Small molecule discovery



Small Molecule Discovery in Oncology and Beyond: Challenges and Opportunities

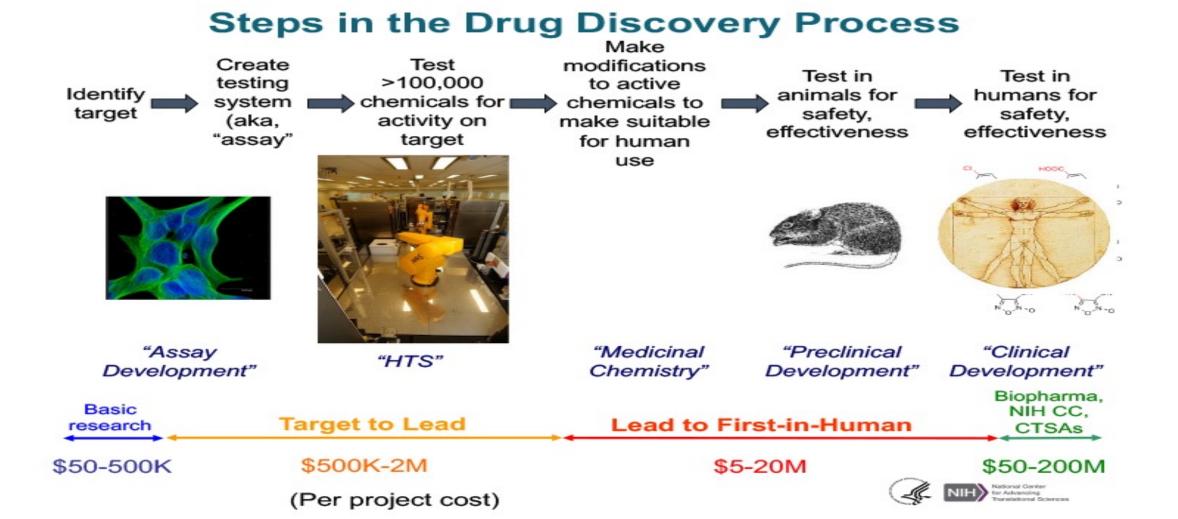
Anton Simeonov, Ph.D.

Scientific Director, National Center for Advancing Translational Sciences (NCATS), National Institutes of Health (NIH)

> TRACO Lecture October 10, 2023



Drug discovery steps

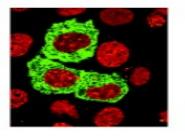


Screening assays

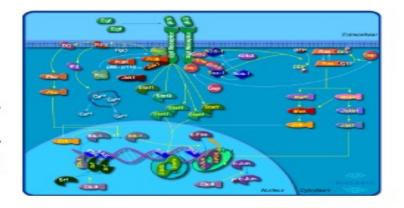
Range of Screening Assays

Extent of reductionism

Phenotype (Image-based HCS, GFP, etc)

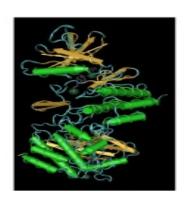


Pathway (Reporters, e.g., luciferase, βlactamase)



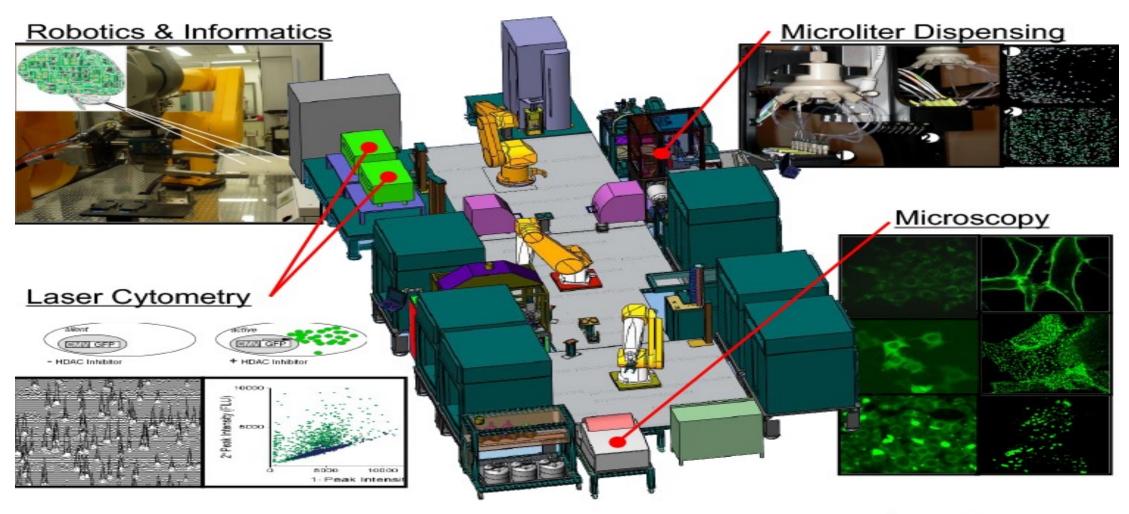


(Enzyme readouts, interactions, etc)





