Aging and Health – A Systems Biology Perspective

Interdisciplinary Topics in Gerontology

Vol. 40

Series Editor

Tamas Fulop Sherbrooke, Que.

Aging and Health – **A Systems Biology Perspective**

Volume Editors

Anatoliy I. Yashin Durham, N.C. S. Michal Jazwinski New Orleans, La.

36 figures, 8 in color, and 9 tables, 2015

Dr. Anatoliy I. Yashin

Duke Center for Population Health and Aging Erwin Mill Building 2024 West Main Street Box 90420 Durham, NC 27705 USA Dr. S. Michal Jazwinski

Tulane Center for Aging Department of Medicine 1430 Tulane Ave., SL-12 New Orleans, LA 70112 USA

Library of Congress Cataloging-in-Publication Data

Aging and health (Yashin)
Aging and health : a systems biology perspective / volume editors,
Anatoliy I. Yashin, S. Michal Jazwinski.
p.; cm. — (Interdisciplinary topics in gerontology, ISSN 0074-1132; vol. 40)
Includes bibliographical references and indexes.
ISBN 978-3-318-02729-7 (hardcover: alk. paper) — ISBN 978-3-318-02730-3 (e-ISBN)
I. Yashin, Anatoli I., editor. II. Jazwinski, S. Michal, editor. III.
Title. IV. Series: Interdisciplinary topics in gerontology; v. 40.
0074-1132
[DNLM: 1. Aging—physiology. 2. Systems Biology. 3. Aged—physiology.
4. Geriatric Assessment. W1 IN679 v.40 2015 / WT 104]
QP86
612.6′7—dc23

2014027396

Bibliographic Indices. This publication is listed in bibliographic services, including Current Contents® and PubMed/MEDLINE.

Disclaimer. The statements, opinions and data contained in this publication are solely those of the individual authors and contributors and not of the publisher and the editor(s). The appearance of advertisements in the book is not a warranty, endorsement, or approval of the products or services advertised or of their effectiveness, quality or safety. The publisher and the editor(s) disclaim responsibility for any injury to persons or property resulting from any ideas, methods, instructions or products referred to in the content or advertisements.

Drug Dosage. The authors and the publisher have exerted every effort to ensure that drug selection and dosage set forth in this text are in accord with current recommendations and practice at the time of publication. However, in view of ongoing research, changes in government regulations, and the constant flow of information relating to drug therapy and drug reactions, the reader is urged to check the package insert for each drug for any change in indications and dosage and for added warnings and precautions. This is particularly important when the recommended agent is a new and/or infrequently employed drug.

All rights reserved. No part of this publication may be translated into other languages, reproduced or utilized in any form or by any means electronic or mechanical, including photocopying, recording, microcopying, or by any information storage and retrieval system, without permission in writing from the publisher.

© Copyright 2015 by S. Karger AG, P.O. Box, CH–4009 Basel (Switzerland) www.karger.com
Printed in Germany on acid-free and non-aging paper (ISO 9706) by Kraft Druck, Ettlingen ISSN 0074–1132
e-ISSN 1662–3800
ISBN 978–3–318–02729–7
e-ISBN 978–3–318–02730–3



Contents

VII Introduction

Jazwinski, S.M. (New Orleans, La.); Yashin, A.I. (Durham, N.C.)

1 Introduction to the Theory of Aging Networks

Witten, T.M. (Richmond, Va.)

18 Applications to Aging Networks

Wimble, C.; Witten, T.M. (Richmond, Va.)

35 Computational Systems Biology for Aging Research

Mc Auley, M.T. (Chester); Mooney, K.M. (Ormskirk)

49 How Does the Body Know How Old It Is? Introducing the Epigenetic Clock Hypothesis

Mitteldorf, J. (Cambridge, Mass.)

