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Clinical Implementation of Germline Cancer Pharmacogenetic Variants during the Next-Generation Sequencing Era

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Abstract

Over 100 FDA-approved medications include pharmacogenetic biomarkers in the drug label, many with cancer indications referencing germline DNA variations. With the advent of next-generation sequencing (NGS) and its rapidly increasing uptake into cancer research and clinical practice, an enormous amount of data to inform documented gene-drug associations will be collected, which must be exploited to optimize patient benefit. This state-of-the-art article focuses on the implementation of germline cancer pharmacogenetics into clinical practice. Specifically, it discusses the importance of germline variation in cancer and the role of NGS in pharmacogenetic discovery and implementation. In the context of a scenario where massive NGS-based genetic information will be increasingly available to health stakeholders, this review explores the ongoing debate over the threshold of evidence **necessary** for implementation, provides an overview of recommendations in cancer by professional organizations and regulatory bodies, discusses limitations of current guidelines and strategies to improve third-party coverage.

Keywords

cancer; germline; implementation; oncology; next-generation sequencing; pharmacogenetics; pharmacogenomics

Introduction

There is diffuse heterogeneity in response to cancer therapy, with only about 25% of patients responding to conventional methods of choosing chemotherapy regimens (1). Additionally, dose-limiting toxicities combined with poor target selectivity commonly result in delay or cessation of therapy owing to reduced drug efficacy in the potentially curative setting.

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CONFLICTS OF INTEREST

Dr. Innocenti receives royalties from the commercialization of the UGT1A1*28 genetic test.

Understanding and applying the knowledge of a patient's cancer genome to resolve these clinical problems has become increasingly utilized. In fact, prospective testing for somatic, or acquired, mutations within a tumor and appropriate selection of targeted therapies is beginning to replace standard of care administration of non-specific cytotoxic agents in many tumor types, owing to enhanced survival and reduced toxicities. For example, the v-Raf murine sarcoma viral oncogene homolog B1 (BRAF) inhibitor, vemurafenib, has replaced the standard of care, dacarbazine, for the treatment of metastatic melanoma patients harboring the *BRAF* V600E mutation (2). The same has been seen with crizotinib as a replacement for cytotoxic chemotherapy as standard first-line therapy in anaplastic lymphoma kinase (ALK) positive non-small-cell lung cancer (NSCLC) (3), trastuzumab in human epidermal growth factor receptor-2 (*HER2*) positive breast cancer (4), erlotinib and afatinib for epidermal growth factor receptor (*EGFR*) positive NSCLC (5, 6), and several others.

While somatic mutations in genes coding for targets of mechanisms of action of drugs are commonly used to predict pharmacodynamics and drug response, germline, or inherited, genome variation can be helpful in predicting pharmacokinetics and/or pharmacodynamics in individual patients (7) (Figure 1). Prospective identification of germline **variants** may aid in normalization of systemic drug exposure and minimization of drug toxicity while preserving the antitumor activity at the target site, thus enhancing clinical benefit. For example, patients carrying the uridine-diphosphate glucuronosyl transferase 1A1*28 (*UGT1A1**28) allele have decreased enzymatic activity, resulting in reduced glucuronidation and impaired inactivation of 7-ethyl-10-hydroxycamptothecin (SN-38, the active component of irinotecan) (8). These patients are recommended to receive a reduced initial dose of irinotecan to minimize drug exposure and reduce severe, dose-limiting toxicities, such as grade 3/4 neutropenia (9). Likewise, patients receiving 6-mercaptopurine and harboring low activity thiopurine-S-methyltransferase (TPMT) phenotypes have increased production of the active thioguanine nucleotide metabolites, which subsequently increases the risk of myelosuppression and gastrointestinal toxicity (10-12). Six-mercaptopurine dose reduction in TPMT-deficient patients has been shown to reduce the risk of toxicity associated with high concentrations of thioguanine nucleotides **without compromising efficacy** (12, 13).

In addition to predicting the pharmacokinetics of a drug, germline variants may also inform cancer biology (14). It is well established that immune cells can be tumor promoting through their ability to regulate angiogenesis, cell proliferation, and tumor invasiveness (14). Furthermore, neovascularization (angiogenesis) promotes tumor growth through the formation of vasculature required to provide nutrients and oxygen to cancer cells while removing wastes (e.g., carbon dioxide). In addition to the immune system and angiogenesis, other systems that do not have the typical somatic alterations of a tumor include inflammation and the stromal microenvironment. Germline variation in genes regulating these systems may affect tumor growth and survival. Initial genome-wide association studies (GWAS) of outcome of cancer patients treated with chemotherapy are corroborating the hypothesis of germline determinants of cancer outcome being related to these systems. For example, a germline GWAS of treatment response in childhood acute lymphoblastic leukemia (ALL) selected the interleukin 15 gene (*IL15*) a determinant of minimal residual

disease, a predictor of outcome (15). Another GWAS of overall survival (OS) in pancreatic cancer patients treated with first-line gemcitabine revealed another gene in the immune system (the interleukin 17F, *IL17F*) as associated with OS (16). These studies are supportive of the notion that utilizing germline variation might predict not only drug behavior but also **host and tumor** biology, subsequently enhancing our understanding of the genetic basis of drug response in cancer.

An extensive number of reviews of the role of germline pharmacogenetics in cancer therapy are readily available in the literature (17-20). In addition, an appreciation of the clinical relevance of both germline and somatic pharmacogenetics can be gained from the number of validated, clinically significant biomarkers listed in Table 1. Despite the vast number of pharmacogenetic associations important in cancer treatment, very few pharmacogenetic tests are utilized routinely in clinical practice. This state of the art article will focus on the implementation of germline cancer pharmacogenetics into clinical practice. Specifically, we will elaborate on the importance of NGS in germline cancer pharmacogenetics implementation. We will explore the debate centered around the level of evidence required to warrant clinical implementation, provide an overview of the landscape of recommendations on pharmacogenetics implementation by professional organizations and regulatory bodies, and discuss the limitations of the current guidelines. Finally, because the uptake of pharmacogenetics into routine clinical practice is strongly influenced by third-party coverage, we will discuss limitations and strategies to improve the current reimbursement rates and, subsequently, translation of cancer pharmacogenetics into practice.

