

Dept. Clinical Pharmacology, University Hospital, Tübingen  
Dr. Margarete Fischer-Bosch-Institute of Clinical  
Pharmacology, Stuttgart



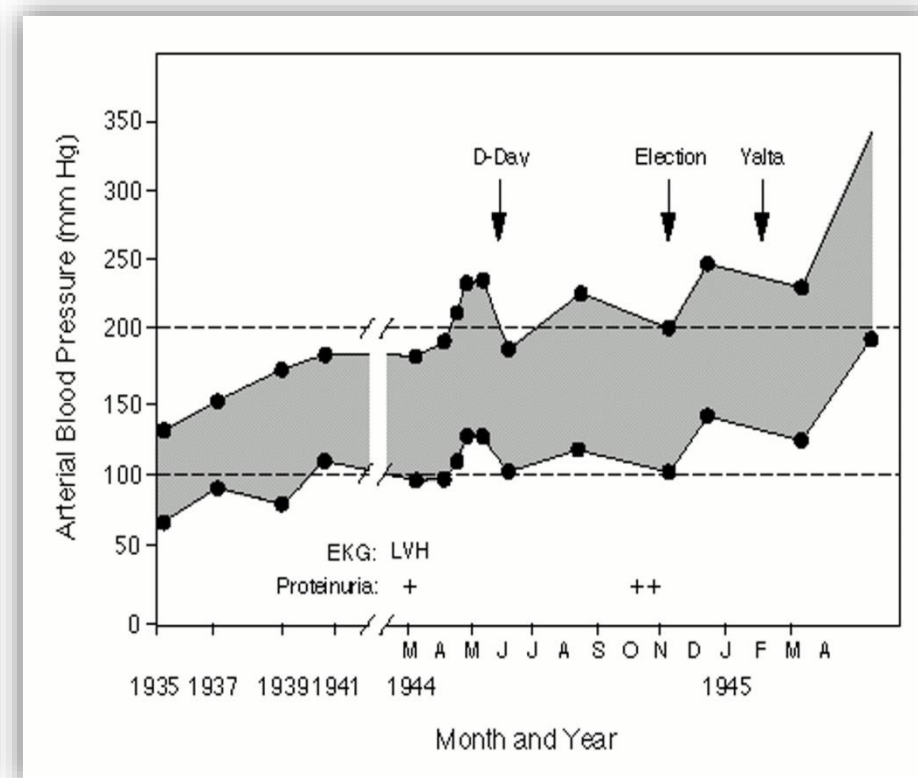
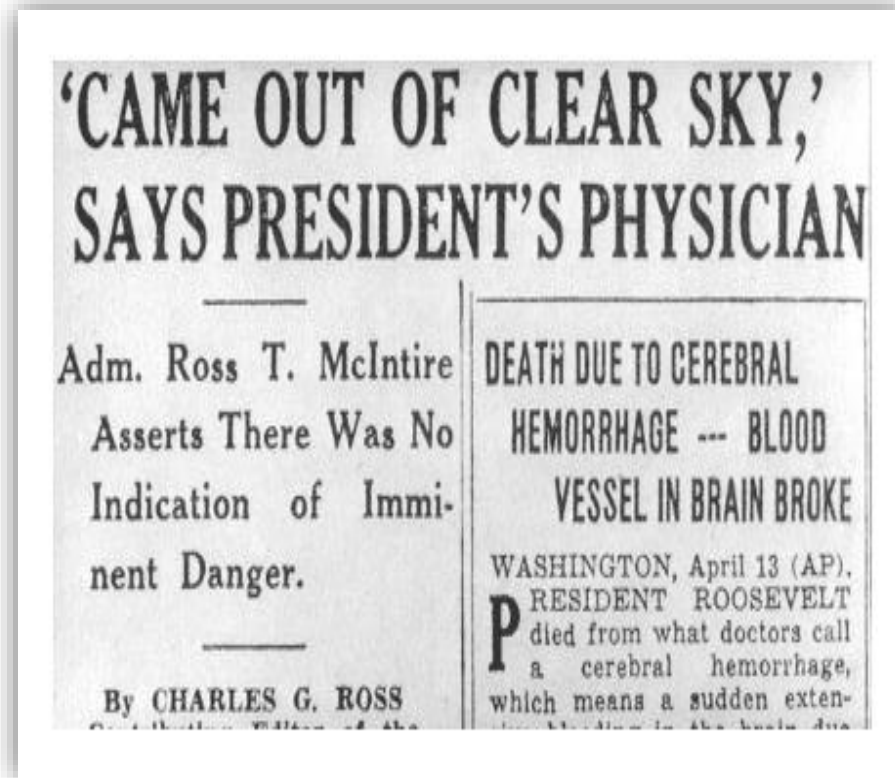
# Pharmacogenomics and Personalized Medicine: Implication for Clinical Practice

Prof. Matthias Schwab

Adjunct Professor of the Yerevan State Medical University, Armenia

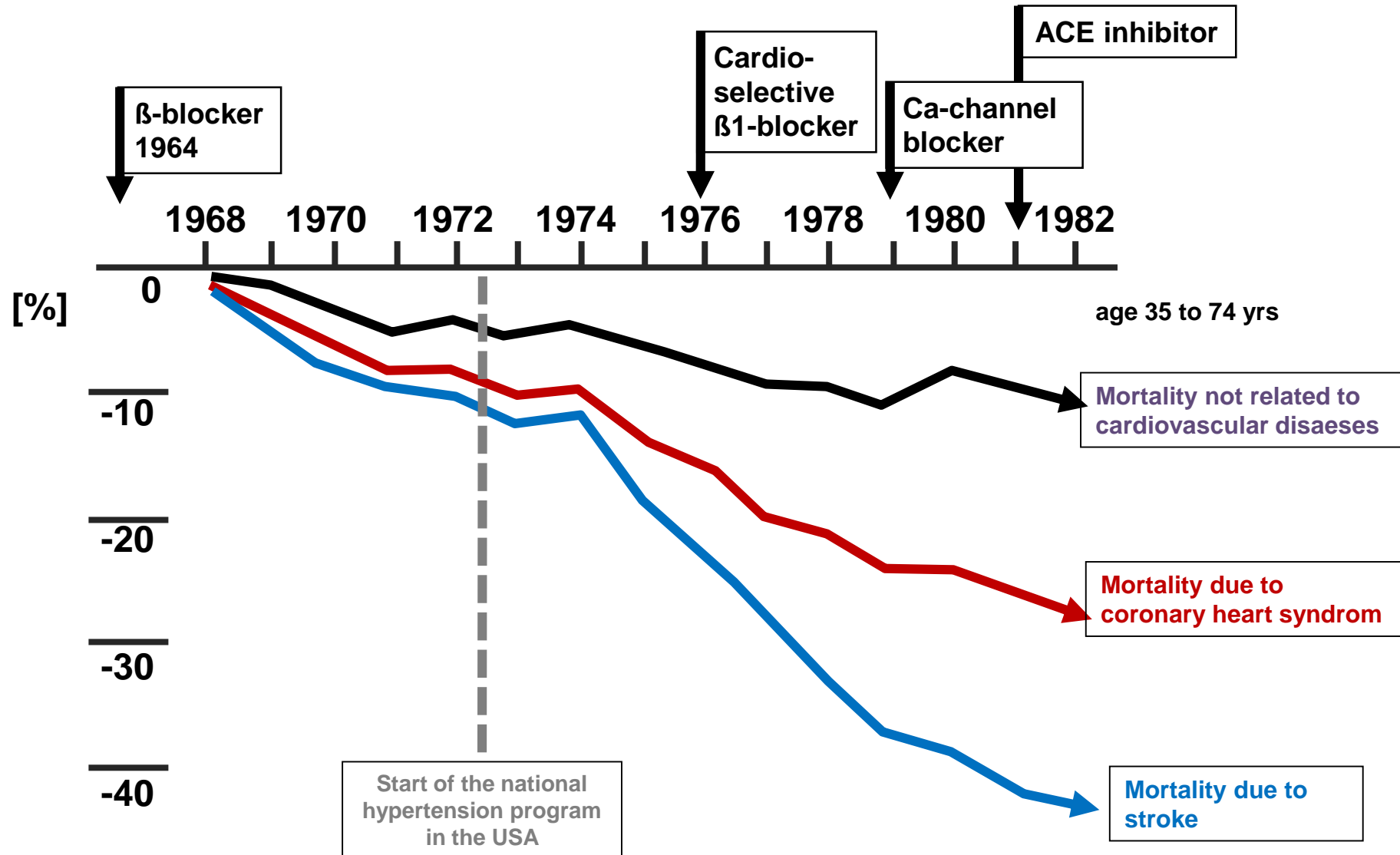
ICPerMed Workshop CPerMed Workshop  
“Advancing Personalised Medicine Through Technology Development”  
November 14, 2023, Siena, Italy

# Arterial pressure of Franklin D. Roosevelt from 1935 until his death on April 12, 1945



Messerli FH: This day 50 years ago *N Engl J Med* 1995

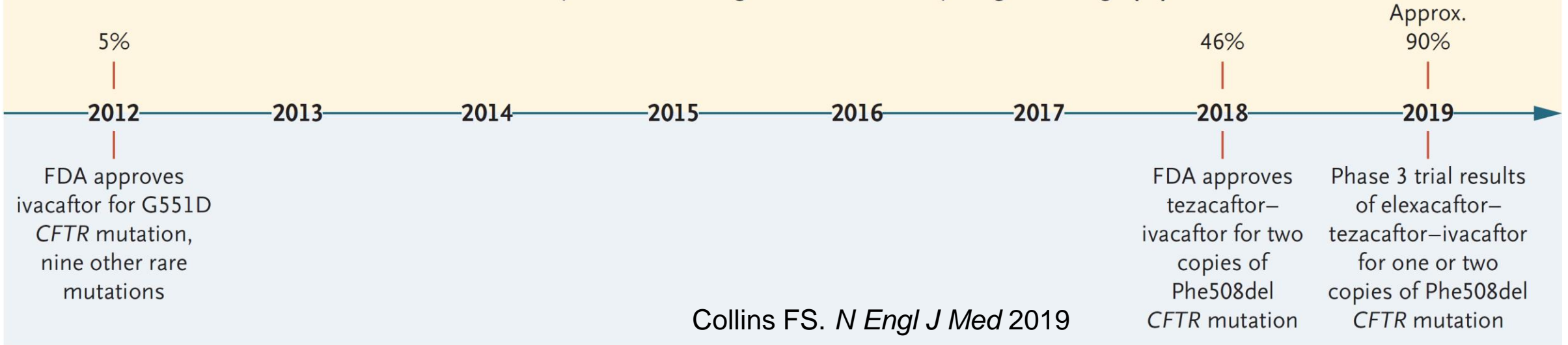
# Treatment of hypertension and consequences on mortality



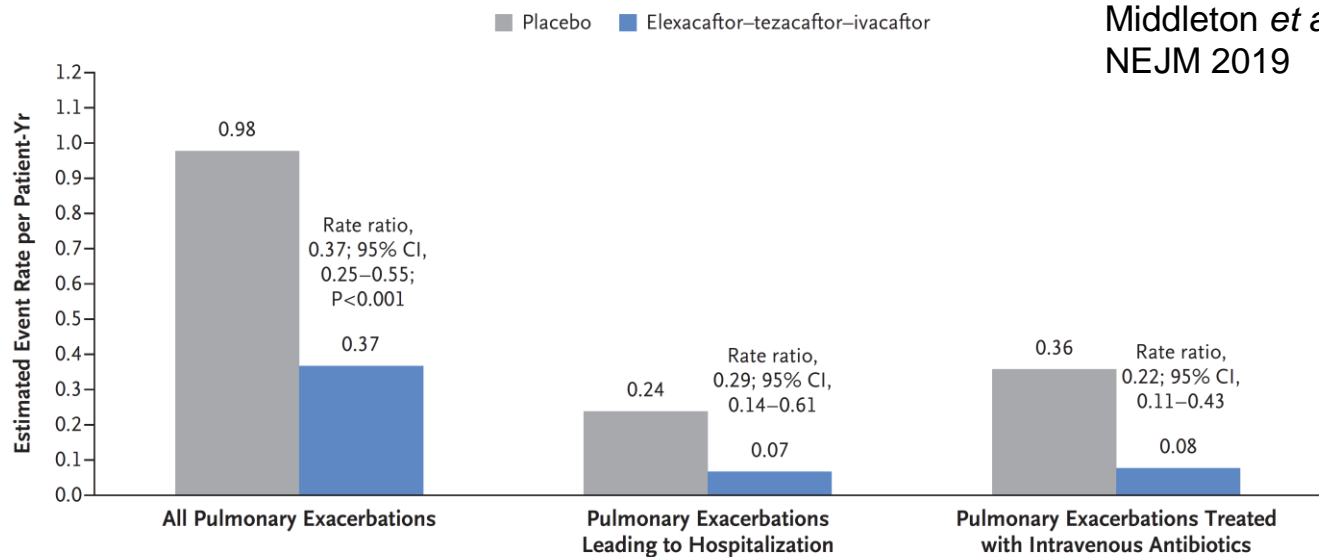
acc. to Lohmann FW, 1989

# A key example for precision medicine and drug development

Patients with Cystic Fibrosis Eligible for Molecularly Targeted Drugs (%)



C Pulmonary Exacerbations

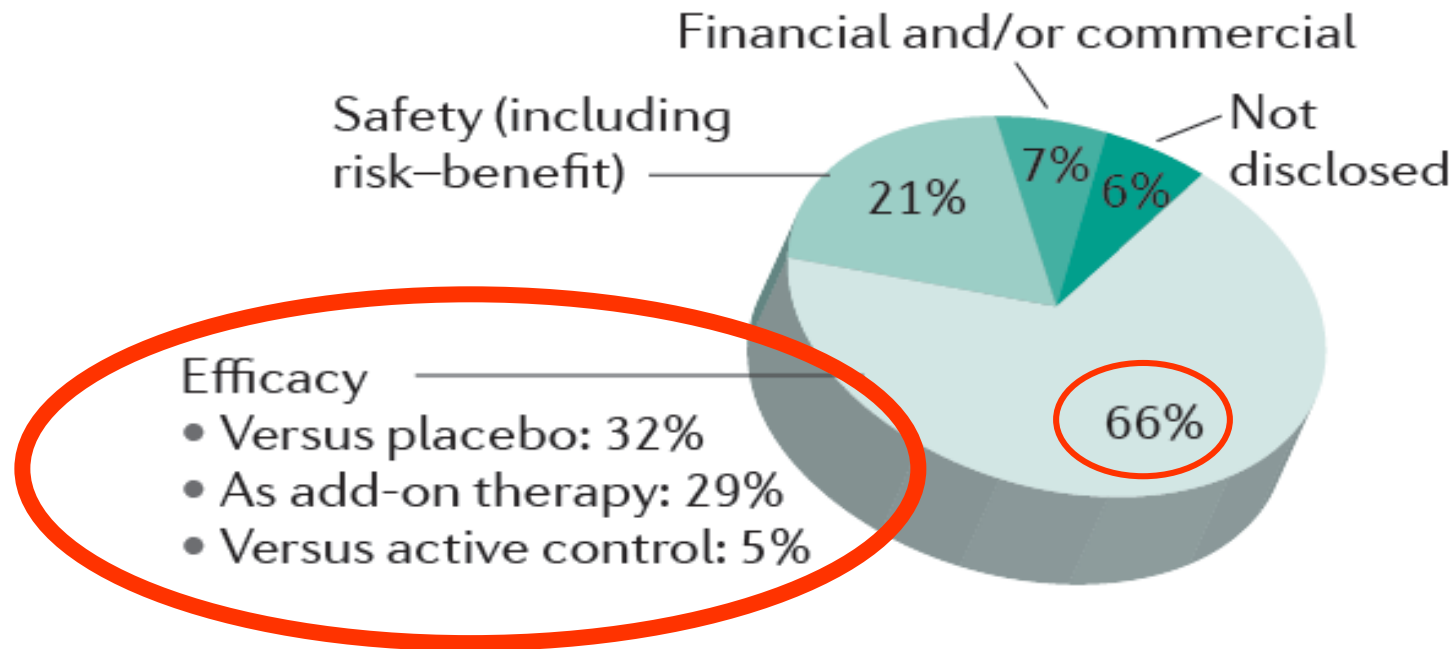


To Day is the most  
 Best day ever in  
 my Life They found  
 a Jean for  
 Cistikfibrosis

