



Pharmacogenomics Knowledge for Personalized Medicine

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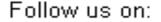
Acknowledgments

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 - Blanca Pineda, T.C. Truong, Tina Zhou
- PGRN & International Collaborators





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Overview

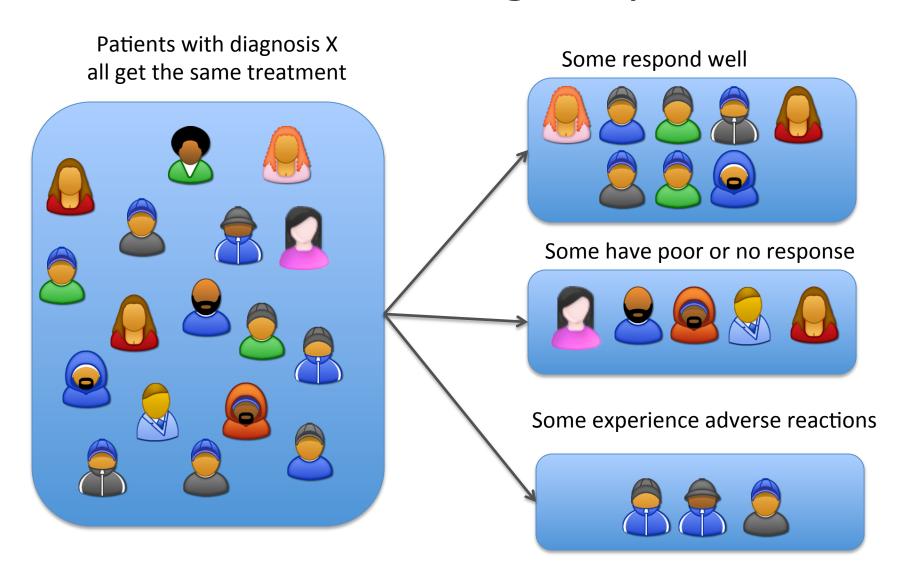
PGx Knowledge | Implementation | Impact

1. PharmGKB and resources for PGx

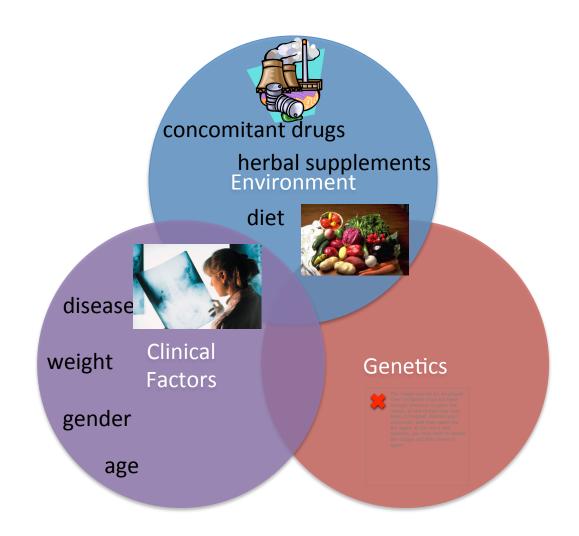
2. Clinical PGx Implementation

3. Does PGx truly have a role in personalized medicine?

Variation in Drug Response



Factors Affecting Drug Response



Clinical Applications of PGx

- Focus treatment by identifying patients with genetic backgrounds likely to respond
- Reduce adverse events by predicting who is at risk
- Potential to save drugs in the pipeline that are effective in subpopulations
- Better understanding of drug interactions

Definitions

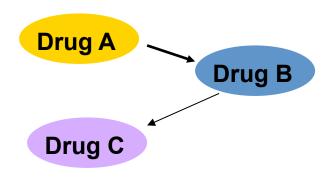
- Pharmacogenetics: study of individual genedrug interactions, usually one or two genes that have dominant effect on a drug response (SIMPLE relationship)
- Pharmacogenomics: study of genomic influence on drug response, often using highthroughput data (sequencing, SNP chip, expression, proteomics) (COMPLEX interactions)

Clinical Promises of PGx

 Personalized Medicine: Selecting the right dose of the right drug to the right patient at the right time

Today:

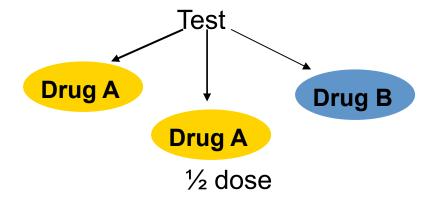
- empirical selection of drug



- Efficacy may vary widely
- Adverse effects are common & unpredictable

Future:

Genetically guided drug and dose selection



- Avoid adverse drug reactions
- Maximize drug efficacy
- Select responsive patients

PharmGKB Content & Activities



Mission

 Collect, encode and disseminate knowledge about the impact of human genetic variation on drug response

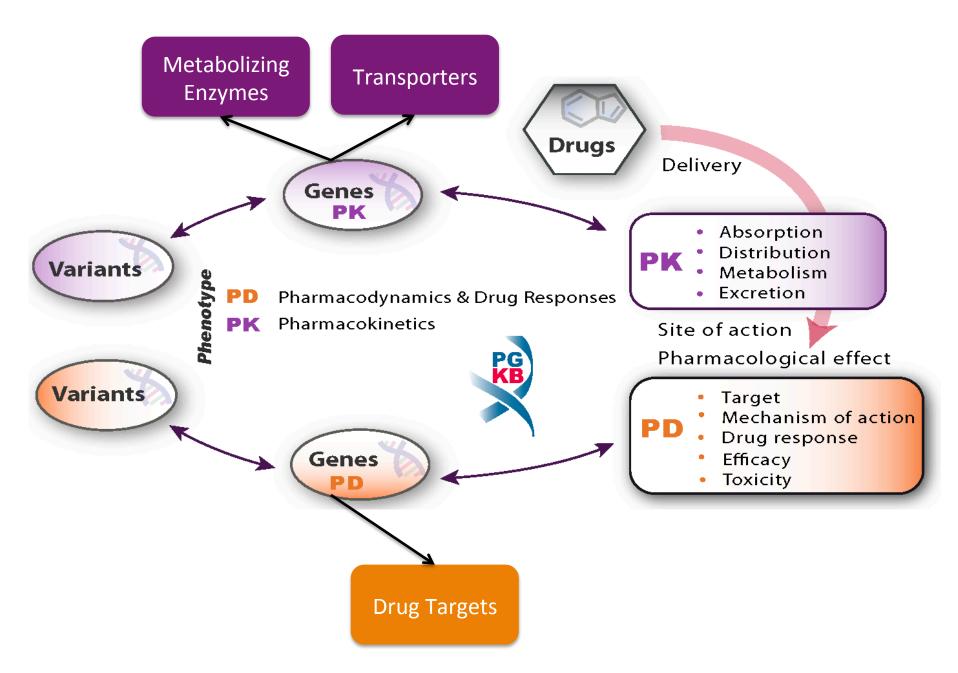
Research

- Manual curation of PGx literature
- Drug-centered pathways
- Important PGx gene summaries

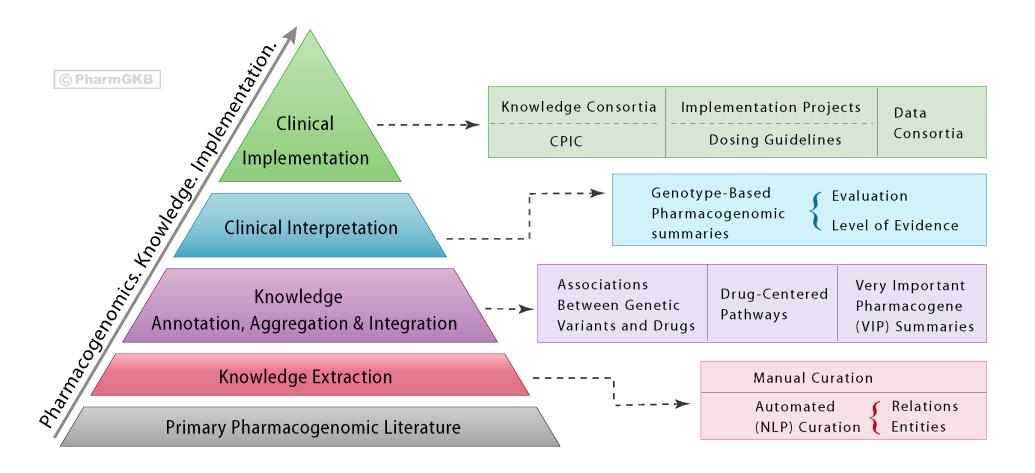
Implementation

- Clinical summaries of PGx variants
- Drug label annotations
- CPIC guidelines
- PGx data consortia (IWPC, ITPC, etc.)
- Genome annotations

Pharmacogenetics Information Flow



PharmGKB Knowledge Pyramid





Clinical

Implementation

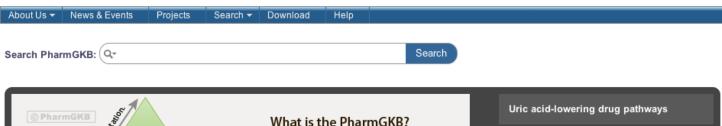
Clinical Interpretation

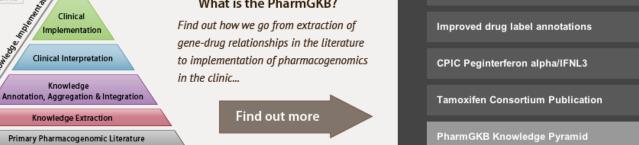
Knowledge

Knowledge Extraction

Pharmacogenomics. Knowledge. Implementation.

PharmGKB is a comprehensive resource that curates knowledge about the impact of genetic variation on drug response for clinicians and researchers.