Maximizing benefit from next-generation sequencing efforts

The advent of NGS has allowed sequencing of an entire human genome at a reasonable cost – the cost of sequencing one genome in 2001 was approximately \$100 million, and in 2013 is less than \$3000 (21). Additionally, the time required to sequence an entire human genome has also decreased dramatically; from over a decade (1990 – 2003) to complete the sequencing of the first human genome (the Human Genome Project), compared to as quickly as a one-day turnaround time offered with some 2013 technologies (e.g., Benchtop Ion Proton™ Sequencer, Life Technologies, Grand Island, NY) (22). This rapid decline in price and turnaround time has resulted in an increase in research and clinical applications of sequencing, most notably in cancer. Major academic institutions and both government-sponsored and private organizations have launched programs for NGS of the cancer genome, with the goals of describing the architecture of cancer-specific somatic alterations and of aiding clinicians in selection of targeted therapy (23).

Because tumor samples contain both acquired and inherited alterations, along with somatic DNA, cancer sequencing efforts also capture germline information. More importantly, in cancer patients, germline DNA is oftentimes also analyzed as a means to identify **variants** in the tumor. As discussed, this germline information plays a crucial role in optimizing the dose and selection of therapy. An additional benefit unique to NGS is the ability to discover rare **variants** in the genome and their impact on drug response. In a study exploring the impact of rare variants versus common variants in *SLCO1B1* on methotrexate clearance, Ramsey and colleagues found that rare damaging nonsynonymous SNPs accounted for

17.8% of the gene's effects on methotrexate clearance (24). Additionally, the rare variants had larger effect sizes than the common nonsynonymous variants, with effect size being inversely proportional to minor allele frequency. Whereas this group had to perform deep resequencing of *SLCO1B1* to discover these rare variants, the advent of NGS provides the opportunity to obtain comprehensive (genome-wide) catalogues of rare variants. Additionally, the larger effect sizes observed with rare variants likely contribute to the overall phenotypic variability of drug response in cancer patients treated with chemotherapy.

In addition to pharmacogenetic research and discovery, germline information generated through NGS has clinical applications, as it informs on drug selection and dose optimization, as well as genetic susceptibility to disease, with cascade testing for the relatives of the patient (Figure 2). In their 2010 recommendations for genetic testing for cancer susceptibility, the American Society of Clinical Oncology (ASCO) reported nine genes with well-validated germline **variants** predictive of cancer susceptibility (25). For example, germline **variants** in the adenomatous polyposis coli (*APC*) gene result in a hereditary condition known as familial adenomatous polyposis. Without any intervention, 100% of these patients will ultimately progress to colorectal cancer (26). Similar risks are conferred **with** the early onset breast cancer gene (*BRCA*) **variants** and breast and ovarian cancers (27), as well as the DNA mismatch repair gene **variants**, which result in Lynch syndrome and, subsequently, colorectal cancer (26).

As of August 2013, there are over 100 drugs with pharmacogenetic information in the U.S. Food and Drug Administration (FDA)-approved drug labels, with 31 being cancer drugs, and 8 of the cancer drugs referencing germline variants (28). NGS is able to provide data to inform most or all of these validated gene-drug associations (i.e., some sequence information may be missed in the case of whole exome sequencing) as well as many others that are under investigation but have yet to confer a label change. Therefore, NGS of the cancer genome is likely the most effective strategy for obtaining preemptive germline assessment of actionable genotypes in cancer patients. It is important to exploit this germline information, determine which variants are validated, warranting clinical implementation, and optimize patient therapy accordingly.

With the many centers and companies now performing NGS and recommending therapy changes based on the results, collaboration to accumulate data would also help maximize the benefit of these efforts. Rather than waiting on data from prospective studies, the large sample sizes would provide the means to retrospectively analyze large patient cohorts for discovery of common and rare variants, validation, and outcomes of pharmacogenetic-based decision-making. One collaborative organization working toward maximizing benefit from NGS projects in all therapeutic areas is the Electronic Medical Records and Genomics (eMERGE) Network, which is a national consortium focused on combining DNA biorepositories with electronic medical records to facilitate large-scale, high-throughput genetic research and returning genetic testing results to patients in a clinical setting (29). Efforts such as this should be exploited from all angles, including somatic and germline **variation** discovery and implementation, as well as clinical and uptake outcomes. On an even broader scale, collaboration of international pharmacogenetics consortiums would provide the basis for understanding population-based genetics and the impact of race on

outcomes worldwide (30). This information may be beneficial in advancing clinical uptake of pharmacogenetics throughout a wide spectrum of health care systems, including those in third-world countries.

Level of evidence to warrant implementation

Generation of clinical recommendations and guidelines is burdened by the debate surrounding the threshold of evidence required for translation of pharmacogenetics into clinical practice. The U.S. Office of Public Health Genomics' Evaluation of Genomic Applications in Practice and Prevention (EGAPP) Working Group has identified the most significant challenges in developing evidence-based reviews and recommendations for genetics testing, which include: (1) uncertainty and difficulty in establishing clinical validity (i.e., how consistently and accurately the test predicts the outcome of interest), (2) lack of direct evidence of clinical utility (i.e., how likely the test is to significantly improve patient outcomes), (3) rapid development and marketing of tests, and (4) lack of robust regulatory infrastructure for genetic testing (31). These limitations contribute to the vast disparities between recommendations, and therefore must be addressed.