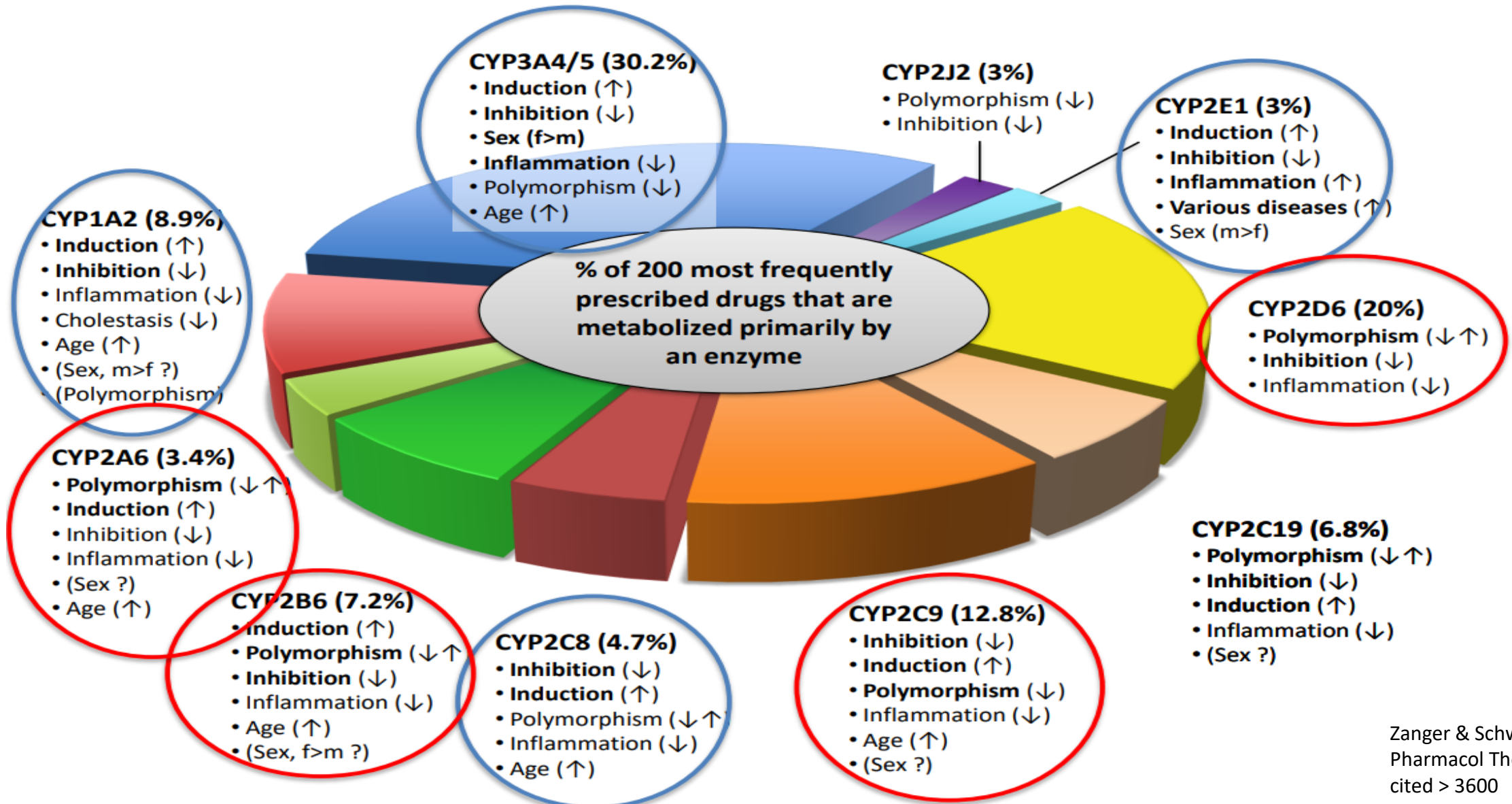
J.H., 8 y/o CF patient.  
 Diary entry, Aug 25, 1989

# Poor or Non response of drugs: A major problem with clinical consequences

## Phase III and submission failure of 83 drugs from 2007-2010

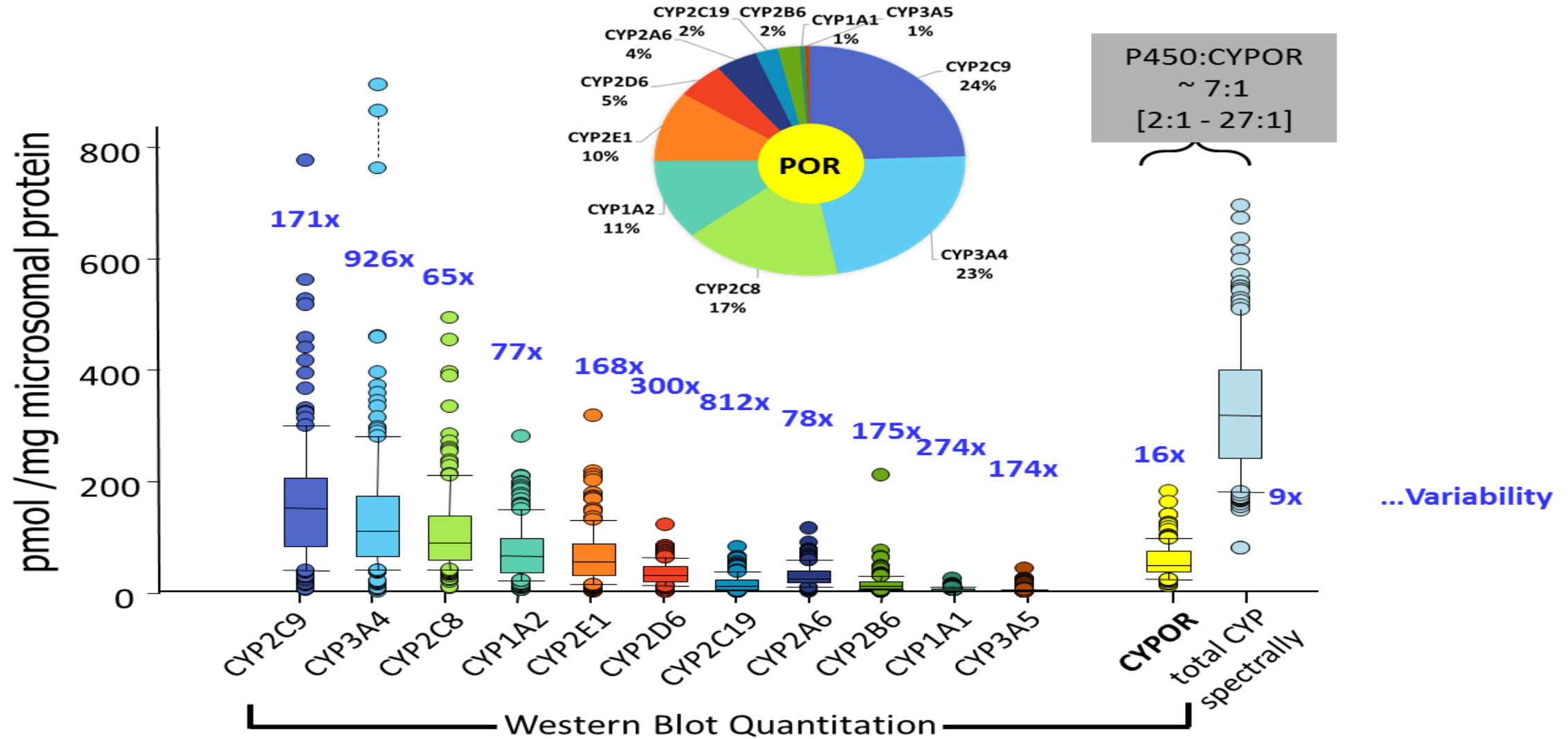


# Various factors explain interindividual variability of expression and function of drug-relevant CYP enzymes



Zanger & Schwab,  
Pharmacol Ther 2013  
cited > 3600

# Expression variability of human Cytochrom P450 enzymes in the IKP human liver bank (up to 900 fold)



# Sources for Variability in Drug Response





# Precision medicine: from base pairs to bedside

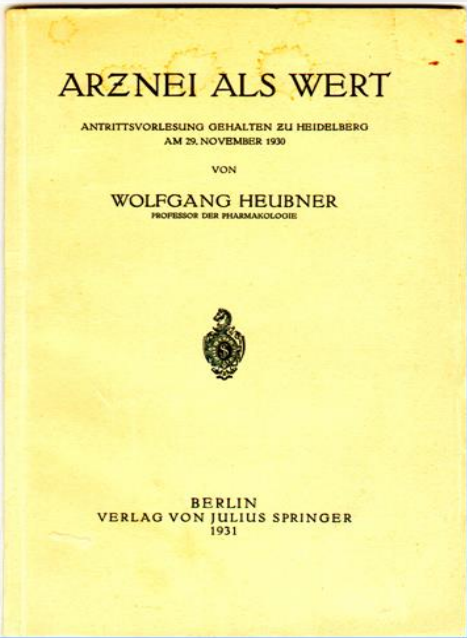
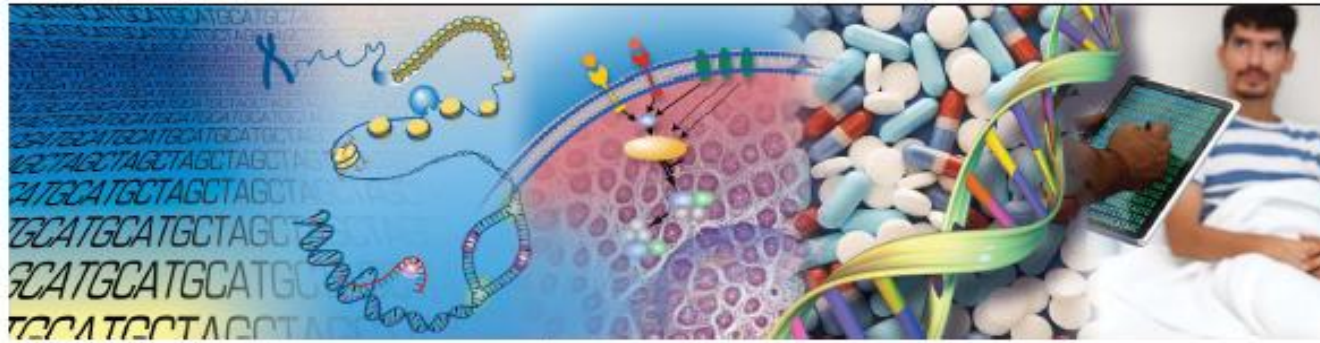
Understanding  
the structure of  
genomes

Understanding  
the biology of  
genomes

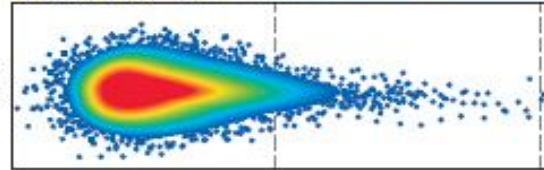
Understanding  
the biology of  
disease

Advancing  
the science of  
medicine

Improving the  
effectiveness of  
healthcare

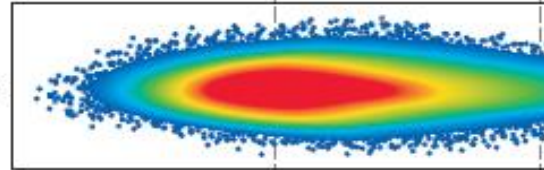


1990–2003  
Human Genome Project

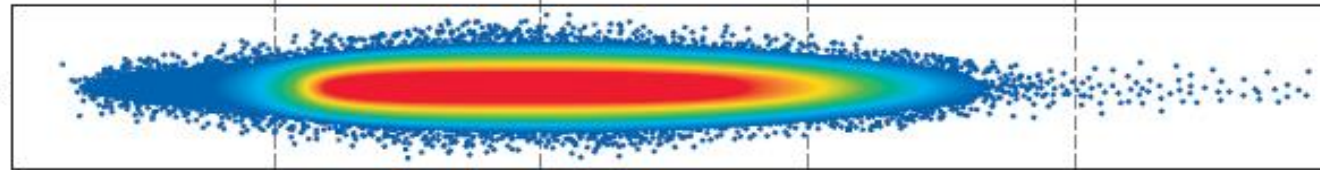


Green *et al.* Nature 2011

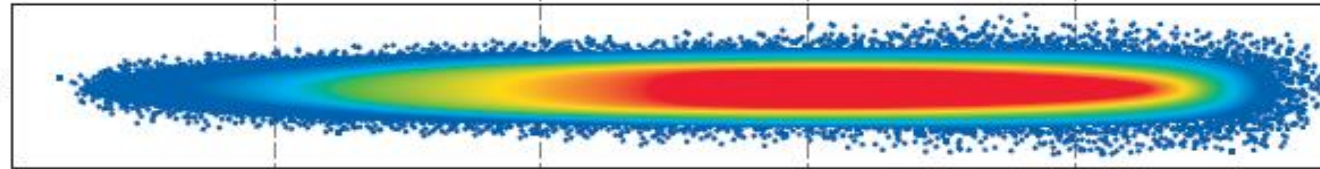
2004–2010



2011–2020



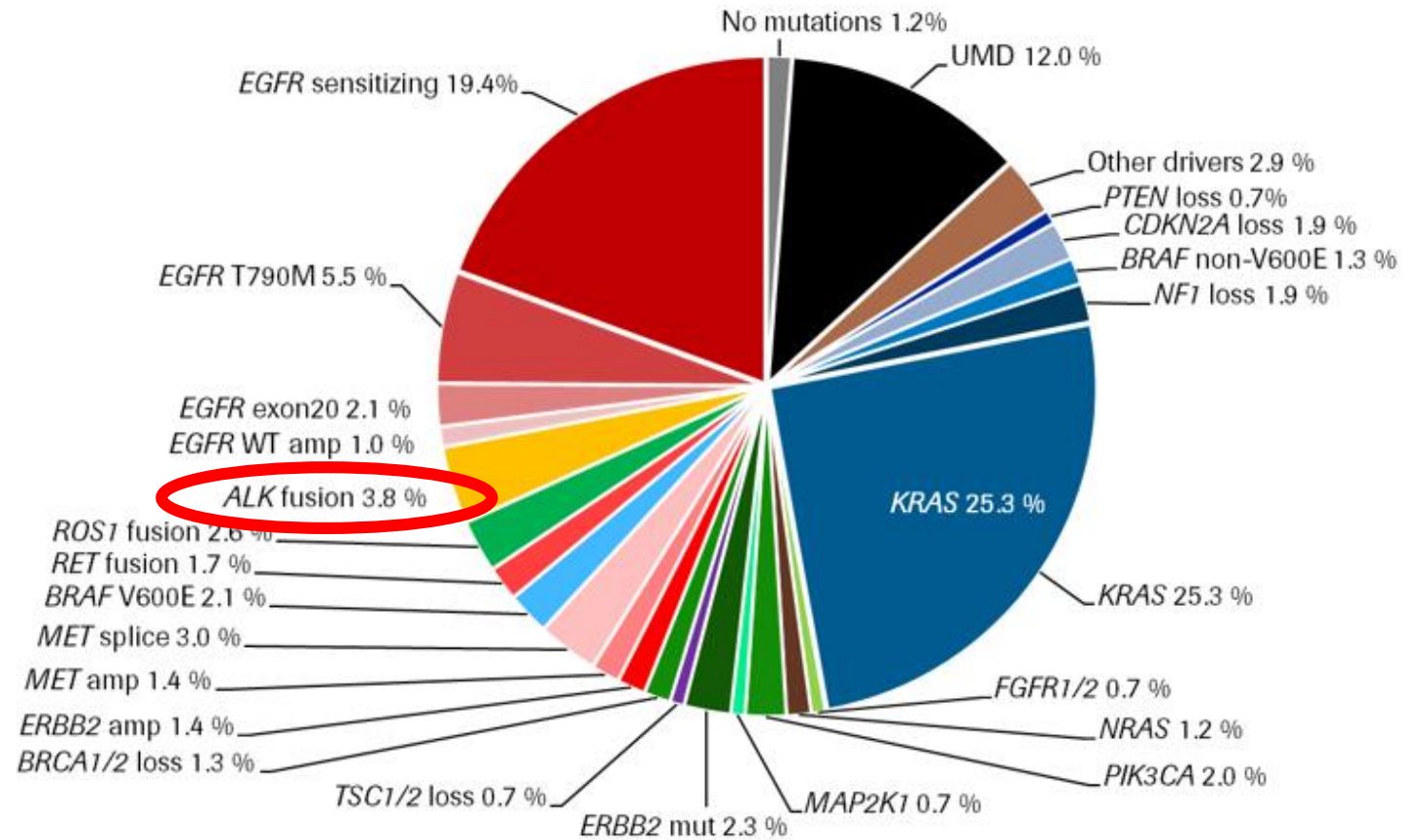
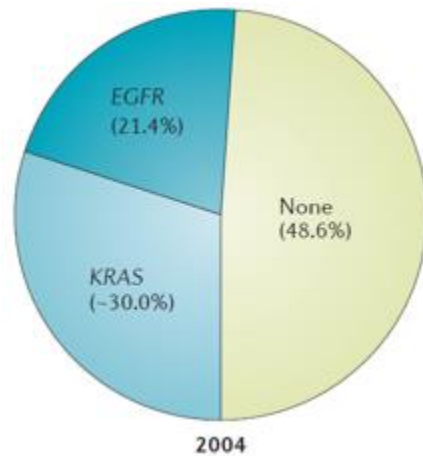
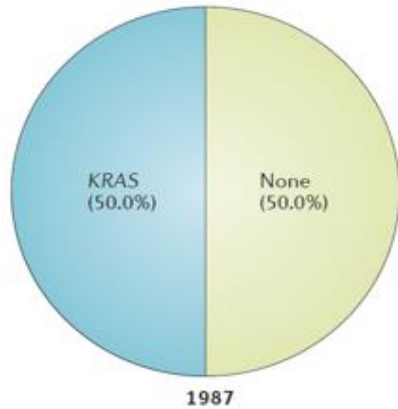
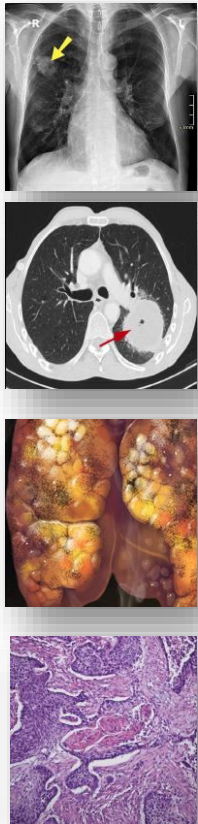
Beyond 2020