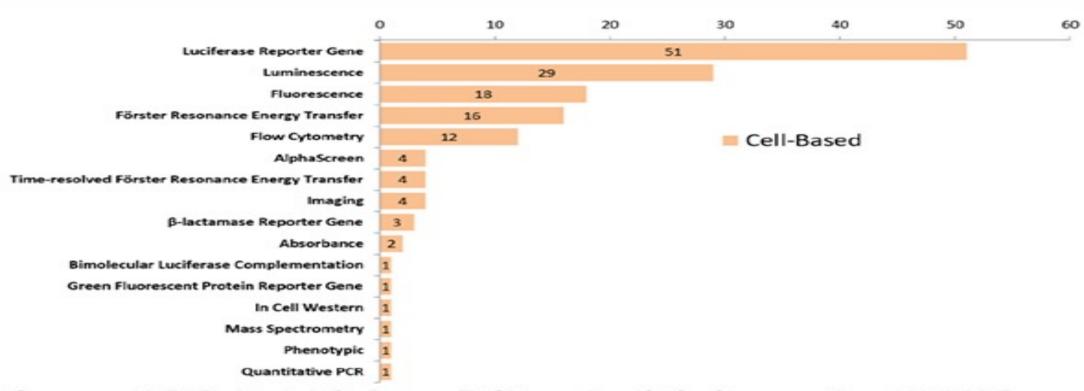
Robotics





HTS assays

149 Cancer Relevant Cell-Based HTS Assays from PubChem



Coussens, N. P., Braisted, J. C., Peryea, T., Sittampalam, S. G., Simeonov, A. and Hall, M. D. Small Molecule Screens: A Gateway to Cancer Therapeutic Agents with Case Studies of FDA-Approved Drugs Pharmacological Reviews, October 2017, 69 (4) 479-496

Assay expense

- Assay expense
 - Cost per well
 - Disposal cost(s)

Instrumentation

- Assay expense
 - Cost per well
 - Disposal cost(s)
- Available instrumentation
 - Select the best possible assays based on the available instrumentation

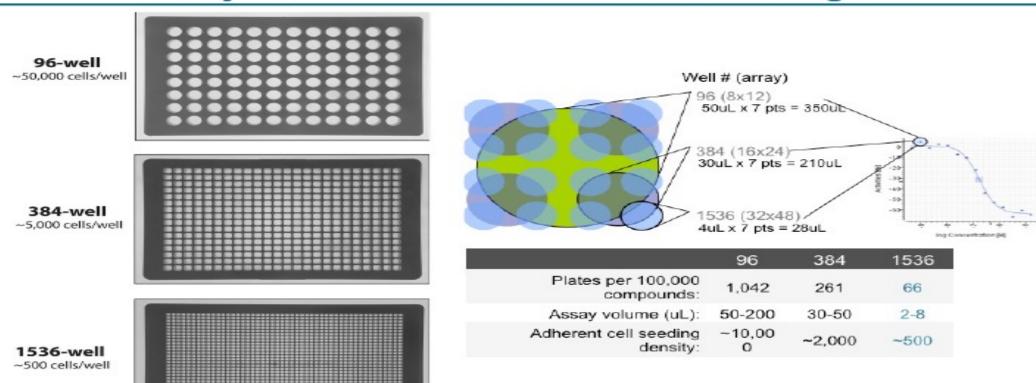
Throughput

- Assay expense
 - Cost per well
 - Disposal cost(s)
- Available instrumentation
 - Select the best possible assays based on the available instrumentation
- Assay throughput
 - Miniaturization reduces the cost per well



Miniaturization

Assay Miniaturization Saves Time and Reagents



Horman, Shane R. "Complex High-Content Phenotypic Screening." Special Topics in Drug Discovery. InTech, 2016.



Multiplex

- Assay expense
 - Cost per well
 - Disposal cost(s)
- Available instrumentation
 - Select the best possible assays based on the available instrumentation
- Assay throughput
 - Miniaturization reduces the cost per well
- Ability to multiplex
 - Can the response be measured by a single parameter; is multiparametric output possible?
 - Increased data per sample
 - Can guide hit slection by differentiating selectivity among related targets
 - Can distinguish pathway inhibition from cytotoxicity in a cell-based assay

Reagents

- Assay expense
 - Cost per well
 - Disposal cost(s)
- Available instrumentation
 - Select the best possible assays based on the available instrumentation
- · Assay throughput
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- Ability to multiplex
 - Can the response be measured by a single parameter; is multiparametric output possible?
 - Increased data per sample
 - Can guide hit slection by differentiating selectivity among related targets
 - Can distinguish pathway inhibition from cytotoxicity in a cell-based assay
- Reagents
 - Stablility for hours is important
 - Consistency is critical (ideally obtain a large quantity from a single lot)
 - All reagents need to be validated (cell lines, antibodies, enzymatic purity, etc.)



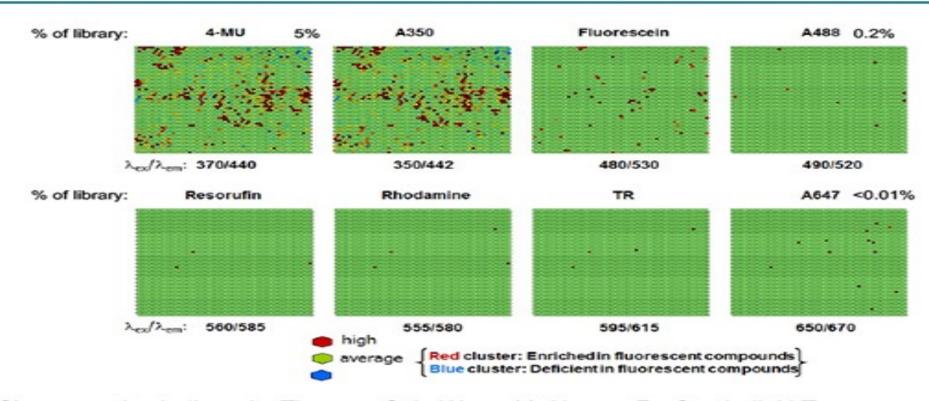
Interference

- Assay expense
 - Cost per well
 - Disposal cost(s)
- Available instrumentation
 - Select the best possible assays based on the available instrumentation
- Assay throughput
 - Miniaturization reduces the cost per well
- Ability to multiplex
 - Can the response be measured by a single parameter; is multiparametric output possible?
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 - Can guide hit slection by differentiating selectivity among related targets
 - Can distinguish pathway inhibition from cytotoxicity in a cell-based assay
- Reagents
 - Stablility for hours is important
 - Consistency is critical (ideally obtain a large quantity from a single lot)
 - All reagents need to be validated (cell lines, antibodies, enzymatic purity, etc.)
- Potential for assay interference
 - Fluorescent compounds can interfere with fluorescent readouts
 - Colored compounds might interfere with luminescence



