# Predictive, Personalized, Preventive and Participatory approach to Medicine: "P4" Leroy Hood

# **Precision Medicine:**

# Personalized, Problematic, and Promising

J. Larry Jameson, M.D., Ph.D., and Dan L. Longo, M.D. NEJM 4 June 2015



#### **IMPRECISION MEDICINE**

For every person they do help (blue), the ten highest-grossing drugs in the United States fail to improve the conditions of between 3 and 24 people (red).



Based on published number needed to treat (NNT) figures. For a full list of references, see Supplementary Information at go.nature.com/4dr78f.



Increasing failures in drug development Success rates of clinical proof-of-concept have dropped from 28% to 18% Insufficient efficacy as the most frequent reason



Nature Reviews Drug Discovery

*Source: John Arrowsmith: Nature Reviews Drug Discovery 2011* Increasing failures in drug development : Analysis of 108 failures in phase II



#### Human whole-genome sequencing power

Maximum throughput for population- and production-scale genomics.



Example: During 2014 the sequencing company Illumina announced the so called 1000 dollar genome.

#### Technology is transforming biomedical science

Technical and scientific advances are currently transforming biomedical research, turning an important part of the field into a new modelling and computational science.

High throughput life science data are today affordable and drives important parts of biomedical research. The exploitation of big data is starting to make direct impact in clinical practice.



#### MICROFLUIDIC TECHNOLOGIES TO IDENTIFY PATIENT'S PATHOGENIC ANTIBODIES







#### Developing precision medicine. Creating Global Health

Huge efforts to establish national and international baselines, outlining the global biological variation in populations are ongoing or are being initiated. These studies will provide bases for further developments of personalized/precision medicine. Examples include e.g. *Genomics England* and the *Precision Medicine Initiative in the US* as well as targeted projects like *The Resilience project*.



Global companies like Google, IBM, Amazon and Microsoft are currently positioning themselves to provide services around storage, management and analyses of the new big life science data.



#### Watson Plays Expanded Role In IBM's Transformation, Applying Expertise In Genomics For Cancer Research

By Amy Nordrum 🔰 @amynordrum 🕿 a.nordrum@ibtimes.com on March 06 2015 3:17 PM EST







Watson, IBM's famous supercomputer, has been analyzing genomic data for the past year in a partnership with the New York Genome Center and is now ready to begin a beta test with other research institutions. Dr. Robert Darnell, CEO of the New York Genome Center, and Dr. Ajay Royyuru, director of the IBM Computational Biology Center, are pictured at the launch of their collaboration in March 2014. Jon Simon/IBM



## SEARCHING FOR STANDARDIZED PIPELINES FOR HUMAN GENOMICS



Broad Institute, Google Genomics combine bioinformatics and computing expertise to expand access to research tools

**Cambridge, Mass.** June 23rd, 2015 — Broad Institute of MIT and Harvard is teaming up with Google Genomics to explore how to break down major technical barriers that increasingly hinder biomedical research by addressing the need for computing infrastructure to store and process enormous datasets, and by creating tools to analyze such data and unravel long-standing mysteries about human health.



PRESS RELEASE

For press inquiries contact:

# **BIOPHARMACEUTICAL COMPANIES ARE COMMITTED TO ADVANCING PERSONALIZED MEDICINES**





33%

expected increase investment in personalized medicines over the next five years





of cancer medicines in the pipeline have the potential to be personalized

69%

**Expected increase in the** number of personalized medicines in development over the next 5 years

Sources: Tufts Center for the Study of Drug Development, "Impact Report," Volume 17, No.3, May/June 2015.