# Genomic information from tumors provide vital information to guide drug development and treatment decisions



# A new paradigm for diagnosis and therapy: Non small lung cancer as prototype for precision medicine shifting from tumor histology to molecular characterisation



**Predictive biomarkers with relevance for treatment in patients with non-small-cell lung cancer**

Biomarker	Method	UICC stage					Drugs with approval conditional on biomarkers
		IB	II	III(op)	III(crtx)	IV	
<i>ALK</i>	IHC, NGS, ISH	+	+	+	-	+	Alectinib, brigatinib, ceritinib, crizotinib, lorlatinib
<i>BRAF</i>	NGS	-	-	-	-	+	Dabrafenib/trametinib
<i>EGFR</i>	NGS	+	+	+	-	+	Afatinib, amivantamab, dacomitinib, erlotinib, gefitinib, mobocertinib*, osimertinib
<i>HER2</i>	NGS	-	-	-	-	+*	Poziotinib*, trastuzumab-deruxtecan*
<i>KRAS</i>	NGS	-	-	-	-	+	Sotorasib, adagrasib*
<i>MET</i>	NGS	-	-	-	-	+	Capmatinib, tepotinib
<i>NTRK1-3</i>	IHC, NGS, ISH	-	-	-	-	+	Entrectinib, larotrectinib
PD-L1	IHC	+	+	+	+	+	Atezolizumab, cemiplimab, durvalumab, pembrolizumab
<i>RET</i>	NGS, ISH	-	-	-	-	+	Pralsetinib, selpercatinib
<i>ROS1</i>	IHC, NGS, ISH	-	-	-	-	+	Crizotinib, entrectinib

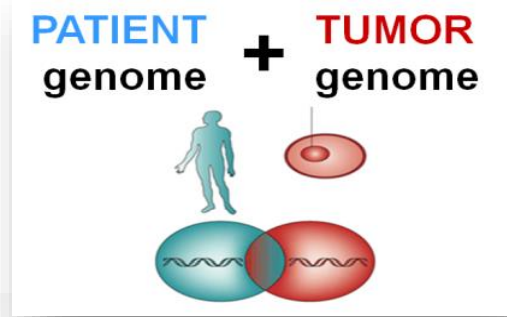
*ALK*, anaplastic lymphoma kinase; *BRAF*, B-rat fibrosarcoma; *EGFR*, epidermal growth factor receptor; *HER2*, human epidermal growth factor receptor 2; IHC, immunohistochemistry; ISH, in situ hybridization; *KRAS*, Kirsten rat sarcoma viral oncogene; *MET*, *MET* proto-oncogene/receptor tyrosine kinase; NGS, deoxyribonucleic acid or ribonucleic acid parallel sequencing ("next-generation sequencing"); *NTRK1-3*, neurotrophic tyrosine kinase 1-3; PD-L1, programmed cell death 1 ligand-1; *RET*, *RET* proto-oncogene; *ROS1*, *ROS* proto-oncogene 1; UICC, Union for International Cancer Control; III(op), stage III primary surgery; III(crtx), stage III definitive chemoradiotherapy

+\* Not currently approved in Europe for this indication.

# Genomic information from the tumor and the patient provides vital information to guide drug therapy



Cohen & Settleman. *Cell* 2014

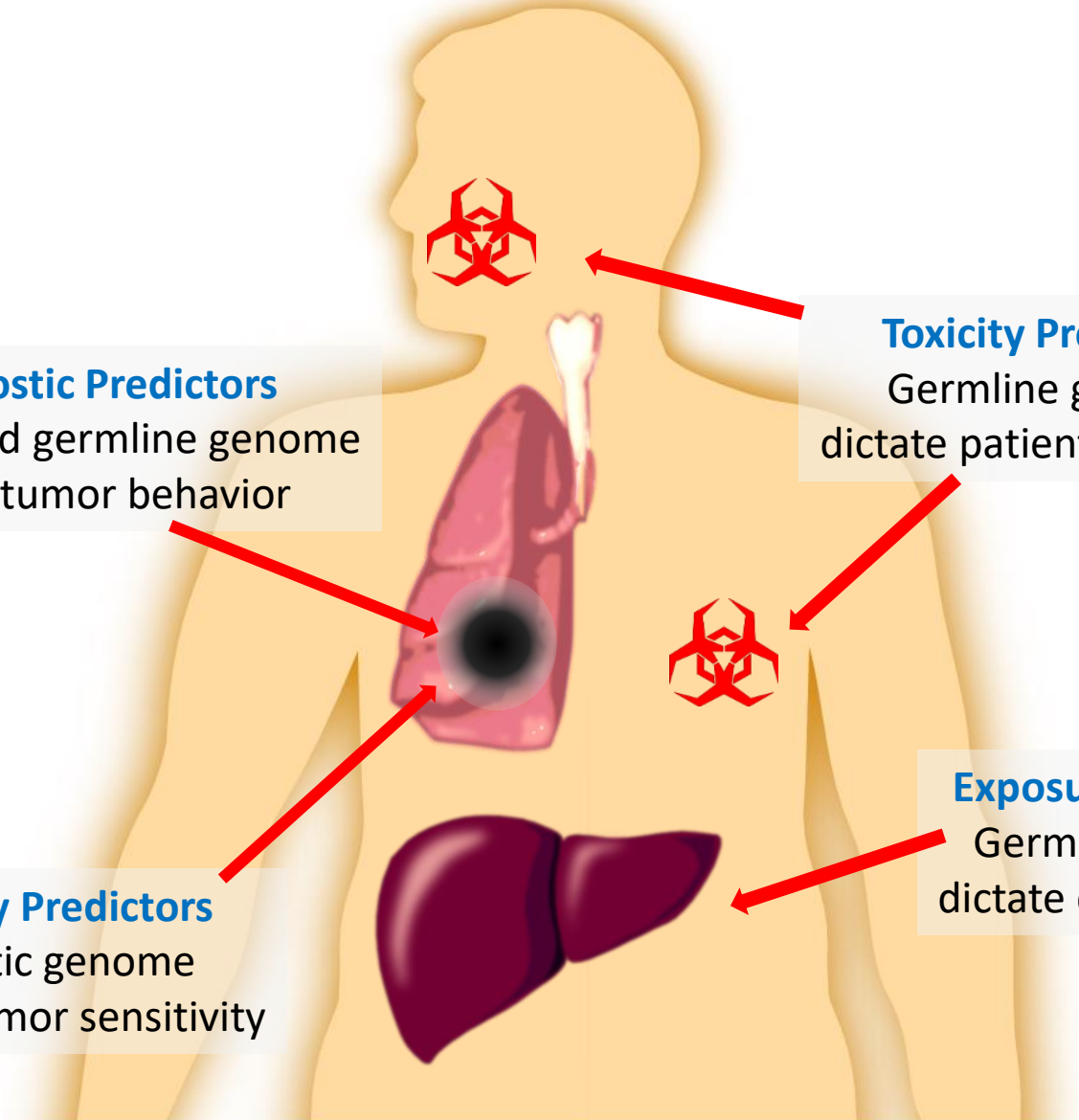


**Prognostic Predictors**  
Somatic and germline genome dictate tumor behavior

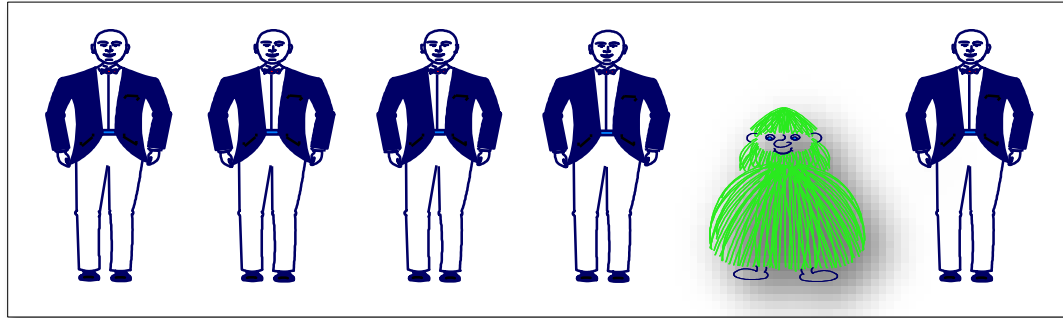
**Toxicity Predictors**  
Germline genome dictate patient sensitivity

**Efficacy Predictors**  
Somatic genome dictate tumor sensitivity

**Exposure Predictors**  
Germline genome dictate drug exposure

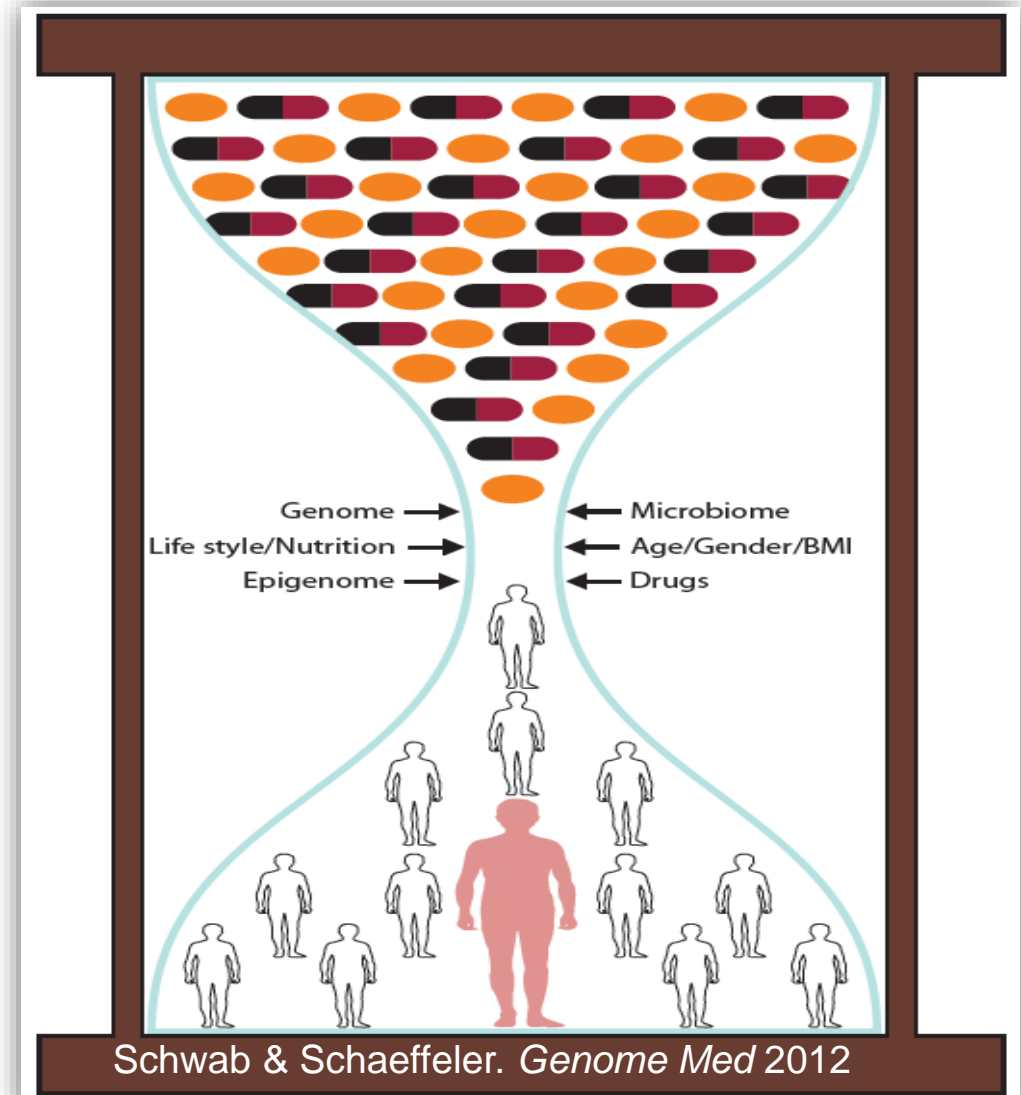


# Personalized / Precision Medicine: delicate balance between benefit and risk





Precision medicine is “*an emerging approach for disease treatment and prevention that takes into account individual variability in genes, environment and lifestyle for each person.*”

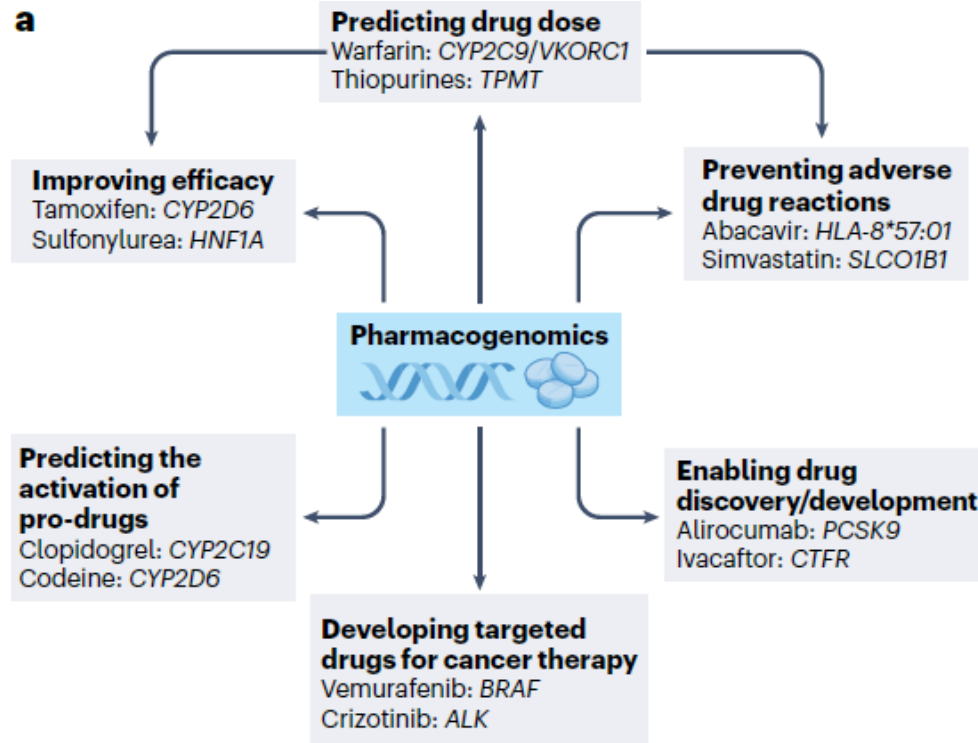
<https://ghr.nlm.nih.gov/primer/precisionmedicine/definition>



# Pharmacogenomics: current status and future perspectives

Munir Pirmohamed  

2023



Country	Number studied	Number of genes evaluated	Proportion carrying at least one actionable genotype or diplotype	Ref.
Australia	5,408	4	95.9%	15
Canada	98	19	96.9%	16
Estonia	42,092	11	99.8%	17
Netherlands	498	11	99.4%	18
Qatar	6045	15	99.5%	19
UK	487,409	14	99.5%	20
UK	713	11	98.7%	21
USA	9,589	6	91.4%	22
USA	1,013	5	99.0%	23

# Randomized clinical trials & Pharmacogenomics (PGx)

Identification of Patients With Variants in *TPMT* and Dose Reduction Reduces Hematologic Events During Thiopurine Treatment of Inflammatory Bowel Disease  
Gastroenterology 2015

Reduced-Function *CYP2C19* Genotype and Risk of Adverse Clinical Outcomes Among Patients Treated With Clopidogrel Predominantly for PCI  
JAMA | Original Investigation  
JAMA 2010

DPYD genotype-guided dose individualisation of fluoropyrimidine therapy in patients with cancer: a prospective safety analysis  
Lancet Oncology 2018

Proceedings of The Knee Society 2021

Prospective Randomized Study Using Pharmacogenetics to Customize Postoperative Pain Medication Following Hip and Knee Arthroplasty  
J Arthroplasty 2022

Potential role of *CMPK1*, *SLC29A1*, and *TLE4* polymorphisms in gemcitabine-based chemotherapy in HER2-negative metastatic breast cancer patients: pharmacogenetic study results from the prospective randomized phase II study of eribulin plus gemcitabine versus paclitaxel plus gemcitabine (KCSG-BR-13-11)  
ESMO Open 2021

E. H. Cho<sup>1†</sup>, J.-Y. Kim<sup>2†</sup>, S.-A. Im<sup>3</sup>, K. H. Jung<sup>4</sup>, J. Sohn<sup>5</sup>, K. S. Lee<sup>6</sup>, Y. S. Chae<sup>7</sup>, K. H. Lee<sup>8</sup>, J. H. Kim<sup>9</sup>, J.-H. Jang<sup>10</sup>, J. H. Ahn<sup>11</sup>, M. S. Park<sup>12</sup>, S.-Y. Lee<sup>10,13,14\*†</sup> & Y. H. Park<sup>2,15\*†</sup>

The NEW ENGLAND JOURNAL of MEDICINE 2008  
ORIGINAL ARTICLE  
HLA-B\*5701 Screening for Hypersensitivity to Abacavir  
Simon Mallal, M.B., B.S., Elizabeth Phillips, M.D., Giampiero Carosi, M.D., Jean-Michel Molina, M.D., Cassy Workman, M.B., B.S., Janez Tomažič, M.D.,

Effect of Genotype-Guided Warfarin Dosing on Clinical Events and Anticoagulation Control Among Patients Undergoing Hip or Knee Arthroplasty  
GIFT Randomized Clinical Trial  
JAMA. 2017;318(12):1115-1124.