While prospective randomized clinical trials (RCTs) are the gold standard and often required for an intervention to be accepted into standard of care, this may not be the ideal study design to demonstrate clinical utility of pharmacogenetics. The feasibility of performing prospective, phase III, RCTs for each pharmacogenetic association discovered is unlikely due to the inherent costs, time, and large sample sizes associated with these trials, which may ultimately deprive many patients of safer and more effective treatments and dosing. To increase efficiency, the focus may be shifted toward retrospective validation and replication (32), randomized phase II studies (33), or adaptive trial designs that allow prospectively planned modifications in design after patient enrollment(34). Unfortunately, alternative approaches such as these may not completely eliminate the need for solid evidence from traditional RCTs, which we have been accustomed to for over 60 years; however, it must also be considered that many laboratory biomarkers in clinical use today have not been tested for their predictive power in randomized studies. The level of evidence considered appropriate to warrant recommendations according to the National Institute of Health's (NIH) Pharmacogenomics Research Network (PGRN) and the Clinical Pharmacogenetics Implementation Consortium (CPIC) includes a strong biological rationale for the gene-drug association, reproducible evidence linking the genetic variation to drug response, and noninferiority compared with current prescribing practice (35). The validity of this evidence threshold is supported by the pharmacogenetic association between *TPMT* and thiopurine toxicity, which never underwent an RCT, yet is likely the most validated and commonly utilized germline pharmacogenetic test in practice.

Another opportunity to generate sufficient evidence to warrant clinical implementation lies in the drug development process. For example, if preclinical models demonstrate that a drug is metabolized via a CYP450 enzyme or is a transporter substrate with known or suspected pharmacogenetic implications (e.g., CYP2D6 or ABCB1) then phase I, II, and III clinical trials should incorporate correlative studies to examine if the drug disposition is altered based on CYP450/**transporter** genotype or altered expression. This approach would allow

for information to be available from the outset of the drug development process and would improve the efficiency of the current model, which has required a multitude of retrospective and prospective studies on drugs that have existed for decades, as correlative pharmacogenetic studies were traditionally never performed during the initial drug development process. The capabilities now exist to easily obtain DNA upfront and perform these studies much earlier. Additionally, it **could** enhance patient selection, contribute to dose optimization and therapy selection, and reduce overall healthcare costs from the beginning. For example, a *UGT1A1* genotype-guided phase I study demonstrated that metastatic colorectal cancer patients lacking the ‘high-toxicity’ genotype (*UGT1A1* *28/*28) were able to tolerate significantly higher doses compared to the standard 180 mg/m² administered in FOLFIRI (5-fluorouracil, leucovorin, and irinotecan) (*1/*1 and *1/*28 patients tolerated up to 370 mg/m² and 310 mg/m², respectively) (36). If this genetic association had been discovered from the outset, clinical studies could have been focused on tailoring the dose by genotype and testing the hypothesis of improved survival benefit with a genotype-driven dosing. Furthermore, using genotype to optimize the therapeutic dose may provide precedence for medications already on the market that have similar pharmacology and metabolism properties.

The debate of the level of evidence required for clinical utility is further complicated by the advent of NGS. Because genetic information with known and validated clinical benefits will be collected and at no additional cost and available with minimal increased effort, it can be argued that the threshold required to warrant single-gene tests greatly differs from the threshold to consider when NGS information is readily available. As mentioned previously, NGS will generate germline information along with somatic. Arguably, it is unethical to ignore this information given that phenotypes exist that predict life-threatening toxicities and/or drug efficacy. Indeed, this is the premise of the CPIC guidelines: given that genotyping information is already available, how should it be utilized by the clinician? (35). Considering the lower level of evidence that would support clinical utility in this setting, the true lack of **clinical decision support (CDS) and** professional organization practice guidelines is realized.

The challenge of data interpretation in facilitating translation of pharmacogenetics into clinical practice

The dissemination of pharmacogenetics into clinical practice is largely influenced by the availability of approved and validated pharmacogenetic tests, clinicians’ ability to use and understand the tests, and evidence-based recommendations to change therapeutic management over the current standards. Currently, a paucity of data exists on standardized pharmacogenetic guidelines by professional organizations, **contributing** to the slow clinical uptake of pharmacogenetics. A large survey of 10,303 physicians demonstrated that the vast majority (97.6%) acknowledged that genetic variations may influence drug response, but only 10.3% felt adequately informed about pharmacogenetic testing and interpretation (37). Interestingly, investigators also determined that early adopters of pharmacogenetic testing are more likely to be practicing in oncology. **Thus**, despite the large number of FDA-approved pharmacogenetic tests and drug label indications, readily available consensus

guidelines and the lack of physician confidence present barriers to widespread pharmacogenetics implementation into clinical practice.

There are two aspects of data interpretation that affect the translation of pharmacogenetics into clinical practice: (1) interpretation of published research results and (2) clinician interpretation of reported genetic results. Firstly, the lack of standardization in conducting pharmacogenetic studies contributes to inconsistencies in results, which makes interpretation challenging or even impossible, and contributes to lack of replication in many instances. Inconsistencies between studies include inaccurate or incomplete genotyping (i.e., failure to include all known functional variants or genotyping of tumor tissue rather than germline DNA), presence of concomitant medications that may affect drug disposition and/or response, thus altering observed 'phenotype', and the common lack of control groups, which complicates the differentiation between predictive (associated with response to treatment) and prognostic (associated with disease outcome in the absence of treatment, i.e., disease severity) genotypes (38). The discordance between positive associations reported due to these inconsistencies contributes to the complexity of data interpretation by researchers, professional organizations, consortia, and clinicians alike.

Once a pharmacogenetic association has proven validity and clinical utility and is ready for clinical implementation, physicians must be willing and able to incorporate it into their practice. Despite their interest, unfortunately, many physicians lack the confidence and knowledge required to accurately interpret and implement pharmacogenetics. CDS tools, which provide physician guidance (most commonly through electronic medical records) on clinical decisions when pertinent pharmacogenetic information is available, have proven to successfully enable translation of pharmacogenetics into clinical practice (39). However, in order to develop accurate recommendations to incorporate into CDS, clear and precise algorithms based on scientifically robust results must be available to the program developers; the creation of such algorithms has been facilitated by professional organizations and consortia discussed below.

