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The right drugs at the right time for the right patient: the MD Anderson precision oncology decision support platform

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Abstract

The development of resources for clinical interpretation of cancer-associated genetic alterations has significantly lagged behind the technical developments enabling their detection in a time-and cost-efficient manner. The lack of scientific and informatics decision support for oncologists can lead to no action being taken or suboptimal therapeutic choices being made, which could affect the clinical outcome of a patient as well as convoluting research findings from clinical trials. In this article, we describe the precision oncology decision support (PODS) platform developed within The Sheikh Khalifa Bin Zayed Al Nahyan Institute for Personalized Cancer Therapy (IPCT) at MD Anderson Cancer Center; the platform aims to bridge the gap between molecular alteration detection and identification of appropriate treatments.

Keywords

Precision oncology; decision support; genomics; personalized medicine

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Introduction

Precision oncology, or personalized cancer medicine, is based on the observation that cancers, even within the same disease site, are driven by a multitude of different molecular aberrations. Under this paradigm, physicians seek to define these alterations and tailor therapy to target the functional consequences of the aberrations specifically. Clinical trials currently exploring whether targeted therapy is more advantageous than standard-of-care across tumor types include the SHIVA clinical trial at the Institut Curie [1], the IMPACT 2 clinical trial at MD Anderson Cancer Center and NCI-MPACT (Molecular Profiling-Based Assignment of Cancer Therapy for Patients with Advanced Solid Tumors). However, precision oncology has already been applied and proven beneficial in several specific tumor types. For example, it is standard of care to treat HER2+ metastatic breast cancers with an FDA-approved HER2-targeting agent [2], because HER2 amplification and overexpression are proven to be predictive of response [3,4]. However, there is not an FDA-approved therapy indicated for the vast majority of molecular alterations. Alternatively, physicians might choose to treat the patient in an experimental setting, but several questions must be addressed beforehand. (i) Is the specific alteration actionable? (ii) If actionable, what are the genotype-matched therapeutic options targeting the aberration or the pathway activated by the aberration? (iii) What is the level of evidence for each drug in the context of the patient's tumor type? (iv) Are the agents available and where are they from? There are tremendous challenges associated with each of these questions as a result of physician time constraints and limitations in genomic knowledge that are not realistic for a practicing oncologist to overcome without ongoing support from geneticists, molecular biologists, computational scientists, computer programmers and bioinformaticians [5]. Thus, decision-support platforms, such as the precision oncology decision support (PODS) team within the Sheikh Khalifa Bin Zayed Al Nahyan Institute for Personalized Cancer Therapy (IPCT) at the MD Anderson Cancer Center, and others [6], are being developed to support this approach. In this paper, we present the PODS approach for discerning which genomic alterations are actionable, in which tumor types, for which drugs and how this information is communicated to oncologists. There are several different types of biomarkers applicable for decision support. However, next-generation sequencing (NGS) is most widely used because it is timely and cost-efficient [7,8]. Thus, the PODS team has first focused efforts on decision-support related to NGS.

Determining whether a specific alteration is actionable

Once a physician receives a molecular testing report from a Clinical Laboratory Improvement Amendments (CLIA)-certified laboratory, he or she must decide if a detected alteration is actionable (i.e. could actions based on the aberration benefit the patient). If DNA is sequenced from a matched normal sample, a mutation can be confidently determined as somatic or germline. Identified germline alterations should be reviewed as there are different considerations for determining the actionability of these alterations and return of these results with the support of genetic counseling. In this paper, we focus our discussion on the actionability of somatic mutations. Alterations can be considered actionable because they are diagnostic, prognostic or predictive of drug response; however, the primary objective of the PODS team is to determine whether alterations are actionable

with regard to therapeutic drug response. The PODS team reviewed over 524 genes routinely tested in clinical samples to determine whether there is a clinically available drug that directly or indirectly targets alterations in the gene; and whether there is (as a basic minimum) preclinical evidence showing that genomic alterations in the gene are drivers of tumorigenesis and confer sensitivity to targeted agents. Genes that meet both of these criteria and/or are used as selection criteria for clinical trial enrolment qualify as actionable – a full list is available from Meric-Bernstam et al. [9]. Our list is comparable with the recently published TARGET actionable gene list [10] for those genes deemed therapeutically actionable. However, we supplemented our list with genes where alterations are being selected for in clinical trials and have not focused on genes actionable for diagnostic or prognostic purposes only. In the PODS actionable list, we provide the types of alterations that are actionable for each gene. For example, fibroblast growth factor receptor $(FGFR)$ is actionable for activating mutations, gene amplification and activating gene fusions [11,12]. However, there is only evidence to support actionability of MLL gene fusions [13–15], not mutations or copy number changes, at this time.