Spectroscopic profiling

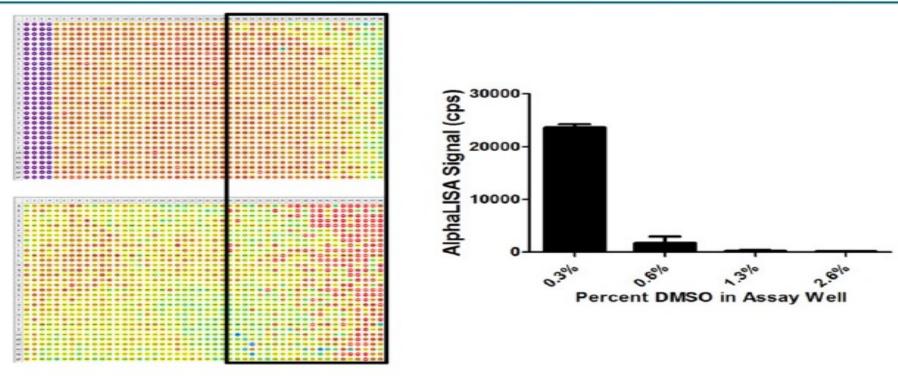
Fluorescence Spectroscopic Profiling of Compound Libraries



Simeonov, A., Jadhav, A., Thomas, C.J., Wang, Y., Huang, R., Southall, N.T., Shinn, P., Smith, J., Austin, C.P., Auld, D.S. and Inglese, J., 2008. Fluorescence spectroscopic profiling of compound libraries. Journal of Medicinal Chemistry, 51(8), 2363-2371.

Tolerance to DMSO

Determination of Assay Tolerance to DMSO/Vehicle is Important



Yasgar A., Jadhav A., Simeonov A., Coussens N.P., AlphaScreen-Based Assays: Ultra-High-Throughput Screening for Small-Molecule Inhibitors of Challenging Enzymes and Protein-Protein Interactions. Methods Mol Biol. 2016;1439:77-98.



Homogenous format

- Homogenous assay format is preferred for screening
 - Add reagents, mix and measure (no solution removal or wash steps)
 - Automation friendly
 - Reduces variability
 - Decreases hands-on time
 - Improves reproducibility



Time required

- Homogenous assay format is preferred for screening
 - Add reagents, mix and measure (no solution removal or wash steps)
 - Automation friendly
 - Reduces variability
 - Decreases hands-on time
 - Improves reproducibility
- Time required for assay
 - Off-line reagent preparation
 - Is temperature equilibration required
 - Actual assay time
 - Kinetic versus end point read
 - Time required for data analysis and record keeping

Signal stability

- Homogenous assay format is preferred for screening
 - Add reagents, mix and measure (no solution removal or wash steps)
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- Time required for assay
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 - Time required for data analysis and record keeping
- Signal stability
 - Does the response occur rapidly or within a few minutes or hours?
 - Longer signal stability allows for flexibility in automated systems
 - Longer signal stability minimizes differences among plates within a stack



Sensitivity

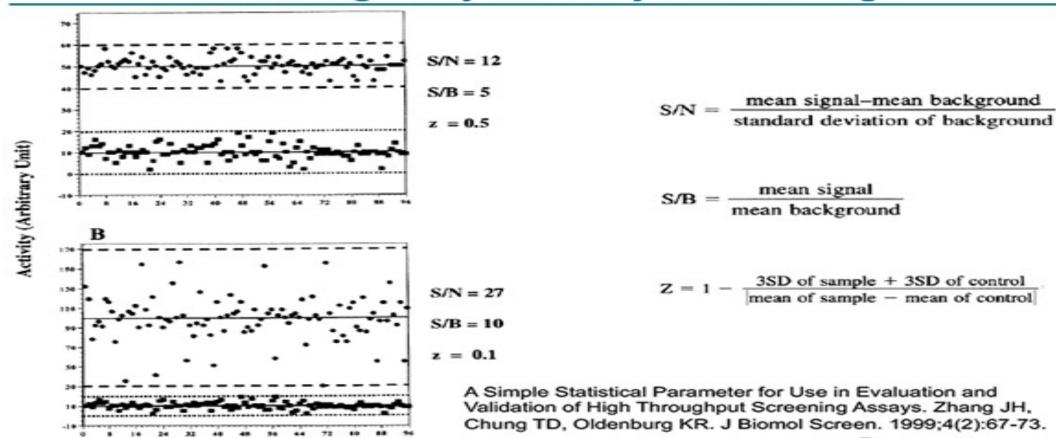
- Homogenous assay format is preferred for screening
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 - Improves reproducibility
- Time required for assay
 - Off-line reagent preparation
 - Is temperature equilibration required
 - Actual assay time
 - Kinetic versus end point read
 - Time required for data analysis and record keeping
- Signal stability
 - Does the response occur rapidly or within a few minutes or hours?
 - Longer signal stability allows for flexibility in automated systems
 - Longer signal stability minimizes differences among stacks of plates
- Assay Sensitivity
 - Choice of readouts is important
 - Colorimetric<fluorescent<luminescent



