Cancer is the disease in which the promise of drug and companion biomarker outputs from the human genome sequence has been best exemplified so far (1). Remarkable progress has been made in “drugging the cancer genome” and developing personalized or precision cancer medicine in which treatment is increasingly based on the genetic makeup of the individual tumor (2). Yet, we have arguably now reached a major inflection point. Thus, notwithstanding a veritable deluge of data from massively parallel sequencing and other large-scale omics initiatives, we remain far from achieving a complete systems biology understanding of human cancers (3). Furthermore, although many molecularly targeted cancer drugs have been approved, median survival is generally enhanced only by a matter of months and drug resistance is just as problematic as with traditional cytotoxic drugs—attributable to tumor heterogeneity, Darwinian selection, and other large-scale omics initiatives, we remain far from achieving a complete systems biology understanding of human cancers (3). Furthermore, although many molecularly targeted cancer drugs have been approved, median survival is generally enhanced only by a matter of months and drug resistance is just as problematic as with traditional cytotoxic drugs—attributable to tumor heterogeneity, Darwinian selection, and other large-scale omics initiatives, we remain far from achieving a complete systems biology understanding of human cancers (3). 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The common 40-digit combination lock generates 64,000 permutations, which is why deciphering the code is essentially impossible if it is forgotten. For the approximately 250 approved cancer drugs, 3,125 2-way combinations and 2,573,000 3-way combinations are possible, whereas for the approximately 1,200 developmental oncology drugs, the respective numbers are 719,000 and 287,280,400 (4). Viewed in another way, 7,626 2-way and 310,124 3-way potential combinations are possible for our estimate of 124 conventionally druggable targets among the 479 genes reported to have causative genetic alterations in cancer (4). How can we reduce these prohibitively large numbers to actionable clinical combinations? The main options currently are as follows: (i) hypothesis-driven approaches based on our increasing knowledge of the molecular basis of drug resistance; or (ii) large-scale strategies centered on in silico modeling, genetic technologies such as synthetic lethal screens, and unbiased combinatorial drug screens (4).

In the new work, Held and colleagues (5) used large-scale unbiased combinatorial drug screening to identify cocktails that are resistant to the clinical BRAF inhibitor vemurafenib. Cancer Discov; 3(1): 14–9. ©2012 AACR.

See related article by Held et al., p. 52 (5).
Evaluation of 28 Melanoma cell lines

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- Single-agent screen
- Combinations screen
- Confirmatory analyses

**Figure 1.** Study workflow for unbiased combinatorial screening, leading to effective genotype-selective combinations discovered by Held and colleagues (5), and the emerging pathways and interaction network derived from their data. **A,** a mechanistically broad library of 150 small-molecule compounds was screened against 28 early-passage human melanoma cell lines, including mutant BRAF or RAS and wild type (WT). A representative set of 40 compounds that were broadly or selectively active against the melanoma panel were chosen for the combinatorial screen. The most synergistic combinations were carried through for further confirmatory analyses, including elucidation of target engagement and pathway modulation; confirmation of on-target activity through the use of alternative chemotype compounds against the same target; identification of a promising triple combination in BRAF-mutant cells; exploration of avoidance of combination-resistant clones arising; and finally, in vivo demonstration of the promising therapeutic effect of a selected 2-drug combination in a mutant NRAS melanoma xenograft in nude mice. **B,** signaling pathways involved in the effective triple combination active in vemurafenib-resistant BRAF-mutant cells. The combination of the BRAF, EGFR/ERBB2, and AKT inhibitors was found to be highly synergistic and most effective in overcoming resistance when compared with 2-agent combinations. Resistant clones could not be generated when melanoma cells were exposed to the triple-drug regimen. Biomarker data suggest that the triple combination is very effective at reducing signaling output in the phosphoinositide 3-kinase (PI3K)-AKT pathway and the mutant BRAF-MEK-ERK MAPK pathway. Dotted lines represent omitted pathway components. RAF homo- and heterodimers are not shown for simplicity. **C,** 2-drug combinations found to be effective in NRAS-mutant cells exploit both signaling and metabolic pathways. HMGCR is a key component of the mevalonate pathway, leading to the production of geranyl-geranyl pyrophosphate, required for the prenylation of NRAS, and hence for localizing NRAS proximally to the plasma membrane. Inhibition of prenylation through the inhibition of HMGCR alone did not have a major growth inhibition effect on RAS-mutant cells; however, combining it with either an HSP90 molecular chaperone inhibitor or a pan-cyclin-dependent kinase (CDK) inhibitor gave significant synergy. It is likely that the synergy seen within NRAS-mutant melanomas involves the cooperative effects of blocking the essential NRAS prenylation through HMGCR inhibition, thus preventing membrane localization and reducing NRAS-RAF-MEK MAPK signaling output, coupled with depletion of RAF isoforms, CDK4, and other relevant HSP90 clients in the case of 17-DMAG, or the inhibition of cell cycle and transcriptional kinases for flavopiridol. Dotted lines represent omitted pathway components; brown hexagons represent metabolites. (continued on following page)
150 small molecules selected to represent diverse biologic mechanisms. One-third comprised a wide range of kinase inhibitors, whereas 20% were nontargeted or broadly cytotoxic agents. The screening library contained approved drugs plus compounds under clinical investigation and chemical tools. High-throughput screening (HTS) was carried out with cell-growth inhibition as the end point, testing a range of concentrations against a panel of 28 patient-derived early-passage melanoma cell lines harboring either BRAF- or RAS-activating mutations or WT for both oncogenes (Fig. 1A, left).