# Prospective Validation of a 21-Gene Expression Assay in Breast Cancer

J.A. Sparano, R.J. Gray, D.F. Makower, K.I. Pritchard, K.S. Albain, D.F. Hayes, C.E. Geyer, Jr., E.C. Dees, E.A. Perez, J.A. Olson, Jr., J.A. Zujewski, T. Lively, S.S. Badve, T.J. Saphner, L.I. Wagner, T.J. Whelan, M.J. Ellis, S. Paik, W.C. Wood, P. Ravdin, M.M. Keane, H.L. Gomez Moreno, P.S. Reddy, T.F. Goggins, I.A. Mayer, A.M. Brufsky, D.L. Toppmeyer, V.G. Kaklamani, J.N. Atkins, J.L. Berenberg, and G.W. Sledge



# The effect of early, comprehensive genomic testing on clinical care in neonatal diabetes: an international cohort study



Lancet 386, September 2015

Figure 1: The paradigm shift of genetic testing Schematic representation of the steps involved in genetic testing before and after the introduction of next-generation sequencing. The red boxes indicate the role ( genetic testing.

#### **MULTIPLEX TESTING IS ALREADY AVAILABLE**

#### **OncoType DX**

Analyzes by qPCR, mRNA expression of a panel of 21 genes within a tumor to determine a Recurrence Score

#### **MammaPrint**

Microarray-based prognostic breast cancer mRNA expression profiling test of 70 genes

#### AlloMap

qPCR-based expression profile of 11 genes to assist physicians in managing heart transplant patients for potential organ rejection

#### **Tissue of Origin**

Microarray technology considers 15 common malignant tumor types, including bladder, breast, and colorectal tumors based on mRNA expression on 1,550 genes





#### SINM PhyzioType<sup>TM</sup> System: <u>Statin-Induced Neuro-Myopathy</u>

GENOMAS DIABETES + CVD, Reduction of Cardio-metabolic Risk by Lipid-lowering: Statins



The SINM PhyzioType System provides the physician with DNA-guided efficacy predictions for aggressive lipid lowering and risk profiles for neuromuscular side effects of atorvastatin, simvastatin, and rosuvastatin. The information can be employed prognostically before prescribing statin therapy or diagnostically to categorize neuro-myopathy in those statin patients already evidencing neurological or muscular symptoms and seeking remedial treatment. The SINM PhyzioType System consists of 4 tests predicting LDL lowering and HDL raising efficacy, and innate side-effect risk for myalgia and CK activity elevation (mopathy), in response to statins on a class-wide and drug-specific basis. A patent on the SINM PhyzioType product is pending as an application.

Statin Induction + Neuro-Myopathy (SINM), the balance of potency and safety, is the main clinical management challenge of these drugs, particularly in diabetes where treatment targets are aggressive requiring LDL cholesterol levels below 100 mg/dl. In medical practice, Neuro-myopathy presents as a constellation of neuromuscular side effects. Clinical symptoms include myalgia (muscle aches, cramps, weakness) and myopathy (muscular injury monitored by serum elevation of muscle enzymes). Neuro-myopathy is more frequent at the higher doses required for treating advanced cardiovascular disease and varies in extent between individual statins and from patient to patient. Therefore, prescribing the most potent statin on an individual basis is critical as well to avoid maximal doses. Statin usage is ultimately limited by toxicity. Neuro-myopathy is disabling to 10-20% of patients on statins, requires alteration of therapy, burdens healthcare with management costs, and reduces compliance. Only 50% of patients remain on statins 6 months after initiation of therapy.

Statins are the most prescribed drugs in the world. Statins are the most effective





#### **TARGETED THERAPY**





#### Targeted





# A real increase in the impact of precision medecine in drug development



2015), PMC, "More than 20 percent of the Novel New Drugs Approved by FDA's Center for Drug Evaluation and Research in 2014 are Personalized Medicines," http://www.personalizedmedicinecoalition.org/Userfiles/PMC- \*As of N Corporate/file/2014-fda-approvals-personalized-medicine2.pdf (accessed May 2015).