- **The Great Evolutionary Divide: Two Genomic Systems Biologies of Aging** Rose, M.R.; Cabral, L.G.; Philips, M.A.; Rutledge, G.A.; Phung, K.H.; Mueller, L.D.; Greer, L.F. (Irvine, Calif.)
- **74 Development and Aging: Two Opposite but Complementary Phenomena** Feltes, B.C.; de Faria Poloni, J.; Bonatto, D. (Rio Grande do Sul)
- **85 Aging as a Process of Deficit Accumulation: Its Utility and Origin** Mitnitski, A.; Rockwood, K. (Halifax, N.S.)
- 99 Low-Grade Systemic Inflammation Connects Aging, Metabolic Syndrome and Cardiovascular Disease

Guarner, V.; Rubio-Ruiz, M.E. (Mexico)

107 Modulating mTOR in Aging and Health

Johnson, S.C.; Sangesland, M.; Kaeberlein, M.; Rabinovitch, P.S. (Seattle, Wash.)

128 Melatonin and Circadian Oscillators in Aging – A Dynamic Approach to the Multiply Connected Players

Hardeland, R. (Göttingen)

141 Diet-Microbiota-Health Interactions in Older Subjects: Implications for Healthy Aging

Lynch, D.B.; Jeffery, I.B.; Cusack, S. (Cork); O'Connor, E.M. (Limerick); O'Toole, P.W. (Cork)

- 155 Systems Biology Approaches in Aging Research
 - Chauhan, A.; Liebal, U.W. (Rostock); Vera, J. (Erlangen); Baltrusch, S.; Junghanß, C.; Tiedge, M.; Fuellen, G.; Wolkenhauer, O.; Köhling, R. (Rostock)
- 177 Conservative Growth Hormone/IGF-1 and mTOR Signaling Pathways as a Target for Aging and Cancer Prevention: Do We Really Have an Antiaging Drug?

 Anisimov, V.N. (St. Petersburg)
- 189 Author Index
- 190 Subject Index

VI Contents

Introduction

Systems biology is a reemerging discipline. Its origins are found in Ludwig von Bertalanffy's general system theory, which eschews reductionism and treats the organism thermodynamically as an open system. A good exposition of this approach is contained in his compendium [1], which is still relevant.

Although general system theory had a significant impact on various disciplines, notably informatics, its consideration in biology, from which it sprung, waned. Systems biology rose again on this substratum around the year 2000. A significant impetus for this was the development of various '-omics', with their capability of generating vast datasets pertaining to cell and organism behavior. The majority of efforts have since been devoted to the generation of networks, and layers of networks, to deduce the multiple interactions of the variables in these datasets.

Another antecedent to the current systems biology is the work of mathematical biologists, whose efforts to model biological processes dynamically feature importantly in some 'strains' of systems biology. Metabolic control analysis comes to mind immediately, as does the literature on the mathematical modeling of the cell cycle. These modeling approaches often incorporate nonlinear functions, and they frequently take into account stochastic elements. These facets are kindred to the consequences of the interaction between components of a system in general system theory. The efforts of both the network systems biologists and the dynamic systems biologists should be juxtaposed to the work of bioinformaticians, who devise methods for manipulating large datasets and cataloging their features.

The systems biology of aging has an even more recent history, although the relevance of the systems approach to aging was already heralded in 1996 [2]. The two sorts of systems biology referred to in the previous paragraph coincide roughly with bottom-up and top-down approaches to the modeling of biological systems. A useful consideration of how these distinct approaches can be profitably integrated has been presented [3]. Most efforts to date attempt to understand the aging process as a determinant of longevity or demise. Little attention has been paid, however, to the emergence of disease and dysfunction as a result of aging, or to the information this emergence has on the biological aging process itself.

The initial idea for this monograph was to explore the frontiers of knowledge connecting aging and health, within a systems biology framework. The crucial importance of this approach lies in the possibility of improving population health by postponing aging or by slowing down individual aging rates. For various reasons, this idea was difficult to realize fully. One reason is that many aspects of the aging process remain unclear and continue to be under intense study, making a discussion of their connections to health perhaps premature. Another reason is that the systems biology of aging is a developing discipline as well, with many new ideas and methods still to appear and to evolve. These factors restricted the scope of this volume and focused it on the foundations and specific aspects of the systems biology of aging, with particular attention to the links between aging changes and diseases of the elderly where corresponding information is available.

The first two chapters introduce the reader to network systems analysis. In the first one by *Tarynn M. Witten*, the author briefly addresses the history of systems biology and introduces the notion of complexity, which manifests itself through nonlinear dynamics, hierarchies and network analysis and can be used to study the intricate and fascinating behaviors of living systems. She suggests treating the biological organism as a network. Then, she explains how network mathematics (graph theory) can provide deeper insight and can even predict potential genes and proteins that are related to the control of organismal life span. The author reviews the history of network analysis at the cellular level and introduces various commonly used network variables. She shows how these variables can be used to predict potential targets for experimental analysis. She also discusses some of the challenges that network methods face.

