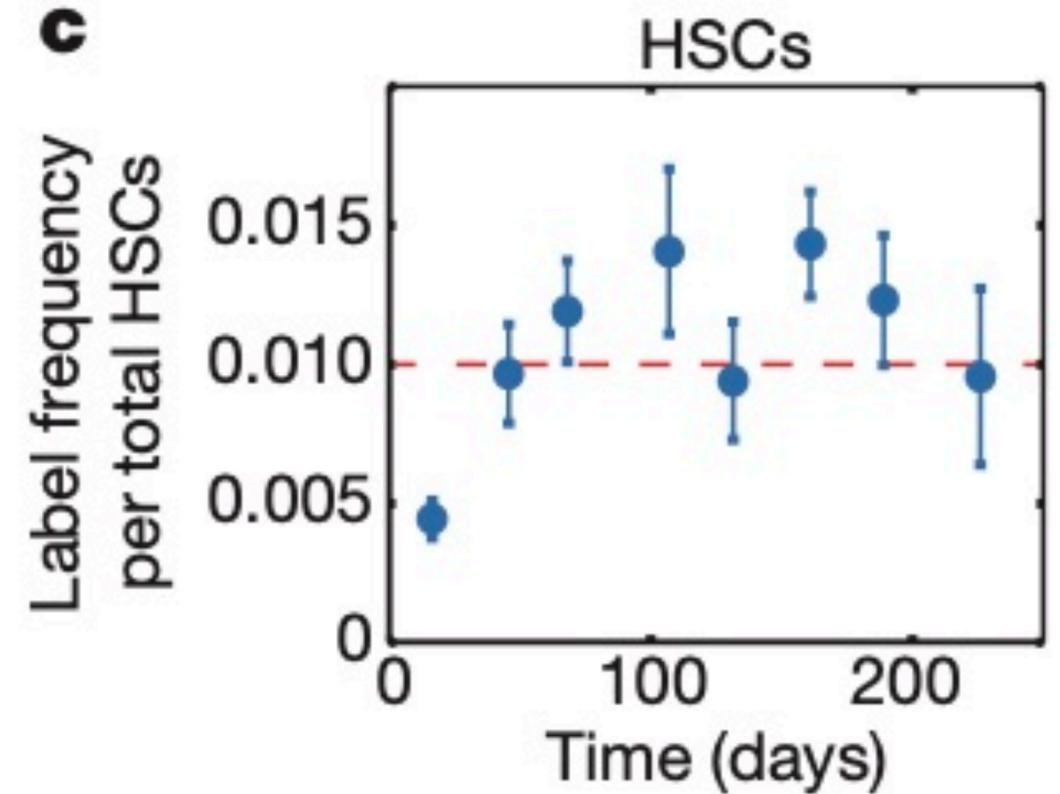
doi:10.1038/nature14242

Fundamental properties of unperturbed haematopoiesis from stem cells *in vivo*

