SHORT RESEARCH ARTICLE

Why tyrosine kinase inhibitor resistance is common in advanced gastrointestinal stromal tumors [v1; ref status: indexed, http://f1000r.es/1ac]

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Abstract

**Background:** Most patients with advanced gastrointestinal stromal tumors (GIST) develop drug resistance to tyrosine kinase inhibitors (TKIs) within two years of starting therapy, whereas most chronic myeloid leukemia (CML) patients in chronic phase still exhibit disease control after a decade on therapy. This article aims to explain this divergence in long term outcomes.

**Methods and results:** By combining clinical and experimental observations with mathematical formulas we estimate that, in advanced GIST, the genetic changes responsible for resistance are generally already present at disease detection.

**Conclusion:** This result has relevant clinical implications by providing support for the exploration of combination therapies.
Introduction

Gastrointestinal stromal tumors (GIST) are sarcomas arising in the muscle wall of the gastrointestinal tract. The majority of GISTs are driven by activating mutations in the receptor tyrosine kinases KIT or PDGFR-α, whose aberrant signaling induces uncontrolled proliferation and decreased apoptosis. Because of the small number of driving genetic mutations, GISTs represent a paradigm for kinase-driven solid tumors, and offer one of the best models to shed light on fundamental questions about cancer, providing a critical understanding of more genomically complex solid tumors.

Tyrosine kinase inhibitors (TKIs), such as imatinib and sunitinib, block the aberrant activation of KIT, leading to major clinical benefits of objective response and durable disease control. Imatinib represents the standard first-line therapy for this disease when it is surgically incurable. However, imatinib does not cure advanced GIST. Moreover, while the large majority of patients treated with imatinib do not show signs of primary resistance (disease progression within the first six months of therapy), secondary resistance to imatinib emerges in at least half the patients after two years of therapy and in more than 80% of patients after seven years.

Imatinib was originally introduced to treat chronic myeloid leukemia (CML), because of its specificity for the TK domain in the bcr-abl translocation gene, which characterizes the disease. Imatinib represents the standard first-line therapy and has led to dramatic improvements in outcomes for CML patients in the chronic phase: at six years the estimated event-free survival is 83%, and an estimated 93% of treated patients are free from progression. Importantly, secondary resistance is far less frequent in CML.

In this article we consider two fundamental, clinically relevant, but still unanswered questions: Why do patients with advanced GIST often relapse and does secondary resistance originate before or during TKI treatment?

Materials and methods

In order to obtain estimates for the probability of at least one drug resistant GIST cell being present at the time the tumor reaches a given diameter, and before the introduction of the TKI, we used formula (5) in Tomasetti et al.:

\[ P_R = 1 - e^{-\frac{\lambda}{1-a-b} \left( \frac{1-a-b}{d+lb} - \frac{1}{1-a-b} \right)} \]

This formula estimates the probability of having resistant mutants \( P_R \) in a tumor of size \( M \) (number of cells), and is derived by counting the number of divisions required for the tumor to reach that size. It is assumed that, at each cell division, there is a small probability \( u \) that one of the daughter cells is hit by a mutation known to induce drug resistance. The parameter \( I \) and \( d \) are the birth and death rates for the cell population, while \( a \) and \( b \) are the probabilities for the cells’ mode’s of division. This mathematical result is based on standard assumptions and has been successfully used to predict the development of acquired resistance to targeted epidermal growth factor receptor (EGFR) blockade in colorectal cancer.

Using these results and parameters values, we can derive the lower bound of Figure 1 for the probability of at least one drug resistant GIST cell being present at the time the tumor reaches a given diameter, and before the introduction of the TKI. Because we selected parameters to generate an unfavorable scenario to our hypothesis, we expected the actual curve to be above the curve of Figure 1. The calculation and the figure were obtained using the freely available R software (version 2.15.3).

Results

We combined experimental data with our mathematical formulas that recently have been successfully used to predict the development of acquired resistance to targeted EGFR blockade in colorectal cancer. By so doing, we have obtained the relationship shown in Figure 1 between the tumor diameter at detection, and the probability that the tumor already harbors a resistant mutant at that time (see Materials and methods for the derivation of Figure 1). For example, for GISTs with diameters of 2 and 6 cm we estimate this probability to be equal to 0.12 and 0.97, respectively.

We now bring these elements to bear in interpreting recent clinical observations. The size of a GIST at presentation may vary between 1 and >40 cm in diameter. For example, in a clinical trial (NCT00237185) of 147 patients with unresectable or metastatic GIST expressing KIT and treated with imatinib, 75% of the patients had a GIST whose diameter was larger than 7 cm at treatment.

Based on Figure 1, we would expect the large majority of these patients to have resistant mutant cells already present by the time of GIST detection and therefore to develop resistance during therapy. In fact, only about 20% of the patients in this clinical trial were still progression-free after five and a half years from the start of imatinib treatment.