The second chapter by *Christopher Wimble* and *Tarynn M. Witten* applies the ideas and methods described in the first chapter to concrete examples, using *Saccharomyces cerevisiae* and *Caenorhabditis elegans*. The authors consider possible aging-related changes in a network, which include inactivation of active nodes/activation of inactive nodes (e.g. genes) and loss of connectivity/increase in connectivity. The factors affecting these processes are not considered. The authors show that the network structure determines its vulnerability to possible targeted attacks. Attacks that knock out essential genes disrupt the life span network because the organism dies when an essential gene is knocked out. The authors believe that understanding patterns in network decomposition could lead to early detection of potential neurodegenerative disorders and to potential pharmaceutical intervention at earlier points of disease development.

The third chapter by *Mark Mc Auley* and *Kathleen M. Mooney* focuses on the application of computational systems biology in aging research starting with the rationale for using it for investigating the aging process. The authors discuss alternative theoretical frameworks that can be used to build models of the complex agerelated disorders associated with unhealthy aging. The chapter starts with the description of dynamic modeling using differential equations. Then, it incorporates aspects of network analysis and agent-based modeling. Computational modeling is

VIII Jazwinski · Yashin

supposed to be an integral component of systems biology, amalgamating with the other techniques discussed in this book to quantitatively represent and simulate biological systems.

The evolutionary theories of aging of biological systems are widely discussed in the literature [4–11]. These theories claim that because aging is largely a postreproductive phenomenon, it should not evolve by natural selection. Joshua Mitteldorf believes that aging could be advantageous for stability of ecosystems and hence can be the result of natural selection. The author pays attention to the fact that animals and plants have biological clocks that help to regulate circadian cycles, seasonal rhythms, growth, development and sexual maturity. He puts forth the hypothesis that evolutionarily evolved aging is also clock driven. He focuses on the epigenetic process of DNA methylation, as a clock mechanism, and its relevance to stem cell aging, in particular, in his chapter. Research on the relationship between methylation and aging is still in an early stage, and it has not yet even been proven that alterations of the methylation state are a cause and not simply a product of aging. The hypothesis that the body's age is stored within the cell nucleus as a methylation pattern suggests a program of research and an anti-aging strategy. If validated, this hypothesis would point to a challenging target for medical intervention. Recent results [12] provide additional information for thinking in this direction.

To what extent can insights derived from the systems biology of aging in animal model systems be applied to human aging? *Michael Rose* and his colleagues argue that systems biology of aging might have a different focus in two types of species. The authors provide evolutionary arguments that aging processes taking place in species with rare sexual recombination are quite different from those in which it is frequent. In the species of first type, the systems biology of aging can focus on large-effect mutants, transgenics, and combinations of such genetic manipulations. In frequently recombining species, the systems biology of aging can examine the genome-wide effects of selection.

Many gerontologists have the strong belief that aging is nonprogrammed and provide arguments supporting this view [13]. Many others provide arguments that aging is likely to be programmed [14–16]. Further studies are needed to resolve the issue. *Bruno Cesar Feltes* and his colleagues treat aging as a programmed process and consider it as a continuation of developmental processes. To overcome environmental challenges, the embryo needs to adapt its metabolism in response to environmental fluctuations. Epigenetic programming is responsive to perturbations or imbalances of intrinsic and/or extrinsic factors experienced in utero. Immune system development and aerobic respiration/glucose metabolism processes are modulated during early development. Small changes in developmental mechanisms and adult trait specification that occur during early development might result in significant morphological alterations during later stages. This can promote an adaptive response and influence gene expression patterns, leading to age-associated diseases, such as cancer, osteoporosis and the decline of the immune system. This concept underpins a net-

Introduction IX

work approach to aging that provides a framework for the appearance of diseases of aging.