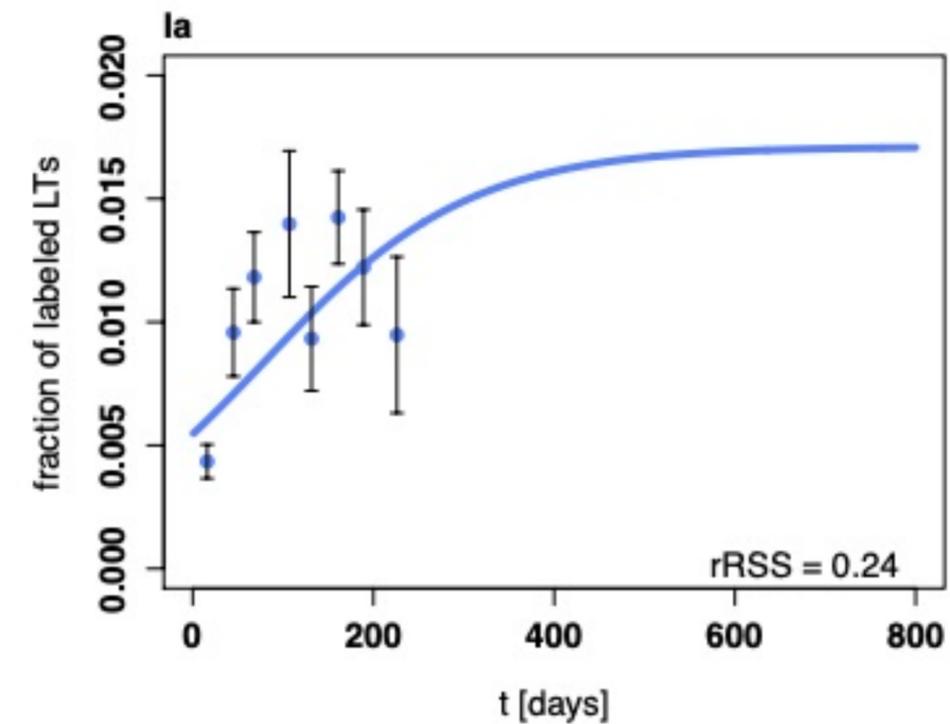
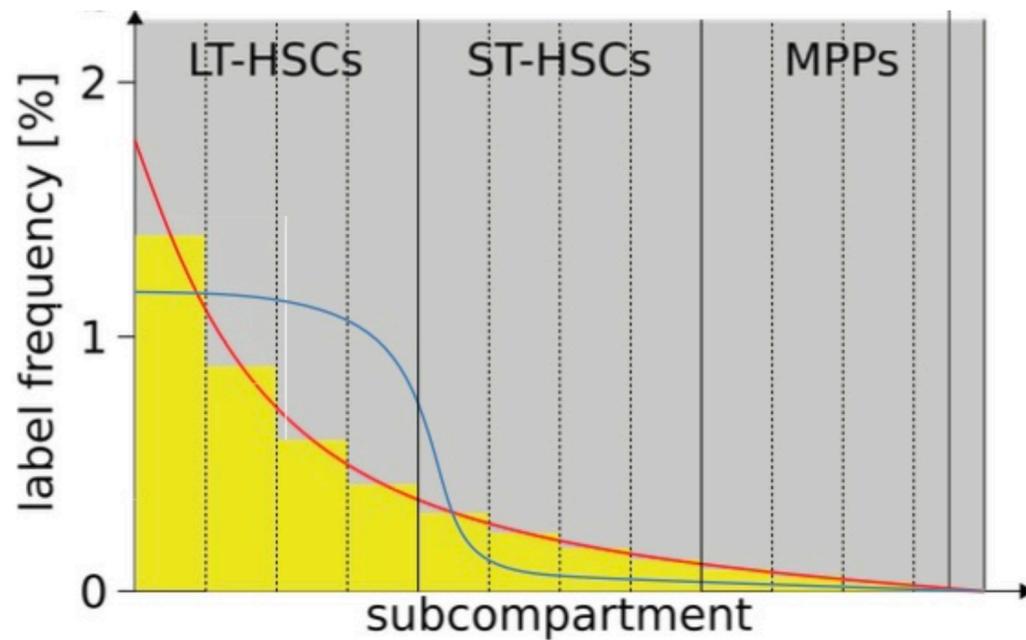
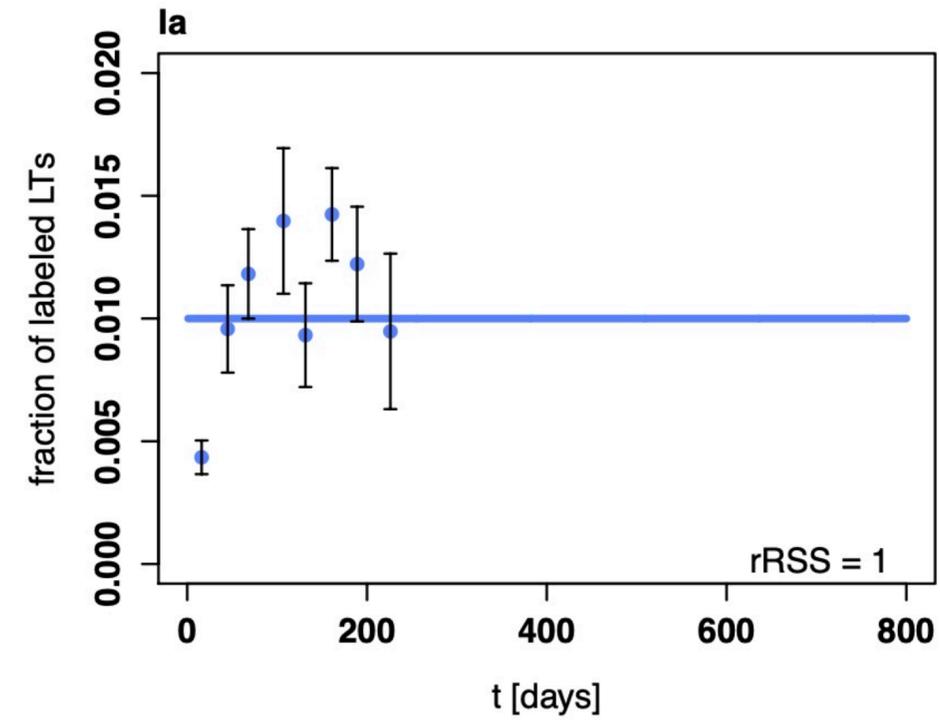
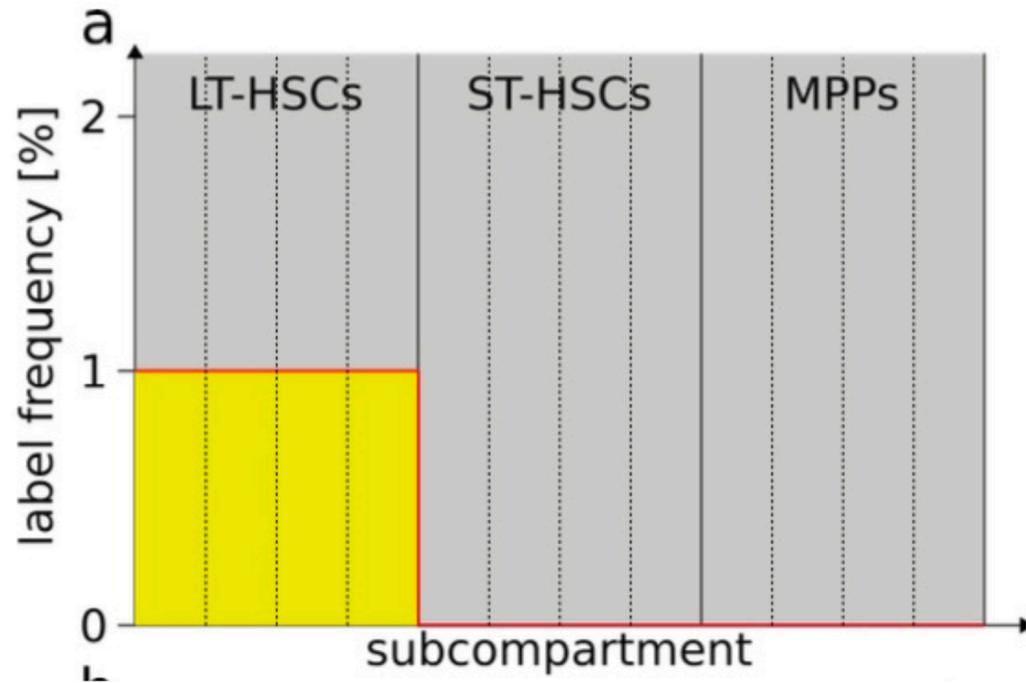
Katrin Busch¹, Kay Klapproth^{1*}, Melania Barile^{2*}, Michael Flossdorf^{2*}, Tim Holland-Letz³, Susan M. Schlenner^{4,5}, Michael Reth^{6,7}, Thomas Höfer² & Hans-Reimer Rodewald¹