An overview of pharmacogenetic recommendations by consortia, professional organizations, and regulatory bodies

The creation of **professional organizations and consortia** devoted to pharmacogenetic-based clinical guidelines and recommendations has provided guidance for uptake into clinical settings, mainly at large research-intensive academic hospitals, with most applications being research focused. Examples of such organizations include CPIC and the Dutch Pharmacogenetics Working Group (DPWG), both devised to create and share evidence-based clinical pharmacogenetics guidelines with therapeutic recommendations for specific gene-drug pairs (35, 40). Table 2 summarizes the germline cancer gene-drug pairs covered by each set of currently available guidelines, as well as a summary of the specific recommendations provided. Of note, there also exists a Japanese regulatory agency and recommendations provided by the Japanese Pharmacogenomics Discussion Group (PDG), which brings together members of the Pharmaceutical and Medical Device Agency (PMDA) to exchange and share data with the goal of maintaining consistency in consultations and promoting appropriate pharmacogenetic clinical trials, but they are not readily available in

English (41). While these organizations have provided helpful guidelines for the most well validated genetic associations, shortcomings remain.

Notably, the guidelines for somatic mutations tend to be consistent across the different regulating bodies. For example, guidelines are in agreement that crizotinib is first-line for patients with the *ALK* positive NSCLC. The same can be said for vemurafenib in melanoma patients harboring the *BRAF* V600E mutation, trastuzumab in *HER2*-positive breast cancer patients, as well as the many other drugs with somatic pharmacogenetic implications. This consistency in guidelines can be explained by the fact that all are targeted agents, which only received approval in tumor types expressing the biomarker of interest. In contrast, the retrospective discovery of germline pharmacogenetic markers has contributed to complexity in the clinical recommendations.

While consortia, professional organizations and regulatory bodies (i.e., the FDA) are universally concordant in their recommendations for drugs associated with somatic mutations, extensive discordance exists between the recommendations based on germline pharmacogenetics (Table 2). Firstly, the gene-drug pairs covered within each set of guidelines varies. For example, while DPWG, EGAPP, FDA, and National Comprehensive Cancer Network (NCCN) guidelines exist for *UGT1A1*-irinotecan gene-drug pair (28, 42-45), the ASCO, CPIC, and the European Medicines Agency (EMA) do not currently provide guidelines for this specific gene-drug pair. Secondly, the extent and specifics of the therapeutic recommendations provided in the guidelines are also discordant. While the DPWG provides broad dose adjustment guidelines for capecitabine based on DPD deficient phenotype (42), EMA and FDA simply contraindicate the drug in the instance of DPD deficiency (28, 46), and ASCO states that there is insufficient evidence to recommend testing or monitoring (47). In the case of NGS, when *DPYD* genotype will be available, the question of how to adjust therapy accordingly arises. Likewise, although **the FDA and the majority of the professional organizations and consortia** address *TPMT* testing with thiopurine administration, the specifics of the recommendations vary. Of note, while the CPIC and DPWG recommend dose decreases (30-70% and 50%, respectively) to avoid the risk of severe myelosuppression in patients of the intermediate metabolizer phenotype (42, 48), the FDA label states that these patients usually tolerate normal doses (45). Although both sets of recommendations may be correct depending on the regimen and its recommended starting dose (i.e., when the protocol starting dosage of mercaptopurine (MP) is 75 mg/m² per day, then dose reductions in heterozygotes is likely necessary, but when the protocol starting dose of MP is 50 mg/m², patients are much more likely to tolerate normal doses), these discrepancies likely prove confusing to **unaware** clinicians who are trying to optimally dose *TPMT* intermediate metabolizers. Thirdly, aside from the discordance among recommendations, an additional shortcoming is the language included in some of the recommendations. For example, the FDA and EMA state that capecitabine is contraindicated in DPD deficient patients, but does not implicitly state the diagnostic criteria for DPD deficiency (i.e., enzyme expression below a certain level or harboring one or two null alleles?) (28, 46). The vague nature of this recommendation imposes challenges for clinicians attempting to apply pharmacogenetics into clinical practice. Similarly, although EGAPP, EMA, FDA, and NCCN do not specifically recommend *UGT1A1* testing in all

patients receiving irinotecan, they do provide general dosing recommendations for *UGT1A1* *28/*28 patients (44-46, 49). In the advent of NGS, this information will be available and should be acted upon accordingly. The FDA's recommendation of reducing the dose of irinotecan by "one level" in *UGT1A1* *28/*28 patients receiving irinotecan is subject to interpretation and, without more detailed recommendations, may result in under- or over-dosing of these patients (28). Importantly, the only cancer drugs with specific germline genotype- and phenotype-guided dosing guidelines are thiopurines (provided in the CPIC and DPWG guidelines), and irinotecan (provided in the DPWG guidelines).

The disparity noted between these guidelines can partially be explained by variations in their review processes. Interestingly, EGAPP went through several iterations of their review process methods before even identifying which topics they would focus on for in-depth reviews and recommendations (31). Another explanation for discordance lies in the evaluation criteria. While clinical validity of biomarkers is easily evaluable and available, analytic validity (i.e., how accurately and reliably the test measures the genotype of interest) and clinical utility are rarely directly available (31). For example, while *HER2* status has been clinically validated (consistently associated with response to trastuzumab), the analytic validity is variable depending on which assay is used (i.e., fluorescence *in situ* hybridization, FISH, or immunohistochemistry, IHC), and clinical utility relies on an assessment of harms versus benefits, which varies by genotype (50). The lack of objective, standardized measures of these variables, especially clinical utility, results in the need for some subjectivity when defining clinical significance, and therefore providing recommendations. A universal evidence-based approach to evaluating pharmacogenetic literature and developing recommendations and guidelines would facilitate simplified translation of pharmacogenetics into clinical practice (50). Importantly, these methods should be established in the context of NGS to align with the paradigm shift in practice (31).