In the chapter that follows, *Arnold Mitnitski* and *Kenneth Rockwood* describe the use of their frailty or deficit index to characterize the state of an aging human. This is a top-down approach that incorporates age-related disease and dysfunction into its derivation. The authors propose that the frailty index can be used as an indicator of an individual's biological age. This index manifested reproducible properties including nonlinear increase with increasing age, higher values in women, strong association with mortality and other adverse outcomes, as well as other properties. Importantly, the authors employ a stochastic dynamics approach to model how the organism recovers as a function of age.

Aging is associated with immunosenescence, and it is accompanied by a chronic inflammatory state which contributes to development of chronic conditions. The chapter by *Verónica Guarner* and *Maria Esther Rubio-Ruiz* shows how low-grade systemic inflammation may be the basis of multiple dysfunctions that evolve during aging, including metabolic syndrome, diabetes, and their cardiovascular consequences. Cardiovascular diseases and endothelial dysfunction are characterized by a chronic alteration of inflammatory function, markers of inflammation, and the innate immune response. Inflammation may thus serve as the integrating factor that makes the frailty index a global measure of system function.

Pharmacologic interventions are believed by many gerontologists as a possibility for slowing down or postponing individual aging processes. A widely discussed target for such interventions is the mTOR (mammalian target of rapamycin) nutrient response pathway. In multicellular organisms, TOR regulates cell growth and metabolism in response to nutrients, growth factors and cellular energy state. Deregulation of TOR signaling alters whole-body metabolism and causes age-related disease. The life-extending effects of dietary restriction in yeast, worms, flies and mice appear to be due largely to inhibition of TOR signaling. There is evidence that TOR may also control aging via modulation of stress-responsive genes and through autophagy. Inhibition of this pathway extends life span in model organisms and confers protection against a growing list of age-related pathologies. In the next chapter, *Simon Johnson* and his colleagues focus their attention on mTOR signaling. The authors inform that some medical interventions affecting this pathway are already clinically approved, and others are under development. Thus, targeting the mTOR pathway is a promising strategy for slowing down the aging rate and improving health of the elderly.

In the following chapter, *Rüdiger Hardeland* discusses melatonin as a systemic integrating agent that interfaces with the environment. A number of studies support the anti-aging properties of melatonin [17, 18]. Melatonin is a derivative of the amino acid tryptophan and widely distributed in food sources, such as milk, almonds, bananas, beets, cucumbers, mustard, and tomatoes. In humans, melatonin is primarily synthesized by the pineal gland, but it is also produced in the gastrointestinal tract and retina. Melatonin and its metabolites are potent antioxidants with anti-inflammatory,

X Jazwinski · Yashin

hypotensive, cell communication-enhancing, cancer-fighting, brown fat-activating, and blood lipid-lowering effects, and thereby protecting tissues from a variety of insults. Melatonin has been shown to support circadian rhythm, hormone balance, reproductive health, cognition, mood, blood sugar regulation, and bone metabolism, while improving overall antioxidant status and lowering blood pressure. Melatonin may assist in preventing diabetic complications, and improving treatment outcomes in patients with cardiovascular disease and certain types of cancer. Consuming melatonin neutralizes oxidative damage and delays the neurodegenerative process of aging [19]. *Hardeland* here shows that this chronobiotic impinges on multiple physiologic systems with implications for health and disease during aging. The chapter discusses the associations of the loss of melatonin secretion and rhythm amplitudes with aging and development of age-related diseases.

It is well known that a diet rich in plant-based foods has many advantages in relation to the health and well-being of an individual. Much less known is the large contribution of the gut microbiota to this effect. *Denise B. Lynch* and her colleagues expand the discussion of aging, health, and disease to encompass the gut microbiome and its mutual relationship with the host. This relationship goes beyond an uneasy symbiosis implicated in immune-related disorders because the host genome and the microbial ecosystem constitute a supergenome. Thus, this is more than an interaction of the host with the environment with significant consequences for healthy aging.

The penultimate chapter by Anuradha Chauhan and colleagues serves as a coda. The authors reprise the history of the systems biology of aging and the different methodological approaches it encompasses. They provide the rationale for using the methods of systems biology in the analyses of the aging of biological systems. They outline the main features of the methodology emphasizing that the structure and functions of the biological systems are investigated by analyzing experimental data through the use of sophisticated mathematical and computational tools, including advanced statistics, data mining, and mathematical modeling. The methodology also includes formulation of working hypotheses, designing new experiments able to prove these hypotheses, and developing computational tools with predictive ability in a biomedical environment. The authors provide several examples that make direct use of the system motifs introduced in previous chapters, and they point to the importance of expanding upon the rudimentary achievements of the systems biology of aging at the present time if we are to intervene in the appearance and progression of age-related disease. The authors believe that the optimal design of biomedical strategies to counteract aging-associated pathologies will require the use of tools and strategies adapted from engineering.