Evaluating assay

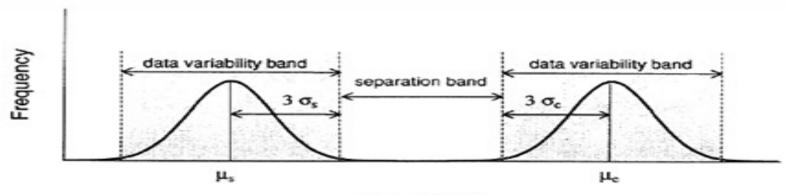
Sample Number

Evaluating Assay Suitability for Screening



Suitability

Evaluating Assay Suitability for Screening



Assay signal

$$Z = 1 - \frac{3SD \text{ of sample} + 3SD \text{ of control}}{|\text{mean of sample} - \text{mean of control}|} *$$

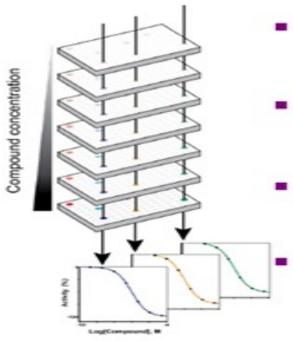
Z-factor value	Structure of assay	Related to screening
1	SD = 0 (no variation), or the dynamic range → ∞	An ideal assay
$1 > Z \ge 0.5$	Separation band is large	An excellent assay
0.5 > Z > 0	Separation band is small	A double assay
0	No separation band, the sample signal variation and control signal variation bands touch	A "yes/no" type assay
<0	No separation band, the sample signal variation and control signal variation bands overlap	Screening essentially impossible

A Simple Statistical Parameter for Use in Evaluation and Validation of High Throughput Screening Assays. Zhang JH, Chung TD, Oldenburg KR. J Biomol Screen. 1999;4(2):67-73.



Quantitative HTS

Improving the Process of Early Discovery: Quantitative High-Throughput Screening (qHTS)



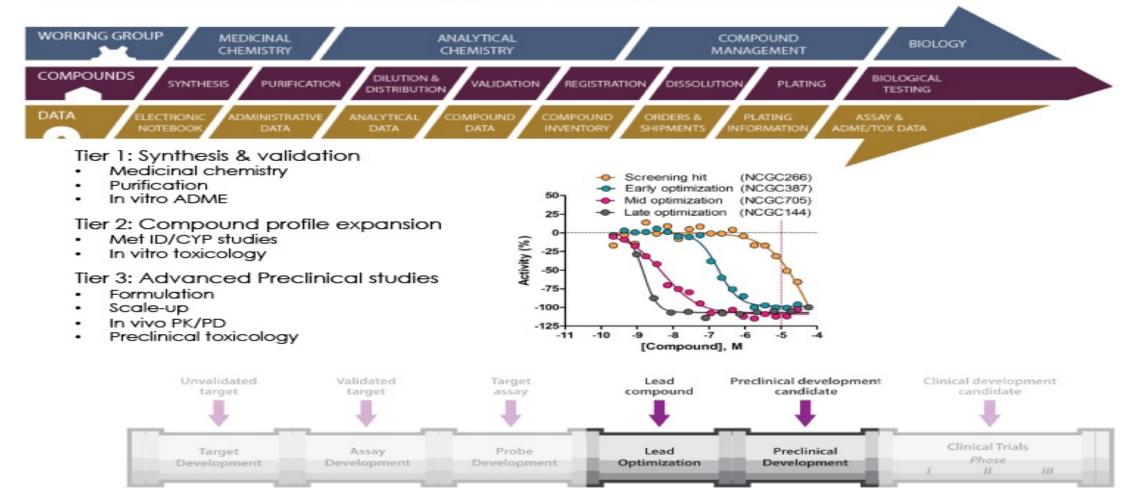
- Conventional screening done at one concentration
 - Not appropriate for potency testing "dose makes the poison"
- qHTS tests compounds assayed at multiple concentrations (range: 4 logs)
- Enabled by miniaturized assay volumes (2-8 μL per test) and informatics pipeline
 - Generates pharmacological actives instead of statistical "hits"
 - Dramatically increases reliability
 - Dramatically reduces false positives and false negatives

PNAS 103:11473

 To date, several hundred million datapoints from several hundred screens have been generated and deposited in the public domain.