To identify whether any tested agents exhibited selective effects in a genotype-specific pattern, Held and colleagues (5)
clustered the compounds based on their growth inhibition profiles and classified them into 3 major categories: those with little effect across the whole melanoma panel, those active across the majority of the panel, and those showing clear differential effects.

Of obvious interest, certain single-agent compounds were selective toward BRAF-mutant cells. As expected (9), these included the BRAF inhibitors vemurafenib, PLX4720, and GDC-0879. However, growth inhibition was often incomplete, and Held and colleagues (5) also confirmed previous observations that a significant fraction (25%) of BRAF-mutant cell lines exhibited innate resistance to vemurafenib, whereas growth stimulation was seen in some mutant RAS and WT lines (10). In addition, loss of PTEN or RB1, known vemurafenib resistance mechanisms, was not necessary for reduced sensitivity, consistent with a role for additional resistance factors such as MET/HGFR (6, 8). These various results emphasize the need for new therapies or combinations in melanomas of all genotypes.

Additional compounds showing selectivity toward mutant BRAF melanomas included the SRC/ABL inhibitor bosutinib, the FGFR inhibitor dovitinib, and the EGFR inhibitor gefitinib—all effectively inactive against BRAF, indicating that sensitivity does not derive from off-target BRAF inhibition. Two MEK inhibitors were active in both mutant BRAF and RAS melanomas, especially the former. Interestingly, melanoma lines resistant to BRAF inhibitors (including the 25% of mutant BRAF cultures with intrinsic resistance) were also resistant to MEK inhibitors. Most intriguingly, the approved 3-hydroxy-3-methylglutaryl-CoA reductase (HMGCR) inhibitor simvastatin, a cholesterol-lowering agent which indirectly blocks prenylation and essential membrane localization of RAS, was the only single agent showing a trend to greater growth inhibition in RAS-mutant melanomas, although at high concentrations. Of note, no compounds selective for the WT cells were found, likely due to the genetic heterogeneity of this group.

The rather lackluster performance of compounds in the single-agent screen, and especially the relatively poor activity of compounds against the RAS-mutant and WT melanomas, further highlighted the need to identify effective combinations. In the second phase of their workflow, Held and colleagues (5) selected 40 representative compounds, chosen because of their broad growth-inhibitory effect or genotype-specific profiles, as well as representing the diverse molecular and biologic mechanisms of the full compound library, and carried these through to the combinatorial HTS (cHTS) campaign (Fig. 1A, middle).

In total, they examined more than 7,000 pairwise combinations of the 40 agents, with 3 concentrations per drug, against 19 representative melanoma cell lines, comprising 8 BRAF-mutant, 5 NRAS-mutant, one HRAS-mutant, and 5 WT lines.