While the guidelines produced by these **professional organizations and consortia** are a step in the right direction, with the universal goal of facilitating implementation of pharmacogenetics into clinical practice, the discrepancies between the guidelines complicate translation for clinicians. Additionally, the language used in the recommendations may be difficult for physicians without an adequate genetics background to understand. For example, while detailed dosing recommendations provide a thorough summary of the literature, the complexity introduced with specific phenotyping criteria has the potential to overwhelm and subsequently deter clinicians without extensive training from adding pharmacogenetic tests to their regular practice. Concordant, succinct guidelines, with detailed but clear recommendations would greatly simplify the transition to pharmacogenetic-guided clinical practice. Furthermore, recommendations on diagnostic assays or methods of detection would provide clinicians with knowledge on how to obtain standardized genetic results for interpretation.

Insurance coverage: More than simply cost effectiveness analyses

In the United States, clinical adoption of pharmacogenetics is heavily influenced by the presence of regulatory recommendations and third-party payment (51). Overall, reimbursement for pharmacogenetic testing has been inconsistent, and the uncertainty

regarding payment represents a major barrier to utilization in clinical practice (52). Another key issue in reimbursement is determining when pharmacogenetic testing is no longer investigative, but has become clinically validated, for a specific indication (52). As previously discussed, regulatory agencies require a high threshold of evidence for clinical recommendations, as do third-party payers who impose the additional requirement of a reasonable cost, which may explain the high variable payer response in the marketplace (51). Particularly, an especially high threshold exists for the more expensive genetic-driven prescriptions for patients whom conventional therapies are predicted to be ineffective or too toxic. Furthermore, because the current procedural terminology (CPT) codes for germline pharmacogenetics are limited to single-gene tests and do not include multi-gene, exome or genome sequencing panels, the tests may be seemingly less important to third-party payers and, therefore, even more difficult to get covered (53).

Few studies have evaluated the cost effectiveness of cancer pharmacogenetics in practice. Of note, a cost implications analysis of reactive versus prospective *DPYD* genotyping in 134 colorectal cancer patients receiving fluorouracil-based therapy revealed the potential for a total cost saving of €131,165 (~\$173,000) through avoiding 5 hospitalizations by preemptively genotyping the patients (54). Similarly, a cost effectiveness analysis of screening for *KRAS* and *BRAF* mutations in colorectal cancer patients to direct treatment with cetuximab compared to the base strategy (no anti-EGFR therapy) reported an incremental cost effectiveness ratio of approximately \$650,000 per additional year of life; the addition of *KRAS* testing saves approximately \$7500 per patient (55). A critical and systematic review of the cost effectiveness of pharmacogenetics revealed that one of the most common biomarkers evaluated was *TPMT*; these studies were focused on a number of indications for thiopurines, including cancer, inflammatory bowel disease, Crohn's disease, and rheumatoid arthritis (56). Nonetheless, the review indicated that *TPMT* genotyping demonstrated clinical validity and likely demonstrated clinical utility. All six of the studies included in the analyses reported genotype-guided dosing of thiopurines to be cost effective when compared to standard dosing. Likewise, *UGT1A1**28 genotyping for irinotecan therapy was also determined to be clinically valid; however, the clinical utility of the test was classified as unclear (note: only two studies utilizing *UGT1A1* genotyping were included) (56). Both of the cost effectiveness studies assessing preemptive *UGT1A1* genotyping demonstrated potential cost effectiveness for the test. Factors that influenced cost effectiveness analyses included race and whether or not efficacy decreases with reduced doses in heterozygotes. Specifically, *UGT1A1**28 genotyping was shown to be cost saving for Africans and Caucasians but not Asians, likely due to the low genotype frequency (observed MAF in Asians: 0.02) (56); the therapeutic efficacy, defined as survival benefit, of irinotecan in *UGT1A1**28/*28 patients after dose reduction had to be 98.4% of full-dose efficacy for genotype-guided dosing to remain cost-saving (56). This example also illustrates the compounded difficulty of proving cost effectiveness with low frequency pharmacogenetic variants due to the high number needed to screen. However, when the information is readily available due to NGS, the burden of proof is significantly lowered.

Perhaps more relevant in the time of NGS is a recent cost effectiveness analysis of a 21-gene assay for guiding adjuvant chemotherapy decisions in breast cancer (Oncotype DX,

Genomic Health, Redwood City, CA), which demonstrated cost effectiveness for intermediate- and high-risk patients (57). Because this test interrogates more than one gene at a lower pricing threshold, these results may provide better predictions of the cost-effectiveness of NGS or other multiple marker tests. That is, compared to a single marker test which costs around \$400-\$500, whole genome sequencing can be completed for around \$3000 and will essentially include most, if not all, germline genetic results ever needed for medication therapy management. In fact, approximately 90% of all bases within the human exome, regardless of allele frequency, can be captured using current sequencing technologies (58). The large number of clinically relevant pharmacogenetic genes interrogated through relatively low-cost NGS further decreases the cost-effectiveness burden, increasing the willingness to pay for a comprehensive genetic test (59). Of note, when NGS is not yet performed under Clinical Laboratory Improvement Amendments (CLIA) conditions (60), additional costs currently associated with NGS include the requirement for sequencing of biomarkers (or other molecular assays) used for clinical decision-making to be performed under CLIA. As NGS increasingly becomes more commonplace, limitations associated with availability of CLIA-certified laboratories will rapidly subside, and FDA-approved next generation sequencers are likely to be available in the near future.

As with the level of evidence for clinical implementation debate, a similar challenge lies in clearly demonstrating cost effectiveness of implementation through comparative effectiveness trials (61). From a reimbursement perspective, in order to truly evaluate cost savings, head-to-head studies with and without pharmacogenetic-guided therapy must be conducted (51). Aside from the low percentage of funding available for this type of research, this prospective design may not be necessary. For example, retrospective review of data collected on drugs, pharmacogenetic test usage, and inferred costs from health insurance and payers' databases may provide an adequate source of cost information for evaluation. It must also be taken into consideration that, while the initial drug cost may be higher, especially in the cancer setting, the money saved by prescribing the optimal therapy from the beginning (i.e., decreased doctors' visits and toxicities, improved outcomes) must not be disregarded.