Once the gene and alteration type are determined to be actionable, the variant (i.e. specific mutation or fusion event) itself must be considered. To facilitate clinical decision making, we provide a granular classification of variant actionability that takes into consideration what is known in the published literature, our in-house functional genomics platform, as well as information about the localization of the mutation within the gene, which might be suggestive of actionability. Thus, we have created the following classifications for variant actionability: 'yes –literature based', 'yes – functional genomics', 'yes – inferred', 'potentially', 'unknown' and 'no' (Box 1). The actionable variant calls are directly related to the functional significance of the variant (Figure 1). A variant is functionally significant if it results in a change in the activity, expression or stability of the expressed protein. The PODS team systematically categorizes the functional significance of each variant as 'activating', 'inferred activating', 'inactivating', 'inferred 'inactivating', 'likely benign' or 'unknown', based on manually curated information (Box 2). A variant is classified as actionable if the functional effect is activating or inferred activating in an oncogene or inactivating or inferred inactivating in a tumor suppressor. Variants with published evidence that they probably do not alter function (i.e. likely benign) are considered not actionable. The IPCT also has an experimental arm, which tests for an alteration's effect on the growth and/or viability of BaF3 and MCF10A cells. However, there are no data currently available regarding the functional significance of a specific aberration within the published literature or IPCT functional genomics platform. Nevertheless, knowledge of the variant location within the gene and relationship to known functional aberrations can provide some insight. We utilize this information to separate those mutations of unknown functional significance into two categories of actionability: 'potentially' or 'unknown'. Currently, functional predictions based on computational tools are not used to define actionability owing to limitations in accuracy and agreement across currently available platforms [16]. We are iteratively building, validating and improving algorithms in house, however, these are not sufficiently robust for patient management [17].

Box 2

Categories of functional significance

Providing clinicians with information regarding variant actionability is extremely useful for clinical trial patient selection. For example, the interpretation of results derived from a trial designed to test the hypothesis that FGFR inhibitors are effective for tumors expressing alterations in FGFR genes will be complicated by the inclusion of patients with mutations known or predicted to not result in activation of the FGFR pathway. Although there are public databases that provide variant-level information about published drug associations, such as My Cancer Genome ([http://www.mycancergenome.org/\)](http://www.mycancergenome.org/) or Targeted Cancer Care [\(https://targetedcancercare.massgeneral.org/](https://targetedcancercare.massgeneral.org/)), information about the functional effect of an alteration is often lacking and is limited to more-frequently detected alterations. In the absence of decision support, clinicians would be left to filter through millions of abstracts available on PubMed or publicly available literature accessible through internet browsers, via keyword searches that are often inefficient at procuring a complete set of literature of high relevance for their review. Thus, the PODS platform provides support to the physician by extracting, curating and communicating information about a variant's actionability back to the physician.

Determining clinically available therapeutic options

If a variant is deemed actionable or potentially actionable, genotype-matched therapies for consideration are presented to the treating oncologist. To accomplish this, drugs are annotated for their direct targets and relevant genes. Direct targets are proteins directly bound and inhibited by the drug (IC_{50} <1 μ M), and the genes encoding them are annotated as relevant for the drug. Additionally, indirect targets are considered if there is published evidence that mutations in the gene sensitize cells to downstream targeting drugs. For example, there is evidence that mutations in the phosphatase and tensin homolog (*PTEN*) gene sensitize cells to mammalian target of rapamycin (mTOR) inhibitors [18,19]. Thus, mTOR is an indirect target of PTEN mutations, and PTEN is annotated as a relevant gene for all mTOR inhibitors. Information is retrieved by searching the published literature, as well as drug–gene interaction databases, such as the Druggable Genome Interaction Database [\(http://dgidb.genome.wustl.edu/\)](http://dgidb.genome.wustl.edu/) and other publicly available sources, such as NCI Drug Dictionary ([http://www.cancer.gov/drugdictionary\)](http://www.cancer.gov/drugdictionary). As with other literature searches, these are extensively manually curated prior to use by PODS.