\*As of March 27, 2015



## EXAMPLES OF CONDITIONS IN WHICH PRECISION MEDICINE HAS BEEN USED\*

Medical Field	Disease	Biomarker	Intervention
Cancer	Chronic myeloid leukemia	BCR-ABL	Imatinib KRAS Colon
	Lung cancer	EML4-ALK	Crizotinib BRAF Melan
Hematology	Thrombosis	Factor V Leiden	Avoid prothrombotic drugs
Infectious disease	HIV/AIDS	CD4+ T cells, HIV viral load	Highly active antiretroviral therapy
Cardiovascular disease	Coronary artery disease	CYP2C19	Clopidogrel
Pulmonary disease	Cystic fibrosis	G551D	Ivacaftor
Renal disease	Transplant rejection	Urinary gene signature	Antirejection drugs
Hepatology	Hepatitis C	Hepatitis C viral load	Direct-acting antiviral agents
Endocrine disease	Multiple endocrine neo-plasia type 2	RET	Prophylactic thyroidectomy
Metabolic disease	Hyperlipidemia	LDL cholesterol	Statins
Neurology	Autoimmune encephalitis	CXCL13	Immunotherapy
Psychiatry	Alcohol-use disorder	GRIK1	Topiramate
Pharmacogenomics	Smoking cessation	CYP2A6	Varenicline
Ophthalmology	Leber's congenitalamaurosis	RPE65	Gene therapy



\* In the biomarker column, proteins or genes that are probed to find the specific variants of interest are shown. AIDS denotes acquired immunodeficiency syndrome, HIV human immunodeficiency virus, and LDL low-density lipoprotein.

## ONCOLOGY IS ON THE LEADING EDGE OF PERSONALIZED MEDICINE

In ten years, cancer patients have seen a four-fold increase in their personalized medicine treatment options.

Breakdown of Oncology Treatment Modalities, Global Market share 2003-2013\*



Sources: IMS Institute for Healthcare Informatics, "Innovation in Cancer Care and Implications for Health Systems: Global Oncology Trend Report," May 2014 (accessed May 2015); National Cancer Institute, "NCI Dictionary of Cancer Terms" (accessed May 2015).



# Clinical efficacy of Vemurafenib (PLX-4032, Zelboraf) in melanomas

Key biomarkers:

Stratification: BRAFV600E mutation

Mechanism: P-ERK Cyclin-D1

Efficacy: Ki-67 18FDG-PET, CT

Clinical endpoint: progression-free survival (%)



Chapman et al, NEJM 2011

18



# **Clinical efficacy of Vemurafenib**



Institut Pasteur

**Strong initial effects vemurafenib** 

- Emerging drug resistancy
- Recurence of aggressive tumors

**Tumor tissue heterogeneity** 

- BRAFV600D/E is driving mutation
- However, also no BRAFV600D/E mutation found in regions of a primary melanoma : Molecular heterogeneity in tumor tissue
- Biomarker levels in tissue vary **Biomarker levels in body fluids will vary**
- Major challenge for (companion) diagnostics

# PERSONALIZED MEDICINES ARE BENEFITTING PATIENTS ACROSS MANY DIFFERENT DISEASES

Across a variety of therapeutic areas, an increasing number of treatments are personalized.\*





Source: U.S. FDA, "Paving the Way for Personalized Medicine", Oct 2013.

#### **PRECISION MEDECINE AND VACCINATION**

CD4+ T Cell Autoimmunity to Hypocretin/Orexin and Cross-Reactivity to a 2009 H1N1 Influenza A Epitope in Narcolepsy

Antibodies to influenza nucleoprotein cross-react with human hypocretin receptor 2

HLA-DQB 1\*0602 Doses of viral capsid? (Pandemrix vs Focetria vaccines) Other genetic determinants?