The final chapter by *Vladimir N. Anisimov* addresses the issue of interventions raised again by *Chauhan* and colleagues. He describes experimental studies evaluating effects of biguanides and rapamycin on survival and carcinogenesis in mice paying attention to similarity in the majority of effects of these drugs on patterns of changes observed during normal aging and in the process of carcinogenesis. Anisi-

Introduction XI

mov considers whether an antiaging drug is in hand, one that combats age-related disease. The conclusion is that promising leads may already be available.

This book is bound to leave the reader unsatiated. The systems biology of aging is a new field. Although it is based on established methodologies, their application has been relatively limited to date. Furthermore, aging presents problems that are peculiar to it. Some of these peculiarities derive from the forces underlying its evolution. Others are the result of its fundamentally stochastic nature and its heterogeneity among individuals. Its presentation as a set of multiple morbidities and comorbidities only adds to the difficulty. We expect that future research will make use of new concepts and new tools to allow these aspects of aging to be adequately treated. Furthermore, we trust that this volume will stimulate such endeavors.

S. Michal Jazwinski, New Orleans, La. Anatoliy I. Yashin, Durham, N.C.

References

- 1 Von Bertalanffy L: General System Theory: Foundations, Development, Applications, rev ed. New York, George Braziller, 1969.
- 2 Jazwinski SM: Longevity, genes, and aging. Science 1996;273:54–59.
- 3 Kriete A, et al: Systems approaches to the networks of aging. Ageing Res Rev 2006;5:434–448.
- 4 de Magalhaes JP, Toussaint O: The evolution of mammalian aging. Exp Gerontol 2002;37:769–775.
- 5 Bredesen DE: The non-existent aging program: how does it work? Aging Cell 2004;3:255–259.
- 6 Capri M, et al: Human longevity within an evolutionary perspective: the peculiar paradigm of a post-reproductive genetics. Exp Gerontol 2008;43: 53–60.
- 7 Goldsmith TC: Aging as an evolved characteristic Weismann's theory reconsidered. Med Hypotheses 2004;62:304–308.
- 8 Holliday R: The evolution of human longevity. Perspect Biol Med 1996;40:100–107.
- 9 Heininger K: Aging is a deprivation syndrome driven by a germ-soma conflict. Ageing Res Rev 2002;1: 481–536.
- 10 Hughes KA, Reynolds RM: Evolutionary and mechanistic theories of aging. Annu Rev Entomol 2005;50:421–445.

- 11 Williams PD, Day T: Antagonistic pleiotropy, mortality source interactions, and the evolutionary theory of senescence. Evolution 2003;57:1478–1488.
- 12 Horvath S: DNA methylation age of human tissues and cell types. Genome Biol 2013;14:R115.
- 13 Blagosklonny MV: Aging is not programmed: genetic pseudo-program is a shadow of developmental growth. Cell Cycle 2013;12:3736–3742.
- 14 Jin K: Modern biological theories of aging. Aging Dis 2010;1:72–74.
- 15 Goldsmith TC: Arguments against non-programmed aging theories. Biochemistry (Mosc) 2013;78:971–978.
- 16 Goldsmith TC: Aging theories and the zero-sum game. Rejuvenation Res 2014;17:1–2.
- 17 Sharman EH, et al: Age-related changes in murine CNS mRNA gene expression are modulated by dietary melatonin. J Pineal Res 2004;36:165–170.
- 18 Acuna-Castroviejo D, et al: Melatonin, mitochondria, and cellular bioenergetics. J Pineal Res 2001; 30:65–74.
- 19 Pohanka M, et al: Oxidative stress after sulfur mustard intoxication and its reduction by melatonin: efficacy of antioxidant therapy during serious intoxication. Drug Chem Toxicol 2011;34:85–91.

XII Jazwinski · Yashin