Determining the level of evidence for use

Once potential therapeutic options are identified, the level of evidence for use in an alteration-and tumor-type-specific context is considered. There is an extremely limited number of genotypes associated with an FDA-approved indication for treatment [20]. If there is no FDA-approved drug indicated for the patient's tumor type and specific alteration, then the physician could choose to: (i) use an FDA-approved drug off-label (targeting the same alteration approved in another tumor type or to target a different variant thought to have the same functional effect; (ii) use an FDA-approved drug within the context of a clinical trial designed to test the use and efficacy of the drug in different tumor types or on other variants of the same gene; or (iii) use experimental therapies through clinical trials. Off-label use is generally discouraged except in scenarios where there are strong clinical data showing that the alteration sensitizes cells of diverse tumor types to the drug [20]. We

have advocated that all off-label use and responses should be captured in a registry to increase the utility of the process. Ultimately, creation of larger international data-sharing initiatives could facilitate sharing of clinical outcome information for drugs used in experimental settings in an international database. To facilitate decision making, the PODS team developed a three-tiered scale that considers the level of evidence for use of a drug in the context of a biomarker and tumor type, as described by Meric-Bernstam et al. [9]. Level 1A associations are for drugs with an FDA-approved indication to treat tumors with a specific alteration within specific tumor types. The lower levels of evidence are based on experimental (clinical or preclinical) data. The PODS level of evidence scheme is complimentary to other proposed schemes [10,16,21–23]. It takes into account whether the utility of the biomarker was assessed prospectively or retrospectively, as a primary or secondary objective, and separates clinical data in adequately powered studies from case studies and preclinical data. However, our scheme is primarily focused on the predictive value of the alteration to the therapy or effectiveness of a drug within a biomarker-selected cohort, as opposed to prognostic or diagnostic use of biomarkers, and it provides fine granularity of the evidence for links between specific aberrations and experimental therapies. The level of evidence is important for review when considering multiple drugs for a particular alteration and when considering which from multiple alterations to target. Additionally, our scheme considers genotypes that confer resistance to a therapy. For example, KRAS mutations confer resistance to anti-epidermal growth factor receptor (EGFR) therapies in colon cancer [24,25], thus colon cancer patients harboring activating KRAS mutations should not be treated with these therapies outside of clinical trials assessing ways to bypass the effects of KRAS. Thus, it is crucial to consider the therapeutic implications of alterations in the context of one another.

Often there is no evidence at the level of a specific variant. For example, a single-patient case study shows a non-small-cell carcinoma (NSCLC) with a HER2 A775_G776insYVMA mutation responds to afatinib therapy (level 3A evidence) [26]; however, there are no studies showing sensitivity of NSCLC tumors harboring another activating HER2 mutation, D769H [27], specifically to afatinib. Thus, to capture these differences in specificity of evidence, the PODS annotation scheme captures four tiers of evidence: gene, functional class (activating or inactivating), alteration type (mutations, copy number changes and gene fusions) and variant.

Another aspect that clinicians could consider when deciding whether to act on a variant is its frequency among mutations detected in cancer. Informatics tools developed by PODS automatically extract frequency information for all variants reported in cBIO ([http://](http://www.cbioportal.org/) www.cbioportal.org/), Catalogue of Somatic Mutations in Cancer (COSMIC; [http://](http://cancer.sanger.ac.uk/cosmic/) cancer.sanger.ac.uk/cosmic/) or MD Anderson sequencing platforms. A more frequently reported alteration might be considered more likely to be a driver of tumorigenesis [28]. Additionally, the frequency of alleles within the tumor sample sequenced (allelic frequency) could also be used to determine the likelihood that an alteration is a driver event and for prioritizing which of multiple alterations to pursue [29,30]. If a particular drug can target multiple alterations detected in a patient's tumor this strengthens the logic for the use of that therapeutic agent.