Clinically-Relevant PGx

- Well-known PGx associations
- · Clinically relevant PGx summaries
- · PGx drug dosing guidelines
- · Drug labels with PGx info
- Genetic tests for PGx
- PGx gene haplotypes



PGx-Based Drug Dosing Guidelines

- IFNL3 (IL28B)/pegIntron and ribavirin: article A and supplement A
- · DPYD/capecitabine, 5FU and tegafur: article | and supplement | |
- · See all CPIC guidelines
- · CPIC gene-drug pairs of interest
- TPP gene tables



PGx Research

- VIP: Very Important PGx gene summaries
- · View PharmGKB pathways
 - Alphabetically
 - · By therapeutic category
- · Annotated SNPs by gene
- Drugs with genetic information

| find PGx Research | Q |
|--------------------------------------|---|
| hint: anter a gane reid drug disease | |

www.pharmgkb.org

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Get your PGx fix:







PharmGKB is a partner of the



Feedback

Citing PharmGKB

Acknowledgements

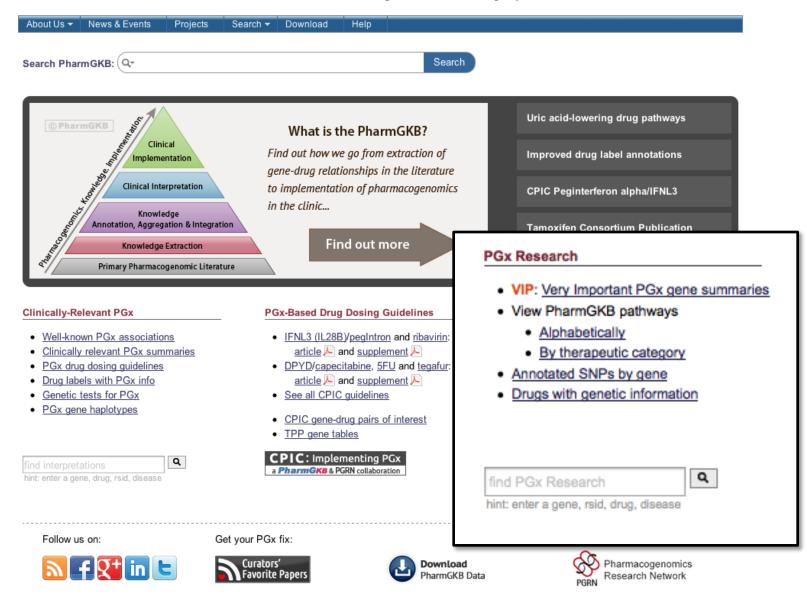
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Pharmacogenomics. Knowledge. Implementation.

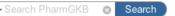
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Feedback Citing PharmGKB Acknowledgements

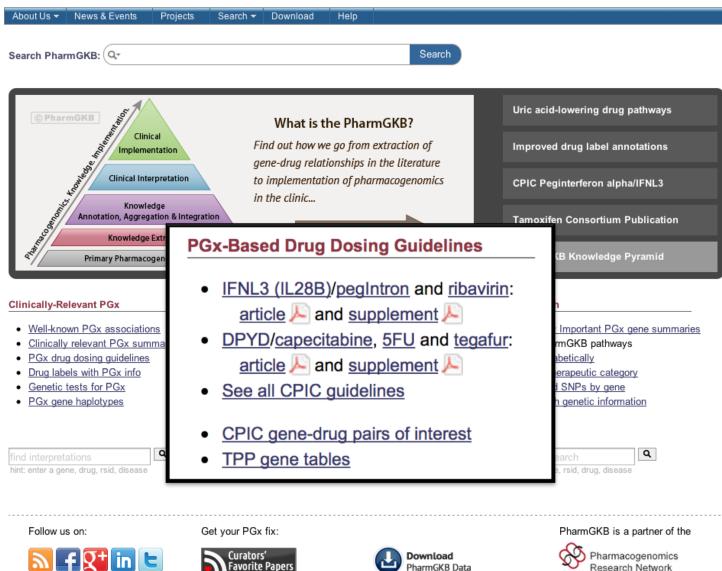
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Feedback

Citing PharmGKB

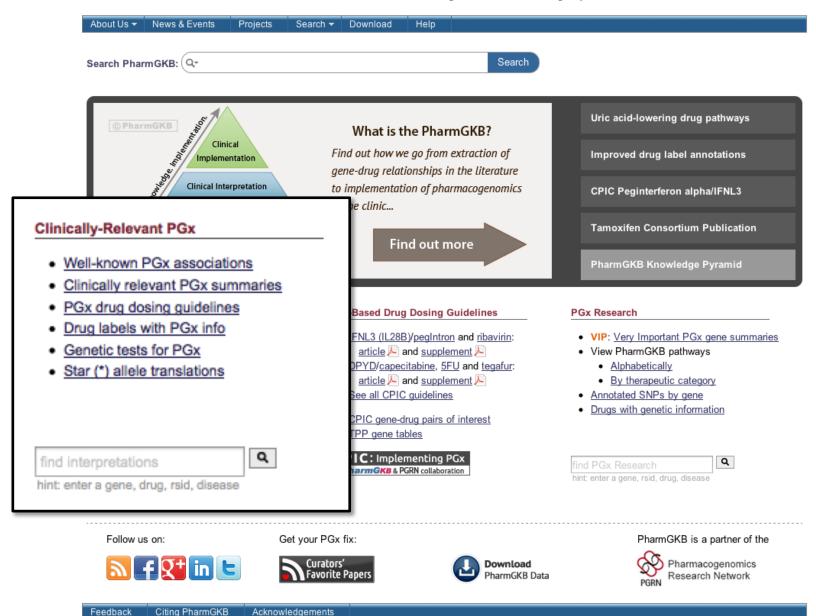




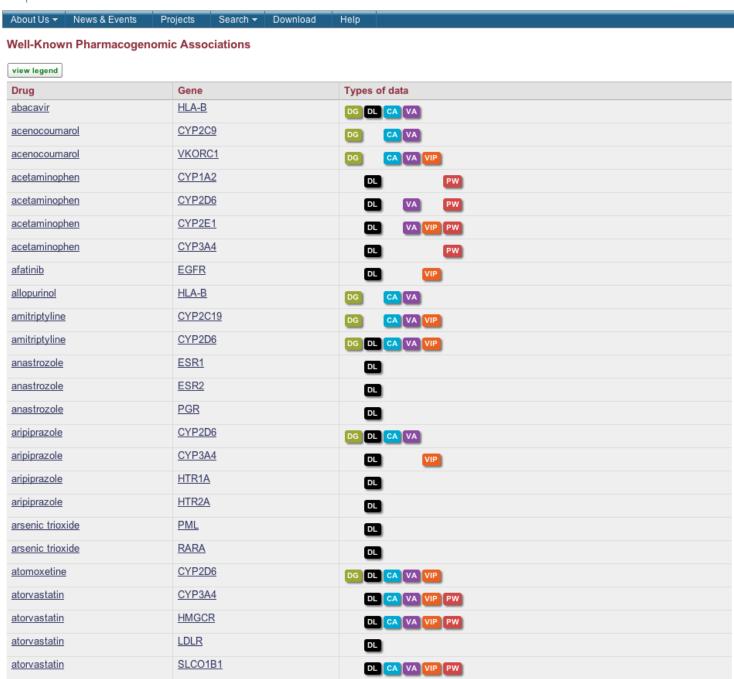


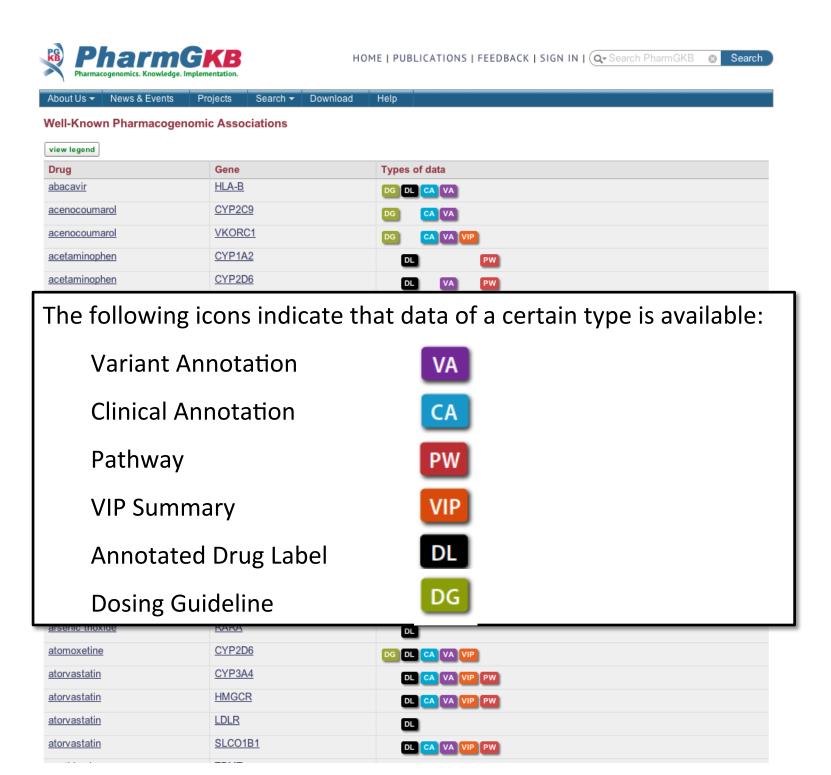
Pharmacogenomics. Knowledge. Implementation.

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warfarin

Clinical PGx PGx Research Overview Properties Pathways Is Related To Publications Downloads/LinkOuts

Dosing Guidelines (1) Drug Labels (1) Clinical Annotations (37) Genetic Tests (18)

CPIC Dosing Guideline for warfarin and CYP2C9, VKORC1

last updated 12/18/2013

Summary

The best way to estimate the anticipated stable dose of warfarin is to use the algorithms available on http://www.warfarindosing.org

Annotation

CPIC guideline authors are aware of several recently published studies on warfarin pharmacogenetics [Articles:24251361, 24251363, 24251360]. These papers have prompted several opinion pieces [Articles: 24328463, 24251364]. The authors are evaluating the information, which will be incorporated into the next update of the CPIC guideline on warfarin.

Look up your warfarin dosing guideline using the IWPC Pharmacogenetic Dosing Algorithm [8].

This dosing recommendation applies to adults only. Please see below for full details of these guidelines, with supporting evidence and disclaimers.

Guidelines regarding the use of pharmacogenomic tests in dosing for warfarin have been published in Clinical Pharmacology and Therapeutics by the Clinical Pharmacogenetics Implementation Consortium (CPIC).

Clinical Pharmacogenetics Implementation Consortium Guidelines for CYP2C9 and VKORC1 Genotypes and Warfarin Dosing. Julie A. Johnson, Li Gong, Michelle Whirl-Carrillo, Brian F. Gage, Stuart A. Scott, C., Michael Stein, Jeffrey L. Anderson, Stephen E. Kimmel, Ming Ta Michael Lee, Munir Pirmohamed, Mia Wadelius, Teri E. Klein, and Russ B. Altman. Clinical Pharmacology & Therapeutics (2011) Oct;90(4):625-629.