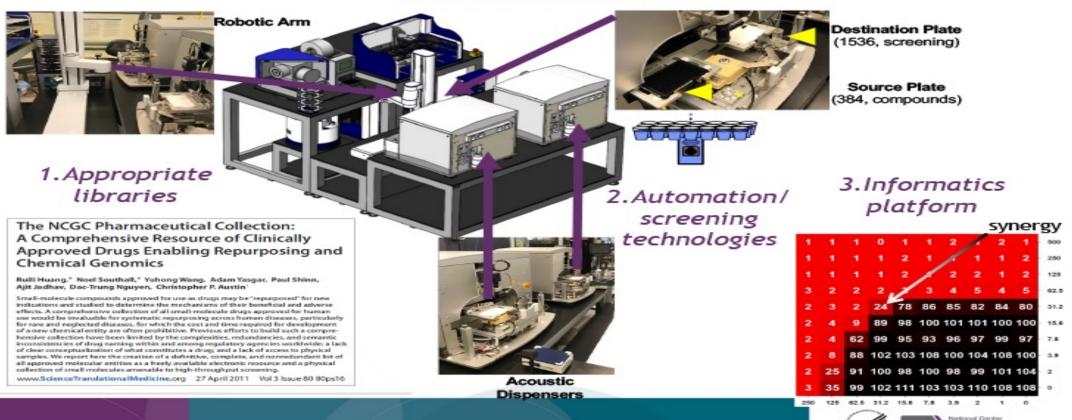
Medicinal chemistry

Medicinal Chemistry, an Integrated Process



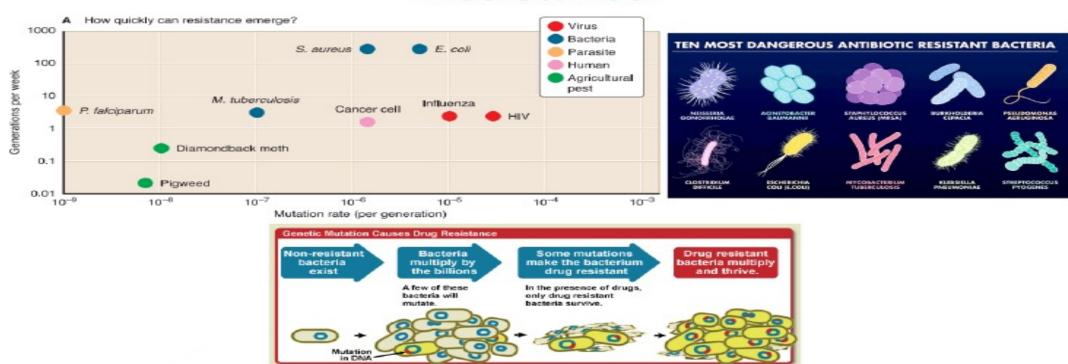
Drug combinations

Translation Challenge: Rapid Discovery of Drug Combinations



Resistance

Application of Drug Combinations to Address Resistance





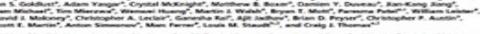
Dissemination

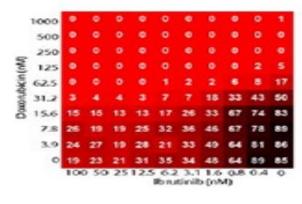
Dissemination of technology: combination screening to overcome drug resistance in cancer cells

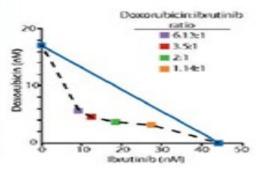
- Applied to ABC subtype of Diffuse Large B-Cell Lymphoma (ABC-DLBCL)
- Ibrutinib is a BTK inhibitor that has activity against ABC DLBCL
- Lead investigators: Craig Thomas (NCATS) and Louis Staudt (NCI)
- Study evaluated 459 drugs in combination with Ibrutinib
 - » 6 x 6 concentration-response "matrix blocks", validation in 10 x 10 concentration-response matrix blocks
- DNA-damaging agents identified as synergizing with Ibrutinib in killing ABC DLBCL cell lines
- Dissemination:
 - » Protocols
 - » Source code for dispense

High-throughput combinatorial screening identifies drugs that cooperate with ibrutinib to kill activated B-cell-like diffuse large B-cell lymphoma cells

on S. Goldket*, Adam Yangar*, Crystal McKnight*, Motthew B. Boxer*, Damien Y. Duveau*, Jan-Kong Jiang*, Sam Michael", Tim Mierzwa", Wemani Huang", Martin J. Walsh", Bryan T. Mott", Paresma Patel", William Leist





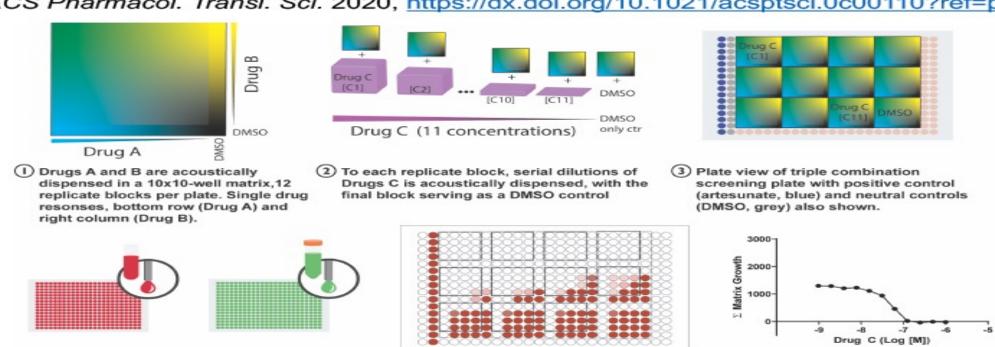




Triple drug combination

Example: triple drug combination screening to tackle resistance against artemisinin-based combination therapies in malaria

ACS Pharmacol. Transl. Sci. 2020, https://dx.doi.org/10.1021/acsptsci.0c00110?ref=pdf



- (4) Dispense P. falciparum and erythrocytes. incubate 72 hr
- (5) Dispense 2 µL of SYBRGreen1 and lysis solution, incubate overnight. Fluorescence quantified
 - (6) Parasite proliferation response is normalized to artesunate and DMSO controls. For each concentration Drug C block, response of Drug A + Drug B wells is summed.
- Triple drug response is analyzed as a function of Drug C concentration.

VIPOR combination



ViPOR Regimen Is Safe, Shows Impressive Activity in Relapsed/Refractory DLBCL

-One Mouro-00000

information provided by (Responsible Party):

National February of Realth Climbs Center (CC) (Setunal Center (notified (NC)))

December 27, 2005 — The 5-drug regimen of variational Analysis producings, should carried and produced whence a fallowing supply profits and encouraging artificator activity with complete responses in patients with entopendirefractory differe large II cell (emphores



The 5-drug regimen of venetoclas (Venciosts), ibrutinib (Intinuica), prechisone, obinuturumab (Gazyva), and lenaldomide (Revinsk), VAPOR) showed a tolerable safety profile and encouraging settlamor activity with complete responses (CRs) in patients with relapsed refractory diffuse large 8-cell lymphoma (DLBCL), according to phase 15/2 findings that were presented during the 2020 ASH Annual Meeting and Exposition.