The combination of experimental and clinical data with our mathematical estimates implies then that secondary resistance in patients...
Discussion

It has been recently suggested that secondary resistance may be the result of the treatment itself rather than pretreatment mutations. It is worth considering this issue further. Secondary mutations are not usually found at detection using conventional Sanger sequencing techniques. However, these techniques are not sensitive for rare events. Because imatinib has not yet selected for resistant mutants, they may remain extremely rare, and thus are likely missed by the assays used for mutation analysis. Thus, the fact that mutants are rarely found at detection does not contradict the possibility that the point mutations did occur before treatment. Using our mathematical formulas again, we estimate that if resistance is present in a GIST of 2 cm in diameter, only approximately 1 out of $10^5$ tumor cells will be drug resistant. Most importantly, while resistance may also originate during treatment, this does not exclude the fact that random point mutations can occur during the re-treatment phase at each cell division. We have shown that the estimated number of resistant mutants produced before the start of the treatment is sufficient to explain the observed clinical data. This logic also holds for the development of tertiary resistant clones that emerge within, on average, six months of starting second-line therapy with sunitinib following failure of imatinib. Thus, our calculations, while not addressing the problem of primary resistance, are able to explain secondary resistance in advanced GIST.

Our prediction that patients with smaller GISTs at detection will have a smaller probability of progression has been already supported by the clinical correlation of tumor size at presentation with improved outcomes on imatinib. With sufficient data, it may also be possible to observe a relation between tumor diameter at detection and probability of resistance that is similar in shape to the data presented in Figure 1, since a resistant clone originating before therapy should eventually grow to a detectable size. Lastly, in the future, with next-generation DNA sequencing techniques, it may become possible to detect the presence of secondary mutations that represent a very small fraction of cells at initial presentation.

Our results, if confirmed, would have important clinical implications. A therapy using a combination of TKIs (for example by adding a new agent with novel spectrum activity to imatinib) would select only for those cells which have been hit by two point mutations, each causing resistance to one of the drugs. We estimate that such a probability is very small for realistic values of the GIST diameter (not considering cross resistance). Therefore, combination therapy could drastically reduce the development of drug resistance caused by point mutations. Also, earlier detection of GIST offers the potential to provide measurable improvements in outcome, as long as it can result in a sufficiently large reduction in the average diameter at detection.

Author contributions

CT and GP conceived the idea. CT, GDD, and GP designed and performed research, and wrote the manuscript. CT contributed the mathematical analysis.

Competing interests

CT and GP have no competing interests to disclose. GDD discloses the following: Novartis. Consultant, <$10k per annum. Honorarium <$10k per annum. Research support to Dana-Farber for specific clinical trial agreements in our sarcoma unit, $>200,000 per year. Research support to Dana-Farber for specific clinical trial agreements in our sarcoma unit, $>200,000 per year. Pfizer. Consultant, <$10k per annum. Honorarium <$10k per annum. Research support to Dana-Farber for specific clinical trial agreements in our sarcoma unit, $>200,000 per year. Infinity Pharmaceuticals. Consultant, <$10k per annum. Research support to Dana-Farber for specific clinical trial agreements in our sarcoma unit, $>200,000 per year. Regulatory presentation support, uncompensated. Glaxo Smith Kline. Consultant, <$10k per annum. Kolltan Pharmaceuticals. Chair, Scientific Advisory Board. Chair, Medical Advisory Board. Consultant. Equity (minor stake, non-public).

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References


Referee Responses for Version 1

Gerald Prager
Department of Medicine, University of Vienna, Vienna, Austria

Approved: 18 July 2013

Referee Report: 18 July 2013
Tomasetti et al. were combining clinical and experimental observations with mathematical formulas to estimate that in advanced GIST, the genetic changes responsible for resistance are already present from the beginning of treatment. The model is of highest interest, especially in respect of second and third line treatment with targeted therapies. However, prospective validation is required before this model can be incorporated in combination drug trials.

I have read this submission. I believe that I have an appropriate level of expertise to confirm that it is of an acceptable scientific standard.

Competing Interests: No competing interests were disclosed.

Shiro Urayama
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Approved: 18 July 2013

Referee Report: 18 July 2013
This is a brief report depicting a mathematical model based estimation of presence of chemoresistant cells in gastrointestinal stromal tumor (GIST). The model incorporates the notion of the presence of rare cells possessing stem cell attributes (cancer stem cells) among heterogeneous cells within such mass, contributing to the chemotherapeutic resistance. On the basis of genetic point mutation as a source for the resistance, the probability formula for existence of resistant cells at a tumor size was constructed. Despite some constraints, the article presents reasonable assumptions providing for the lower bound of the probability. Based on this model, many of the clinical index GIST mass has significant likelihood of containing a tyrosine kinase inhibitor resistant cell at the time of the discovery. If future clinical findings support the assumptions made, the model would demonstrate a rational for combination therapeutics.

Specific points:

Title and Abstract: Appropriate

Article content: Methods and approaches are described appropriately and references made to the main formula utilized

Conclusions: Appropriate
Data: Appropriate as included

Minor item:

Materials and Methods second paragraph, 5th sentence should have “10^9 cancer cells” instead of “10^{-9} cancer cells are present per cm^3 of tumor mass”.

I have read this submission. I believe that I have an appropriate level of expertise to confirm that it is of an acceptable scientific standard.

**Competing Interests:** No competing interests were disclosed.

1 Comment

**Author Response**

**Cristian Tomasetti**, Johns Hopkins University, USA
Posted: 11 Nov 2013

We thank the referee. It should read "estimated that 10^9 cells".

**Competing Interests:** I am Cristian Tomasetti, one of the authors of the article.