Download: article A and supplement A

Pharmacogenetic algorithm-based warfarin dosing

Excerpt from the warfarin dosing guidelines:

Numerous studies have derived warfarin dosing algorithms that use both genetic and non-genetic factors to predict warfarin dose [Articles:18305455, 19228618, 18574025]. Two algorithms perform well in estimating stable warfarin dose across different ethnic populations; [Articles:18305455, 19228618] these were created using more than 5,000 subjects. Dosing algorithms using genetics outperform nongenetic clinical algorithms and fixed-dose approaches in dose prediction [Articles: 18305455, 19228618].

The best way to estimate the anticipated stable dose of warfarin is to use the algorithms available on http://www.warfarindosing.org (offering both highperforming algorithms [Articles:18305455, 19228618]). The dosing algorithm published by the International Warfarin Pharmacogenetics Consortium is also online, at http://www.pharmgkb.org/do/serve?obild=PA162372936&objCls=Dataset#tabview=tab2. The two algorithms provide very similar dose recommendations.

Download: IWPC Pharmacogenetic Dosing Algorithm 3

Clinical PGx PGx Research Click for FI

Click for clinical annotations

nkOuts.

Dosing Guidelines (1) Drug Labels (1)

Clinical Annotations (37) Genetic Tests (18)

PharmGKB gathers information regarding PGx on FDA drug labels from the FDA's "Table of Pharmacogenomic Biomarkers in Drug Labels", and from FDAapproved FDA and EMA-approved (European Medicines Agency) EMA labels brought to our attention. Excerpts from the label and downloadable highlighted label PDFs are manually curated by PharmGKB.

Please note that some drugs may have been removed from or added to the FDA's "Table of Pharmacogenomic Biomarkers in Drug Labels" without our knowledge. We periodically check the table for additions to this table and update PharmGKB accordingly.

There is currently no such list for European drug labels - we are working with the EMA to establish a list of European Public Assessment Reports (EPAR)s that contain PGx information. We are constructing this list by initially searching for drugs for which we have PGx-containing FDA drug labels - of these 44 EMA EPARs were identified and are being curated for pgx information.

We welcome any information regarding drug labels containing PGx information approved by the FDA. EMA or other Medicine Agencies around the world please contact feedback.

view legend

FDA Label for warfarin and CYP2C9, VKORC1

last updated 10/25/2013

This label is on the FDA Biomarker List

Actionable PGx

Summarv

Warfarin (Coumadin) is an anticoagulant used as a prophylaxis and to treat venous thrombosis, pulmonary embolism, thromboembolic complications from atrial fibrillationa and cardiac valve replacement, and to reduce the recurrence of myocardial infarction. The FDA recommends genetic testing for CYP2C9 and VKORC1 variants prior to initiating treatment with warfarin.

Annotation

The VKORC1:G-1639A polymorphism is associated with lower dose requirements for warfarin in Caucasian and Asian patients. Increased bleeding risk and lower initial warfarin dose requirements have been associated with the CYP2C9*2 and CYP2C9*3 alleles. Approximately 30% of the variance in warfarin dose could be attributed to genetic variation in VKORC1, and about 40% of dose variance could be explained taking into consideration both VKORC1 and CYP2C9 genetic polymorphisms. Accounting for genetic variation in both VKORC1 and CYP2C9, age, height, body weight, interacting drugs, and indication for warfarin therapy explained about 55% of the variability in warfarin dose.

Excerpt from the warfarin drug label:

The patient's CYP2C9 and VKORC1 genotype information, when available, can assist in selection of the starting dose. Table 5 describes the range of stable maintenance doses observed in multiple patients having different combinations of CYP2C9 and VKORC1 gene variants. Consider these ranges in choosing the initial dose.

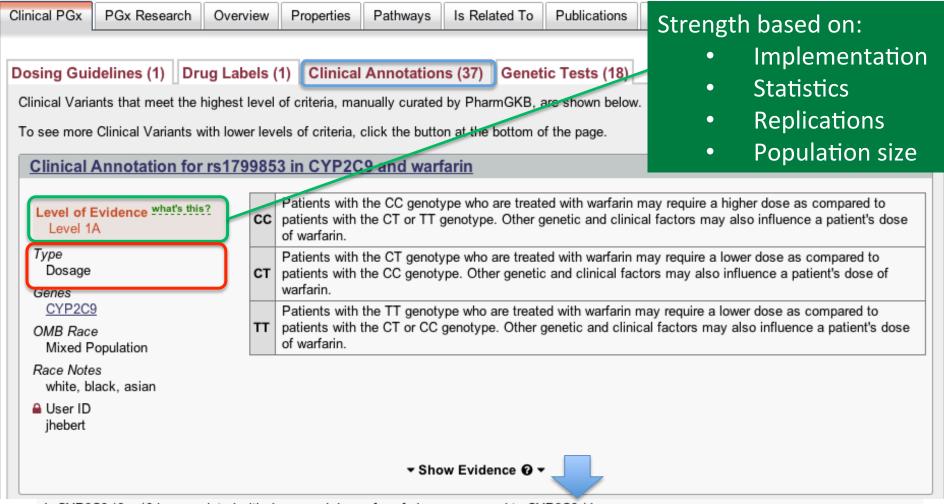
For the complete drug label text with sections containing pharmacogenetic information highlighted, see the warfarin drug label \(\mathcal{L} \). Pharmacogenomicsrelated dosing information is found in Table 5 on page 27.

*Disclaimer: The contents of this page have not been endorsed by the FDA and are the sole responsibility of PharmGKB.

Full label available at DailyMed

Drug/Small Molecule: warfarin

Clinical annotation is a summary of the clinical impact of a genomic variant on drug response phenotype.



1. CYP2C9 *2 + *3 is associated with decreased dose of warfarin as compared to CYP2C9 *1.

Patients carrying at least one copy of the CYP2C9 *2 or *3 alleles needed significantly lower doses of warfarin and also showed significantly greater variability in dose as compared to patients with the wildtype *1/*1 genotype.

% PMID:22990331 % Annotation Page

| Study Size | Frequency | Race | Population Characteristics | P-value | Ratio | Туре |
|------------|---------------------|-----------|----------------------------|---------|-------|-------------|
| 206 / | 0.129 *2 / 0.032 *3 | Brazilian | Drug: warfarin | < .03 | | prospective |

rs4149056 at 12:21331549 in SLCO1B1 (VIP)

Alleles (on + chromosomal strand) ?

T > C

Amino Acid Translation

Val174Ala

Variant annotation lists impact of a genomic variant on drug response phenotype based on individual publication

Alternate Names:

14091673T>C, 21331549T>C, 521T>C, 52422T>C, SLCO1B1*5, Val174Ala

C.

Haplotypes

Variant allele present in: SLCO1B1*5, SLCO1B1*15, SLCO1B1*17

| linical PGx PGx Research Overview VIP Is Related To Publications Downloads/LinkOuts |
|---|
| |

Variant Annotations

PharmGKB variant annotations provide information about variant-drug pairs or variant-disease pairs based on individual PubMed publications. Each annotation represents information from a single paper and the goal is to report the information that the author states, not an interpretation of the paper. The PMID for supporting PubMed publications is found in the "Evidence" field.

Information presented, including study size, allele frequencies and statistics is taken directly from the publication. However, if the author does not correct p-values in cases of multiple hypotheses, curators may apply a Bonferroni correction. Curators attempt to report study size based on the actual number of participants used for the calculation of the association statistics, so the number may vary slightly from what is reported in the abstract of the paper. OMB Race Category information is derived from the paper and mapped to standardized categories. Category definitions may be found by clicking on the "OMB Race Category" link.

Add filter: pick column \$

| PMID | Drug | Sentence | Significance | pValue | # of Cases | Race |
|-----------------|--------------------------|---|--------------|--------|------------|------|
| <u>21878834</u> | mycophenolate mofetil | Allele T is not associated with increased incidence of diarrhea when treated with mycophenolate mofetil in people with Kidney Transplantation as compared to allele C. | no | 0.654 | 338 | |
| <u>21878834</u> | mycophenolate mofetil | Allele T is not associated with increased risk of developing leukopenia when treated with mycophenolate mofetil in people with Kidney Transplantation as compared to allele | no | 0.395 | 338 | |

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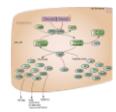
DRUG/SMALL MOLECULE:

warfarin

Clinical PGx PGx Research Overview Properties Pathways Is Related To Publications Downloads/LinkOuts

PharmGKB Curated Pathways

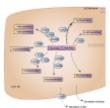
Pathways created internally by PharmGKB based primarily on literature evidence.



1. Warfarin Pathway, Pharmacodynamics

Simplified diagram of the target of warfarin action and downstream genes and effects.

Click for pathway (PK, PD)



2. Warfarin Pathway, Pharmacokinetics

Representation of the candidate genes involved in transport, metabolism and clearance of warfarin.

External Pathways

Links to non-PharmGKB pathways.

PharmGKB contains no links to external pathways for this drug. To report a pathway, click here.

Browse Pathways by Therapeutic Categories

Table of Contents

- · Anti-infective agents
- Anticancer agents
- · Cardiovascular and hematology agents
- Endocrine and Metabolic Disease agents
- Gastrointestinal agents
- Musculoskeletal agents
- Neurological agents
- · Pain, anti-inflammatory and immunomodulating agents
- Physiological mechanisms
- · Respiratory agents

Browse alphabetically.