The cHTS identified many new, highly effective, and biologically interesting genotype-selective 2-drug combinations. Surprisingly, the selective combinations revealed for BRAF-mutant melanomas (1,021) massively outnumbered those selective for either RAS-mutant (75) or WT cells (22). Combinations found to be selective for BRAF-mutant cells involved a range of primary targets, albeit dominated by protein kinase inhibitors such as vemurafenib, the SRC/ABL inhibitor bosutinib, the FGFR inhibitor PD-173074, the MET inhibitor PHA-665752, the AKT inhibitor MK-2206, the ERBB2/EGFR inhibitor lapatinib, and the relatively unselective vascular endothelial growth factor receptor (VEGFR) inhibitor sunitinib, together with the proposed pan-BCL2 inhibitor obitoclax.

Remarkably, the HMGCR inhibitor simvastatin was involved in half of the 2-drug combinations selective against RAS-mutant melanomas. In contrast to the combination pairs in BRAF-mutant–selective combinations that were dominated by protein kinase inhibitors, simvastatin was effective against mutant RAS melanomas in combination with a far wider mechanistic range of compounds, including, particularly, inhibitors of the molecular chaperone HSP90 and the ubiquitin ligase XIAP, as well as those for MEK, pannexin-dependent kinases (CDK), and JGFR. No combinations were found to be selective for WT melanomas, but some combinations were effective across all 3 melanoma genotypes, the strongest of which was the combination of a STAT inhibitor (static) with FAK inhibitor 14.

Moving on to the third phase of the study, Held and colleagues (5) characterized promising 2-way combinations in greater biologic detail, carried out mechanistic biomarker studies to show target engagement and pathway inhibition, tested additional compounds acting on highlighted targets, progressed promising members of effective 2-drug combinations into triple combination studies for mutant BRAF melanoma lines, and assessed ability to suppress development of resistant clones (Fig. 1A, right).

To identify the 2-way combinations with the most added value, Held and colleagues (5) looked for additive, synergistic, or antagonistic interactions according to the Bliss independence method. Intriguingly, most combinations selective toward BRAF-mutant cells showed additivity or synergy, whereas most combinations in RAS-mutant melanomas were formally antagonistic; that is, although effective, they were less active than predicted from the sum of single-agent sensitivities.

Among the many effective combinations in BRAF-mutant melanomas, the strongest 2-drug efficacies and synergies observed were between the allosteric AKT inhibitor MK-2206 combined with either the ERBB2/EGFR inhibitor lapatinib or the SRC/ABL inhibitor bosutinib. RAS-mutant (and WT) melanomas were generally less sensitive and the most efficacious and synergistic 2-way combinations for RAS-mutant melanomas involved the HMGCR inhibitor simvastatin plus either the HSP90 molecular chaperone inhibitor 17-DMAG or the pan-CDK inhibitor flavopiridol. It was reassuring that combinations using alternative compounds acting against the same targets gave similar synergistic effects, increasing confidence that the synergy derives from on-target, not off-target, modulation.

Importantly, Held and colleagues (5) identified a key triple combination, involving BRAF+EGFR+AKT inhibition, which was highly effective in BRAF-mutant melanomas and overcame vemurafenib resistance. Vemurafenib sensitivity was reestablished by blocking EGFR and AKT, with biomarker studies indicating that this was most likely because the combination suppressed both the phosphoinositide-3 kinase (PI3K) and RAS–RAF–MEK–ERK MAPK pathways, which makes obvious mechanistic sense (Fig. 1B). The results are consistent with the known effects of EGFR inhibition in blocking the feedback activation loop between MEK and EGFR (potentially via CDC25C) which activates CRAF and MEK following inhibition of mutant BRAF in colorectal cancer.
(11), although ERBB2 may play an additional role here. Also appealing was that the triple combination was highly effective in preventing the emergence of resistance in cell culture.

As mentioned, in NRAS-mutant melanomas, the HMGCR inhibitor simvastatin was a key sensitizer to other agents. Held and colleagues (5) focused their mechanistic work on the interaction of the statin with the pan-CDK inhibitor flavopiridol. Since membrane localization of NRAS was almost eliminated by simvastatin, they silenced NRAS expression by RNA interference (RNAi) and showed that, in combination with flavopiridol, the NRAS knockdown phenocopied the decrease in MAPK signaling seen with simvastatin as well as the cytotoxic effects of combined HMGCR and pan-CDK inhibition. Thus, the synergistic effects of simvastatin in the combination are likely mediated by reduced NRAS activity, which may also apply to the other HMGCR-containing combinations, for example, with the HSP90 inhibitor 17-DMAG (Fig. 1C). The beneficial interactions seen with HMGCR inhibition in NRAS-mutant melanomas may be hypothesized to involve the cooperative effects of blocking NRAS–RAF–MEK MAPK signaling output coupled to the depletion of RAF isoforms, CDK4, and other relevant HSP90 clients in the case of 17-DMAG or the inhibition of cell cycle and transcriptional kinases for flavopiridol (Fig. 1C). The potentially interesting 3-drug combination for NRAS-mutant melanomas was not investigated.