The NEW ENGLAND JOURNAL of MEDICINE 2013  
ORIGINAL ARTICLE

A Randomized Trial of Genotype-Guided Dosing of Warfarin

Prospective *CYP2C19* Genotyping to Guide Antiplatelet Therapy Following Percutaneous Coronary Intervention  
A Pragmatic Randomized Clinical Trial  
Circ Genom Precis Med 2020

Clinical utility of combinatorial pharmacogenomic testing in depression: A Canadian patient- and rater-blinded, randomized, controlled trial  
Transl Psychiatry 2022

Arun K. Tiwari<sup>1,2,30</sup>, Clement C. Zai<sup>1,2,3,4,30</sup>, C. Anthony Altar<sup>5</sup>, Julie-Anne Tanner<sup>6</sup>, Paige E. Davies<sup>6</sup>, Paul Traxler<sup>6</sup>, James Li<sup>6</sup>, Elizabeth S. Cogan<sup>7</sup>, Matthew T. Kucera<sup>7</sup>, Ana Gugila<sup>6</sup>, Nicole Braganza<sup>1,2</sup>, Heather Emmerson<sup>1,2</sup>, Gwyneth Zai<sup>1,2,3</sup>, Daniel J. Müller<sup>1,2,3</sup>, Robert Levitan<sup>1,2,3</sup>, Stefan Kloiber<sup>2,3,8</sup>, Zafiris J. Daskalakis<sup>9</sup>, Benicio N. Frey<sup>10,11</sup>, James M. Bowen<sup>12,13,14</sup>, Jean-Eric Tarride<sup>15,16,17</sup>, Richard Tytus<sup>18</sup>, Ranjith Chandrasena<sup>19</sup>, Nicholas Voudouris<sup>20</sup>, Valerie H. Taylor<sup>21</sup>, Raymond Tempier<sup>22,23</sup>, Verinder Sharma<sup>24</sup>, Akshya Vasudev<sup>25,26</sup>, Peter Dzongowski<sup>27</sup>, Lew Pliamm<sup>28</sup>, Todd Greenspoon<sup>29</sup>, Bryan M. Dechairo<sup>7</sup> and James L. Kennedy<sup>1,2,3,31</sup>



# ***NUDT15* and *TPMT*** explain thiopurine related drug toxicity in European patients with severe cytopenia/pancytopenia (n=107)

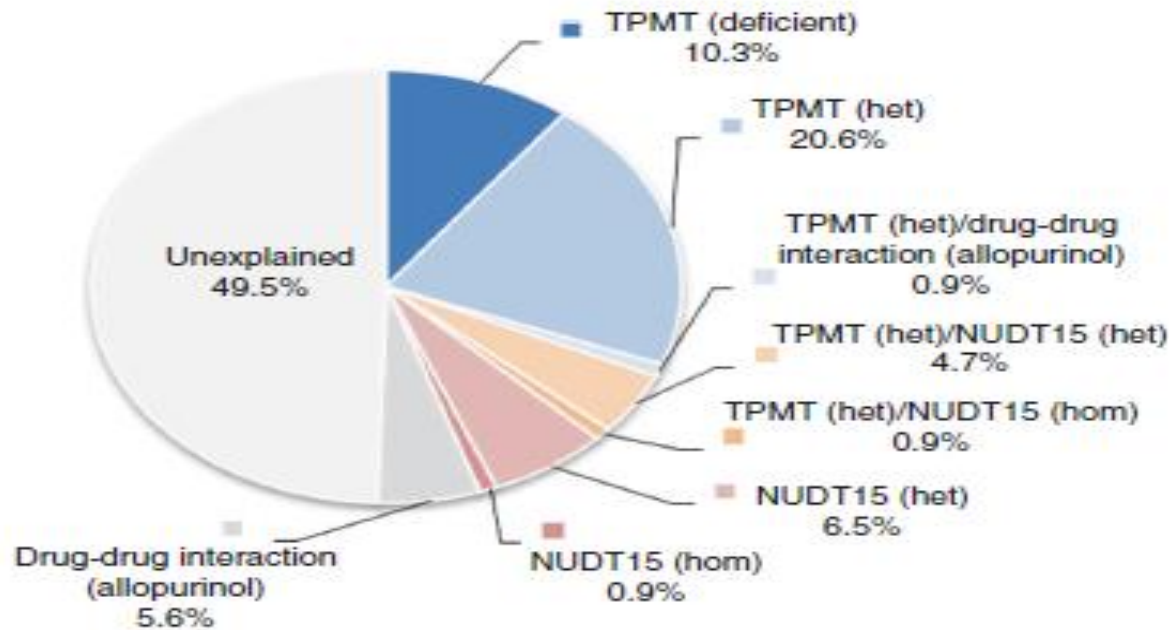


Dr. Margarete Fischer-Bosch  
Institut für Klinische Pharmakologie

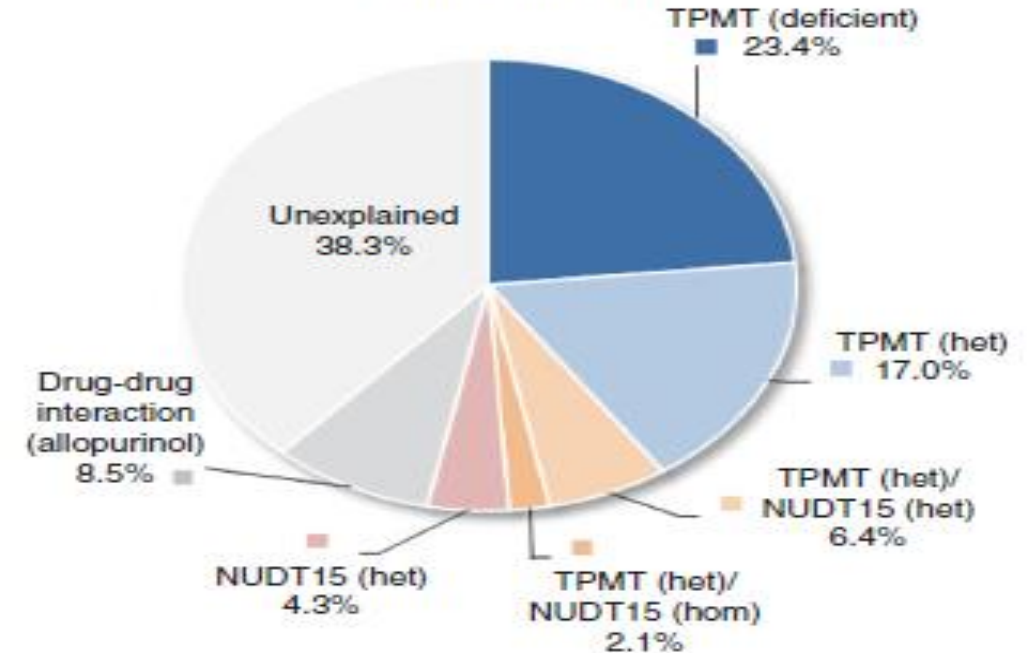
IKP diagnostic cohort  
for TPMT (n > 25.000)

c

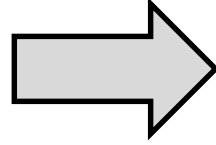
All cases (n = 107)



Cases (n = 47) who developed toxicity ≤ 3 months



In collaboration with the German ALL study coordination all ALL children ***preemptively*** tested for TPMT to avoid hematotoxicity

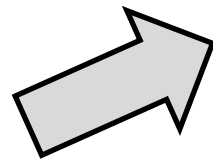


TPMT  
First description  
1980

## Clinical Pharmacogenetics Implementation Consortium Guidelines for Thiopurine Methyltransferase Genotype and Thiopurine Dosing: 2013 Update





MV Relling<sup>1</sup>, EE Gardner<sup>2</sup>, WJ Sandborn<sup>3</sup>, K Schmiegelow<sup>4,5</sup>, C-H Pui<sup>6</sup>, SW Yee<sup>7</sup>, CM Stein<sup>8</sup>, M Carrillo<sup>9</sup>, WE Evans<sup>1</sup>, JK Hicks<sup>1</sup>, M Schwab<sup>10,11</sup> and TE Klein<sup>9</sup>

Clin Pharmacol Ther 2013

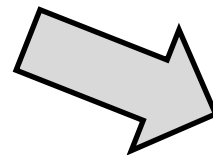


NUDT15  
First description  
2014




## Pharmacogene Variation Consortium Gene Introduction: *NUDT15*

Jun J. Yang<sup>1</sup>, Michelle Whirl-Carrillo<sup>2</sup>, Stuart A. Scott<sup>3,4</sup> , Amy J. Turner<sup>5,6</sup>, Matthias Schwab<sup>7,8</sup> , Yoichi Tanaka<sup>9</sup>, Guilherme Suarez-Kurtz<sup>10</sup>, Elke Schaeffeler<sup>6,11</sup>, Teri E. Klein<sup>2</sup>, Neil A. Miller<sup>12,13</sup>  and Andrea Gaedigk<sup>13,14</sup> 

Clin Pharmacol Ther 2018



## Clinical Pharmacogenetics Implementation Consortium Guideline for Thiopurine Dosing Based on **TPMT and NUDT15** Genotypes: 2018 Update

Mary V. Relling<sup>1</sup>, Matthias Schwab<sup>2,3,4</sup> , Michelle Whirl-Carrillo<sup>5</sup>, Guilherme Suarez-Kurtz<sup>6</sup>, Ching-Hon Pui<sup>7</sup>, Charles M. Stein<sup>8</sup>, Ann M. Moyer<sup>9</sup> , William E. Evans<sup>1</sup>, Teri E. Klein<sup>4</sup>, Federico Guillermo Antillon-Klussmann<sup>10,11</sup>, Kelly E. Caudle<sup>1</sup>, Motohiro Kato<sup>12</sup>, Allen E.J. Yeoh<sup>13,14</sup>, Kjeld Schmiegelow<sup>15,16</sup> and Jun J. Yang<sup>1</sup> 

Clin Pharmacol Ther 2018



# DPYD pharmacogenetic diagnostics is implemented

## dihydropyrimidine-dehydrogenase and 5-fluorouracil-, capecitabine- and tegafur-therapy in patients with colorectal cancer

VOLUME 26 · NUMBER 13 · MAY 1 2008

JOURNAL OF CLINICAL ONCOLOGY ORIGINAL REPORT

**2008**

### Role of Genetic and Nongenetic Factors for Fluorouracil Treatment-Related Severe Toxicity: A Prospective Clinical Trial by the German 5-FU Toxicity Study Group

Matthias Schwab, Ulrich M. Zanger, Claudia Marx, Elke Schaeffeler, Kathrin Klein, Jürgen Dippon, Reinhold Kerb, Julia Blievernicht, Joachim Fischer, Ute Hofmann, Carsten Bokemeyer, and Michel Eichelbaum

### Clinical relevance of DPYD variants c.1679T>G, c.1236G>A/HapB3, and c.1601G>A as predictors of severe fluoropyrimidine-associated toxicity: a systematic review and meta-analysis of individual patient data

*Lancet Oncol* 2015

Didier Meulendijks\*, Linda M Henricks\*, Gabe S Sonke, Maarten J Deenen, Tanja K Froehlich, Ursula Amstutz, Carlo R Largiad..., Barbara A Jennings, Anthony M Marinaki, Jeremy D Sanderson, Zdenek Kleibl, Petra Kleiblova, Matthias Schwab, Ulrich M Zanger, Claire Palles, Ian Tomlinson, Eva Gross, André B P van Kullenburg, Cornelis J A Punt, Miriam Koopman, Jos H Beijnen, Annemieke Cats, Jan H M Schellens

CLINICAL PHARMACOLOGY & THERAPEUTICS

### Clinical Pharmacogenetics Implementation Consortium (CPIC) Guideline for Dihydropyrimidine Dehydrogenase Genotype and Fluoropyrimidine Dosing: 2017 Update

**2018**

Ursula Amstutz<sup>1</sup>, Linda M. Henricks<sup>2</sup>, Steven M. Offer<sup>3</sup>, Julia Barbarino<sup>4</sup>, Jan H.M. Schellens<sup>2,5</sup>, Jesse J. Swen<sup>6</sup>, Teri E. Klein<sup>4</sup>, Howard L. McLeod<sup>7</sup>, Kelly E. Caudle<sup>8</sup>, Robert B. Diasio<sup>3,9</sup> and Matthias Schwab<sup>10,11,12</sup>

New testing and treatment recommendations for fluorouracil, capecitabine, tegafur and flucytosine

13 March 2020  
EMA/125891/2020

EUROPEAN MEDICINES AGENCY  
SCIENCE · MEDICINES · HEALTH




**Bundesinstitut für Arzneimittel und Medizinprodukte**

**04. Juni 2020**

**5-Fluorouracil- (f.v.), Capecitabin- und Tegafur-haltige Arzneimittel: Tests vor Behandlungsbeginn zur Identifizierung von Patienten mit DPD-Mangel, die ein erhöhtes Risiko für schwere Toxizität haben**



**Positionspapier**

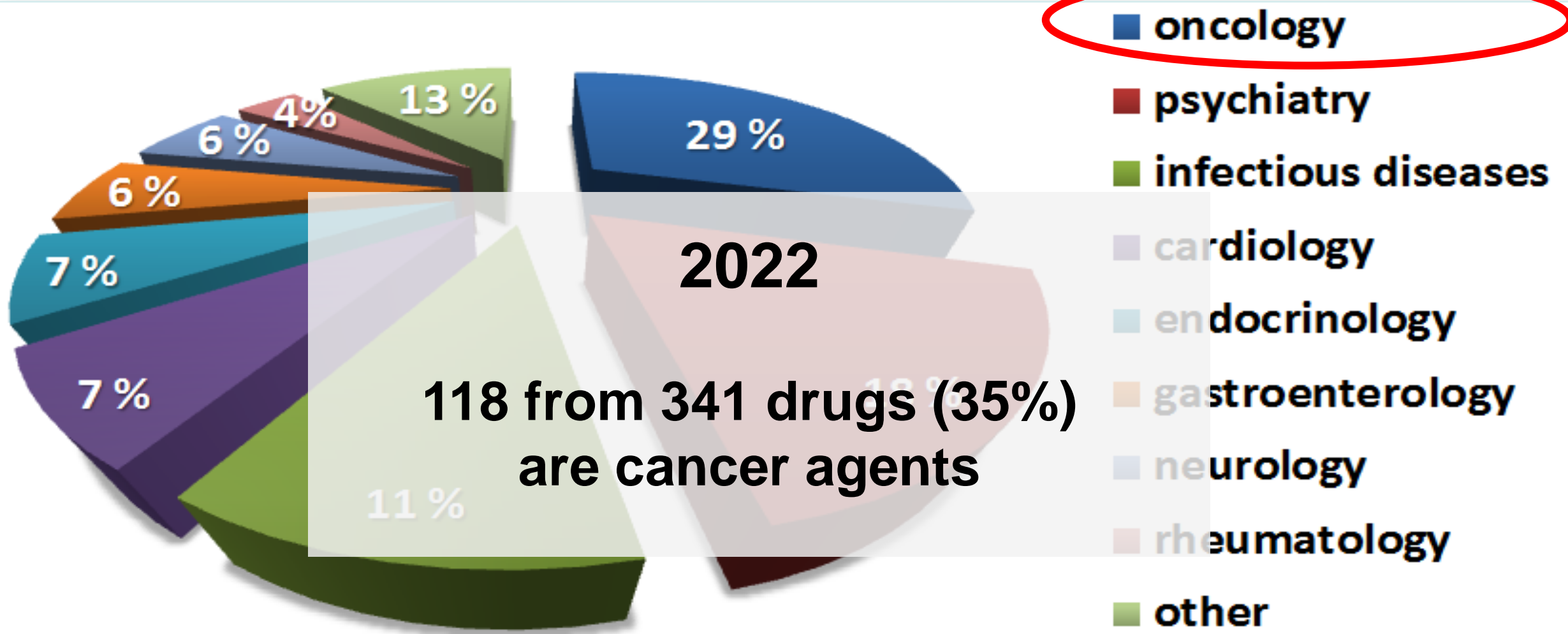
**Dihydropyrimidin-Dehydrogenase (DPD) -Testung vor Einsatz von 5-Fluorouracil, Capecitabin und Tegafur**

Juni 2020

**Juni 2020**

Cost reimbursement guaranteed by the **statutory health insurances in Germany**

# More than 341 FDA-approved drugs with labeled pharmacogenomic information



# Digital-supported PGx information & implementation



Search PharmGKB



Search for a molecule, gene, variant, or combination

## Want Personalized PGx Recommendations?



Try out our new [Genotype Selection Interface](#) (GSI) to access and compare pharmacogenomic guideline recommendations from CPIC and DPWG based on the genotypes you enter.