126 PK and PD pathways

Anti-infective agents (7)

- Abacavir Pathway, Pharmacokinetics/Pharmacodynamics
- Amodiaguine Pathway, Pharmacokinetics
- · Artemisinin and Derivatives Pathway, Pharmacokinetics
- Lamivudine Pathway, Pharmacokinetics/Pharmacodynamics
- · Nevirapine Pathway, Pharmacokinetics
- Tenofovir/Adefovir Pathway, Pharmacokinetics
- Zidovudine Pathway, Pharmacokinetics/Pharmacodynamics Publication

Anticancer agents (33)

- Antimetabolite Pathway Folate Cycle, Pharmacodynamics
- Aromatase Inhibitor Pathway (Breast Cell), Pharmacodynamics
- Aromatase Inhibitor Pathway (Multiple Tissues), Pharmacodynamics
- · Busulfan Pathway, Pharmacodynamics
- · Cyclophosphamide Pathway, Pharmacodynamics
- · Cyclophosphamide Pathway, Pharmacokinetics
- Doxorubicin Pathway (Cancer Cell), Pharmacodynamics Publication
- Doxorubicin Pathway (Cardiomyocyte Cell), Pharmacodynamics Publication
- Doxorubicin Pathway, Pharmacokinetics Publication
- · EGFR Inhibitor Pathway, Pharmacodynamics
- · Erlotinib Pathway, Pharmacokinetics
- Etoposide Pathway, Pharmacokinetics/Pharmacodynamics Publication
- Fluoropyrimidine Pathway, Pharmacodynamics Publiqued
- Fluoropyrimidine Pathway, Pharmacokinetics Publiqued
- · Gefitinib Pathway, Pharmacokinetics

GENE:

CYP2C19

cytochrome P450, family 2, subfamily C, polypeptide 19



Introduction

The cytochrome P450, family 2, subfamily C, polypeptide 19 (CYP2C19) gene is located within a cluster of cytochrome P450 genes (Centromere-CYP2C18-CYP2C9-CYP2C9-CYP2C8-Telomere) on chromosome 10q23.33. The CYP2C19 enzyme contributes to the metabolism of a large number of clinically relevant drugs and drug classes such as antidepressants [Article:15199661], benzodiazepines [Article:8148870], mephenytoin [Article:8195181], proton pump inhibitors (PPIs) [Article:15258107], and the antiplatelet prodrug clopidogrel [Article:16772608]. Like other CYP450 genes, inherited genetic variation in CYP2C19 and its variable hepatic expression contributes to interindividual phenotypic variability in CYP2C19-substrate metabolism. The CYP2C19 "poor metabolism" phenotype was initially discovered by studies on impaired mephenytoin metabolism and the major molecular defect responsible for the trait is the CYP2C19*2 (c.681G>A; rs4244285) loss-of-function allele [Article:8195181]. CYP2C19 genotype has since been shown to affect the metabolism of several drugs and clinical CYP2C19 genetic testing is currently available [Article:21716271, 21412232].

Expression

CYP2C19 is predominantly expressed in the liver and, to a lesser extent, in the small intestine [Article:10487415]. Constitutive expression of CYP2C19 is largely mediated by hepatic nuclear factors 4 alpha (HNF4alpha, HNF4A) and 3 gamma (HNF3gamma, FOXA3) [Article:17827783, 17576804, 15130783], and transcriptional activation is mediated by the drug responsive nuclear receptors CAR (NR1I3), PXR (NR1I2), and GRalpha (NR3C1) [Article:12869636, 11181490], suggesting regulation by endogenous hormones and by drugs such as rifampicin [Article:2223426, 20086032]. In addition to rifampicin, human CYP2C19 can be induced by ritonavir, nelfinavir, hyperforin, St. John's wort, dexamethasone, and artemisinin [Article:19702536]. In vitro expression studies have recently shown that the GATA-4 (GATA4) transcription factor also upregulates CYP2C19 transcriptional activity by binding to two predicted GATA-specific promoter elements [Article:20206639]. Reduced CYP2C19 activity among women using steroid oral contraceptives results from transcriptional down-regulation of CYP2C19 expression through binding of ligand-activated estrogen receptor alpha to a specific ERE consensus half-site in the CYP2C19 promoter [Article:20675569].

Certain selective serotonin reuptake inhibitors (SSRIs; e.g., fluoxetine, fluvoxamine) [Article: 18691982, 8880055] and PPIs (e.g. omeprazole, and lansoprazole) [Article: 11309556, 9433390, 9224780] have an inhibitory effect on CYP2C19, which may cause drug-drug interactions with co-administered CYP2C19-metabolized drugs. For example, early studies suggested that omeprazole (a common PPI) diminished the pharmacodynamic antiplatelet effects of clopidogrel and increased corresponding cardiovascular risks [Article: 19258584, 18206732]. However, it is currently not clear if identified changes in ex vivo platelet aggregation due to concomitant omeprazole and clopidogrel administration translates into clinically meaningful outcome differences (for review see [Article: 21126648]).

Clinical CYP2C19 Pharmacogenetic Testing

Although a number of genotyping technologies can be used to interrogate variant CYP2C19 alleles in Clinical Laboratory Improvement Amendments (CLIA)-approved laboratories, two genotyping platforms have been approved by the U.S. Food and Drug Administration (FDA) at the time of this writing: the AmpliChip,Å® CYP450 Test (Roche Molecular Systems, Inc., Pleasanton, CA) that interrogates CYP2C19*2 and *3 (plus CYP2D6 variant alleles) and the Infiniti,Å® CYP2C19 Assay (AutoGenomics, Inc., Vista, CA) that interrogates CYP2C19*2, *3, and *17. For test interpretation and clopidogrel dosing suggestions, see the Clinical Pharmacogenetics Implementation Consortium (CPIC) guidelines for CYP2C19 genotype and clopidogrel therapy [Article:21716271]. Additionally, a recent clinical pharmacogenetics practice review provides dosing guidelines for clopidogrel and other CYP2C19-metabolized drugs [Article:21412232] and CYP2C19/CYP2D6 genotype-based antidepressant dosing recommendations have been previously reported [Article:11531654].

Citation

PharmGKB summary: very important pharmacogene information for cytochrome P450, family 2, subfamily C, polypeptide 19.

Pharmacogenetics and genomics. 2011. Scott Stuart A, Sangkuhl Katrin, Shuldiner Alan R, Hulot Jean-Sébastien, Thorn
Caroline F, Altman Russ B, Klein Teri E. Publicad

Browse VIP Genes

The following icons indicate that data of a certain type is available:

DC Dosing Guideline information is available
Drug Label information is available
CA High-level Clinical Annotation is available
VA Variant Annotation is available
VIF VIP information is available
PW Pathway is available

[close]

Result: 50

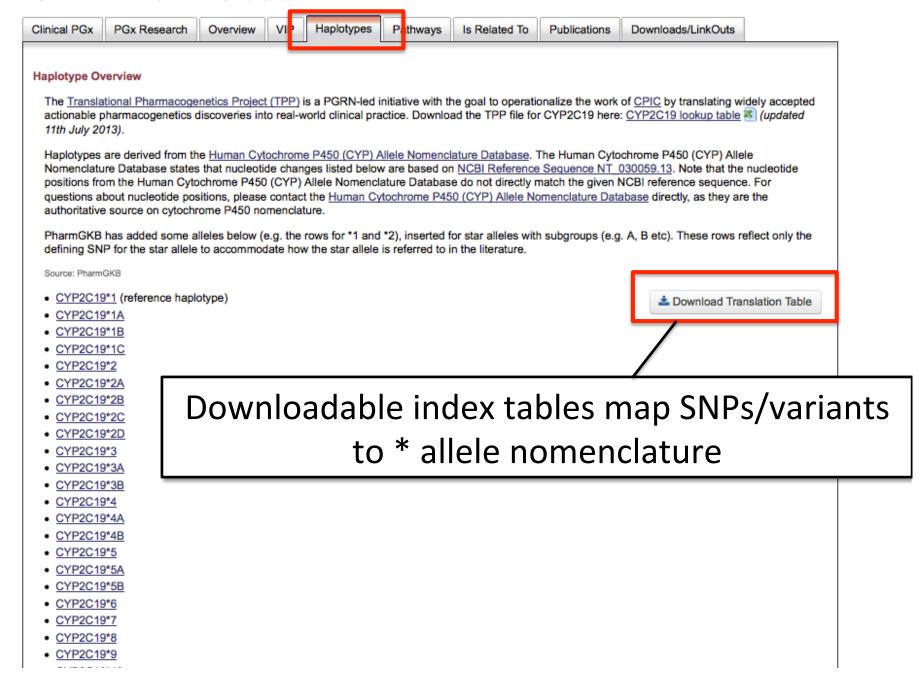


| VAVIP | ABCB1 PGx Summary | Result: 50 |
|-----------------|--|------------|
| VAVIF | ATP-binding cassette, sub-family B (MDR/TAP), member 1 ACE PGx Summary angiotensin I converting enzyme (peptidyl-dipeptidase A) 1 | EO VID |
| VAVIP | ADH1A PGx Summary alcohol dehydrogenase 1A (class I), alpha polypeptide | 50 VIP |
| VAVIP | ADH1B PGx Summary alcohol dehydrogenase 1B (class I), beta polypeptide | |
| VAVIP | ADH1C PGx Summary alcohol dehydrogenase 1C (class I), gamma polypeptide | |
| VAVIP | ADRB1 PGx Summary adrenoceptor beta 1 | |
| DL VA VIF | ADRB2 PGx Summary adrenoceptor beta 2, surface | |
| VAVIP | AHR PGx Summary aryl hydrocarbon receptor | |
| VAVIP | ALDH1A1 PGx Summary aldehyde dehydrogenase 1 family, member A1 | |
| VAVIP | ALOX5 PGx Summary arachidonate 5-lipoxygenase | |
| VIP | BRCA1 PGx Summary breast cancer 1, early onset | |
| VAVIP | COMT PGx Summary catechol-O-methyltransferase | |
| DL VA VIF | CYP1A2 PGx Summary cytochrome P450, family 1, subfamily A, polypeptide 2 | |
| VAVIF | CYP2A6 PGx Summary cytochrome P450, family 2, subfamily A, polypeptide 6 | |
| VAVIP | CYP2B6 PGx Summary cytochrome P450, family 2, subfamily B, polypeptide 6 | |
| DG DL CA VA VIP | CYP2C19 PGx Summary cytochrome P450, family 2, subfamily C, polypeptide 19 | |
| VAVIP | CYP2C8 PGx Summary cytochrome P450, family 2, subfamily C, polypeptide 8 | |
| DG DL CA VA VIP | CYP2C9 PGx Summary cytochrome P450, family 2, subfamily C, polypeptide 9 | |

GENE:

CYP2C19

cytochrome P450, family 2, subfamily C, polypeptide 19



Additional Resources in PGx

Genes and variants:

- NCBI dbSNP (http://www.ncbi.nlm.nih.gov/projects/SNP/)
- Entrez GENE (http://www.ncbi.nlm.nih.gov/sites/entrez)
- UCSC genome browser (http://genome.ucsc.edu/cgi-bin/hgGateway)
- CYP allele nomenclature committee (http://www.cypalleles.ki.se/)
- HuGE Navigator (http://hugenavigator.org/)

Drugs:

- DrugBank (http://www.drugbank.ca/)
- NCBI PubChem (http://pubchem.ncbi.nlm.nih.gov/)
- KEGG (http://www.genome.jp/kegg/ligand.html)
- Drug interaction table (http://www.medicine.iupui.edu/flockhart/table.htm)