ScienceTranslational Medecine; 18/12/2013 (1/8/2014); 1/7/2015







#### WHAT TYPES OF BIOMARKERS DO WE HAVE ?



- 1. Screening (e.g. mammography, fecal occult blood)
- 2. Diagnostic (e.g. cardiac troponin)
- 3. Prognosis (e.g. cytokeratins, estrogen receptors)
- 4. Prediction of response to treatment (e.g. HER2)
- 5. Patient follow-up (e.g. PSA)



#### **BIOMARKER RESEARCH AND VALIDATION: A LONG JOURNEY**



Analytical and clinical validity drive regulatory approval

Clinical utility and health economics benefits drive reimbursement



# DRUG-DIAGNOSTIC CO-DEVELOPMENT PROCESS: THERANOSTIC





# PARTNERSHIPS AND COLLABORATIONS ARE TRANSFORMING THE RESEARCH AND DEVELOPMENT OF PERSONALIZED MEDICINES

#### **AMP (Accelerating Medicines Partnership)**

Developing new diagnostics and biological targets for treatments in Alzheimer's disease, type 2 diabetes, rheumatoid arthritis, and lupus. *The Partners: biopharmaceutical companies, NIH, patient and disease organizations* 

#### **Biomarkers Consortium**

Institut Pasteur

Combining expertise and resources to rapidly identify, develop, and qualify biomarkers, which will then advance new therapies and guide improvements in regulatory and clinical decision-making. *The Partners: biopharmaceutical companies, NIH, CMS, FDA, patient and disease organizations* 

#### Lung-MAP (Lung Cancer Master Protocol)

Using comprehensive genetic screening to identify mutations in lung cancer patients in order to direct them to a specific investigational treatment, all operating under a single clinical trial protocol.

The Partners: biopharmaceutical companies, NIH, FDA, patient and disease organizations



**bio**markers



Sources: National Institutes of Health, "Accelerating Medicines Partnership," http://nih.gov/science/amp/index.htm; The Biomarkers Consortium, http://www.biomarkersconsortium.org/index.php; Lung Cancer Master Protocol, http://www.lung-map.org/ (all cites accessed May 2015).

#### INTEGRATING INFORMATION ABOUT IMMUNE RESPONSE, GENETIC & ENTEROTYPE VARIABILITY



#### Response





# MILIEU INTÉRIEUR CONSORTIUM







A population based assessment of the Genetic & Environmental Determinants of Immune Phenotype Variance



Institut Pasteur











#### **1,000 HEALTHY DONORS COHORT**



#### **GENETIC SUSCEPTIBILITY ≠ GENETIC DETERMINISM**



We need functional biomarkers



#### **PROFILING INDUCED IMMUNE RESPONSES**



## POINT-OF-CARE FUNCTIONAL IMMUNE ASSAYS PERMITS ON-SITE SAMPLE COLLECTION STANDARDIZATION



A) Prefill tubing with blood



B) Pull, until it "clicks"



C) Break away plunger



D) Mix gently 3x



E) Incubate for 4h (mRNA, miRNA analysis) or 22h (protein and lipidome studies)



# **The Center for Translational Science**









# Precision Medicine: Personalized, Problematic, and Promising

J. Larry Jameson, M.D., Ph.D., and Dan L. Longo, M.D.

NEJM 4 June 2015



#### **CURRENT STANDARDIZATION AND COORDINATION EFFORTS**







There exist several global coordinated efforts to achieve standardization and sharing of big life science data, notably the Global Alliance for Genomics and Health, but due to heterogeneity, diversity and immaturity of technologies, practices and frameworks the tasks are currently overwhelming.



# DISEASES ARE THE RESULT OF PERTURBATIONS IN COMPLEX BIOMOLECULAR NETWORKS





#### **ISSUES WITH AN IMPACT ON PERSONALIZED MEDICINE**

The implementation of personalized medicine requires a confluence of multiple factors. Full implementation of personalized medicine can only be achieved when all sectors converge toward the center.





# WE ARE FACING ENORMOUS CHALLENGES AROUND ESTABLISHING REPLICABLE AND REPRODUCIBLE RESEARCH PRACTICES FOR DATA INTENSIVE BIOMEDICAL SCIENCE

#### Open access, freely available online

#### Essay

#### Why Most Published Research Findings Are False

#### Summary

current published research findings are false. The probability that a research clai is true may depend on study power and bias, the number of other studies on the same question, and, importantly, the ratio of true to no relationships among the is less likely to be true when the studies conducted in a field are smaller; when effect sizes are smaller; when there is a greater number and lesser preselection of tested relationships; where there is greater flexibility in designs, definitions outcomes, and analytical modes; when interest and prejudice; and when m teams are involved in a scientific fie in chase of statistical significance. designs and settings, it is more likely for a research claim to be false than true. Moreover, for many current scientific often be simply accurate measures of the prevailing bias. In this essay, I discuss the implications of these problems for the conduct and interpretation of research.

factors that influence this problem and some corollaries thereof.