## Interested in Pediatric Pharmacogenomics?



Read about pediatrics on PharmGKB through the [Pediatric Dashboard](#). Switch Pediatric Focus "on" using the Focus link at the top right-hand corner of any page to see relevant information highlighted, if available. See [Pediatric Help](#) for more information.

Clinical Guideline Annotations

 201

Drug Label Annotations

 1,014

FDA Drug Label Annotations





 440

Curated Pathways





 230

## Annotations

### Clinical

 CLINICAL GUIDELINE ANNOTATIONS	201
 DRUG LABEL ANNOTATIONS	1,014
 FDA DRUG LABEL ANNOTATIONS	440
 CLINICAL ANNOTATIONS	5,073

### Research

 PATHWAYS	230
 VIPs (Very Important Pharmacogenes)	69
 VARIANT ANNOTATIONS	26,684
 ANNOTATED DRUGS	767

**CPIC: Clinical Pharmacogenetics Implementation Consortium**



NATURE | VOL 537 | 8 SEPTEMBER 2016

OUTLOOK PRECISION MEDICINE

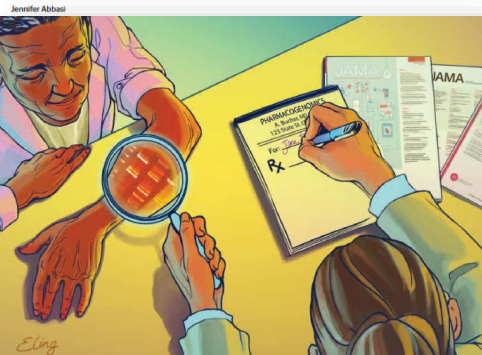


**The right drug for you**

Personalized prescribing is gaining momentum, but is there enough evidence for it to become standard clinical practice?

JAMA Published online September 21, 2016

Medical News & Perspectives  
Getting Pharmacogenomics Into the Clinic



**11 / 2020:  
25 CPIC guidelines covering > 60 drugs**

Current Drug Metabolism, 2014, 15, 209-217

209

**Incorporation of Pharmacogenomics into Routine Clinical Practice: the Clinical Pharmacogenetics Implementation Consortium (CPIC) Guideline Development Process**

Kelly E. Caudle<sup>1\*</sup>, Teri E. Klein<sup>2</sup>, James M. Hoffman<sup>1</sup>, Daniel J. Müller<sup>3,4</sup>, Michelle Whirl-Carrillo<sup>2</sup>, Li Gong<sup>2</sup>, Ellen M. McDonagh<sup>2</sup>, Katrin Sangkuhl<sup>2</sup>, Caroline F. Thorn<sup>2</sup>, Matthias Schwab<sup>5,6</sup>, José A.G. Agúndez<sup>7</sup>, Robert R. Freimuth<sup>8</sup>, Vojtech Huser<sup>9</sup>, Ming Ta Michael Lee<sup>10,11,12</sup>, Otito F. Iwuchukwu<sup>13</sup>, Kristine R. Crews<sup>1</sup>, Stuart A. Scott<sup>14</sup>, Mia Wadelius<sup>15</sup>, Jesse J. Swen<sup>16</sup>, Rachel F. Tyndale<sup>3,4</sup>, C. Michael Stein<sup>13,17</sup>, Dan Roden<sup>13,17</sup>, Mary V. Relling<sup>1</sup>, Marc S. Williams<sup>18</sup> and Samuel G. Johnson<sup>19,20</sup>

**Clinical Pharmacogenetics Implementation Consortium (CPIC) Guideline for CYP2D6 Genotype and Use of Ondansetron and Tropisetron**

GC Bell<sup>1</sup>, KE Caudle<sup>2</sup>, M Whirl-Carrillo<sup>3</sup>, RJ Gordon<sup>4</sup>, K Hikino<sup>5</sup>, CA Prows<sup>6</sup>, A Gaedigk<sup>7</sup>, JAG Agúndez<sup>8,9</sup>, S Sadhasivam<sup>10,11</sup>, TE Klein<sup>3</sup> and M Schwab<sup>12,13,14</sup> Clin Pharmacol Ther 2017

**Clinical Pharmacogenetics Implementation Consortium Guideline for Thiopurine Dosing Based on TPMT and NUDT15 Genotypes: 2018 Update**

Clin Pharmacol Ther 2019

Mary V. Relling<sup>1</sup>, Matthias Schwab<sup>2,3,4</sup>, Michelle Whirl-Carrillo<sup>5</sup>, Guilherme Suarez-Kurtz<sup>6</sup>, Ching-Hon Pui<sup>7</sup>, Charles M. Stein<sup>8</sup>, Ann M. Moyer<sup>9</sup>, William E. Evans<sup>1</sup>, Teri E. Klein<sup>4</sup>, Federico Guillermo Antillon-Klussmann<sup>10,11</sup>, Kelly E. Caudle<sup>1</sup>, Motohiro Kato<sup>12</sup>, Allen E.J. Yeoh<sup>13,14</sup>, Kjeld Schmiegelow<sup>15,16</sup> and Jun J. Yang<sup>16</sup>

**Clinical Pharmacogenetics Implementation Consortium Guidelines for Thiopurine Methyltransferase Genotype and Thiopurine Dosing: 2013 Update**

Clin Pharmacol Ther 2013

MV Relling<sup>1</sup>, EE Gardner<sup>2</sup>, WJ Sandborn<sup>3</sup>, K Schmiegelow<sup>4,5</sup>, C-H Pui<sup>6</sup>, SW Yee<sup>7</sup>, CM Stein<sup>8</sup>, M Carrillo<sup>9</sup>, WE Evans<sup>1</sup>, JK Hicks<sup>1</sup>, M Schwab<sup>10,11</sup> and TE Klein<sup>9</sup>

**Clinical Pharmacogenetics Implementation Consortium (CPIC) Guideline for Dihydropyrimidine Dehydrogenase Genotype and Fluoropyrimidine Dosing: 2017 Update**

Ursula Amstutz<sup>1</sup>, Linda M. Henricks<sup>2</sup>, Steven M. Offer<sup>3</sup>, Julia Barbarino<sup>4</sup>, Jan H.M. Schellens<sup>2,5</sup>, Jesse J. Swen<sup>6</sup>, Teri E. Klein<sup>4</sup>, Howard L. McLeod<sup>7</sup>, Kelly E. Caudle<sup>8</sup>, Robert B. Diasio<sup>3,9</sup> and Matthias Schwab<sup>10,11,12</sup> Clin Pharmacol Ther 2017

**Clinical Pharmacogenetics Implementation Consortium (CPIC) Guideline for CYP2D6 and Tamoxifen Therapy**

Clin Pharmacol Ther 2018

Matthew P. Goetz<sup>1</sup>, Katrin Sangkuhl<sup>2</sup>, Henk-Jan Guchelaar<sup>3</sup>, Matthias Schwab<sup>4,5,6</sup>, Michael Province<sup>7</sup>, Michelle Whirl-Carrillo<sup>2</sup>, W. Fraser Symmans<sup>8</sup>, Howard L. McLeod<sup>9</sup>, Mark J. Ratain<sup>10</sup>, Hitoshi Zembutsu<sup>11</sup>, Andrea Gaedigk<sup>12</sup>, Ron H. van Schaik<sup>13,14</sup>, James N. Ingle<sup>1</sup>, Kelly E. Caudle<sup>15</sup> and Teri E. Klein<sup>2</sup>

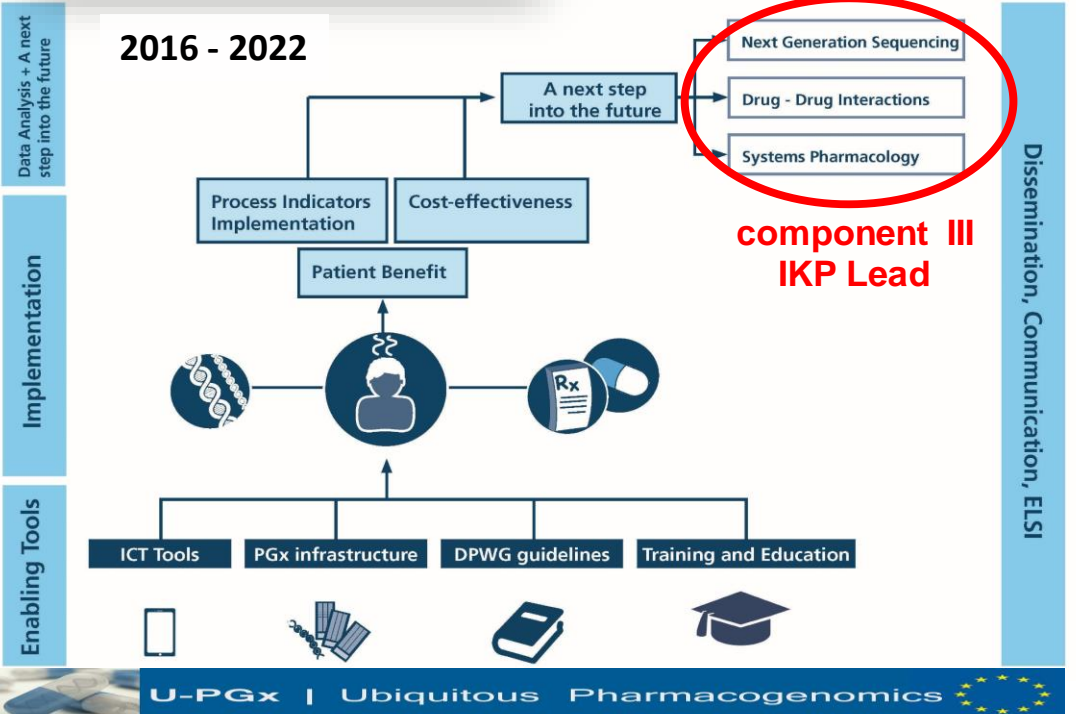
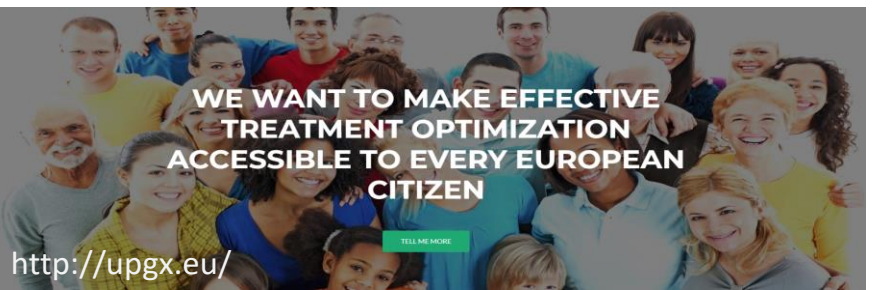
**Clinical Pharmacogenetics Implementation Consortium (CPIC) Guideline for CYP2C19 and Proton Pump Inhibitor Dosing**

Clin Pharmacol Ther 2020

John J. Lima<sup>1\*</sup>, Cameron D. Thomas<sup>2</sup>, Julia Barbarino<sup>3</sup>, Zeruesenay Desta<sup>4</sup>, Sara L. Van Driest<sup>5</sup>, Nihal El Rouby<sup>2,6</sup>, Julie A. Johnson<sup>2</sup>, Larisa H. Cavallari<sup>2</sup>, Valentina Shakhnovich<sup>7,8,9</sup>, David L. Thacker<sup>10,11</sup>, Stuart A. Scott<sup>12,13</sup>, Matthias Schwab<sup>14,15,16</sup>, Chakradhara Rao S. Uppugunduri<sup>17,18</sup>, Christine M. Formea<sup>19</sup>, James P. Franciosi<sup>20,21</sup>, Katrin Sangkuhl<sup>3</sup>, Andrea Gaedigk<sup>7</sup>, Teri E. Klein<sup>3</sup>, Roseann S. Gamal<sup>22,23</sup> and Takahisa Furuta<sup>24</sup>

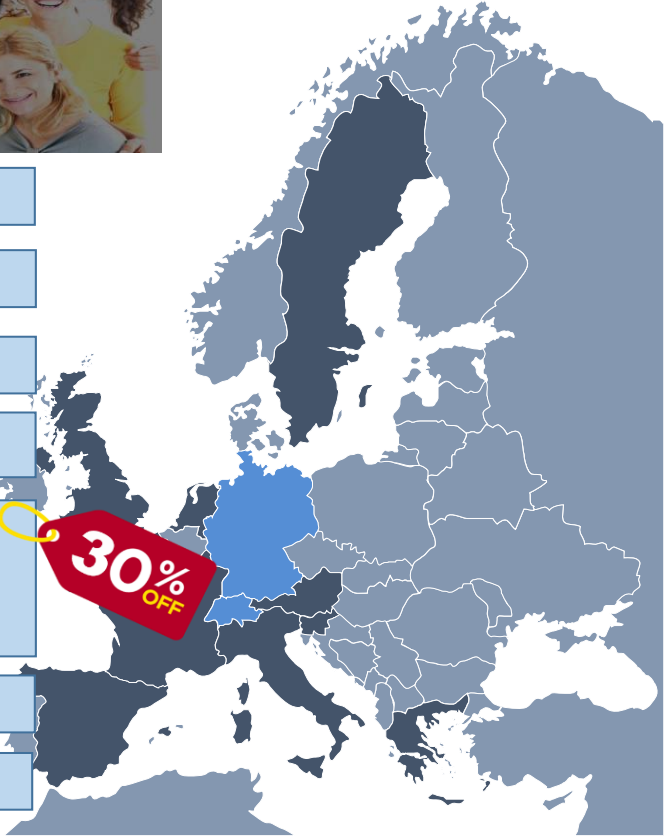
# The Ubiquitous Pharmacogenomics (U-PGx) PREPARE trial

Making actionable pharmacogenomic data and effective treatment optimization accessible to Every European citizen (Lead HJ Guchelaar, NL, Vice Chair M Schwab)



**component III  
 IKP Lead**

- 15Mio € Horizon2020 funding
- Framework for implementation
- ~7,000 patients recruited
- 7 European countries
- Pre-emptively PGx testing of a panel of markers can results in reducing ADRs
- Manuscript *in press*
- Extended other research activities



Component III comprises NGS, DDI & pharmacometrics

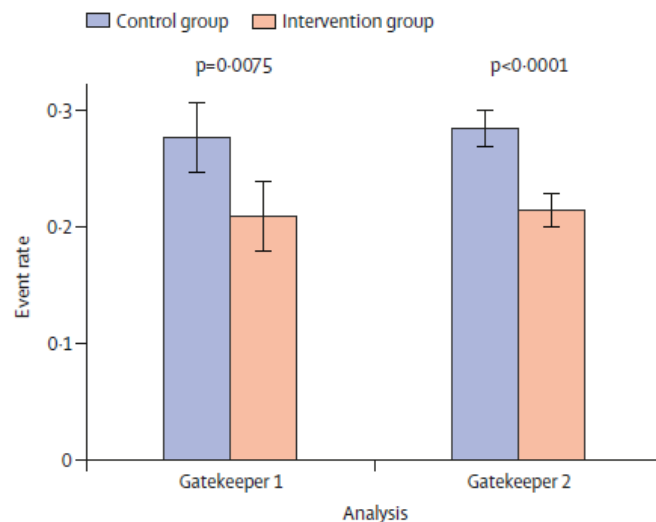
# A 12-gene pharmacogenetic panel to prevent adverse drug reactions: an open-label, multicentre, controlled, cluster-randomised crossover implementation study

THE LANCET

February 2, 2023

*Jesse J Swen, Cathelijne H van der Wouden\*, Lianne EN Manson\*, Heshu Abdullah-Koolmees, Kathrin Blagec, Tanja Blagus, Stefan Böhringer, Anne Cambon-Thomsen, Erika Cecchin, Ka-Chun Cheung, Vera HM Deneer, Mathilde Dupui, Magnus Ingelman-Sundberg, Siv Jonsson, Candace Joefield-Roka, Katja S Just, Mats O Karlsson, Lidija Konta, Rudolf Koopmann, Marjolein Kriek, Thorsten Lehr, Christina Mitropoulou, Emmanuelle Rial-Sebbag, Victoria Rollinson, Rossana Roncato, Matthias Samwald, Elke Schaeffeler, Maria Skokou, Matthias Schwab, Daniela Steinberger, Julia C Stingl, Roman Tremmel, Richard M Turner, Mandy H van Rhenen, Cristina L Dávila Fajardo, Vita Dolžan, George P Patrinos, Munir Pirmohamed, Gere Sunder-Plassmann, Giuseppe Toffoli, Henk-Jan Guchelaar, on behalf of the Ubiquitous Pharmacogenomics Consortium†*

**Interpretation** Genotype-guided treatment using a 12-gene pharmacogenetic panel significantly reduced the incidence of clinically relevant adverse drug reactions and was feasible across diverse European health-care system-organisations and settings. Large-scale implementation could help to make drug therapy increasingly safe.