Pharmacogenomics Biomarkers for approved drugs at FDA

 http://www.fda.gov/Drugs/ScienceResearch/ResearchAreas/Pharmacogenetics/ ucm083378.htm

Summary: PharmGKB and resources for PGx

- PGx variation in genetics impacts drug response
- Drug efficacy and safety can be improved via genome-informed drug use
- Non-genetic factors (environment, life style) are also important
- PharmGKB curates knowledge about the impact of human genetic variation on drug response and its clinical implementation
- Long term goal: genome-informed drug use that increases efficacy and decreases side effects

Overview:



PGx Knowledge | Implementation | Impact



1. PharmGKB and resources for PGx

2. Clinical PGx Implementation (Moving from PharmGKB to the Clinic)

3. Does PGx truly have a role in personalized medicine?

Moving from PharmGKB to the Clinic

- Clinical applications of the pharmacogenomics data and knowledge in the PharmGKB include:
 - Data-centric Consortia (PharmGKB-PGRN initiated)
 - Knowledge-centric Consortia
 - Practical guidelines for pharmacogenomics in the clinic

Clinical Annotation of Human Genomes

Data-centric Consortia

PharmGKB is a broker of pharmacogenomic data for data sharing consortia

- International Warfarin Pharmacogenetics Consortium (IWPC) and the International Warfarin Pharmacogenetics Consortium - Genome Wide Association Studies (IWPC-GWAS)
 - devoted to pooling genotype and phenotype data relevant to the anticoagulant warfarin
- International Tamoxifen Pharmacogenomics Consortium (ITPC)
 - gather genetic and clinical data on the efficacy and toxicity of tamoxifen from around the world to test for specific associations between genetic variants and clinical effects

- International SSRI Pharmacogenomics Consortium (ISPC)
 - Discover new genetic variants that are important for predicting response of depression to SSRIs using genome wide association studies (GWAS)
- International Clopidogrel Pharmacogenomics Consortium (ICPC)
 - Discover additional common and rare gene variants associated with clopidogrel response through GWAS and other genomewide approaches
- International Consortium for Antihypertensives
 Pharmacogenomics Studies (ICAPs)
 - Advance the pharmacogenomics of antihypertensive drugs by facilitating collaboration between research groups, and by amassing large samples sizes for GWAS meta-analyses

Success of the IWPC & ITPC

The NEW ENGLAND JOURNAL of MEDICINE

ESTABLISHED IN 1812

FEBRUARY 19, 2009

Estimation of the Warfarin Dose with Clinical and Pharmacogenetic Data

The International Warfarin Pharmacogenetics Consortium*

THROMBOSIS AND HEMOSTASIS

Warfarin pharmacogenetics: a single **VKORC1** polymorphism is predictive of dose across 3 racial groups

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(M) Genetic variants associated with warfarin dose in African-American individuals: a genome-wide association study

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Lancet 2013; 382: 790-96 Background VKORC1 and CYP2C9 are important contributors to warfarin dose variability, but explain less variability Published Online for individuals of African descent than for those of European or Asian descent. We aimed to identify additional June 5, 2013 variants contributing to warfarin dose requirements in African Americans.

> Clinical Pharmacology & Therapeutics advance online publication 18 December 2013; doi: 10.1038/clpt.2013.186

CYP2D6 Genotype and Adjuvant Tamoxifen: Meta-Analysis of Heterogeneous Study Populations **OPEN**

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Pharmacogenomics Consortium
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Knowledge-centric Consortia: Moving To The Clinic

Create, curate, review, and update written summaries and recommendations for implementing specific pharmacogenomic tests

- Clinical Pharmacogenetics Implementation Consortium (CPIC)
 - Use well-defined evidence criteria and evaluation
 - Published on the PharmGKB website

CPIC: Implementing PGx a PharmGKB & PGRN collaboration

CPIC: Clinical Pharmacogenetics Implementation Consortium of the Pharmacogenomics Research Network

MV Relling1 and TE Klein2

The slow rate at which pharmacogenetic tests are being adopted in clinical practice is partly due to the lack of specific guidelines on how to adjust medications on the basis of the genetic test results. One of the goals of the Clinical Pharmacogenetics Implementation Consortium (CPIC) of the National Institutes of Health's Pharmacogenomics Research Network (http://www.pgrn.org) and the Pharmacogenomics Knowledge Base (PharmGKB, http://www.pharmgkb.org) is to provide peer-reviewed, updated, evidence-based, freely accessible guidelines for gene/drug pairs. These guidelines will facilitate the translation of pharmacogenomic knowledge from bench to bedside.

RATIONALE FOR FORMING THE CPIC

Although there has been substantial by pe over the potential of genetic testing to improve medication use, the relatively low untake of pharmacogenetics into clinical practice provides value.

fact that little of such testing is done preemptively and therefore the results are not available when the prescribing decision is made. Some of these barriers will persist for many years to come.

One barrier to clinical implementation of pharmacogenetics that is addressable⁵ is the lack of clear, curated, peer-reviewed guidelines that translate laboratory test results into actionable prescribing decisions for specific drugs. It is the goal of the CPIC (http://www.pharmgkb.org/views/project.jsp?pId=74) to provide such guidelines, the first of which is published in this same issue. The guidelines will center on genes (e.g., thiopurine methyltransferase (TPMT) and its implications for thiopurines) and drugs (e.g., warfarin and all the major genes that influence its action).

The CPIC, which was established in 2009, consists of Pharmacogenomics Research Network members, PharmGKB staff, and experts in pharmacogenetics, pharmacogenomics, and laboratory medicine. The consortium was created to address the need for very specific midance to clinicians and laboratories

Clinical Pharmacogenomics Implementation Consortium (CPIC)

- Established by the Pharmacogenomics Research Network and PharmGKB
- GOAL: Address some of the barriers to implementation of PGx tests in clinical practice
- HOW available genetic test results should be used to optimize drug therapy, not WHETHER tests should be ordered
- Guidelines peer-reviewed and published in Clinical Pharmacology and Therapeutics
 - simultaneous posting on PharmGKB

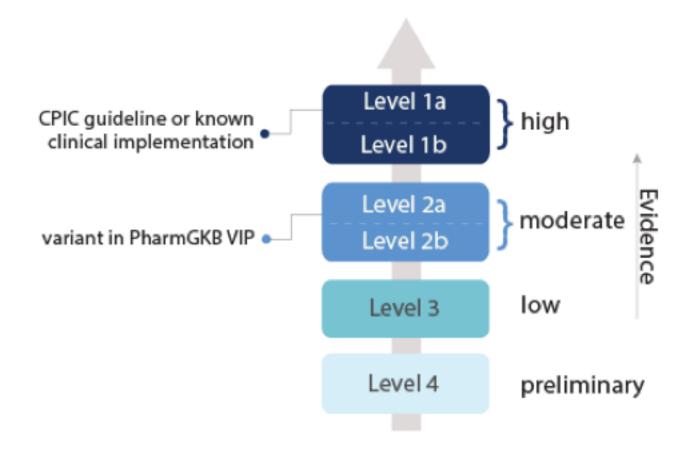
Heart of the CPIC Guideline

- There must be a diplotype that is so "high risk" for the gene that if you knew the patient had that diplotype, you would take it into account in
 - choosing which drug or
 - choosing a dose
- If there are no recommendations that you are willing to make based on at least one high-risk diplotype, then it is probably not worth writing the CPIC guideline
- A knowledgeable clinician needs to buy into at least ONE recommendation

Clinical Pharmacogenomics Implementation Consortium (CPIC)

- Thiopurines/TPMT
- Warfarin/CYP2C9 & VKORC1
- Codeine/CYP2D6
- Clopidogrel/CYP2C19
- Carbamazepine/HLA-B*1502
- Abacavir/HLA-B*5701
- Allopurinol/HLA-B*1501
- Simvastatin/SLCO1B1
- Tricyclic Acids/CYP2D6/CYP2C19
- Capecitabine & Fluorouracil/DPYD
- PegIntron/ILFN3 (IL28B)
- others in the pipeline

Clinical Annotations Level of Evidence





Grading Supporting Evidence

- High: Evidence includes consistent results from welldesigned, well-conducted studies.
- Moderate: Evidence is sufficient to determine effects, but the strength of the evidence is limited by the number, quality, or consistency of the individual studies; generalizability to routine practice; or indirect nature of the evidence.
- Weak: Evidence is insufficient to assess the effects on health outcomes because of limited number or power of studies, important flaws in their design or conduct, gaps in the chain of evidence, or lack of information. Valdes, R., Payne, D.A. & Linder, M.W. Laboratory analysis and application of pharmacogenetics to clinical practice. (Washington, DC, NACB, 2010).

Grading Supporting Evidence

- High: Evidence includes consistent results from welldesigned, well-conducted studies.
- Moderate: Evidence is sufficient to determine effects, but the strength of the evidence is limited by

Note: randomized, controlled trials comparing outcomes with genotype-guided dosing vs not will ind be RARE

 Weak: Evidence is insufficient to assess the effects on health outcomes because of limited number or power of studies, important flaws in their design or conduct, gaps in the chain of evidence, or lack of information. Valdes, R., Payne, D.A. & Linder, M.W. Laboratory analysis and application of pharmacogenetics to clinical practice. (Washington, DC, NACB, 2010).

FDA Drug Labeling for Azathioprine

TPMT Testing

The most common non-functional alleles associated with reduced levels of TPMT activity are TPMT*3A and TPMT*3C. Patients with two non-functional alleles (homozygous) have low or absent TPMT activity and those with one non-functional allele (heterozygous) have intermediate activity. Accurate phenotyping (red blood cell TPMT activity) results are not possible in patients who have received recent blood transfusions. TPMT testing may also be considered in patients with abnormal CBC results that do not respond to dose reduction. Early drug discontinuation in these patients is advisable. TPMT TESTING CANNOT SUBSTITUTE FOR COMPLETE BLOOD COUNT (CBC) MONITORING IN PATIENTS RECEIVING AZATHIOPRINE TABLETS (see CLINICAL PHARMACOLOGY, WARNINGS, ADVERSE REACTIONS and DOSAGE AND ADMINISTRATION sections).