Pharmacogenetic tests are most likely to be cost effective for medications with serious risks (i.e., high genotype relative risk or high rates) of toxicity or inefficacy and that are more expensive, such as chemotherapy agents. Once the price of NGS drops to well less than \$1000 in the near future, the cost-effectiveness debate will likely shift from a focus on clinical outcomes to a focus on the cost associated with setting up the infrastructure required to analyze, store the resulting data, and reporting the results of the tests.

As the cost of testing decreases and effectiveness becomes well documented, reimbursement will be more widely adopted. While it may not be cost effective now to genotype single variants, as technologies continue to improve and the price for pharmacogenetic tests continue to drop, the cost effectiveness burden will also continue to decrease rapidly. Furthermore, as NGS becomes increasingly more common, the potential for derived clinical benefit from genotyping also multiplies.

CONCLUSION

While most clinical and industry efforts are focused on exploring somatic alterations as a means to target driver mutations, this is not the only key to successfully optimize therapy. Germline variation can be used to predict and reduce drug toxicity, enhance clinical efficacy, and inform the potential biology of the tumor. Similarly, researchers and clinicians must take advantage of the information gained from the numerous sequencing efforts underway (30). Not only do these projects promote research and discovery, but the information generated should not be ignored clinically. With NGS technologies, validated pharmacogenetic gene-drug pairs should be interrogated and acted upon as indicated. Concordant detailed guidelines would greatly enhance translation into clinical practice.

In order for a genetic test to be adopted into clinical practice, it must provide reliable, actionable, and predictive information that the clinician would not have otherwise known. Before clinical implementation of a pharmacogenetic gene-drug pair, robust clinical evidence is necessary; however, reliance on prospective RCTs as the only way to justify implementation is unrealistic, and the delay associated with construction, conduction, and interpretation of results could potentially deprive patients of life-saving or life-extending therapies. Rather, the DNA samples provided from patients entered into cancer clinical trials and the drug development process should be exploited to retrospectively discover and validate pharmacogenetic associations. Previously the discussion had been focused on the future of pharmacogenetics, when all patients will have pre-emptive genotyping performed in anticipation of their future medical needs. However, we need to take advantage of what is happening now – NGS is increasingly common, particularly in the realm of cancer. Utilization of these sequencing efforts to facilitate pharmacogenetics implementation will provide the basis for demonstration of uptake and feasibility of mass pre-emptive implementation.

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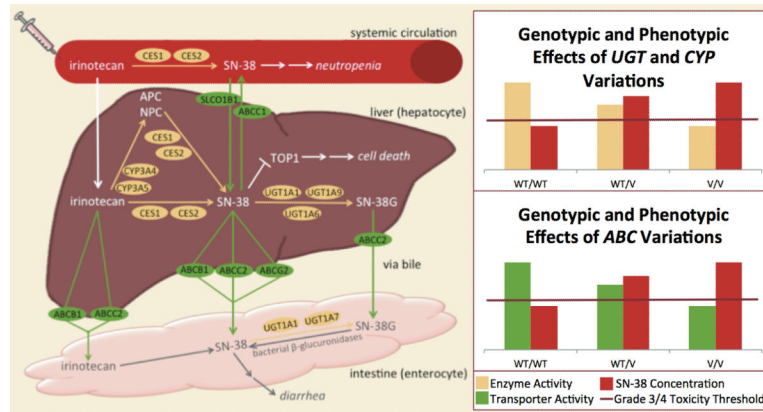


Figure 1. Example of the impact of germline pharmacogenetics on drug metabolism and toxicity
 Depicted is the pharmacokinetic and pharmacodynamic pathway of irinotecan. Graphs represent the effect of genotypic variation of key pharmacogenetic genes on the concentration of SN-38, the active metabolite that is also responsible for toxicities. Variations in *UGT1A1*, *UGT1A6*, *UGT1A7*, *UGT1A9*, *CYP3A4* and *CYP3A5* have been shown to (directly or indirectly) decrease enzymatic activity, resulting in decreased glucuronidation (inactivation) and, ultimately, an increase in SN-38 concentration. As illustrated in the graphs, *UGT* and *CYP* activity decreases in an additive manner in variant carriers (Please note that genetic associations between *CYPs* and irinotecan are not as strongly established as those with *UGT*). Along with this decrease in enzymatic activity, comes an increase in SN-38 concentration. The line on the graph represents the SN-38 concentration threshold for grade 3/4 (severe) toxicity. As depicted, variant carriers have SN-38 concentrations that more commonly cross the toxicity threshold. Likewise, variations in *ABCB1*, *ABCC2*, *ABCG2*, and *SCLO1B1* may decrease transporter activity, also resulting prolonged exposure to SN-38 and increased side effects (Please note that genetic associations between *ABC* genes and irinotecan/SN-38 are not as strongly established as those with *UGT*)

Abbreviations – WT: wildtype; V: variant

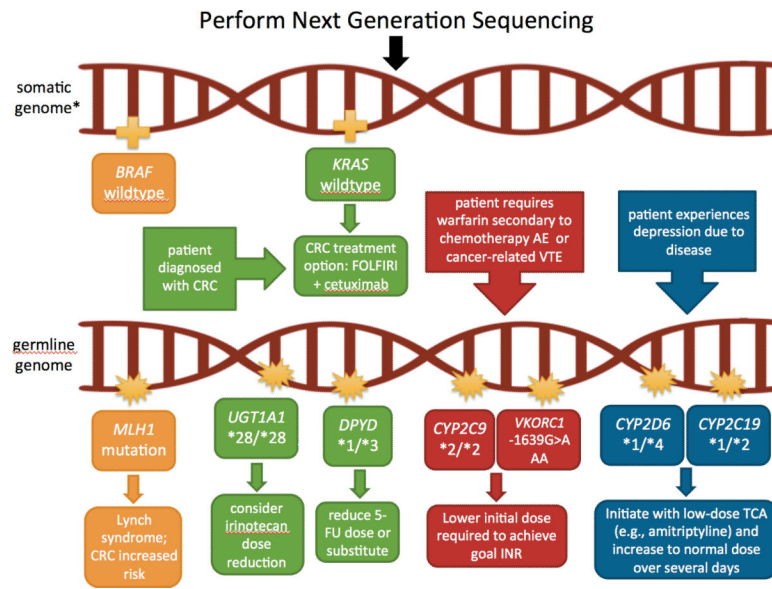


Figure 2. Example of how next-generation sequencing can be utilized to inform therapeutic decision-making