In the second analysis, which included all groups, the prevalence of the development of a causal clinically relevant ADR was 21% in the study group and 29% in the control group, **reducing the risk of an ADR by 30% (OR 0.70 [95% CI 0.61–0.79]; p <0.0001)**



# COST EFFECTIVENESS of PGx testing based on Clinical PGx Implementation Consortium (CPIC): a systematic review

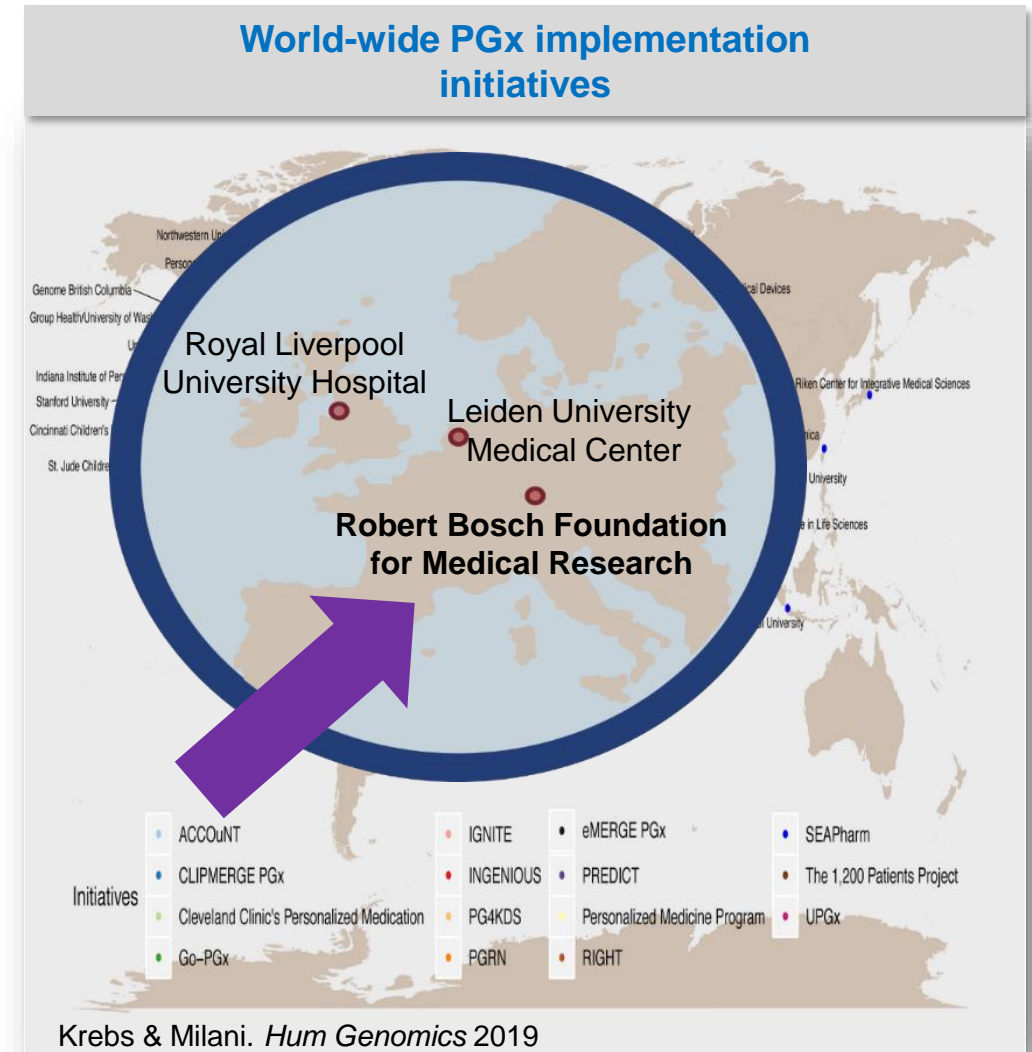
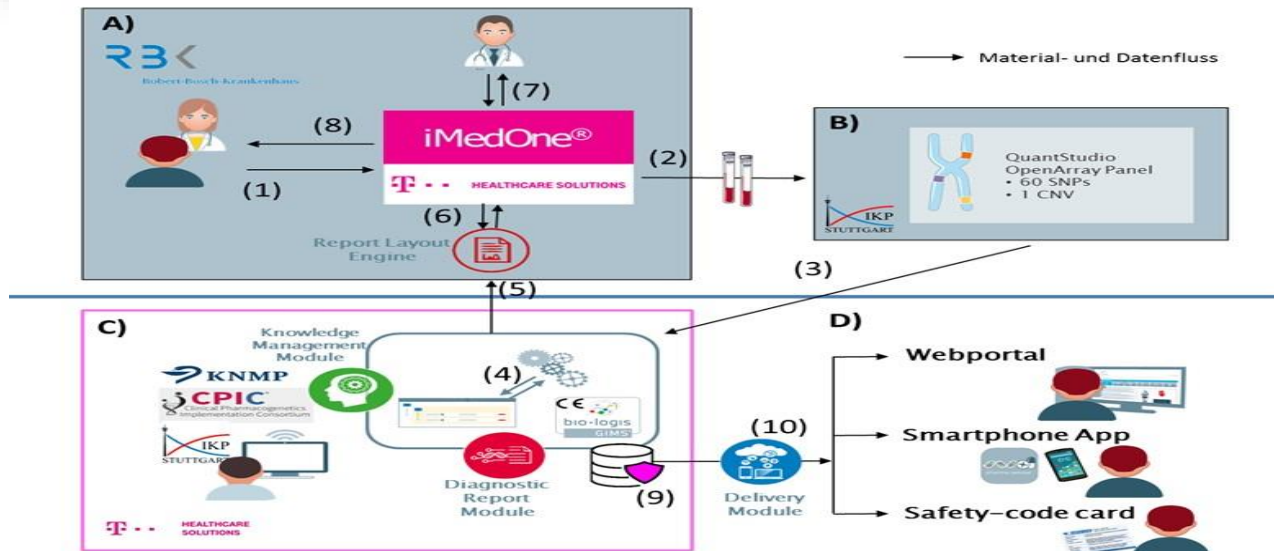
**Table 2 Summary of drug-gene pairs and cost outcomes**

Class	Gene	Total articles reviewed	Cost-saving	Cost-effective	Not cost-effective	Uncertain	Drugs
Aminoglycosides <sup>23</sup>	<i>mt-RNR1</i>	1	—	—	1	—	Tobramycin
Analgesics <sup>24</sup>	<i>CYP2D6</i>	1	—	—	1	—	Codeine
Anticoagulant <sup>25-40</sup>	<i>CYP2C9 &amp; VKORC1</i>	15	—	6	5	4	Warfarin
Antidepressants <sup>41-51</sup>	<i>CYP2C9</i>	1	—	1	—	—	Citalopram, escitalopram, fluvoxamine, paroxetine, sertraline, amitriptyline, clomipramine, doxepin, imipramine, nortriptyline, trimipramine, desipramine
	Multigene panel <sup>a</sup>	9	8	1	—	—	
Antiepileptic <sup>52-59</sup>	<i>HLA-A*31:01</i>	7	1	2	4	—	Carbamazepine, phenytoin
	<i>HLA-B*15:02</i>	1	—	1	—	—	
Antifungal <sup>60-61</sup>	<i>CYP2C19</i>	2	2	—	—	—	Voriconazole
Antigout <sup>62-71</sup>	<i>HLA-B*58:01</i>	10	1	4	5	—	Allopurinol
Antiplatelet <sup>15,72-93</sup>	<i>CYP2C19</i>	22	4	17	1	—	Clopidogrel
	<i>CYP2C19 &amp; CYP2D6</i>	1	1	—	—	—	Clopidogrel, tramadol
Antiretroviral <sup>94-104</sup>	<i>HLA-B*57:01</i>	8	2	4	1	1	Abacavir
	<i>CYP2B6</i>	2	2	—	—	—	Efavirenz
	<i>UGT1A1</i>	1	—	—	—	1	Atazanavir
Cardiovascular medications <sup>18,105</sup>	<i>CYP2C9, CYP2C19, SLCO1B1, &amp; VKORC1</i>	2	—	2	—	—	Clopidogrel, simvastatin, warfarin
Fluoropyrimidines <sup>106-110</sup>	<i>DPYD</i>	5	4	1	—	—	Fluorouracil, capecitabine
Multidrug <sup>10</sup>	<i>CYP2D6, CYP2C19, CYP2C9, CYP3A4, &amp; VKORC1</i>	1	—	—	—	1	Citalopram, escitalopram, fluvoxamine, paroxetine, sertraline, amitriptyline, clomipramine, doxepin, imipramine, nortriptyline, trimipramine, desipramine, celecoxib, hydrocodone, flurbiprofen, ibuprofen, meloxicam, tramadol, piroxicam, phenytoin, clopidogrel, codeine, voriconazole
Pegylated interferon <sup>111-112</sup>	<i>IFNL3 (IL-28B)</i>	2	—	2	—	—	Pegylated interferon alpha
Proton Pump Inhibitors <sup>113</sup>	<i>CYP2C19</i>	1	1	—	—	—	Omeprazole, lansoprazole
Selective Estrogen Receptor Modulators <sup>114-116</sup>	<i>CYP2D6</i>	3	—	2	—	1	Tamoxifen
Thiopurines <sup>117-127</sup>	<i>TPMT</i>	11	3	5	2	1	Azathioprine, mercaptopurine
<b>Total</b>	<b>All</b>	<b>108</b>	<b>29</b>	<b>48</b>	<b>21</b>	<b>10</b>	<b>All</b>



<sup>a</sup>Antidepressant studies contain variable multigene panels ranging from 6 to 13 genes. —, none.

# CLINICAL Research: Implementation of PGx into clinical practice at Robert-Bosch-Hospital

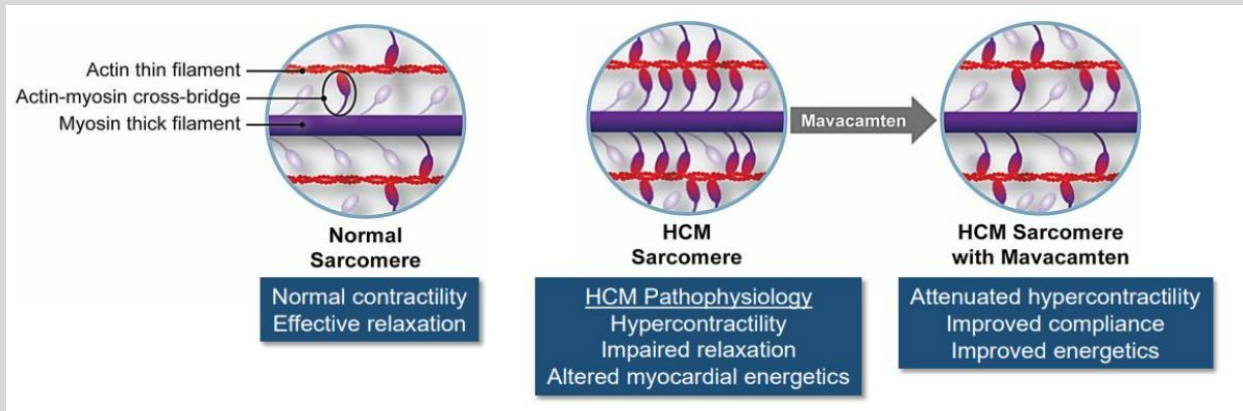
## The use of digital medicine and App-based solutions



# Drug Labeling requires up-front PGx diagnostics

Dug	Kind of Genotyping	Specification acc. to <i>Summary of product characteristics (SmPC)</i>	Possible ADRs under standard dosage in variant carriers	Consequence(s)
	CYP2D6 genotyping (pretherapeutic) in M. Gaucher type 1	CYP2D6 genotyping is a prerequisite before treatment	<b>PM:</b> significantly increased plasmaconcentration of Eliglustat and increased risk of ADRs (head- and joint aches). <b>UM:</b> Therapy failure	<b>PM:</b> Bisection of the daily dose. <b>UM:</b> Eliglustat should not be applied to CYP2D6-UMs
	CYP2C9 genotyping (pretherapeutic) in secondary progressive MS	CYP2C9 genotyping is a prerequisite before treatment	Significantly increased drug exposure to CYP2C9*3*3/CYP2C9*1*3/CYP2C19*2*3, thereby increased risk of ADRs such as headache and hypertension	<u>Contraindication for CYP2C9*3*3 genotype. Halving the maintenance dosage for CYP2C9*1*3 or -*2*3 genotype</u>