Results showed that of 52 evaluable patients. The best overall response was 71%, with a complete response (CR) rate of 52% and a 19% partial response (FR) rate. Specifically, in relapsed patients (n = 36), the objective response rate (ORR) was 50% with a 70% and 10% CR and PR rate, respectively. The ORR was 56% in refractory patients (n = 22), with a 27% CR rate and a 27% PR rate.

https://www.onclive.com/view/vipor-regimen-is-safe-showsimpressive-activity-in-relapsed-refractory-dlbcl

VIPOR Regimen Signals Boott in Patients With Mantle Cell Lymphoma February T 2002

@ 00000

In an extension with Targeted Christopy Constigue Million, PSI, the asset the anguing 1970A study exploring a divarial funcion known and BOLF

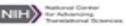
Treatment with the VIPOR regimen consisting of veneroclas (Vendesta), Envirob (Imbranical), prediscore, and lenalidomide (Norlimed), has than far appeared safe for use in patients with martie collifyrighoma (MCL) and has demonstrated preinwary

Results from the phase 1 portion of the VIPOR study (NCT02020010) were presented during the 63rd American Society of Hernatology (ASH) Armusi Meeting & Exposition. Of the 11 patients who were treated, the ORR was 100% and the complete remission (CR) rate was 60%, him parients were evaluable for safety and no dose-limiting tradiction were observed. There were less grade 3 and 4 adverse events (AEs), but the hematologic grade 3r4 AEs included neutropenia (13%), anomia (11%), and thromborympenia (FN). The non-hemutologic grade 3/4 AEs included hypologicmia

(30%) along with forigue, hypomogressemia, elevated bilinable, strial fibrillation, lung infection, and synospe occurring in 11% of patients each

https://www.targetedonc.com/view/vipor-regimensignals-benefit-in-patients-with-mantle-cell-lymphoma





3D models

Increasing the predictivity of *in vitro* assays: a continuum of 3D models of healthy and diseased tissues