non-homogenous HSC population:
'tip' HSCs



HSC heterogeneity



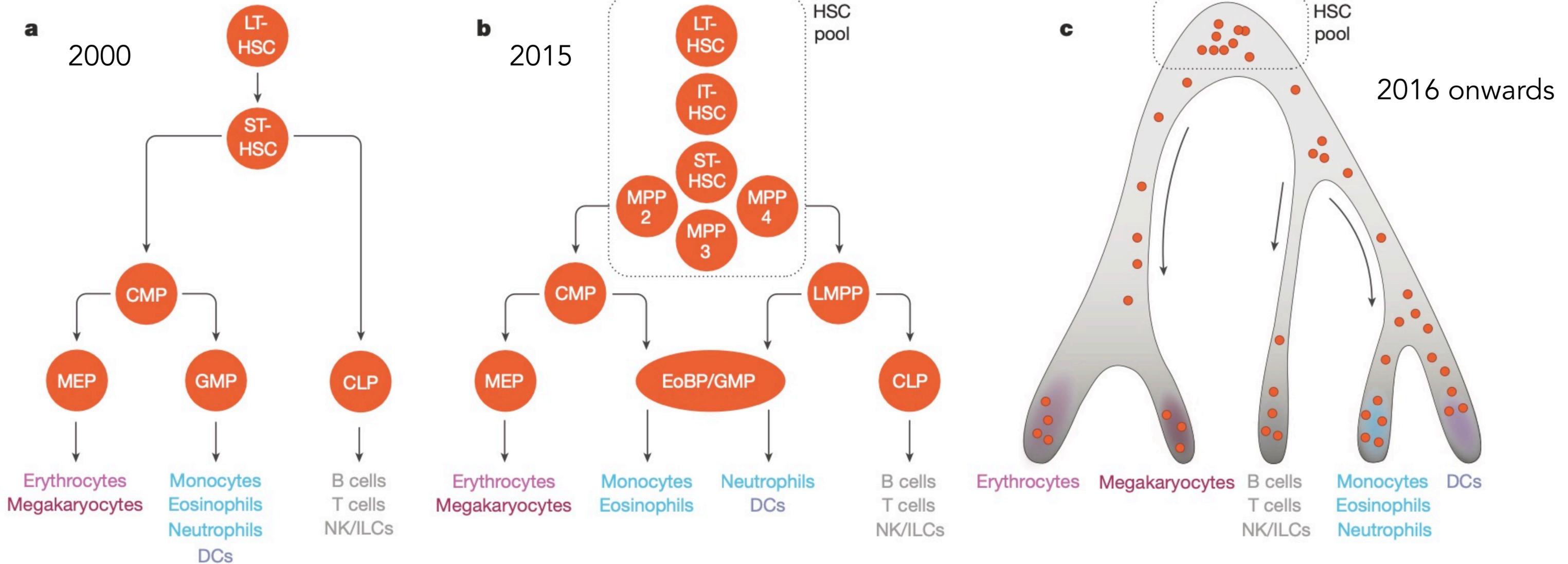
HSC heterogeneity

REVIEW