In this example, next-generation sequencing (NGS) is performed using both the tumor (somatic) and inherited (germline) DNA samples. NGS reveals a germline *MLH1* variant, which suggests possible Lynch syndrome (see Table 1). The *BRAF* wildtype tumor provides further evidence for this diagnosis, as *BRAF* mutations are extremely uncommon with Lynch syndrome. Due to Lynch syndrome, the example patient develops colorectal cancer (CRC). NGS of a colorectal tumor reveals the patient is *KRAS* wildtype, thus, is predicted to respond to an epidermal growth factor receptor (EGFR) inhibitor, such as cetuximab. The clinician decides to start the patient on the first-line treatment option of FOLFIRI [folinic acid (leucovorin), fluorouracil (5-FU), and irinotecan] + cetuximab. Germline NGS information can be used to further optimize dose selection and management. Specifically, the patient is determined to carry two reduced-activity *UGT1A1* alleles (*28/*28), putting him at an increased risk for severe irinotecan toxicity (neutropenia); a dose reduction is recommended. Additionally, the patient carries one inactive *DPYD* allele, which may warrant a 5-FU dose decrease. If the patient has encounters indications for other medications with validated pharmacogenetic associations (e.g., warfarin or amitriptyline in this case), that information will also be provided through NGS and should be readily available to inform drug decisions. *Note: Germline variants may or may not also be present on the somatic genome.

Abbreviations – AE: adverse event; CRC: colorectal cancer; INR: international normalized ratio; TCAs: tricyclic antidepressants; TDM: therapeutic drug monitoring; VTE: venous thromboembolism

Table 1

Examples of clinically significant cancer pharmacogenetic associations.

Gene	Drug(s)	Genome	Association	FDA-Label?(28)
Abelson murine leukemia viral oncogene homolog 1 (<i>ABL</i>)	bosutinib, dasatinib, imatinib, nilotinib, ponatinib	Somatic	Drug activity	Yes
Anaplastic lymphoma receptor tyrosine kinase (<i>ALK</i>)	crizotinib	Somatic	Drug activity	Yes
Cytochrome P450 2B6 (<i>CYP2B6</i>)	cyclophosphamide	Germline	Nephrotoxicity risk	No (62)
Cytochrome P450 2D6 (<i>CYP2D6</i>)	tamoxifen	Germline	Disease recurrence	No (63)
Cytochrome P450 3A4/3A5 (<i>CYP3A4/3A5</i>)	cyclophosphamide	Germline	Drug activity	No (64)
Dihydropyrimidine dehydrogenase (<i>DPYD</i>)	capecitabine, fluorouracil	Germline	Stomatitis, diarrhea, and neutropenia risk	Yes
DNA mismatch repair genes (<i>MLH1, MSH2, MSH6, PMS2</i>)	fluorouracil	Germline	Drug activity	No (65)
Estrogen receptor 1 (<i>ESR1</i>)	fulvestrant, tamoxifen, toremifene	Somatic	Drug activity	Yes
Fc fragment of IgG receptor (<i>FcγR</i>)	ceutuximab, rituximab, trastuzumab	Somatic	Disease progression, response	No (66)
Glucose-6-phosphate dehydrogenase (<i>G6PD</i>)	rasburicase	Germline	Hemolysis risk	Yes
Epidermal growth factor receptor 1 (<i>EGFR</i>)	afatinib, erlotinib, vandetanib	Somatic	Drug activity	Yes
Human epidermal growth factor receptor 2 (<i>HER2, ERBB2</i>)	trastuzumab, trastuzumab emtansine, lapatinib, pertuzumab	Somatic	Drug activity	Yes
Janus kinase 2 (<i>JAK2</i>)	ruxolitinib	Somatic	Drug activity	Yes
Kirsten rat sarcoma viral oncogene homolog (<i>KRAS</i>)	cetuximab, panitumumab	Somatic	Drug activity	Yes
Mitogen-activated protein kinase (<i>MAP2K, MEK</i>)	trametinib	Somatic	Drug activity	Yes
Promyelocytic leukemia/retinoic acid receptor, alpha fusion gene (<i>PML/RARα</i>)	arsenic trioxide, all trans retinoic acid (ATRA)	Somatic	Drug activity	Yes
Thiopurine methyltransferase (<i>TPMT</i>)	mercaptopurine, thioguanine, cisplatin	Germline	Myelosuppression risk, drug activity, ototoxicity risk	Yes
Thymidylate synthetase (<i>TYMS</i>)	capecitabine, fluorouracil	Germline	Drug activity	No (67, 68)
UDP-glucuronosyltransferase 1A1 (<i>UGT1A1</i>)	irinotecan, nilotinib	Germline	Neutropenia risk, hyperbilirubinemia risk, drug activity	Yes
V-kit Hardy-Zuckerman 4 feline sarcoma viral oncogene homolog (<i>KIT</i>)	imatinib	Somatic	Drug activity	Yes
V-raf murine sarcoma viral oncogene homolog B (<i>BRAF</i>)	dabrafenib, emurafenib	Somatic	Drug activity	Yes

Table 2
 Summary of worldwide recommendations by professional organizations and regulatory bodies for germline cancer pharmacogenetics.