2D Spheroids Organoids Printed Tissues Organ-on-a-chip

Physiological complexity

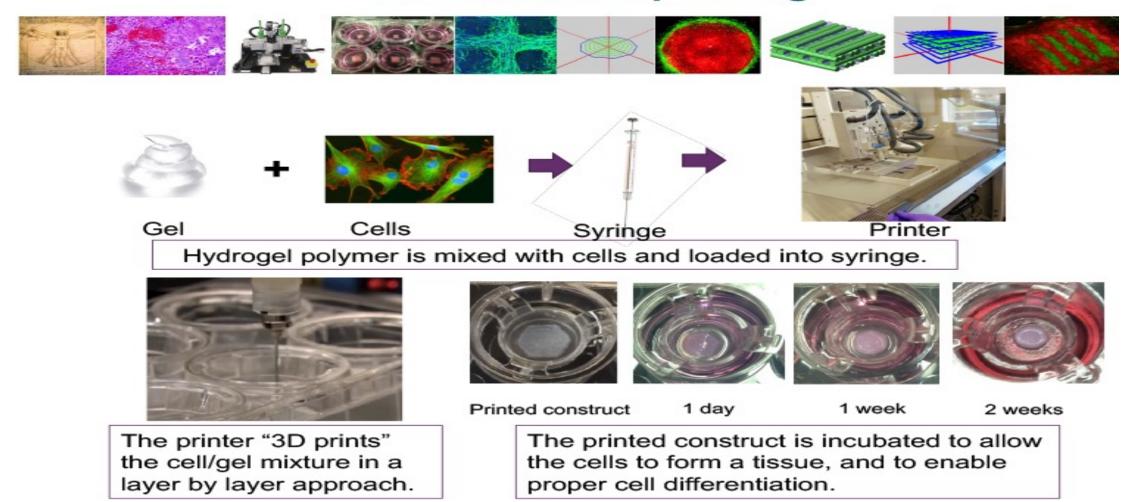
HTS compatibility

Physiological complexity



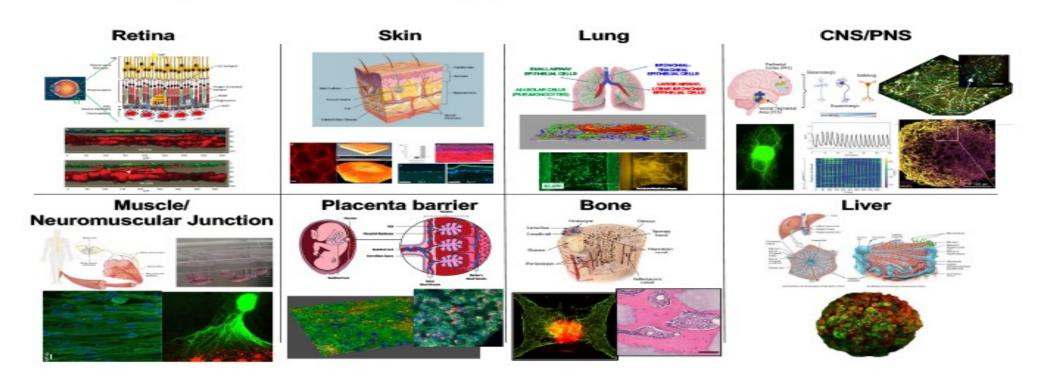
Tissue bioprinting

3D Tissue Bioprinting



3D tissue models

Current portfolio of engineered 3D tissue models



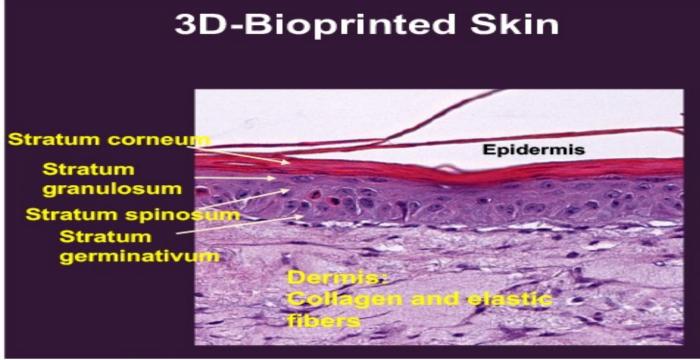
Program Director Marc Ferrer, Ph.D. https://ncats.nih.gov/bioprinting



Skin biofabrication

Skin biofabrication







Skin tissue generation

Generation of bioprinted skin tissues

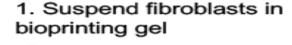
Reconstructed human epidermis (RhE)

- Coat the 96-well transwell insert membrane with collagen
- 2. Add keratinocytes
- 3. Submerge culture for 3 days
- 4. Air-liquid interface culture for 8 days

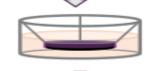


- Bioprint fibroblast bioink to a 3-layer U shape on bottom side of 96-well transwell insert membrane
- 4. Submerge bioprinted tissue in medium for 7 days
- 5. Add keratinocytes and submerge culture for 3 days
- 6. Air-liquid interface culture for 8 days

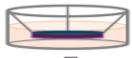




















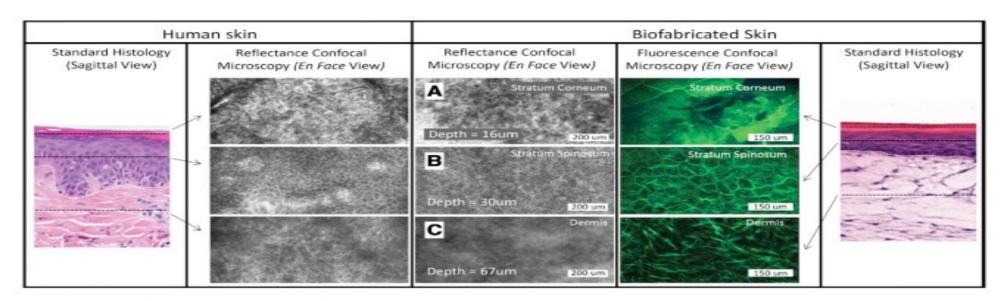
Tissue model

www.oncotarget.com

Oncotarget, 2020, Vol. 11, (No. 27), pp: 2587-2596

Research Paper

A 3D biofabricated cutaneous squamous cell carcinoma tissue model with multi-channel confocal microscopy imaging biomarkers to quantify antitumor effects of chemotherapeutics in tissue



Collaboration between NCATS (Marc Ferrer) and Rockefeller University (Daniel Gareau)



Information





Book

Sharing internal know-how: Assay Guidance Manual (47 chapters/ 1,338 printed pages)

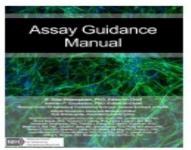


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Considerations for Early Phase Drug Discovery	1 Chapter
In Vitro Biochemical Assays	10 Chapters
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Assay Validation, Operations and Quality Control	5 Chapters
Assay Technologies	2 Chapters
Instrumentation	2 Chapters
Pharmacokinetics and Drug Metabolism	1 Chapter
Glossary of Quantitative Biology Terms	1 Chapter

Website:https://ncats.nih.gov/expertise/preclinical/agm

Email us: NCATS AGM Editors@mail.nih.gov



Facebook: www.facebook.com/assayguide

https://ncats.nih.gov/agm-video

August 7th Videos

- Austin, CP: Welcome to the Assay Guidance Manual (AGM) Workshop
- Coussens, NP: Strategies for Assay Selection & Robust Biochemical
- Riss, T: Treating Cells as Reagents to Design Reproducible Screening 3.
- Trask, OJ: Assay Development Considerations for High Content Imaging
- 5. Auld, DS: Studies in Mechanisms and Methods in Assay Interferences
- Dahlin, JL: Assay Interference by Chemical Reactivity 6.
- 7. Chung, TDY: Basic Assay Statistics, Data Analysis & Rules of Thumb
- 8. Devanarayan, V: Reproducibility & Differentiability of Potency Results
- 9. Sittampalam, GS: Avoiding Artifacts & Interferences in Assay Operations

March 26-27th Videos

- Austin, CP: Welcome to the Assay Guidance Manual (AGM) Workshop
- Coussens, NP: Robust Assays Define Success in Preclinical Research
- 3. Lal-Nag, M: Target Identification & Validation in Translational Discovery
- 4. Foley, TL: Development & Validation of Cell-Based and Biochemical
- 5. Riss, T: Treating Cells as Reagents to Design Reproducible Screening
- Trask, OJ: Assay Development for HCS & Best Practices for 3D HCS 6.
- 7. Roth, KD: Mass Spectrometry for Drug Screening and Lead Optimization
- 8. Dahlin, JL: Bioassay Interference by Aggregation and Chemical Reactivity
- 9. Patnaik, S: Lead Selection and Optimization by Medicinal Chemistry
- 10. Xia, M: In Vitro Toxicological Testing Using a qHTS Platform
- 11. Xu. X: In Vitro Assessment of ADME Properties of Lead Compounds
- 12. Kahl, SD: Statistical Design of Experiments for Assay Development
- 13. Guha, R: Pharos Application to Target Evaluation and Drug Discovery
- Weidner, JR: Assay Operations: Keeping Assays Robust and Reproducible



Assay guidance manual

Assay Guidance Manual Training Workshops

- Online Training Modules
- Upcoming Workshops
- Past Workshops

NCATS offers a variety of <u>Assay Guidance Manual (AGM</u>) training workshops throughout the year designed to share best practices and advice on robust assay design, development and implementation for researchers involved in the drug discovery process.