**MAVACAMTEN:**  
a cardiac myosin inhibitor  
to treat obstructive hypertrophic  
cardiomyopathy



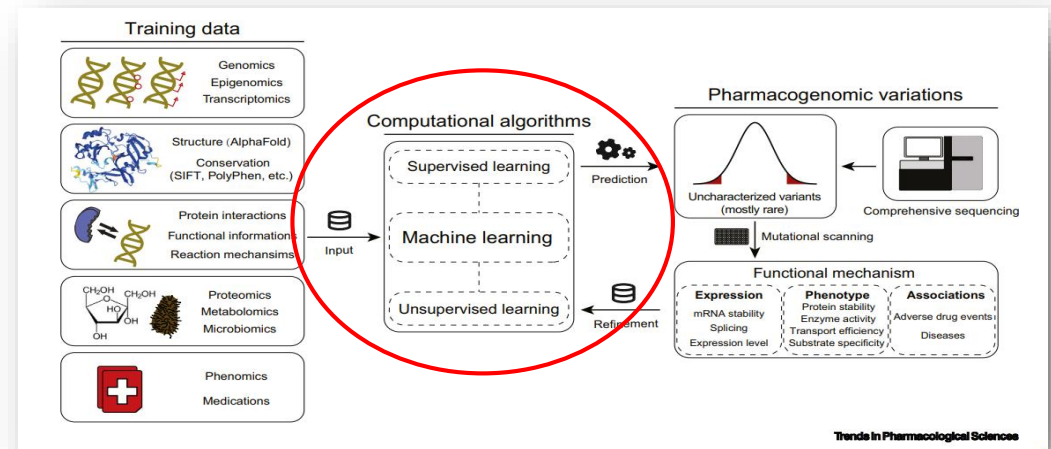
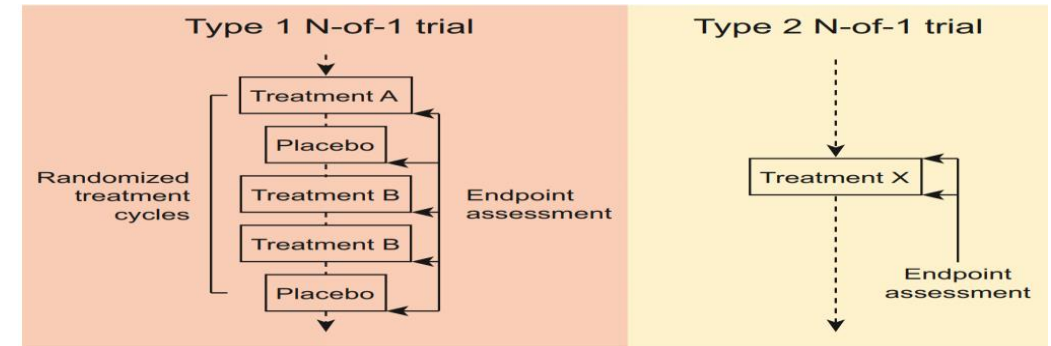
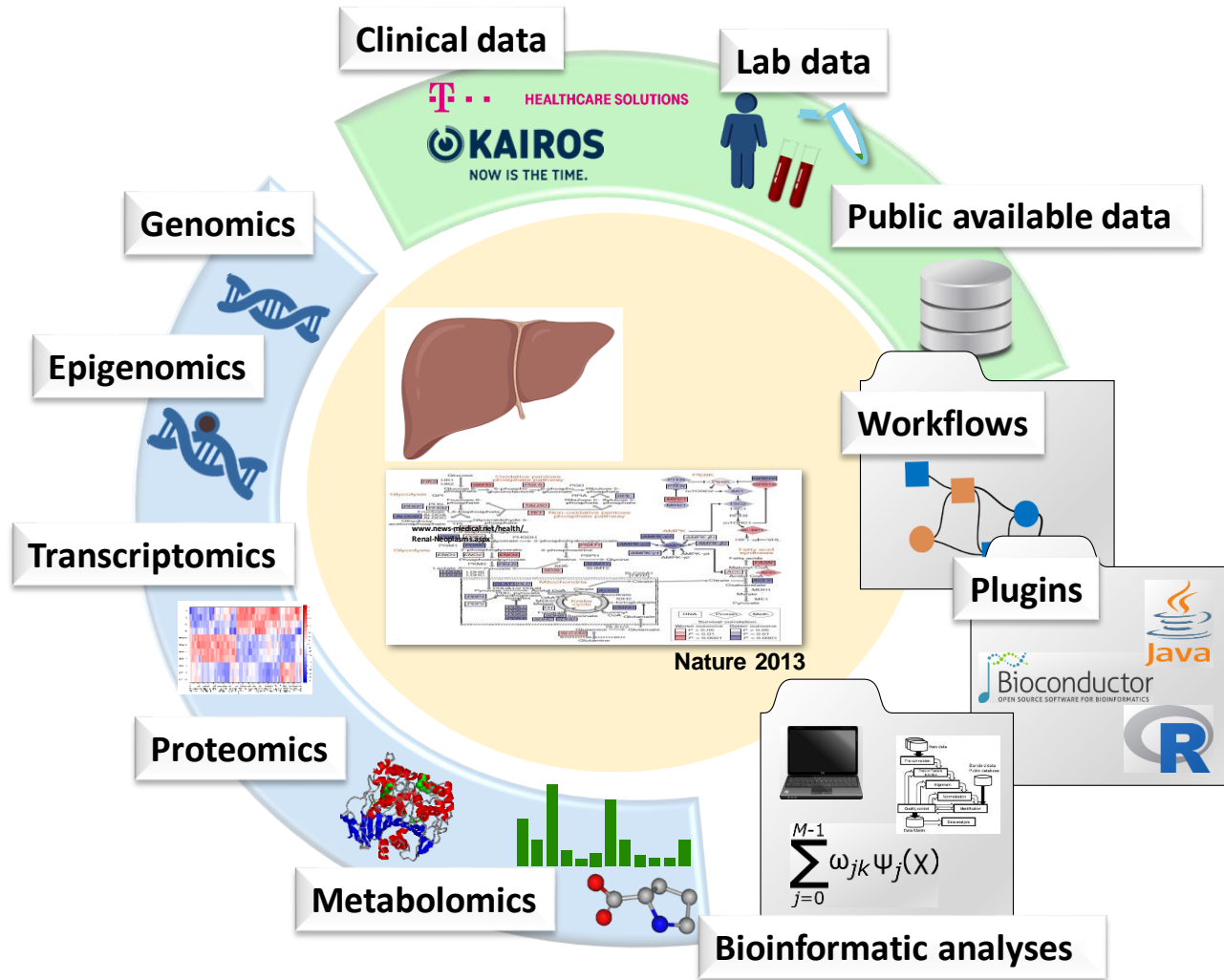
- United States
- European Union
- Australia
- Canada
- Brazil
- Switzerland
- Macau
- South Korea
- Singapore



## 12.5 Pharmacogenomics

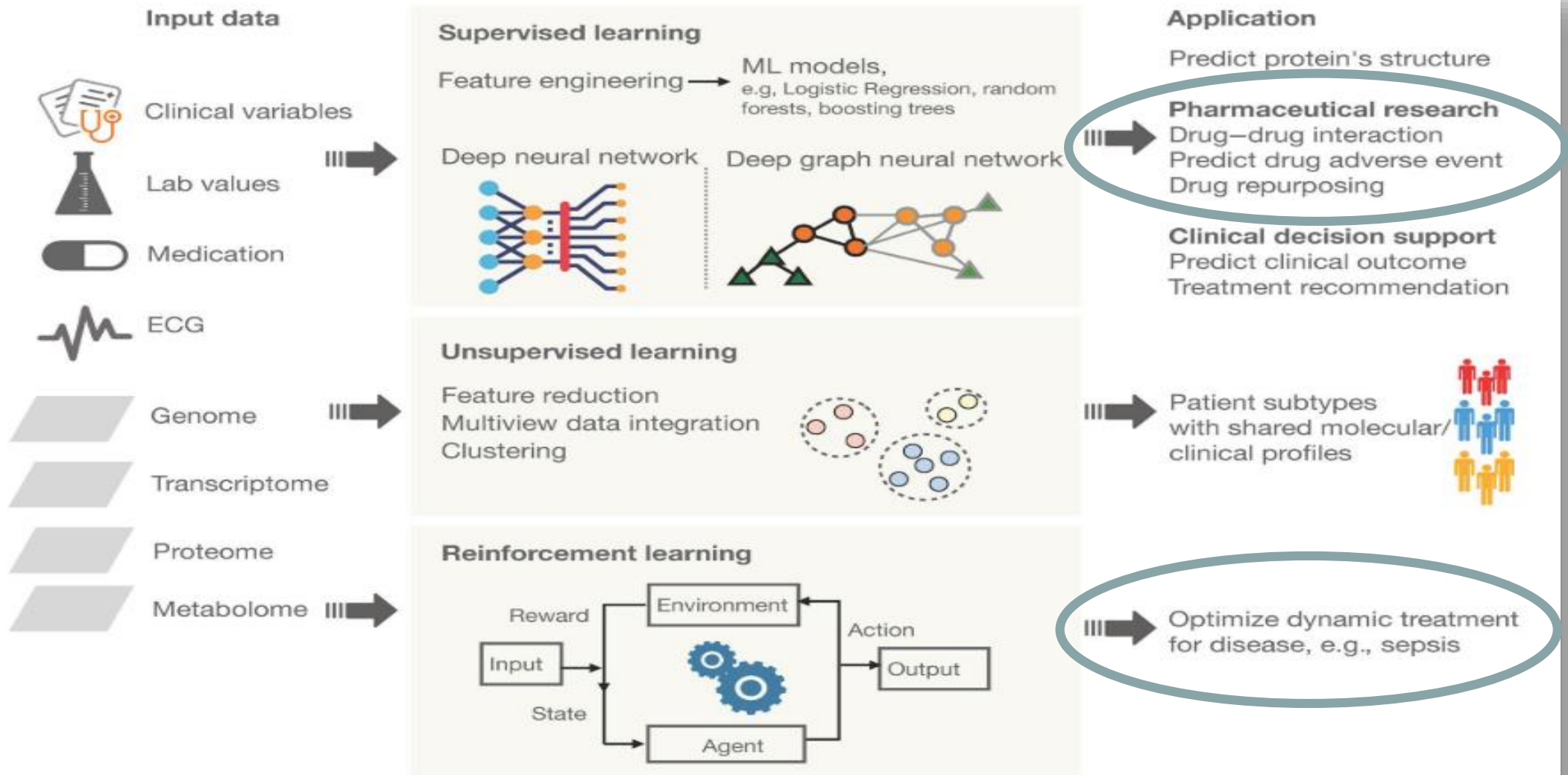
Mavacamten AUC<sub>inf</sub> increased by 241% and C<sub>max</sub> increased by 47% in CYP2C19 poor metabolizers (PMs) compared to normal metabolizers (NMs) following a single dose of 15 mg mavacamten. Mean half-life is prolonged in CYP2C19 PMs compared to NMs (23 days vs. 6 to 9 days, respectively).

# Methodological advances paralleled by innovative trial designs enable individualized targeted therapies



Zhou, Tremmel, Schaeffeler, Schwab, Lauschke. *Trends Pharmacol Sci* 2022  
Tremmel, ...Schaeffeler, Schwab. *Ann Rev Pharmacol Toxicol* 2023

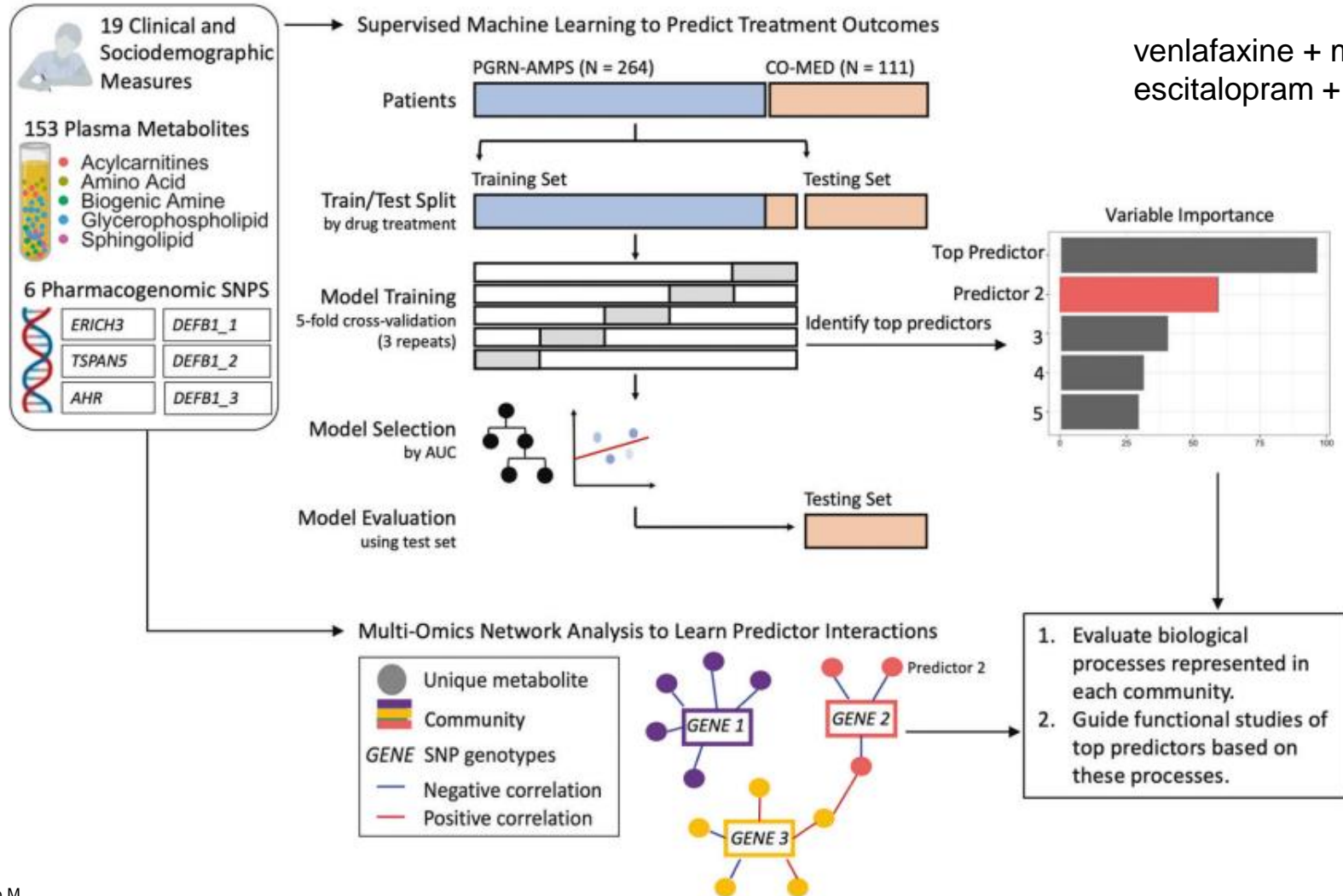
# AI implementation on Pharmacogenomics



**Figure 1** Machine learning and PGx research. ECG, electrocardiogram; ML, machine learning.

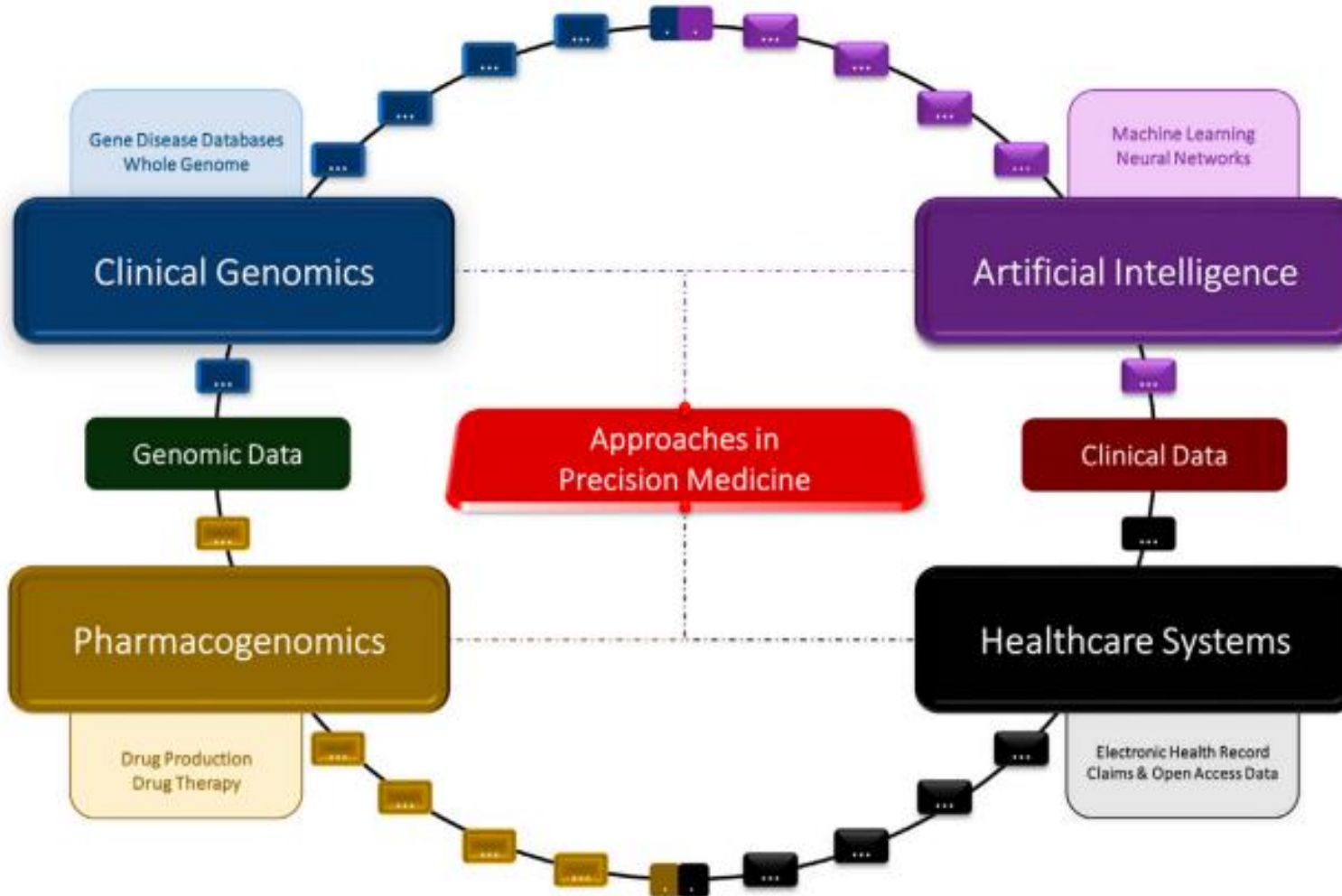
# Multi-omics driven prediction of response to combination antidepressant therapy: a machine learning approach with cross-trial replication

Conceptual overview of model development and evaluation

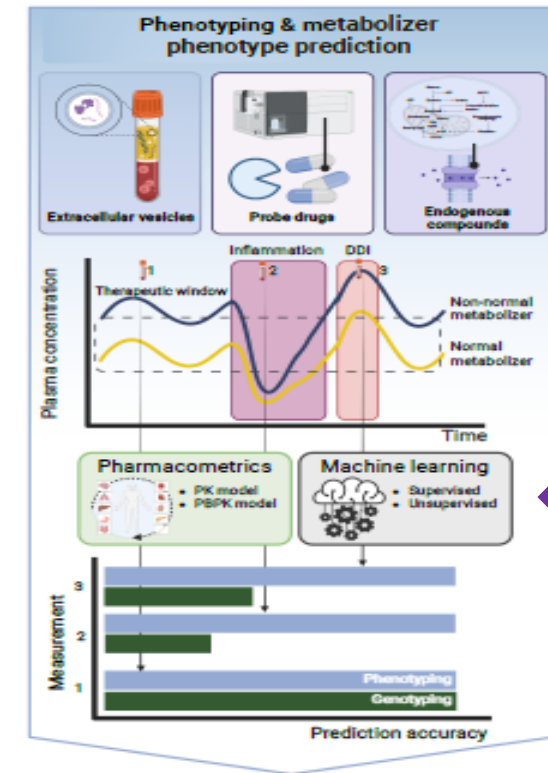
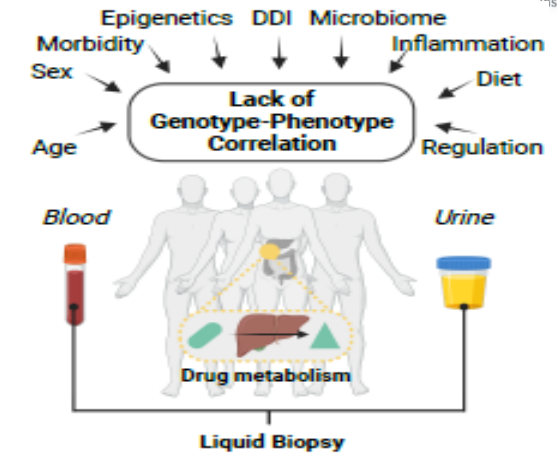


The results suggest that integrating specific metabolites and SNPs achieves accurate predictions of treatment response across classes of antidepressants.