doi:10.1038/nature25022

From haematopoietic stem cells to complex differentiation landscapes

Elisa Laurenti¹ & Berthold Göttgens¹

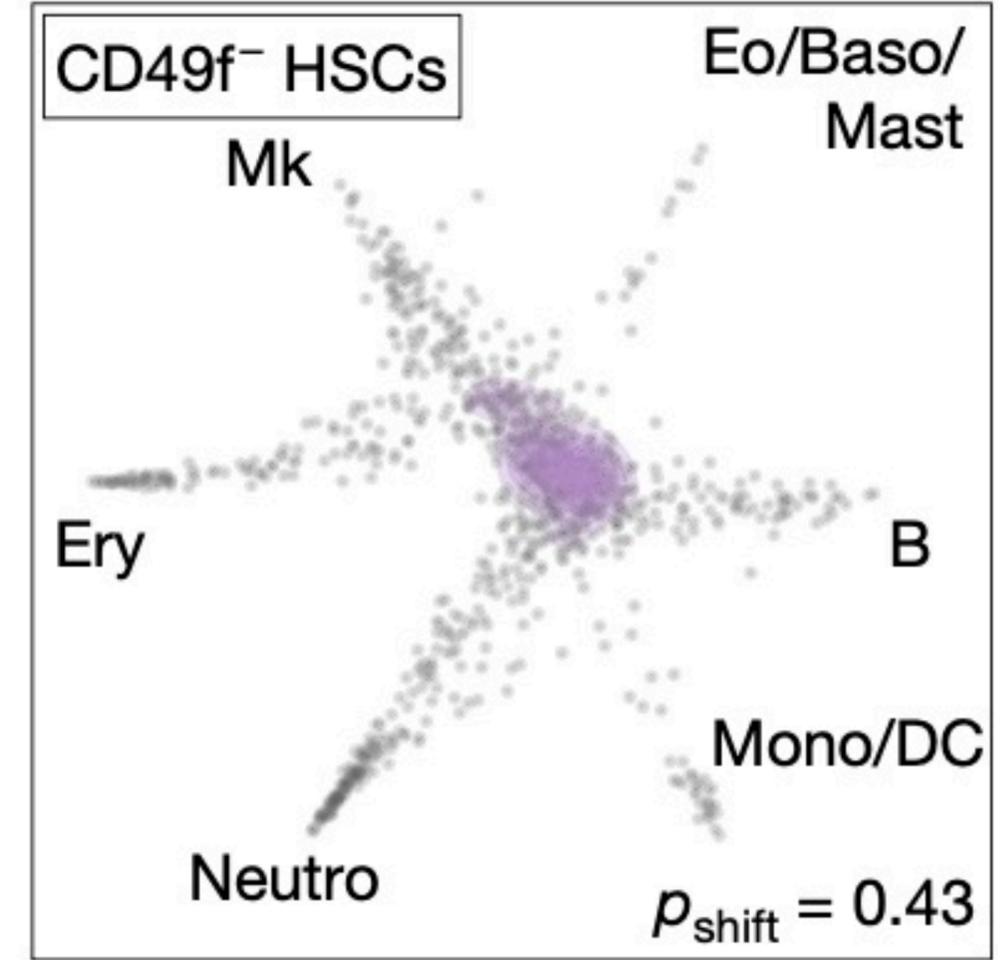
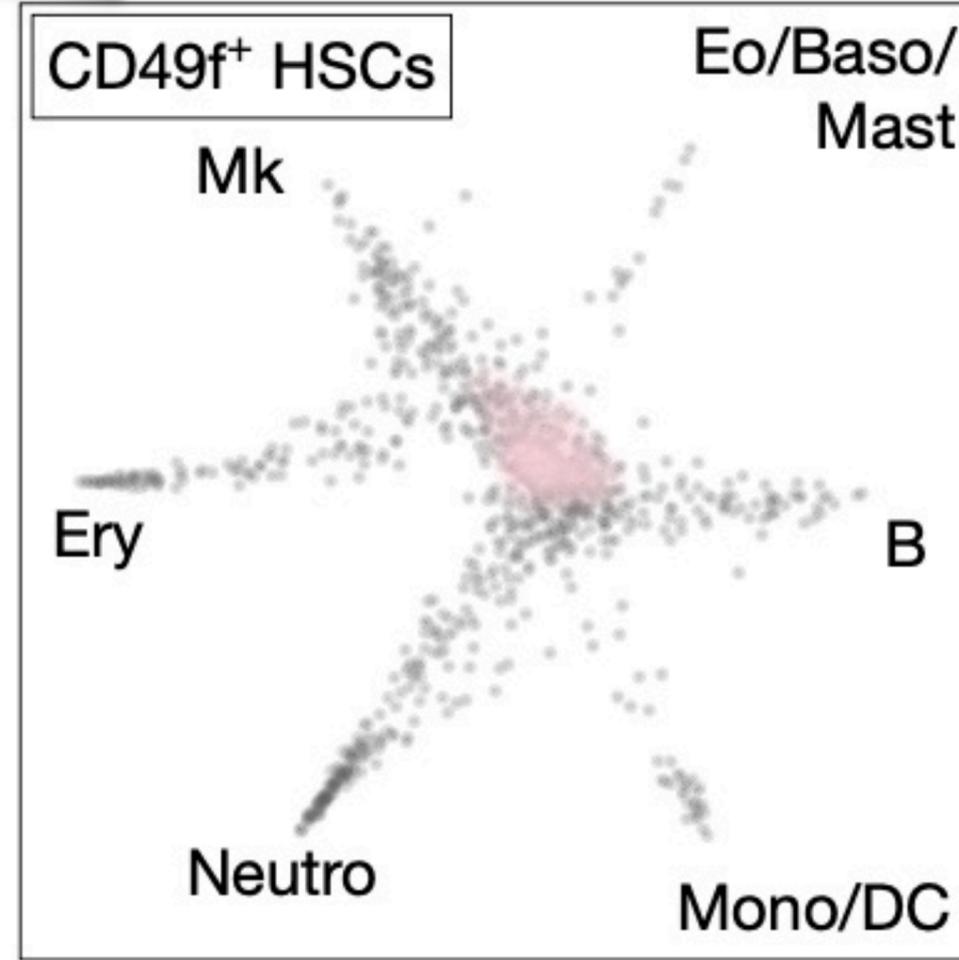
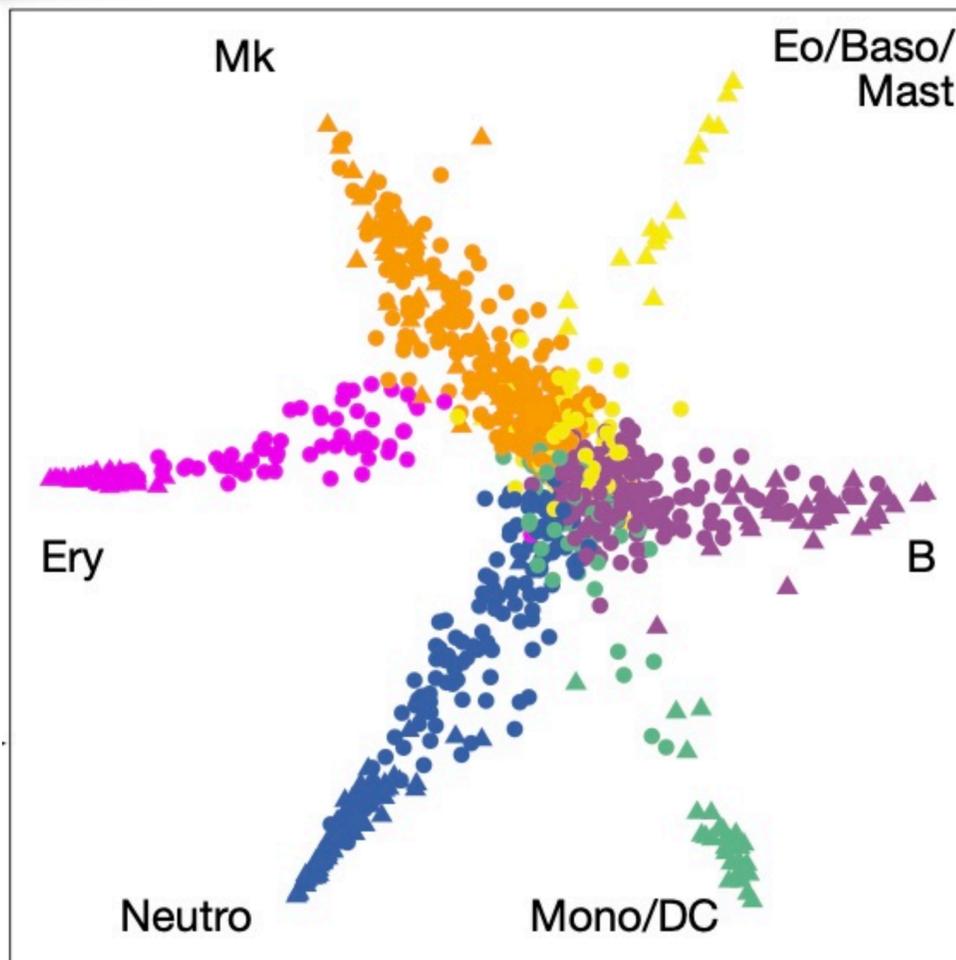