#### Modeling the Framework for False Positive Findings

Several methodologists have pointed out [9–11] that the high rate of nonreplication (lack of confirmation) of research discoveries is a consequence of the convenient, yet ill-founded strategy of claiming conclusive research findings solely on the basis of a single study assessed by formal statistical significance, typically for a *p*-value less than 0.05. Research is not most appropriately represented and summarized by *p*-values, but, unfortunately, there is a widespread notion that medical research articles

#### It can be proven that most claimed research findings are false.

should be interpreted based only on pvalues. Research findings are defined here as any relationship reaching formal statistical significance, e.g., effective interventions, informative predictors, risk factors, or associations. "Negative" research is also very useful.

PLoS Medicine Vol 2, Issue 8, August 2005

is characteristic of the field and can vary a lot depending on whether the field targets highly likely relationships or searches for only one or a few true relationships among thousands and millions of hypotheses that may be postulated. Let us also consider, for computational simplicity, circumscribed fields where either there is only one true relationship (among many that can be hypothesized) or the power is similar to find any of the several existing true relationships. The pre-study probability of a relationship being true is R/(R+1). The probability of a study finding a true relationship reflects the power  $1 - \beta$  (one minus the Type II error rate). The probability of claiming a relationship when none truly exists reflects the Type I error rate,  $\alpha$ . Assuming that *c* relationships are being probed in the field, the expected values of the 2 × 2 table are given in Table 1. After a research finding has been claimed based on achieving formal statistical significance, the post-study probability that it is true is the positive predictive value, PPV. The PPV is also the complementary probability of what Wacholder et al. have called the false positive report probability [10]. According to the 2

- Fast technological developments make it hard to establish stable standards.
- Both techniques and protocols are constantly evolving.
- Holistic and integrative analyses over different platforms and between different datatypes are extremely challenging.
- Storage, management, analysis and sharing of data are subject to legal and ethical considerations.

Institut Pasteur

# THE COMMUNITY IS PUSHING FOR REPRODUCIBLE RESEARCH

~

**nature** International weekly journal of science

Home News & Comment Research Careers & Jobs Current Issue Archive Audio & V

Archive Volume 496 Issue 7446 Editorial Article

NATURE | EDITORIAL

#### Announcement: Reducing our irreproducibility

24 April 2013

🖄 PDF 🛛 🔍 Rights & Permissions

Over the past year, *Nature* has published a string of articles that highlight failures in the re and reproducibility of published research (collected and freely available at go.nature.com// The problems arise in laboratories, but journals such as this one compound them when th exert sufficient scrutiny over the results that they publish, and when they do not publish er information for other researchers to assess results properly.

From next month, *Nature* and the Nature research journals will introduce editorial measure address the problem by improving the consistency and quality of reporting in life-sciences To ease the interpretation and improve the reliability of published results we will more systematically ensure that key methodological details are reported, and we will give more methods sections. We will examine statistics more closely and encourage authors to be transparent, for example by including their raw data.

#### nature biotechnology Home Current issue News & comment Research Archive Authors & referees About the journa home L current issue editorial full text NATURE BIOTECHNOLOGY | EDITORIAL 《 量 日本語要約

#### Rebooting review

*Nature Biotechnology* **33**, 319 (2015) | doi:10.1038/nbt.3202 Published online 07 April 2015

🖄 PDF 🔮 Citation 📲 Reprints 🔍 Rights & permissions 🖾 Article metrics

*Nature Biotechnology* is reevaluating editorial oversight of papers centered on computational analyses in anticipation of the 'big data' world.