# Concept diagram comprising artificial intelligence, clinical genomics, pharmacogenomics, and big data approaches in precision medicine



Abdelhalim *et al.* Front Genet 2022



Tremmel, ...Schwab. Ann Rev Pharmacol Toxicol 2023

# The future of Personalized Medicine

## Conventional Big Data

Data derived from advanced analytical technology (eg. Omics, Deep Sequencing, Imaging)

## Unused Big Data

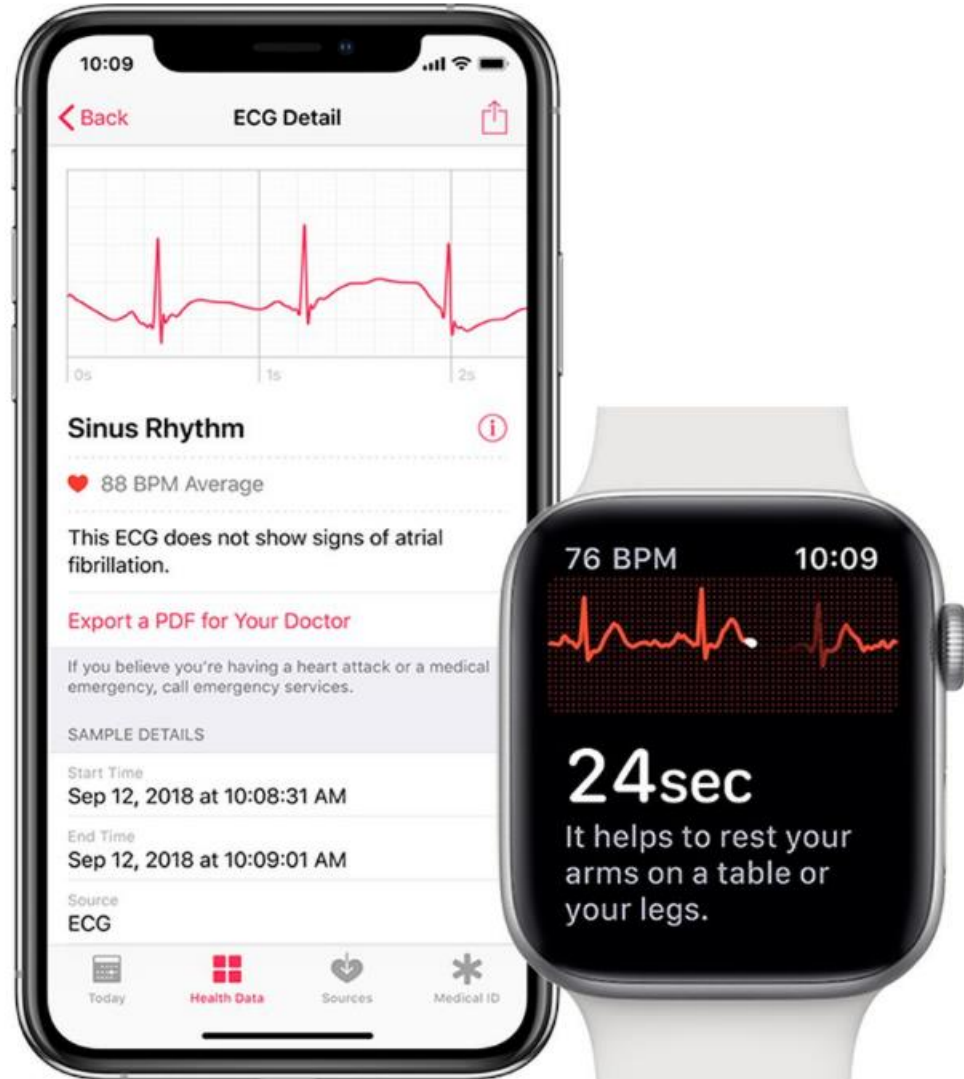
Data derived from standard Clinical Care

## Private Big Data

Data derived from non-professional, private sources



# Sensor-based technology combined with AI



## Detection of Atrial Fibrillation in a Large Population Using Wearable Devices: The Fitbit Heart Study

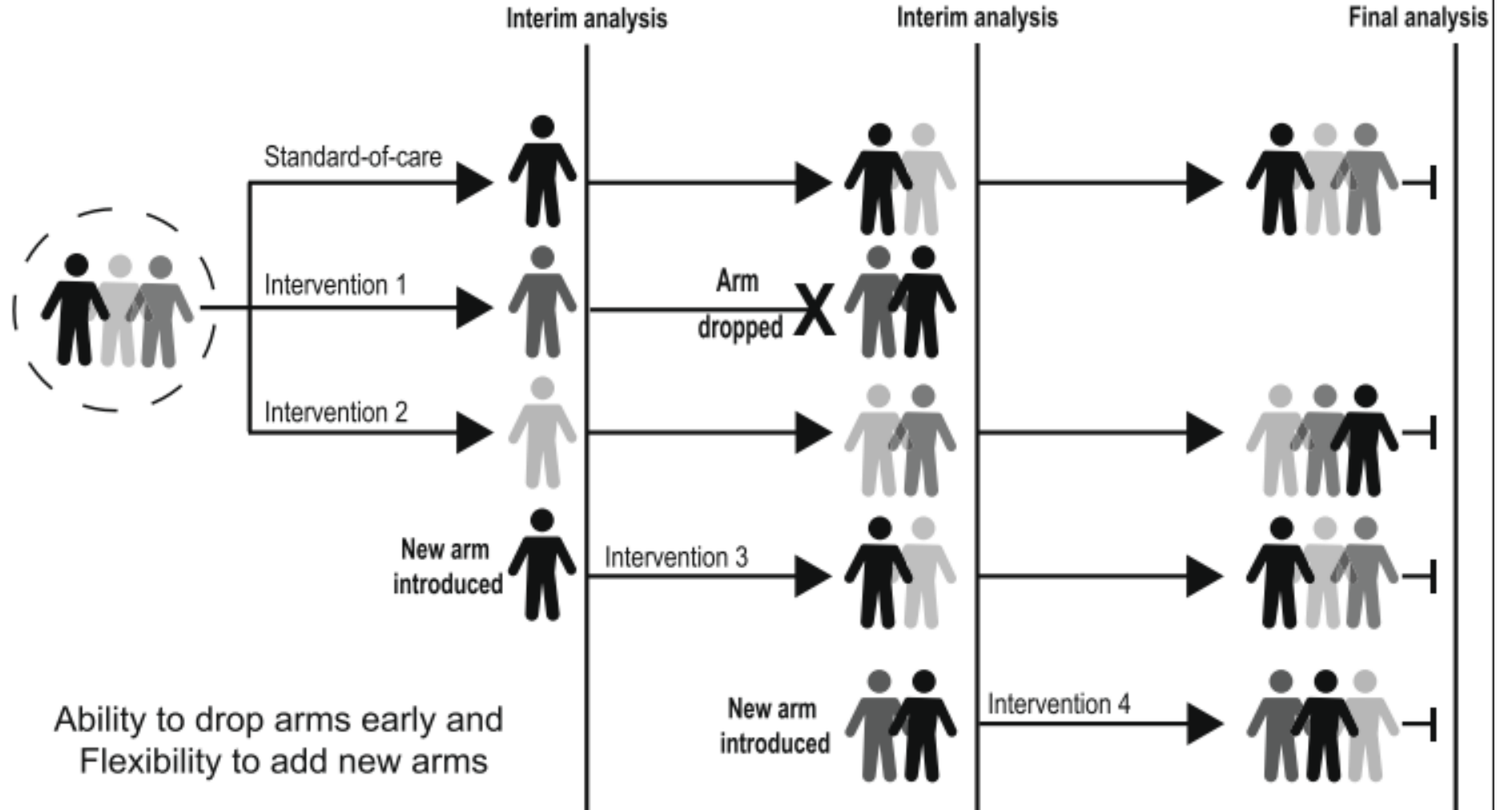
Steven A. Lubitz<sup>1</sup>, MD, MPH; Anthony Z. Faranesh, PhD; Caitlin Selvaggi, MS; Steven J. Atlas, MD, MPH; David D. McManus, MD, ScM; Daniel E. Singer<sup>2</sup>, MD; Sherry Pagoto, PhD; Michael V. McConnell<sup>3</sup>, MD, MSEE; Alexandros Pantelopoulos, PhD; Andrea S. Foulkes<sup>4</sup>, PhD

### What Are the Clinical Implications?

- The Fitbit wearable-based irregular heart rhythm algorithm may be useful for early detection of undiagnosed atrial fibrillation.
- Individuals with a Fitbit wearable-based irregular heart rhythm detection have a substantial likelihood of having atrial fibrillation confirmed on a subsequent ECG patch monitor and considerable burden of atrial fibrillation.
- Because wearable-based irregular heart rhythm detections using photoplethysmography sensors operate during periods of inactivity, wearing devices at night may maximize the sensitivity.
- Detection of atrial fibrillation during periods of active motion remains a challenge.

# Innovative trial designs to foster precision medicine in clinical care: consideration of age groups and molecular markers

## Platform Trials





# RECOVERY

2 years on

## GLOBAL CUMULATIVE TOTALS

48616 Participants

189 Active sites

5  
'No c  
from hyc

March 2022  
nib reduces deaths  
about one-fifth

Oct 2023

19 March 2020  
First patient enrolled

10 March 2020  
First draft  
protocol written

4 May 2020  
10,000 patients enrolled

16 June 2020  
Dexamethasone reduces  
deaths by one-third  
in sickest patients

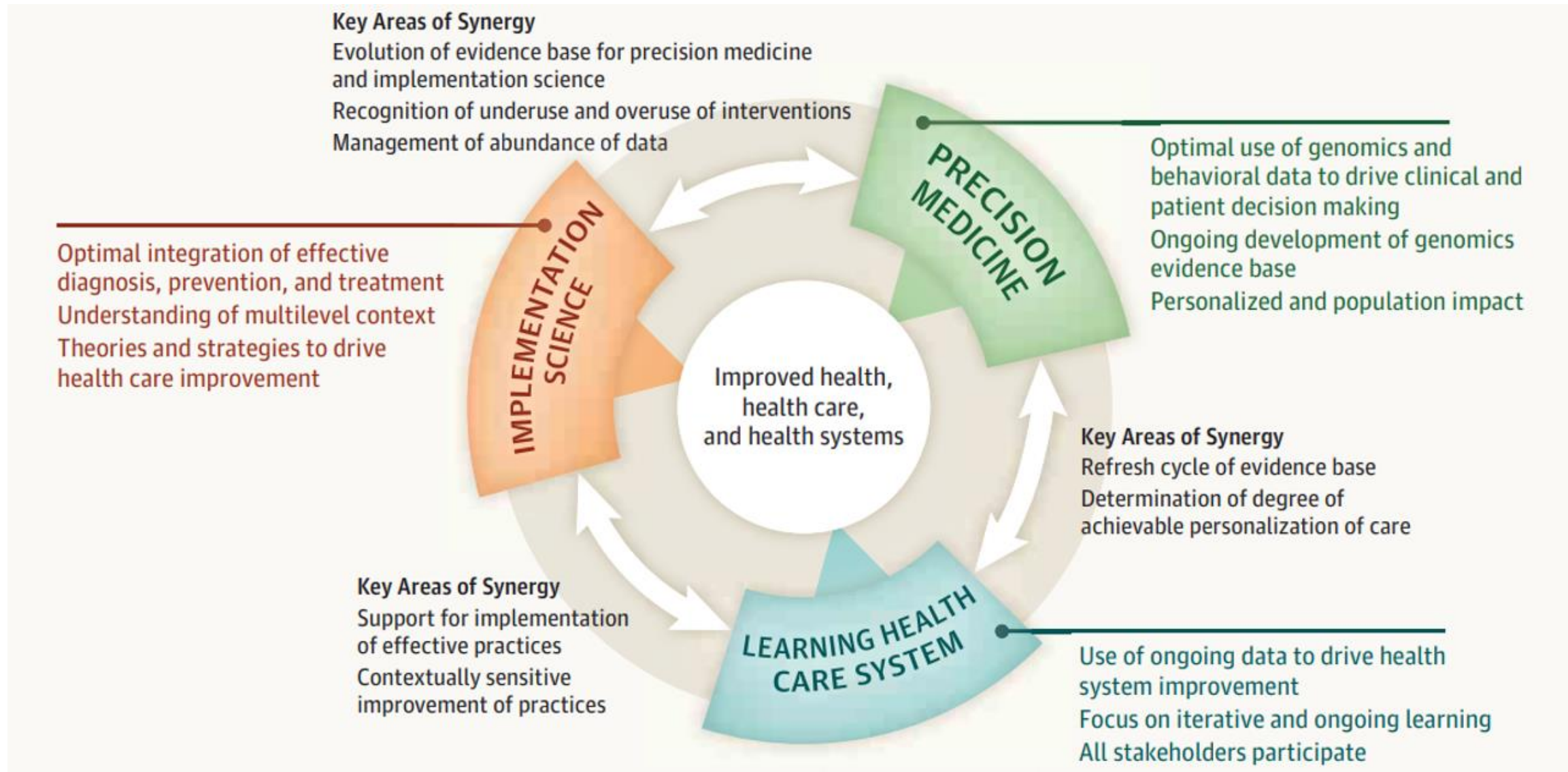
14 December 2020  
Azithromycin found  
to be ineffective

11 February 2021  
Corticosteroids with  
tocilizumab reduces  
deaths by up to a half

5 March 2021  
Colchicine found  
to be ineffective

20 June 2021  
Monoclonal antibody  
combination reduces deaths  
in people who have not  
mounted their own  
immune response

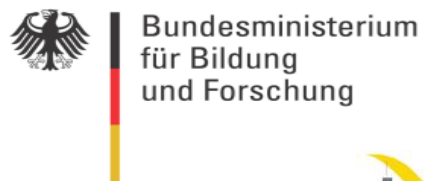
# Contributions of Implementation Science, Learning Health Care system, and Precision Medicine



# Robert Bosch Krankenhaus, Stuttgart



# IKP Stuttgart



Bundesministerium  
für Bildung  
und Forschung



interfaculty centre for pharma-  
cogenomics and drug research



Dr. Margarete Fischer-Bosch  
Institut für Klinische Pharmakologie



Robert-Bosch-Krankenhaus



EBERHARD KARLS  
UNIVERSITÄT  
TÜBINGEN



HORIZON 2020



DFG Deutsche  
Forschungsgemeinschaft



Bosch Health Campus  
Behandlung. Forschung. Bildung.



Universitätsklinikum  
Tübingen



Robert Bosch  
Stiftung

IKP founded 1973 by Dr. Margarete-Fischer-Bosch