DOSAGE AND ADMINISTRATION

TPMT TESTING CANNOT SUBSTITUTE FOR COMPLETE BLOOD COUNT (CBC) MONITORING IN PATIENTS RECEIVE'S AZATHIOPRINE TABLETS. TPMT genotyping or phenotyping can be used to identify patients with absent or reduced TPMT activity. Patients with low or absent TPMT activity are at an increased risk of developing severe, life-threatening suvelotoxicity from azathioprine tablets if conventional doses are given. Physicians may consider alternative therapies for patients who have low or absent TPMT activity (homozygous for non-functional alleles). Azathioprine tablets should be administered with caution to patients having one non-functional allele (heterozygous) who are at risk for reduced TPMT activity that may lead to toxicity if conventional doses are given. Dosage reduction is recommended in patients with reduced TPMT activity. Early drug discontinuation may be considered in patients with abnormal CBC results that do not respond to dose reduction.

CPIC Guidelines for Azathioprine

| Examples | | Dosing | Classification | | |
|---|---|--|----------------|--|--|
| of TPMT | Phenotype | recommendations | of recommen- | | |
| Diplotypes | | for azathioprine | dation | | |
| *1/*1 | Homozygous wild-type or normal, high activity | Start with normal starting dose (e.g., 2–3 mg/kg/d) and adjust doses of azathioprine based on disease-specific guidelines. Allow 2 weeks to reach steady state after each dose adjustment. | Strong | | |
| *1/*2, *1/*3A, *1/*3B, *1/*3C, *1/*4 | Heterozygote or intermediate activity | If disease treatment normally starts at the "dose", consider starting at 30–70% of target dose (e.g., 1–1.5 mg/kg/d), and titrate based on tolerance. Allow 2–4 weeks to reach steady state after each dose adjustment. | Strong | | |
| *3A/*3A, *2/*3A, *3C/*3A, *3C/*4, *3C/*2, *3A/*4 | Homozygous variant, mutant, low, or deficient activity | Consider alternative agents. If using azathioprine start with drastically reduced doses (reduce daily dose by 10-fold and dose thrice weekly instead of daily) and adjust doses of azathioprine based on degree of myelosuppression and disease-specific guidelines. Allow 4–6 weeks to reach steady state after each dose adjustment. Azathioprine is the likely cause of myelosuppression. | Strong | | |

Clinical Annotation of Human Genomes

Prediction of genetic risk of variants associated with recognized drug responses and for novel variants

Clinical assessment incorporating a personal genome



Euan A Ashley, Atul J Butte, Matthew T Wheeler, Rong Chen, Teri E Klein, Frederick E Dewey, Joel T Dudley, Kelly E Ormond, Aleksandra Pavlovic, Alexander A Morgan, Dmitry Pushkarev, Norma F Neff, Louanne Hudgins, Li Gong, Laura M Hodges, Dorit S Berlin, Caroline F Thorn, Katrin Sangkuhl, Joan M Hebert, Mark Woon, Hersh Sagreiya, Ryan Whaley, Joshua W Knowles, Michael F Chou, Joseph V Thakuria, Abraham M Rosenbaum, Alexander Wait Zaranek, George M Church, Henry T Greely, Stephen R Quake, Russ B Altman

Summary

Background The cost of genomic information has fallen steeply, but the clinical translation of genetic risk estimates remains unclear. We aimed to undertake an integrated analysis of a complete human genome in a clinical context.

Lancet 2010; 375: 1525-35 See Comment page 1497

Challenges in the clinical application of whole-genome sequencing



Kelly E Ormond, Matthew T Wheeler, Louanne Hudgins, Teri E Klein, Atul J Butte, Russ B Altman, Euan A Ashley, Henry T Greely

As the cost of sequencing the human genome falls, medical use of whole-genome sequencing will rapidly advance. In this Viewpoint, we consider the opportunities

or more serious diseases. For example, a patient could learn that he or she has a genetic predisposition for sudden cardiac death. Such risks could be suspected

Lancet 2010; 375: 1749-51 Published Online April 30, 2010

PharmGKB Annotation Method

- Evaluated 2500 SNP annotations for direct drug relevance to "patient 0"
- Evaluated CNVs in known important genes (VIP, PK, PD)
- Evaluated novel SNPs in known important genes (VIP, PK, PD)

| rier organic anion transporter family, member 181 ne P450, family 2, subfamily C, polypeptide 19 epoxide reductase complex, subunit 1 ne P450, family 4, subfamily F, polypeptide 2 rgic receptor rier organic anion transporter family, member 181 a reductase | rs4149056 rs4244285 rs9923231 rs2108622 rs1801252 rs11045819 | T/T A/G C/T C/C A/A A/C | HMG-CoA reductase inhibitors (statins) Clopidogrel and CYP2C19 substrates Warfarin Warfarin Atenolol, metoprolol Fluvastatin | No increased risk of myopathy CYP2C19 poor metaboliser; many drugs might need adjustment Reduced dose needed Reduced dose needed Might be preferable to calcium-channel blockers Good response | High ³⁵ High ³⁶ High ³⁷ High ³⁸ High ³⁸ | | | | |
|---|--|--|--|---|--|--|--|--|--|
| epoxide reductase complex, subunit 1 ne P450, family 4, subfamily F, polypeptide 2 rgic receptor rier organic anion transporter family, member 181 | rs9923231 rs2108622 rs1801252 rs11045819 | C/T C/C A/A | CYP2C19 substrates Warfarin Warfarin Atenolol, metoprolol | need adjustment Reduced dose needed Reduced dose needed Might be preferable to calcium-channel blockers | High ³⁶ High ³⁷ High ^{38,39} | | | | |
| ne P450, family 4, subfamily F, polypeptide 2 rgic receptor rier organic anion transporter family, member 181 | rs2108622 rs1801252 rs11045819 | C/C A/A | Warfarin Atenolol, metoprolol | Reduced dose needed Might be preferable to calcium-channel blockers | High ³⁷ High ^{38,39} | | | | |
| rgic receptor rier organic anion transporter family, member 181 | rs1801252 rs11045819 | A/A | Atenolol, metoprolol | Might be preferable to calcium-channel blockers | High ^{38,39} | | | | |
| rier organic anion transporter family, member 1B1 | rs11045819 | | | 5 | - | | | | |
| | | A/C | Fluvastatin | Good response | Manufit and Co. | | | | |
| reductase | 17220540 | | | GOOG (CSPOTISC | Medium [®] | | | | |
| | rs17238540 | T/T | Pravastatin | Patient might have good response | Medium | | | | |
| reductase | rs17244841 | A/A | Pravastatin, simvastatin | No reduced efficacy | Medium | | | | |
| rgic receptor, surface | rs1042713 | A/G | β blockers | Other treatment options might be preferable | Medium⁴¹ | | | | |
| rgic receptor, surface | rs1042714 | C/C | β blockers | Other treatment options might be preferable | Medium ^{41,42} | | | | |
| ne P450, family 2, subfamily D, polypeptide 6 | rs3892097 rs1800716 | C/C | Metoprolol and other CYP2D6 substrates | Normal CYP2D6 metaboliser | Medium ⁴³ | | | | |
| pendent kinase inhibitor 2A/2B | rs10811661 | T/T | Metformin | Reduced likelihood of response | Medium ⁴⁴ | | | | |
| pendent kinase inhibitor 2A/2B | rs10811661 | T/T | Troglitazone | Reduced likelihood of response | Medium44 | | | | |
| CDKN2A/B Cyclin-dependent kinase inhibitor 2A/2B rs10811661 T/T Troglitazone Reduced likelihood of response Medium ⁶⁴ SNP=single nucleotide polymorphism. HMG-CoA=3-hydroxy-3-methylglutaryl-coenzyme A. | | | | | | | | | |
| | endent kinase inhibitor 2A/2B endent kinase inhibitor 2A/2B morphism. HMG-CoA=3-hydroxy-3-methylglutaryl-c | rs1800716 endent kinase inhibitor 2A/2B rs10811661 endent kinase inhibitor 2A/2B rs10811661 morphism. HMG-CoA=3-hydroxy-3-methylglutaryl-coenzyme A. | rs1800716 endent kinase inhibitor 2A/2B rs10811661 T/T endent kinase inhibitor 2A/2B rs10811661 T/T morphism. HMG-CoA=3-hydroxy-3-methylglutaryl-coenzyme A. | rs1800716 CYP2D6 substrates endent kinase inhibitor 2A/2B rs10811661 T/T Metformin endent kinase inhibitor 2A/2B rs10811661 T/T Troglitazone morphism. HMG-CoA=3-hydroxy-3-methylglutaryl-coenzyme A. | rs1800716 CYP2D6 substrates endent kinase inhibitor 2A/2B rs10811661 T/T Metformin Reduced likelihood of response endent kinase inhibitor 2A/2B rs10811661 T/T Troglitazone Reduced likelihood of response | | | | |

| | Gene name | SNP location | Patient genotype | Drug(s) affected | Effect type | Coding change | | | | |
|--------------|---|-------------------|---------------------|---|-----------------|---------------|--|--|--|--|
| NOD2 | Nucleotide-binding oligomerisation domain containing 2 | 16:49303700 | A/G | Infliximab | Pharmacodynamic | V793M | | | | |
| NOD2 | Nucleotide-binding oligomerisation domain containing 2 | 16:49302615 | C/T | Infliximab | Pharmacodynamic | S431L | | | | |
| SLC15A1 | Solute carrier family 15 (oligopeptide transporter), member 1 | 13:98176691 | C/T | Atorvastatin, fluvastatin, HMG-CoA reductase inhibitors, lovastatin, pravastatin, rosuvastatin, simvastatin | Pharmacokinetic | Y21C | | | | |
| HLA-DRB5 | MHC class II, DR beta 5 | 6:32593811 | T/T | Clozapine | Pharmacodynamic | T262K | | | | |
| MICA | MHC class I polypeptide-related sequence A | 6:31484467 | C/T | Mercaptopurine, methotrexate | Pharmacodynamic | I14T | | | | |
| SLC22A8 | Solute carrier family 22 (organic anion transporter), member 8 | 11:62517376 | С/Т | Cimetidine, estrone, anti-inflammatory and antirheumatic products, non- steroids, ibuprofen, indometacin, ketoprofen, methotrexate, phenylbutazone, piroxicam, probenecid, atorvastatin, fluvastatin, HMG-CoA reductase inhibitors, lovastatin, pravastatin, rosuvastatin, simvastatin, adefovir dipivoxil, tenofovir, antineoplastic agents, cyanocobalamin, folic acid, folinic acid, pyridoxine | Pharmacokinetic | R534Q | | | | |
| SNP=single n | ucleotide polymorphism. HMG-CoA=3-hydro | oxy-3-methylgluta | ryl-coenzyme | A. *Predicted to be damaging by PhD-SNP algorithm. 45 | | | | | | |
| Table 4: Pha | Table 4: Pharmacogenomic rare and novel non-synonymous damaging variants* | | | | | | | | | |

A Family Quartet

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PLOS GENETICS

Phased Whole-Genome Genetic Risk in a Family Quartet Using a Major Allele Reference Sequence

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Abstract

Whole-genome sequencing harbors unprecedented potential for characterization of individual and family genetic variation. Here, we develop a novel synthetic human reference sequence that is ethnically concordant and use it for the analysis of genomes from a nuclear family with history of familial thrombophilia. We demonstrate that the use of the major allele reference sequence results in improved genotype accuracy for disease-associated variant loci. We infer recombination sites to the lowest median resolution demonstrated to date (<1,000 base pairs). We use family inheritance state analysis to control sequencing error and inform family-wide haplotype phasing, allowing quantification of genome-wide compound heterozygosity. We develop a sequence-based methodology for Human Leukocyte Antigen typing that contributes to disease risk prediction. Finally, we advance methods for analysis of disease and pharmacogenomic risk across the coding and non-coding genome that incorporate phased variant data. We show these methods are capable of identifying multigenic risk for inherited thrombophilia and informing the appropriate pharmacological therapy. These ethnicity-specific, family-based approaches to interpretation of genetic variation are emblematic of the next generation of genetic risk assessment using whole-genome sequencing.

