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High Content Screening

A Powerful Approach to Systems Cell Biology and Drug Discovery

Edited by

D. Lansing Taylor

Cellumen, Inc., Pittsburgh, PA

Jeffrey R. Haskins

Cellomics, Inc., Pittsburgh, PA

Kenneth A. Giuliano

Cellumen, Inc., Pittsburgh, PA

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Preface

There has always been some tension between proponents of hypothesis-driven and discovery-driven research in the broad field of life sciences. Academic research has been primarily focused on hypothesis-driven research. However, the success of the human genome project, a discovery-driven research approach, has opened the door to adding other types of discovery-driven research to a continuum of research approaches.

In contrast, drug discovery research in the pharmaceutical industry has embraced discovery-driven research for many years. A good example has been the discovery of active compounds from large chemical libraries, through screening campaigns.

The success of the human genome project has also demonstrated the need for both academic researchers and industrial researchers to now understand the functions of genes and gene products. The cell is the basic unit of life and it has been at the cellular level where function can be demonstrated most cost-effectively and rapidly. High content screening (HCS) was developed by Cellomics Inc. in the mid-1990s to address the need for a platform that could be used in the discovery-driven research and development required to understand the functions of genes and gene products at the level of the cell.

It is important to understand that HCS evolved from light microscope imaging methods, used extensively in hypothesis-driven research for more than a decade before the introduction of HCS. The automation and informatics of HCS added the capability of discovery-driven research and development on cells to the existing strengths of the manual and semi-automated imaging light microscopy methods already applied to hypothesis-driven research. It is predicted that both hypothesis-driven research using advanced imaging microscopic methods and discovery-driven research and development (R&D) using HCS will continue to be used as a continuum of approaches. In fact, the continued evolution of HCS is expected to include the incorporation of new optical modules that come from the basic research activities of investigators from both academia and industry. However, HCS will always give up some flexibility relative to the imaging microscopy systems in favor of speed.

This volume was assembled to assist both existing users of HCS, as well as investigators considering the addition of a discovery-driven platform to their R&D activities. We assembled a team of authors that include the innovators of HCS, academic researchers that are at the forefront in applications of HCS to basic research, and experts from industry that are driving the evolution of HCS reagents, informatics and applications for drug discovery. The chapters have been organized into sections that highlight the importance of integrating instrumentation, application software, reagents and informatics. In addition, there are a combination of pure review chapters on key topics and specific methods chapters.

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The editors would like to thank the authors for taking part in this project and hope that this volume will serve as a valuable resource as the use of HCS continues to grow and evolve.

D. Lansing Taylor, PhD Jeffrey R. Haskins, PhD Kenneth A. Giuliano, PhD

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Contributors

Matthew J. Anstett • Spotfire, Inc., Somerville, MA

Daniel Bassoni • Vitra Bioscience, Inc., Mountain View, CA

Oren Beske • Vitra Bioscience, Inc., Mountain View, CA

Sara Bjørn • BioImage A/S, Copenhagen, Denmark

Robert A. Blake • Exelixis, Inc., South San Francisco, CA

Andrej Bugrim • GeneGo, St. Joseph, MI

Grace K. Y. Chan • The Neuroscience Research Centre, Merck Sharp and Dohme Research Laboratories, Essex, UK

Rajesh V. Chavli • Panomics, Inc, Fremont, CA

Mark A. Collins • Panomics, Inc., Pittsburgh, PA

Peter G. Conrad, II • Genospectra, Inc., Fremont, CA

Wallace J. Czekalski • Cellomics, Inc., Pittsburgh, PA

R. Terry Dunlay • Sage Sciences, Inc., Albuquerque, NM

Sean Ekins • GeneGo, Jerkintown, PA, and School of Pharmacy Department of Pharmaceutical Sciences, College Park, MD

JOHN T. Elliott • National Institute of Standards and Technology, Gaithersburg, MD

James G. Evans • Whitehead-MIT BioImaging Center, Computational and Systems Biology Initiative, Massachusetts Institute of Technology, Cambridge, MA

Leon S. Garfinkel • Hoffman-La Roche Inc., Global Research Infrastructure, Nutley, NJ

RALPH J. GARIPPA • Hoffmann-La Roche, Inc., Nutley, NJ

RICHIK N. GHOSH • Cellomics, Inc., Pittsburgh, PA

KENNETH A. GIULIANO • Cellumen, Inc., Pittsburgh, PA

RICHARD S. GIVENS • Department of Chemistry, University of Kansas, Lawrence, KS

Simon Goldbard • Vitra Bioscience, Inc., Mountain View, CA

Albert H. Gough • Cellumen, Inc., Pittsburgh, PA

Joe W. Gray • Life Sciences Division, Lawrence Berkeley National Laboratory, Berkeley, CA, and the Comprehensive Cancer Center, University of California, San Francisco, CA