Determining the availability of genotype-matched therapies

If there is no FDA-approved drug indicated for the patient's alteration and tumor type then a physician could consider an experimental therapy within a clinical trial setting. It can be difficult and time consuming to identify all of the genotype-matched clinical trials appropriate for a patient. This is partly because there is no structured format for recording genotypes that are being selected for or that are relevant within registered clinical trial documents. Thus, the PODS team systematically curates clinical trials for their relevance to specific genotypes. We categorize clinical trials in two broad categories: genotype-selected and genotype-relevant. Genotype-selected trials require detection of a particular biomarker for patient enrolment. Genotype-relevant trials use drugs that are annotated by PODS as relevant for alterations in specific genes. Because the vast majority of clinical trials are not genotype-selected trials, this process dramatically increases the number of trials for consideration compared with a keyword search for a gene within clinical trial registries. Additionally, we are currently in the process of creating an interactive clinical trial portal where dynamic logistical data, such as trial status, number of open slots, currently accepted tumor types and granular eligibility criteria (performance status, brain/CNS metastasis allowance, etc.) are captured, in addition to manually curated, genotype-relevant information. The portal is queryable by clinicians for the purpose of identifying open clinical trials that best match a patient's molecular and clinical profile.

Communicating information between decision support and clinicians

The PODS team is developing several methods for communicating curated information to clinicians. Our clinical trial portal is one means by which physicians can proactively search for trials that are a genotype match for their patients. Additionally, we provide proactive email alerts of genotype-matched clinical trials available at MD Anderson Cancer Center to physicians that receive molecular testing for their patients through IPCT. These methods facilitate identification of clinical trials once it is determined that an alteration is actionable. To supply clinicians with a convenient means of requesting annotations of alterations for the purpose of determining actionability, we have created a web-based form where requests are entered in a standardized manner. Annotations are provided that include the functional significance, actionable gene and actionable variant calls previously described in addition to a detailed descriptive annotation of the information, with references, that was used to make those decisions. More detailed reports, including curated drug information and level of evidence, are being designed.

After annotations are provided, a clinical decision follow-up questionnaire is sent to the requester, enabling the PODS team to capture which alterations were indeed acted on by the physician and the therapy chosen. This is powerful information for retrospective studies analyzing the functional effect of an alteration and patient response to a particular therapy. Additionally, the PODS team routinely submits any alteration requested by a clinician for annotation and deemed 'unknown' for functional significance to the functional genomics platform. When results are available, the information is communicated to the requesting clinician. Lastly, we have created an open-access Website: Personalized Cancer Therapy [\(https://pct.mdanderson.org/](https://pct.mdanderson.org/)), which currently provides information regarding over 24

actionable genes. Each gene page discusses genetic alterations deemed functionally or therapeutically significant, relevant drugs, level of evidence associated with each drug in genotype and tumor type-context, and genotype-matched clinical trials available at MD Anderson and elsewhere. Importantly the data underlying the portal are extensively curated by domain experts as well as by clinicians actively involved in the management of appropriate clinical trials. This is an expanding website, with new gene pages added on a continuous basis and information routinely updated.

Concluding remarks

The PODS platform provides clinical decision support for precision oncologists within MD Anderson by providing them with easily accessible means to obtain scientifically curated information about the functional effects of genetic alterations, genotype-matched therapeutics and genotype-matched clinical trials that are relevant for their patients. Personalized Cancer Therapy [\(https://pct.mdanderson.org/](https://pct.mdanderson.org/)) makes aspects of the process available to all physicians and indeed is being used to drive clinical trial designs elsewhere. We believe the future implementation of an electronic health record system with structured fields for detected molecular alterations as well as enforcement of clinical trial registries with the same structured information is necessary to enable a routine delivery of precision oncology. Delivering on the promise of precision oncology will require a strong, user friendly and rapidly adapting decision support process. Precision oncology is truly a team approach that must incorporate expert information from clinicians, computational scientists, bioinformaticians, computer programmers and biological scientists [5,9,16,31,32]. The PODS platform brings these experts together to improve patient care and enhance research efforts.

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Highlights

- **•** Precision oncology matches tumor molecular alterations with appropriate therapies
- **•** Decision support platforms are crucial for optimal and scalable implementation
- **•** Actionability of specific variants, as well as specific genes, should be assessed
- Level of evidence should be considered for each alteration and therapy considered
- **•** Clinical outcome registries for drugs used in experimental settings are suggested

Figure 1.

Flowchart for deciphering whether the genetic variant is actionable. This flowchart represents the questions asked (diamonds) and possible information determined (parallelograms) to reach an answer (circles) regarding whether a genetic alteration or variant is actionable.