Finally, Held and colleagues (5) translated one exemplar key finding into an in vivo NRAS-mutant melanoma xenograft in nude mice. It was encouraging that the 2-drug combination of simvastatin plus flavopiridol was well tolerated and showed greater antitumor activity compared to the agents alone. Further in vivo animal model studies are now required, including evaluation of the 3-drug combination of BRAF+EGFR+AKT inhibitors identified in vitro for BRAF-mutant melanomas. Investigation of the effects of a triple combination of simvastatin, flavopiridol, and 17-DMAG in RAS-mutant melanoma would also be especially interesting to pursue in vivo (Fig. 1C), as would additional detailed exploration of the mechanisms underlying the observed selective combinations. Our own initial analysis of the network of the targets of drugs for which the combinations showed the highest efficacy and synergy in BRAF- or NRAS-mutant melanomas illustrates connected but distinct processes involved in the combinatorial treatment of the 2 genotypes (Fig. 1D).

The new work illustrates the power of systematic large-scale combinatorial screening of unbiased 2-way combinations for discovering novel therapeutically actionable genotype-selective combinations that merit progression toward clinical investigation in mutant BRAF and RAS melanoma, including vemurafenib-resistant disease. Significantly, the effective combinations were not predicted by single-agent screening. Of special note are the 2-drug combination of statins and pan-CDK inhibitors (with additional potential of HSP90 inhibition) for RAS-mutant, and the 3-drug regimen of vemurafenib plus EGFR and AKT inhibition for BRAF-mutant melanoma. In another recent large-scale compound screen of pairwise combinations of 300 compounds in 9 established melanoma cell lines, Roller and colleagues (12) did not find synergistic interactions specific for BRAF, RAS, or WT genotypes but did identify robust synergy across all genotypes between the multikinase inhibitor sorafenib and the nonsteroidal anti-inflammatory drug (NSAID) diclofenac, with drug substitution experiments indicating combined effects on MAPK and cyclooxygenase (COX). Differences seen may reflect the distinct properties of early-passage versus established melanoma lines. The combinatorial small-molecule screening approach complements the use of genome sequencing of vemurafenib-resistant melanomas, examination of signaling crosstalk and feedback loops, and unbiased genome- or kinase-wide loss-of-function RNAi screening—which have also led to clinically actionable combinations such as BRAF plus MEK or receptor tyrosine kinase inhibitors (4, 6, 8, 11) and certainly yielded some unexpected combinations. Especially given the eye-watering number of possible drug–genotype combinations, rapid progress in the search for the best genotype-selective combinations to overcome resistance in multiple cancer types, which will likely reveal many unpredicted results, as here, will require global collaborations and data sharing (13). Furthermore, some combinatorial targets revealed by unbiased screens will not have clinical drugs available, emphasizing the importance of systematic approaches to extending the druggable cancer genome on the way to achieving the reality of combinatorial precision cancer medicine (2, 14).

Disclosure of Potential Conflicts of Interest

P. Workman and B. Al-Lazikani are employees of The Institute of Cancer Research which has a commercial interest in the discovery and development of anticancer drugs, including kinase inhibitors, and operates a Rewards to Inventors scheme. P. Workman is a former employee of AstraZeneca and declares commercial interactions with Yamanouchi (now Astellas), Piramed Pharma (acquired by Roche), Genentech, Vernalis, Novartis, Chroma Therapeutics, Astex Pharmaceuticals, AstraZeneca, Cyclacel, Onyx Pharmaceuticals, Merck Serono, Sareum, Janssen, Wilex and Nextech Ventures. B. Al-Lazikani is a former employee of Inpharmatica.

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Unpicking the Combination Lock for Mutant *BRAF* and *RAS* Melanomas

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