Citation: Dewey FE, Chen R, Cordero SP, Ormond KE, Caleshu C, et al. (2011) Phased Whole-Genome Genetic Risk in a Family Quartet Using a Major Allele Reference Sequence. PLoS Genet 7(9): e1002280. doi:10.1371/journal.pgen.1002280

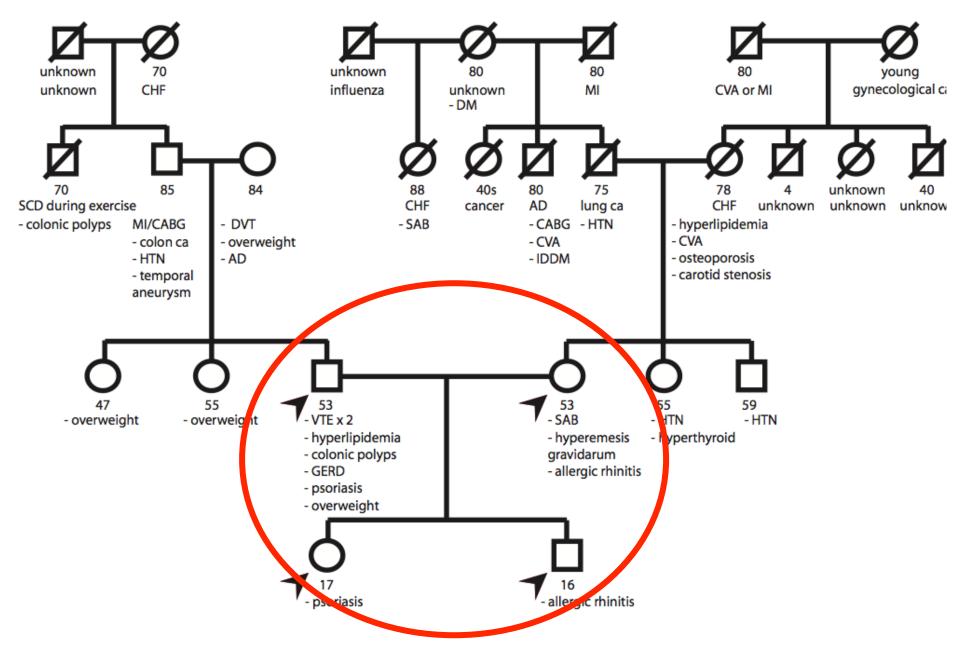


Table S7. Example pharmacogenomics annotation

| Proton P | ump Inhibitors (such as Prilosec) |
|----------|---|
| Father | Probable typical response to proton pump inhibitors. |
| Details: | CYP2C19*2/CYP2C19*17, one poor metabolizer allele and one ultra-rapid metabolizer allele: Response to proton pump inhibitors with this combination in alleles is not <u>well-studied</u> . The poor metabolizer allele associates with increased response to treatment for some indications, while the ultra-rapid metabolizer allele associates with decreased response. |
| Mother | May not respond well to commonly prescribed dosages due to ultrarapid clearance of these drugs. |
| Details: | CYP2C19*17 homozygous, ultra-rapid metabolizer: Is associated with increased proton pump inhibitor clearance and decreased efficacy. |
| Sister | May not respond well to commonly prescribed dosages due to ultrarapid clearance of these drugs. |
| Details: | CYP2C19*17 homozygous, ultra-rapid metabolizer: Is associated with increased proton pump inhibitor clearance and decreased efficacy. |
| Brother | Probable typical response to proton pump inhibitors. |
| Details: | CYP2C19*2/CYP2C19*17, one poor metabolizer allele and one ultra-rapid metabolizer allele: Response to proton pump inhibitors with this combination in alleles is not <u>well-studied</u> . The poor metabolizer allele associates with increased response to treatment for some indications, while the ultra-rapid metabolizer allele associates with decreased response. |

Table S9. Variants associated with adverse drug response

| Key: Father, | Mother, Brother, Sister = | | _ | Family members' genotypes as compared to other possible genotypes; not a population-based statistic | | | | |
|-------------------|------------------------------|--|---|---|---|---------------------|--|--|
| Gene Symbol | SNP Location | Drug(s) | Drug(s) More Likely to Cause Side Effect | Drug(s) Less Likely to Cause Side Effect | No PGx Action/ Phenotype Unknown | Confidence Level | | |
| TPMT | rs1800460 | purine analogues | | ■ ○■○ | | High | | |
| HTR3B | rs1800497 | antipsychotics | ■ ○■○ | | | Medium | | |
| HTR2C | rs1414334 | antipsychotics, clozapine, risperidone | ■0 | 0 | | Medium | | |
| ARVCF, COMT | rs9332377 | cisplatin | • | ■ ○■○ | | Medium | | |
| FAM119A, CREB1 | rs7569963 | citalopram | | | 00 | Medium | | |
| ABCC2 | rs17222723 | doxorubicin | ••• | 00 | | Medium | | |
| ABCB1 | rs1045642 | efavirenz, nelfinavir | • | ■00 | • | Medium | | |
| CYP1A2 | rs762551 | leflunomide | • | | • | Medium | | |
| PICK1, ENTHD1 | rs2076369 | methamphetamine | • | 0 | ■■○ | Medium | | |
| ADORA2A | rs2298383 | methotrexate | = 0 | 0 | • | Medium | | |
| ABCC1 | rs246240 | methotrexate | ■ ○ ■ ○ | • | • | Medium | | |
| REN, ETNK2 | rs2368564 | muraglitazar | • | ■00 | • | Medium | | |
| CHRNA4 | rs2236196 | nicotine | 00 | | • | Medium | | |
| MTHFR | rs1801131 | nitrous oxide | • | | | Medium | | |
| HTR2C | rs518147 | olanzapine | 0 | | 0 | Medium | | |
| EPHX1 | rs1051740 | phenytoin | 00 | | | Medium | | |
| EPHX1 | rs1051740 | phenytoin | 00 | • | | Medium | | |
| EPHX1 | rs2234922 | phenytoin | • | 00 | | Medium | | |
| intergenic | rs1695 | platinum compounds | =0= 0 | | | Medium | | |

Table S8. Variants associated with drug efficacy

| | | • | | | | | |
|-----------------------------|-----------------|---|---|-----------------------------------|--|---------------------|--|
| Key: Father, Mo Sister = | other, Brother, | | Family members' genotypes as compared to other possible genotypes; not a population-based statistic | | | | |
| Gene Symbol | SNP | Drug(s) | Drug(s) More Likely to Work | Drug(s) Less Likely to Work | No <u>PGx</u> Action/ Phenotype Unknown | Confidence Level | |
| GRIK4 | rs1954787 | citalopram | = 00 | | | High | |
| LTA, TNF | rs1800629 | adalimumab, etanercept, infliximab | | • | • | Medium | |
| VDR | rs1544410 | alendronate, bisphosphonates, calcium, clodronate, etidronic acid, raloxifene | | | | Medium | |
| ABCB1 | rs2032583 | antidepressants | | ■ 00 | | Medium | |
| FKBP5 | rs3800373 | antidepressants | • | | • | Medium | |
| FKBP5 | rs1360780 | antidepressants | • | | • | Medium | |
| HTR2A | rs7997012 | antidepressants, citalopram | ■0 | = 0 | • | Medium | |
| SERPINE1 | rs2227631 | antidepressants, citalopram, fluoxetine | 0 | • •• | • | Medium | |
| NOS3 | rs2070744 | antihypertensives and diuretics in combination | | | | Medium | |
| PPARA | rs4253778 | beta blocking agents | 0 | | • | Medium | |
| IL1B | rs16944 | bisphosphonates, clodronate, etidronic acid, risedronate, tiludronate | •• | 00 | | Medium | |
| COMT | rs165599 | bupropion | | • | • | Medium | |
| HTR3B | rs1800497 | bupropion | | • | • | Medium | |

| Key: Father, I | Mother, Brother, Sister = | n¢n¢ | Family members' genotypes as compared to other possible genotypes; not a population based statistic | | | | | | |
|----------------|------------------------------|-------------------------|---|--|-------------------------------------|-------------------------------------|--|---------------------|--|
| Gene Symbol | SNP Location | Drug(s) | Drug Dose(s) Easy to Predict | Drug Dose(s) Difficult to Predict | Drug Dose(s) Above Average | Drug Dose(s) Below Average | No <u>PGx</u> Action/ Phenotype Unknown | Confidence Level | |
| CYP3A5 | rs776746 | cyclosporine | • | | | | | High | |
| CYP4F2 | rs2108622 | acenocoumarol, warfarin | | | | | | Medium | |
| CYP4F2 | rs2108622 | acenocoumarol, warfarin | | | | | | Medium | |
| SCN1A | rs3812718 | carbamazepine | • | • | 0=0 | • | • | Medium | |
| NALCN | rs7992226 | methotrexate | | | | | | Medium | |
| COMT | rs4680 | morphine | | | | | | Medium | |
| OPRM1 | rs1799971 | morphine | | | | | | Medium | |
| SCN1A | rs3812718 | phenytoin | | | 0=0 | | • | Medium | |
| EPHX1 | rs2292566 | warfarin | | | | | | Medium | |
| STX4 | rs10871454 | warfarin | | | | | | Medium | |
| VKORC1 | rs8050894 | warfarin | | | | | | Medium | |
| CYP3A4 | rs2740574 | docetaxel | ■ ○■○ | | | | | Low | |
| ABCB1 | rs1045642 | fexofenadine | | • | | • | | Low | |
| CYP3A4 | rs2740574 | indinavir | | • | • | • | • | Low | |
| SLCO1B1 | rs4149056 | methotrexate | | | • | • | • | Low | |
| SLCO1B1 | rs2306283 | pravastatin | • | | | • | • | Low | |
| CYP3A4 | rs2740574 | tacrolimus | | | | | | Low | |