Regulatory Body	Type of Initiative	Date of Initiative	Oncology Germline Gene-Drug Pairs Addressed	Recommendation Overview	
ASCO	Professional Organization Recommendations	GI cancer: 2006 (47)	<i>DPYD</i> -flourouracil and capecitabine	Insufficient evidence to recommend testing to monitor or predict response to therapy	
CPIC	Pharmacogenetic Guideline Consortium	Published 2011(69) Updated 2013(48)	<i>TPMT</i> -thiopurines	Advocate for <i>TPMT</i> testing before initiation	
				Provide dosing recommendation tables by phenotype for each of the thiopurines	
DPWG	Pharmacogenetic Guideline Consortium	Submitted	<i>DPYD</i> -flourouracil and capecitabine	Recommendation pending	
				Underway	Recommendation pending
				Published 2008(40) Updated 2011(42)	Intermediate metabolizers: consider aromatase inhibitor for postmenopausal women, avoid concomitant <i>CPY2D6</i> inhibitors
					Poor metabolizers: consider aromatase inhibitor for postmenopausal women
				<i>DPYD</i> -flourouracil, capecitabine and tegafur	Intermediate metabolizers: reduce dose by 50% or select alternative agent
Poor metabolizers: select alternative drug					
EGAPR(43)	Genomic Applications Working Group	2009(49)	<i>TPMT</i> -thiopurines	Intermediate metabolizers: select alternative drug or reduce dose by 50%, except thioguanine – select alternative agent	
				Poor metabolizers: select alternative drug or reduce dose by 90%, except thioguanine – select alternative agent	
				Reduce starting dose by 30% in <i>*28</i> homozygotes receiving >250 mg/m ²	
EMA(46)	Regulatory – Drug Label Indications		<i>UGT1A1</i> -irinotecan	Evidence insufficient to recommend for or against routine use of <i>UGT1A1</i> genotyping in patients receiving irinotecan	
				May choose lower dose or alternative drug if found to be <i>*28</i> / <i>*28</i>	
				Contraindicated if known <i>DPD</i> deficiency due to increased toxicity	
			<i>DPYD</i> -capecitabine, tegafur	Contraindicated in patients with <i>G6PD</i> deficiencies due to risk of hemolytic anemia or methemoglobinemia	
				<i>G6PD</i> -rasburicase	Patients with little or no inherited <i>TPMT</i> activity are at increased risk for severe toxicity from conventional doses, and generally require severe dose reductions.
			<i>TPMT</i> -mercaptapurine	<i>TPMT</i> genotyping or phenotyping can be used to identify patients with absent or reduced <i>TPMT</i> activity.	

Regulatory Body	Type of Initiative	Date of Initiative	Oncology Germline Gene-Drug Pairs Addressed	Recommendation Overview
FDA(70)	Regulatory – Drug Label Indications	2003	<i>UGT1A1</i> -erlotinib	Use with caution in patients with low expression of <i>UGT1A1</i> due to inhibitory effects on glucuronidation
		2004	<i>DPYD</i> -capecitabine	Contraindicated with <i>DPD</i> deficiency due to potentially fatal toxicity
		2002	<i>DPYD</i> -flourouracil	Should not be used in patients with <i>DPD</i> deficiency due to potential toxicities
			<i>G6PD</i> -rasburicase	Contraindicated in patients with <i>G6PD</i> deficiency due to risk of hemolysis. Screen all higher risk patients for <i>G6PD</i> deficiency (e.g., African or Mediterranean ancestry) prior to initiation.
		2011	<i>TPMT</i> -cisplatin	Variants in <i>TPMT</i> associated with increased risk of ototoxicity. All pediatric patients should undergo audiometric testing at baseline, prior to each dose, and for several years post therapy.
			<i>TPMT</i> -mercaptopurine	Recommends, but does not require genetic testing. Homozygous-deficient patients accumulate excessive drug concentrations, which increase the risk for toxicity. They generally require substantial dose reductions. Heterozygous patients accumulate higher concentrations than people with normal <i>TPMT</i> activity and are also more likely to experience toxicity. Most tolerate normal doses.
		2001	<i>TPMT</i> -thioguanine	Individuals with an inherited deficiency of <i>TPMT</i> are at an increased risk for myelosuppression. There are laboratories that offer testing for <i>TPMT</i> deficiency.
		2005	<i>UGT1A1</i> -irinotecan	<i>UGT1A1</i> *28 homozygotes are at an increased risk for neutropenia. Consider dose reduction by at least one level; precise dosing unknown.
		2007	<i>UGT1A1</i> -nilotinib	<i>UGT1A1</i> *28 patients may be at increased risk for hyperbilirubinemia.
		NCCN	Clinical Practice Guidelines	Breast: 2013(71)
NHL: 12/2012(72)	<i>G6PD</i> -rasburicase			Patients with <i>G6PD</i> deficiency may have increased adverse reactions (methemoglobinemia and severe hemolysis)
ALL: 2012(73)	<i>TPMT</i> -thiopurines			Consider testing for <i>TPMT</i> polymorphisms in patients receiving 6-mercaptopurine maintenance therapy due to increased risk of hematopoietic toxicity in variant carriers
CRC: 2012(74), 2013(44)	<i>UGT1A1</i> -irinotecan			Genetic polymorphisms in <i>UGT1A1</i> may lead to drug accumulation and possible severe toxicity. Mentions commercial tests available and FDA-label warning for <i>UGT1A1</i> *28 carriers. State guidelines for use in clinical practice not available.

Regulatory Body	Type of Initiative	Date of Initiative	Oncology Germline Gene-Drug Pairs Addressed	Recommendation Overview
PharmGKB(75)	Web-based Database	2010 – present		Summary of CPIC and DPWG recommendations FDA and EMA label excerpts

Abbreviations – ASCO: American Society of Clinical Oncology; CPIC: Clinical Pharmacogenetics Implementation Consortium; DPWG: Dutch Pharmacogenetics Working Group; EGAPP: Evaluation of Genomic Applications in Practice and Prevention; EMA: European Medicines Agency; FDA: U.S. Food and Drug Administration; NCCN: National Comprehensive Cancer Network; PharmGKB: Pharmacogenomics Knowledgebase; *CYP2D6*: cytochrome P450, family 2, subfamily D, polypeptide 6; *DPYD*: dihydropyrimidine dehydrogenase; *G6PD*: glucose-6-phosphate dehydrogenase; *TPMT*: thiopurine S-methyltransferase; *UGT1A1*: UDP glucuronosyltransferase 1 family, polypeptide A1