Computational biology papers pose particular challenges to the peer review process. Often, a computational approach or its software implementation may be insufficiently documented or missing. The version of the software may not match the algorithm described in a paper or produce the published results. And source code associated with software central to the main claims of a paper may not be made available. These issues have prompted *Nature* 



# THE CANCER TEST

A nonprofit's effort to replicate 50 top cancer papers is shaking up labs

Science 26 juin 2015







# Novel methodologies for clinical trials?

Time for one-person trials Precision medicine requires a different type of clinical trial that focuses on individual, not average, responses to therapy,

Nature 30 Avril 2015



# **Personal profile-based healthcare**

#### Personal Omics Profiling Reveals Dynamic Molecular and Medical Phenotypes

Rui Chen,<sup>1,11</sup> George I. Mias,<sup>1,11</sup> Jennifer Li-Pook-Than,<sup>1,11</sup> Lihua Jiang,<sup>1,11</sup> Hugo Y.K. Lam,<sup>1,12</sup> Rong Chen,<sup>2,12</sup> Elana Miriami,<sup>1</sup> Konrad J. Karczewski,<sup>1</sup> Manoj Hariharan,<sup>1</sup> Frederick E. Dewey,<sup>3</sup> Yong Cheng,<sup>1</sup> Michael J. Clark,<sup>1</sup> Hogune Im,<sup>1</sup> Lukas Habegger,<sup>6,7</sup> Suganthi Balasubramanian,<sup>6,7</sup> Maeve O'Huallachain,<sup>1</sup> Joel T. Dudley,<sup>2</sup> Sara Hillenmeyer,<sup>1</sup> Rajini Haraksingh,<sup>1</sup> Donald Sharon,<sup>1</sup> Ghia Euskirchen,<sup>1</sup> Phil Lacroute,<sup>1</sup> Keith Bettinger,<sup>1</sup> Alan P. Boyle,<sup>1</sup> Maya Kasowski,<sup>1</sup> Fabian Grubert,<sup>1</sup> Scott Seki,<sup>2</sup> Marco Garcia,<sup>2</sup> Michelle Whirl-Carrillo,<sup>1</sup> Mercedes Gallardo,<sup>9,10</sup> Maria A. Blasco,<sup>9</sup> Peter L. Greenberg,<sup>4</sup> Phyllis Snyder,<sup>1</sup> Teri E. Klein,<sup>1</sup> Russ B. Altman,<sup>1,5</sup> Atul J. Butte,<sup>2</sup> Euan A. Ashley,<sup>3</sup> Mark Gerstein,<sup>6,7,8</sup> Kari C. Nadeau,<sup>2</sup> Hua Tang,<sup>1</sup> and Michael Snyder<sup>1,\*</sup>





#### **THE INSTITUT PASTEUR IN 2015**



Institut Pasteur



33 institutes Pasteur gather about 9 500 people in 26 countries, over 5 continents

- ✤ in agreement with the local health authorities
- **b** within the international network, the institutes share their knowledge, their research programs and keep control of the development of infectious diseases

A major partner for international institutions, Fundations, Governments and industrials

#### Institut Pasteur

## THE GLOBAL VISION FOR THE FUTURE

#### **Cloud for data management and analysis: a Centre for Global Health Genomics**



The Institut Pasteur is moving to establish a global framework for reproducible research with unified bio-banking, data storage, management and analysis.

Resources will be connected and shared through the IP cloud for data analysis.



#### INSTITUT PASTEUR IS CONNECTED TO THE THE EUROPEAN INITIATIVE ELIXIR.

The IP network has the ambition to take a globally leading role to secure alignment around our focus on precision medicine for global health







#### The Institut Pasteur International Network for Data Analysis (IP-INDA): An aligned global community for data analysis ready for action



#### Global collaborative dynamism through local adaption



Developing and sharing best practices in bioinformatics globally, performing training and engaging in data intensive biomedical research.

Follow us on https://twitter.com/IGDA\_Pasteur



Global coordination, example, The Steering Committee INDA 17th March 2015 in Paris