Take Home from Clinical Annotations of Human Genome Projects

- Pharmacogenomics is a good test bed for whole genome applications
 - strong effects, environment controlled mostly
- PharmGKB has information for individual advice for >100 drugs/individual
- The value for each individual is knowledge about a few key drug response predictions
- Rare variants are important and challenging

Overview:



PGx Knowledge | Implementation |

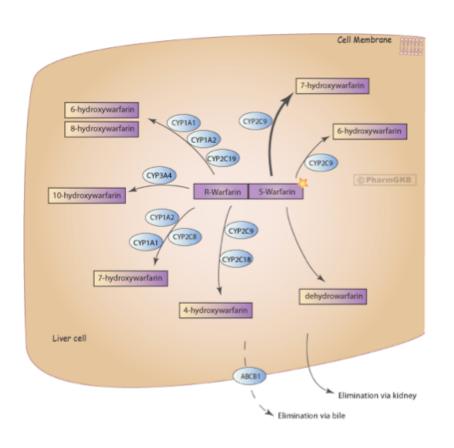


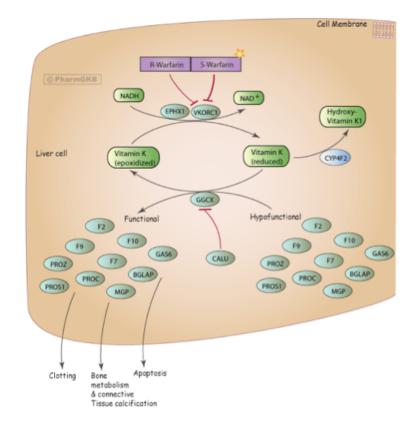
- 1. PharmGKB and resources for PGx
- 2. Clinical PGx Implementation
 - Annotation of Human Genomes
 - Dosing Guidelines (CPIC)
- 3. Does PGx truly have a role in personalized medicine?
 - Warfarin Dosing
 - Narcotics

Case 1: Warfarin Genetics

- Three genes known to affect warfarin dose: CYP2C9, VKORC1 and CYP4F2
- Know variation in CYP2C9 affects PK
- But only accounted for < 15% of variation
- Vitamin K epoxide reductase (VKORC1) affects PD
- Found in rat-poison-resistant rats
- Non-coding SNP explains 35% of variation
- VKORC1: -1639 G>A allele

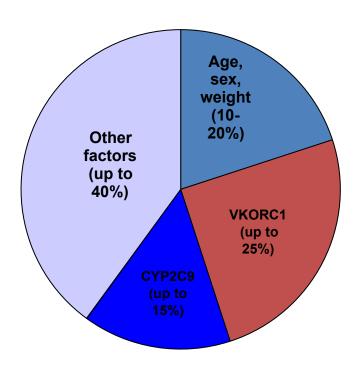
Warfarin PK & PD Pathways





Warfarin Response

- Clinical and environmental factors
 - Age, gender, ethnicity, BMI
 - Co-administered drugs
 - Co-morbidity
 - Food (Vitamin K intake)
 - Smoking
- Genetic factors
 - CYP2C9 and VKORC1



Warfarin Consortium and Recent Results

- IWPC retrospective study better dose prediction with PGx
- COAG trial no increase of time in therapeutic range with PGx dosing
- EU-PACT Warfarin trial PGx group had higher mean percentage of time in therapeutic range
- EU-PACT Acenocoumarol and Phenprocoumon trial – no increase of time in therapeutic range with PGx dosing
- GIFT trial will focus on clinical outcomes with PGx

Warfarin Label Changes for PGx

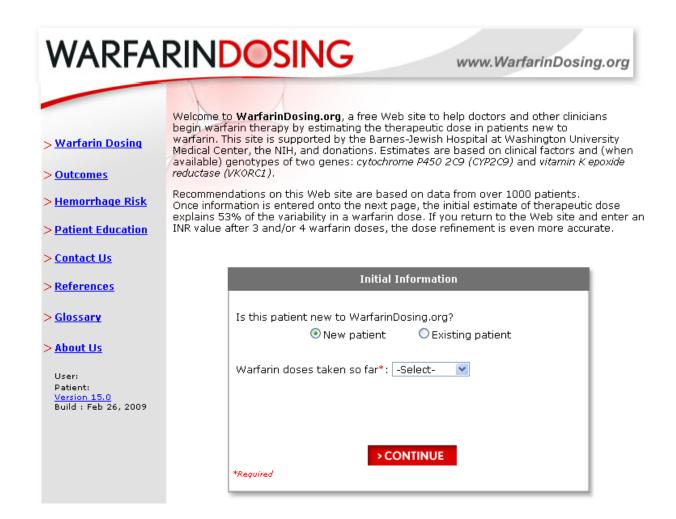
- In 2007 and 2010, FDA updated label
 - a "patient's CYP2C9 and VKORC1 genotype information, when available, can assist in selection of the starting dose."
 - provides initial dosage recommendations for different variant combinations



Table 5: Range of Expected Therapeutic Warfarin Doses Based on CYP2C9 and VKORC1 Genotypes[†]

| VKORC1 | CYP2C9 | | | | | | | |
|--------|-------------|--------|----------|----------|----------|----------|--|--|
| | *1/*1 *1/*2 | | *1/*3 | *2/*2 | *2/*3 | *3/*3 | | |
| GG | 5-7 mg | 5-7 mg | 3-4 mg | 3-4 mg | 3-4 mg | 0.5-2 mg | | |
| AG | 5-7 mg | 3-4 mg | 3-4 mg | 3-4 mg | 0.5-2 mg | 0.5-2 mg | | |
| AA | 3-4 mg | 3-4 mg | 0.5-2 mg | 0.5-2 mg | 0.5-2 mg | 0.5-2 mg | | |

Warfarin Dosing Calculator



23andMe, Inc. 11/22/13



Department of Health and Human Services

Public Health Service Food and Drug Administration 10903 New Hampshire Avenue Silver Spring, MD 20993

Nov 22, 2013
Ann Wojcicki
CEO
23andMe, Inc.
1390 Shoreline Way
Mountain View, CA 94043

Document Number: GEN1300666 Re: Personal Genome Service (PGS)

WARNING LETTER

Dear Ms. Wojcicki,

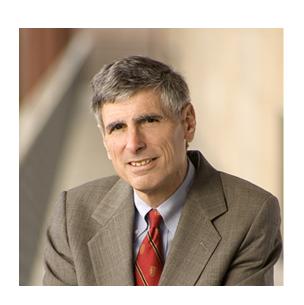
The Food and Drug Administration (FDA) is sending you this letter because you are marketing the 23andMe Saliva Collection Kit and Personal Genome Service (PGS) without marketing clearance or approval in violation of the Federal Food, Drug and Cosmetic Act (the FD&C Act).

This product is a device within the meaning of section 201(h) of the FD&C Act, 21 U.S.C. 321(h), because it is intended for use in the diagnosis of disease or other conditions or in the cure, mitigation, treatment, or prevention of disease, or is intended to affect the structure or function of the body. For example, your company's website at www.23andme.com/health (most recently viewed on November 6, 2013) markets the PGS for providing "health reports on 254 diseases and conditions," including categories such as "carrier status," "health risks," and "drug response," and specifically as a "first step in prevention" that enables users to "take steps toward mitigating serious diseases" such as diabetes, coronary heart disease, and breast cancer. Most of the intended uses for PGS listed on your website, a list that has grown over time, are medical device uses under section 201(h) of the FD&C Act. Most of these uses have not been classified and thus require premarket approval or de novo classification, as FDA has explained to you on numerous occasions.

Case 2: An Odyssey With Pain

- Phil Pizzo, former Dean SOM, Stanford
- Chair, IOM panel on pain
- Marathon runner, boundless energy
- Developed chronic pain, 4 negative MRIs
- Compression of a nerve
- Surgery
- Relief from nerve entrapment within days

BUT....



Adverse Events

- Highly sensitive to opiates
- Two episodes of respiratory depression within days of surgery requiring naloxone reversal and ICU
- PGx an important factor

PERSPECTIVE LESSONS IN PAIN RELIEF

Lessons in Pain Relief — A Personal Postgraduate Experience Philip A. Pizzo, M.D.

PGx Objectives

- Identify the variation in drug response and associate it with genetic variation
- Evaluate clinical significance (not so easy)
 - Analytic validity, clinical validity, clinical utility
- Develop screening tests
- Individualize drug therapy

Challenges of Translational PGx

- Many published studies but few replications
- Statistical significance ≠ clinical significance
- RCTs are used to show clinical utility but difficult for PGx
- Difficulty controlling for gene-environment, gene-disease and dietary factors

PGx is NOT Routinely Used...

- Analytic validity, clinical validity/utility
- Practical concerns
 - Costs for genotyping and who pays
 - Availability of genotypes/time delay
- Clinician adoption
 - Education
 - Clear, specific guidelines
 - Information delivery mechanisms

...Yet PGx Is Moving Into Practice

- Addressing practical concerns
 - Rapidly decreasing costs and readily available genotyping/ sequencing services
 - Preemptive genotyping results in electronic medical health records
- Addressing clinician adoption
 - Integration into medical training
 - FDA drug labeling
 - Published dosing guidelines
 - Clinical Pharmacogenetics Implementation Consortium (CPIC)
 - "Pharmacogenetics: from bench to byte- an update of guidelines." Swen JJ, et al. Clin Pharmacol Ther. 2011 May; 89(5):662-73.

We MUST be advocates

A fabulous example



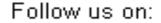
Acknowledgments

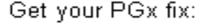
- Russ Altman (co-PI) and Michelle Whirl-Carrillo (Assistant Director)
- The PharmGKB team:
 - Julia Barbarino, Li Gong, Ellen McDonagh, Katrin Sangkuhl, Joan Hebert
 - Ryan Whaley, Mark Woon, Darla Hewett, Mei Gong, Feng Liu
 - Blanca Pineda, T.C. Truong, Tina Zhou
- PGRN & International Collaborators





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Thank You