Dale E. Greenwalt • Cambrex Bio Science Walkersville, Inc., Walkersville, MD

Yinghui Guan • Lawrence Berkeley National Laboratory, Berkeley, CA

George T. Hanson • Invitrogen Corporation, Madison, WI

JEFFREY R. HASKINS • Cellomics, Inc., Pittsburgh, PA

Ronald P. Herzig • Upstate USA/Chemicon International, Charlottesville, VI

ANN F. HOFFMAN • Hoffmann-La Roche, Inc., Nutley, NJ

Jeffrey T. Hung • Molecular Probes/Invitrogen, Eugene, OR

MICHAEL J. IGNATIUS • Molecular Probes/Invitrogen, Eugene, OR

Paul A. Johnston • University of Pittsburgh School of Medicine, Department of Pharmacology, Pittsburgh, PA

xii Contributors

Julie E. Kerby • The Neuroscience Research Centre, Merck Sharp and Dohme Research Laboratories, Essex, UK

John B. Kerrison • Wilmer Eye Institute, Johns Hopkins Hospital, Baltimore, MD

Eugene Kirillov • GeneGo, St. Joseph, MI

JUERGEN A. KLENK • Booz Allen Hamilton, Inc., McLean, VA

Kurt J. Langenbach • National Institute of Standards and Technology, Gaithersburg, MD

OLEG LAPETS • Cellomics, Inc., Pittsburgh, PA

John S. Lazo • Department of Pharmacology, University of Pittsburgh Drug Discovery Institute, University of Pittsburgh, Pittsburgh, PA

Viggo Linde • BioImage A/S, Copenhagen, Denmark

Frosty Loechel • NeuroSearch A/S, Ballerup, Denmark

Georgyi V. Los • Promega Corporation, Madison, WI

MARNIE L. MACDONALD • Odyssey Thera, Inc., San Ramon, CA

Thomas Machleidt • Invitrogen Corporation, Madison, WI

Daniel R. Marshak • Cambrex Corporation, Baltimore, MD

Paul Matsudaira • Whitehead-MIT BioImaging Center, Computational and Systems Biology Initiative, Massachusetts Institute of Technology, Cambridge, MA

DENNIS McDaniel • National Institute of Standards and Technology, Gaithersburg, MD

K. Gregory Moore • Serologicals Corporation, Charlottesville, VA

RICHARD M. NEVE • Life Sciences Division, Lawrence Berkeley National Laboratory, Berkeley, CA, and the Comprehensive Cancer Center, University of California, San Francisco, CA

Anthony Nichols • Molecular Screening and Cell Pharmacology Department, Serono Pharmaceutical Research Institute, Geneva, Switzerland

Tatiana Nikolskaya • GeneGo, St. Joseph, MI

Yuri Nikolsky • GeneGo, St. Joseph, MI

Peter O'Brien • Safety Sciences Europe, Pfizer Global Research and Development, Sandwich. UK

LEN PAGLIARO • BioImage A/S, Copenhagen, Denmark

Anne L. Plant • National Institute of Standards and Technology, Gaithersburg, MD Morten Præstegaard • BioImage A/S, Copenhagen, Denmark

GILLIAN R. RICHARDS • The Neuroscience Research Centre, Merck Sharp and Dohme Research Laboratories, Essex, UK

Matt Robers • Invitrogen Corporation, Madison, WI

Peter B. Simpson • The Neuroscience Research Centre, Merck Sharp and Dohme Research Laboratories, Essex, UK

WAYNE SPECKMANN, Upstate USA, Charlottesville, VA

Jackie L. Stilwell • Lawrence Berkeley National Laboratory, Berkeley, CA

D. Lansing Taylor • Cellumen, Inc., Pittsburgh, PA

DONALD P. TAYLOR • VIVISIMO, Inc., Pittsburgh, PA

NICK THOMAS • GE Healthcare, The Maynard Centre, Cardiff, UK

Alessandro Tona • National Institute of Standards and Technology, Gaithersburg, MD, and Geo-centers, Inc. Newton, MA

Contributors xiii

Andreas Vogt • Department of Pharmacology, University of Pittsburgh Drug Discovery Institute, University of Pittsburgh, Pittsburgh, PA

Alan S. Waggoner • Carnegie Mellon University, Pittsburgh, PA

John K. Westwick • Odyssey Thera, Inc., San Ramon, CA

Keith Wood • Promega Corporation, Madison, WI

Donald J. Zack • Wilmer Eye Institute, Johns Hopkins Hospital, Baltimore, MD



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