HSC heterogeneity

nature
cell biology

Human haematopoietic stem cell lineage commitment is a continuous process

Lars Velten^{1,10}, Simon F. Haas^{2,3,4,10}, Simon Raffel^{2,4,5,10}, Sandra Blaszkiewicz^{2,3}, Saiful Islam⁶, Bianca P. Hennig¹, Christoph Hirche^{2,3}, Christoph Lutz⁵, Eike C. Buss⁵, Daniel Nowak⁷, Tobias Boch⁷, Wolf-Karsten Hofmann⁷, Anthony D. Ho⁵, Wolfgang Huber¹, Andreas Trumpp^{2,4,8,11,12}, Marieke A. G. Essers^{2,3,11,12} and Lars M. Steinmetz^{1,6,9,11,12}

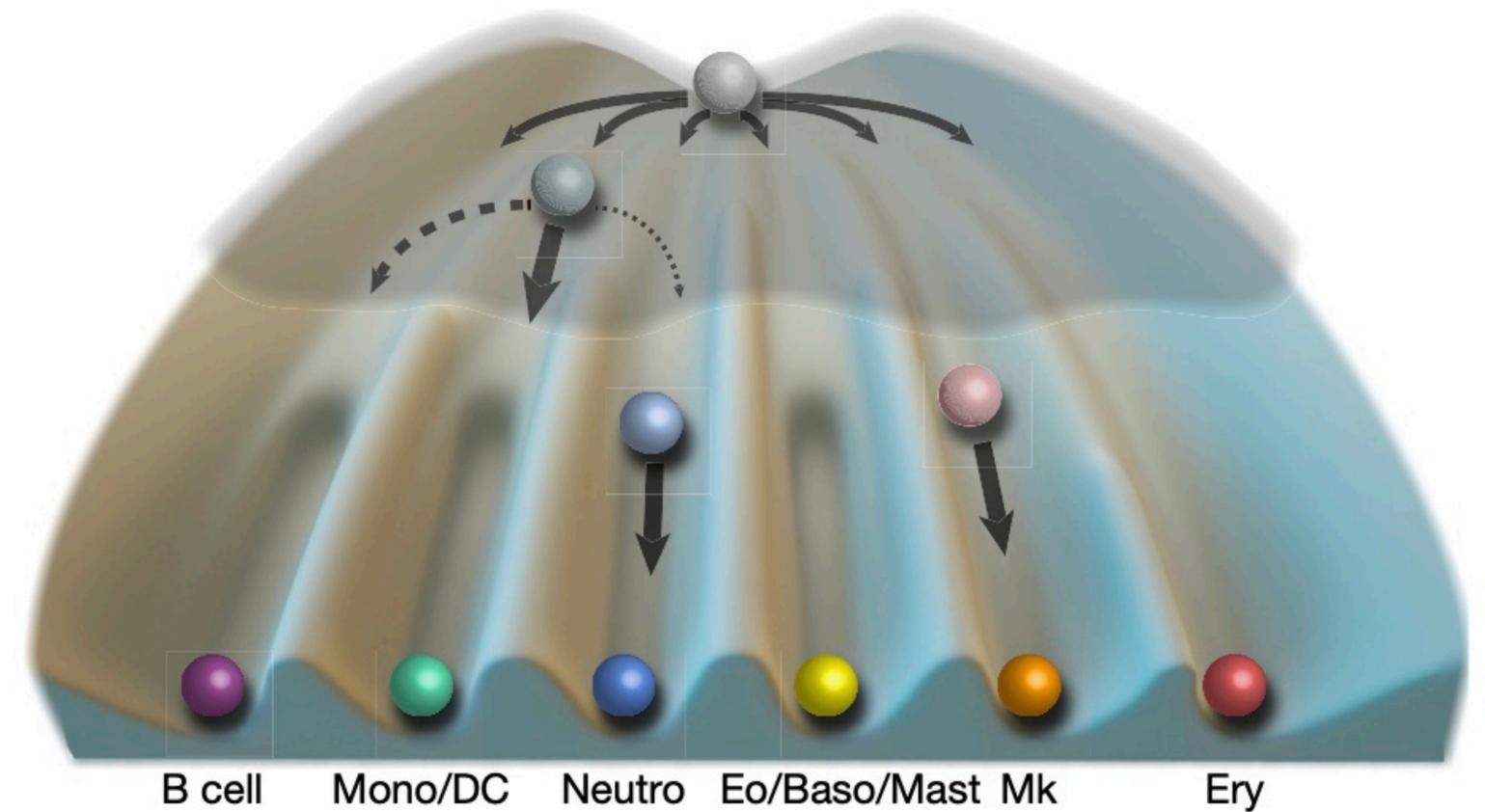
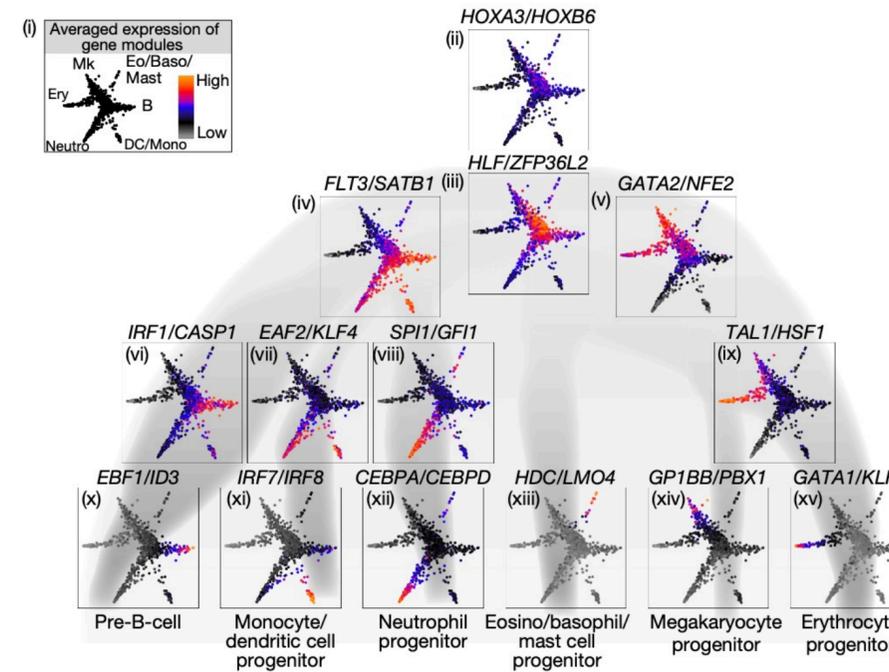
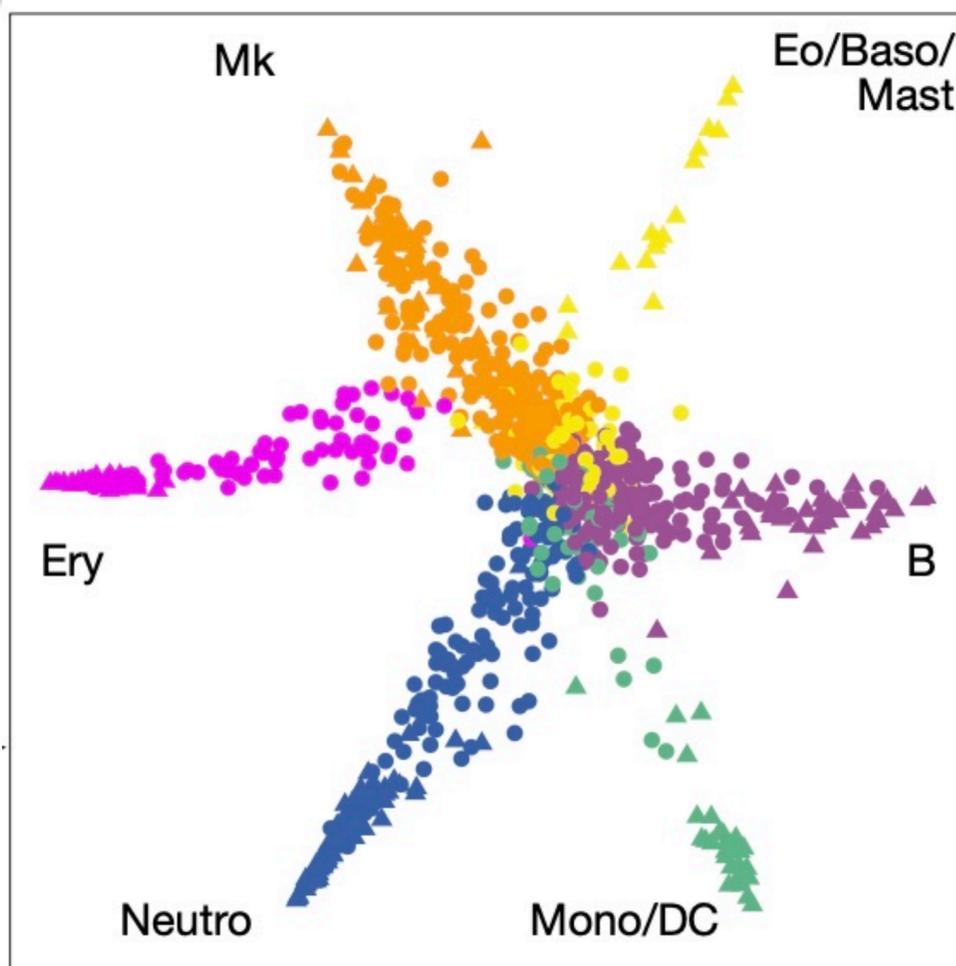


HSC heterogeneity

nature
cell biology

Human haematopoietic stem cell lineage commitment is a continuous process

Lars Velten^{1,10}, Simon F. Haas^{2,3,4,10}, Simon Raffel^{2,4,5,10}, Sandra Blaszkiewicz^{2,3}, Saiful Islam⁶, Bianca P. Hennig¹, Christoph Hirche^{2,3}, Christoph Lutz⁵, Eike C. Buss⁵, Daniel Nowak⁷, Tobias Boch⁷, Wolf-Karsten Hofmann⁷, Anthony D. Ho⁵, Wolfgang Huber¹, Andreas Trumpp^{2,4,8,11,12}, Marieke A. G. Essers^{2,3,11,12} and Lars M. Steinmetz^{1,6,9,11,12}



Summary

It is an open conceptual and formal question **whether quiescence and activation in HSCs are truly two distinct and discrete states, or whether they are better understood as two extremes along a continuous spectrum of functional activity.** The continuous concept can incorporate further aspects of functional and phenotypic heterogeneity and confers a dynamic perspective on stem cells.

HSC heterogeneity is a feature not a mistake.