Online Training Modules

NCATS offers an online AGM training workshop in addition to the in-person AGM workshops held throughout the year. The online training workshop also features experts sharing best practices and expert advice on assay design, development and implementation. View the video modules.



Assay Guidance Workshop on 3D Tissue Models for Antiviral Drug Development

THIS EVENT HAS ENDED

Video of the workshop is available at the links below:

Assay Guidance Workshop on 3D Tissue Models for Antiviral Drug Development (Day 1) (June 7, 2022)

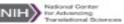
Assay Guidance Workshop on 3D Tissue Models for Antiviral Drug Development (Day 2) (June 8, 2022)

About the Workshop

The National Center for Advancing Translational Sciences (NCATS) Assay Guidance Manual (AGM) program is hosting a two-day workshop that will cover a broad range of critical concepts, including practical approaches and best practices, for developing standardized 3D cellular assays with the hope of helping the community to successfully develop therapeutics for future pandemic threats. This workshop is jointly organized by NCATS, the National Institute of Allergy and Infectious Diseases (NIAID) and the Bill & Melinda Gates Foundation. The overall goal of this workshop is to help scientists establish robust, reproducible, scalable, consistent, advanced 3D tissue models to study pandemic threat viruses.

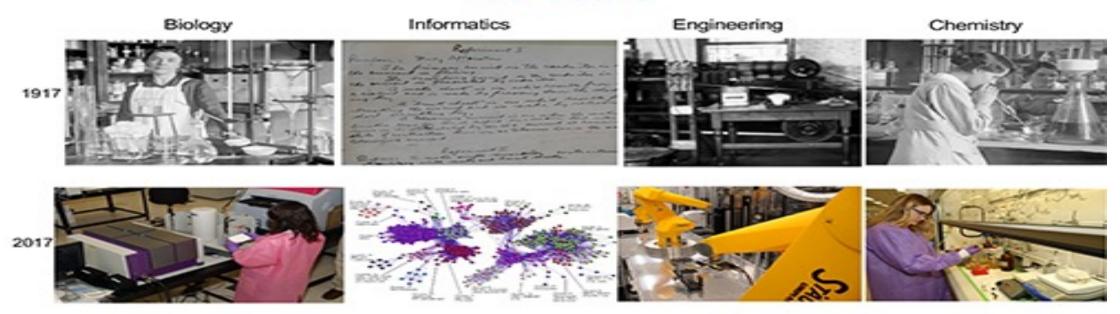
https://ncats.nih.gov/expertise/preclinical/agm/training





Biomedical changes

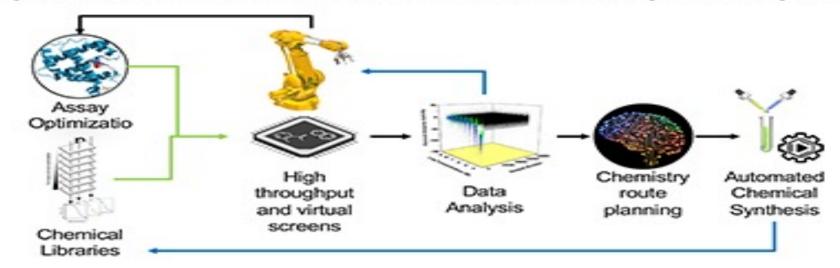
Changes in Biomedical Research Fields in the Last 100 Years



Joining forces

Chemistry, Engineering, Informatics, and Biology Joining Forces to Automate the Design, Generation, and Testing of New Molecules

A Specialized Platform for Innovative Research Exploration (ASPIRE)





Biological assay development

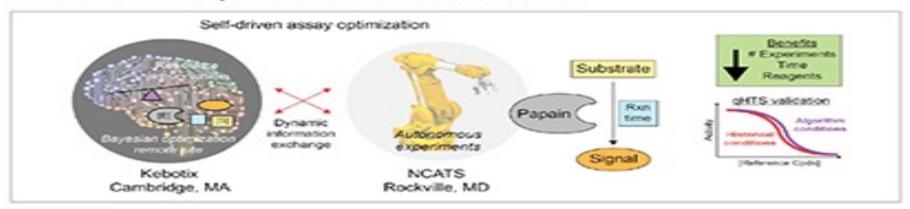


Cross-Platform Bayesian Optimization System for Autonomous Biological Assay Development

SLAS Technology 2021, Vol. 24(4) 579–590 O Society for Lilborisony Automation and Screening 2021 DOI: 10.1177/24724303211053782 journals saggled-comfrome/(s

SSAGE

Sam Elder¹*, Carleen Klumpp-Thomas²*, Adam Yasgar², Jameson Travers², Shayne Frebert², Kelli M. Wilson², Alexey V. Zakharov², Jayme L. Dahlin², Christoph Kreisbeck¹, Dennis Sheberla¹, Gurusingham S. Sittampalam², Alexander G. Godfrey², Anton Simeonov², and Sam Michael²



Graphical Abstract.



NCATS

NCATS

COLLABORATE. INNOVATE. ACCELERATE.









