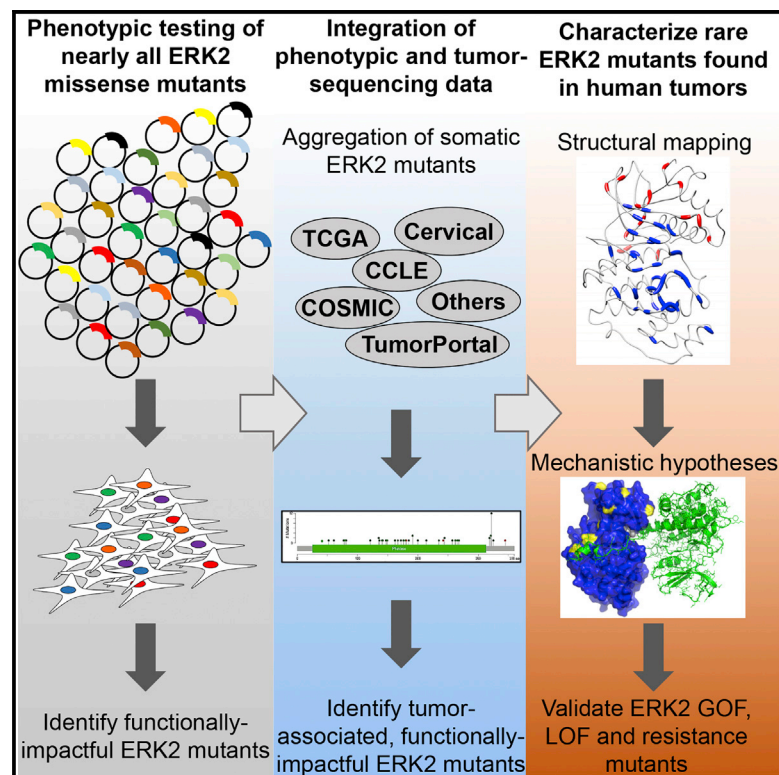


## Phenotypic Characterization of a Comprehensive Set of *MAPK1/ERK2* Missense Mutants

### Graphical Abstract



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### In Brief

Using comprehensive functional characterization of ERK2 mutants, Brenan et al. identify rare cancer-associated gain- and loss-of-function mutant ERK2 proteins. Gain-of-function ERK2 mutants form two mechanistic classes that drive differential responses to RAF, MEK, and ERK inhibitors, which may help to indicate therapeutic treatment strategies for patients whose tumors harbor these mutants.

### Highlights

- Characterization of function and ERK-inhibitor sensitivity of 6,810 ERK2 mutants
- Discovery of rare tumor-associated gain- and loss-of-function ERK2 mutants
- A mechanistic class of ERK2 GOF mutants that mimic the *sevenmaker* mutation is defined
- Mutation of distinct ERK2 effector domains leads to opposite activity profiles



# Phenotypic Characterization of a Comprehensive Set of *MAPK1/ERK2* Missense Mutants

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## SUMMARY

Tumor-specific genomic information has the potential to guide therapeutic strategies and revolutionize patient treatment. Currently, this approach is limited by an abundance of disease-associated mutants whose biological functions and impacts on therapeutic response are uncharacterized. To begin to address this limitation, we functionally characterized nearly all (99.84%) missense mutants of *MAPK1/ERK2*, an essential effector of oncogenic RAS and RAF. Using this approach, we discovered rare gain- and loss-of-function ERK2 mutants found in human tumors, revealing that, in the context of this assay, mutational frequency alone cannot identify all functionally impactful mutants. Gain-of-function ERK2 mutants induced variable responses to RAF-, MEK-, and ERK-directed therapies, providing a reference for future treatment decisions. Tumor-associated mutations spatially clustered in two ERK2 effector-recruitment domains yet produced mutants with opposite phenotypes. This approach articulates an allele-characterization framework that can be scaled to meet the goals of genome-guided oncology.

## INTRODUCTION

Many thousands of tumor genomes have been sequenced to deepen our understanding of the genetic basis of cancer and to guide therapeutic strategies (Roychowdhury and Chinnaiyan, 2014). Computational approaches that identify significantly mutated genes or detect mutational clusters within individual genes have revealed the complex landscape of genetic alterations in cancer (Weinstein et al., 2013; Hudson et al., 2010; Kamburov et al., 2015; Lawrence et al., 2014; Niu et al., 2016; Porta-Pardo and Godzik, 2014; Tamborero et al., 2013;

Vogelstein et al., 2013). As a result, tumor-associated mutations have been detected in nearly all human genes and the number of uncharacterized mutations continues to rise (Lawrence et al., 2014).

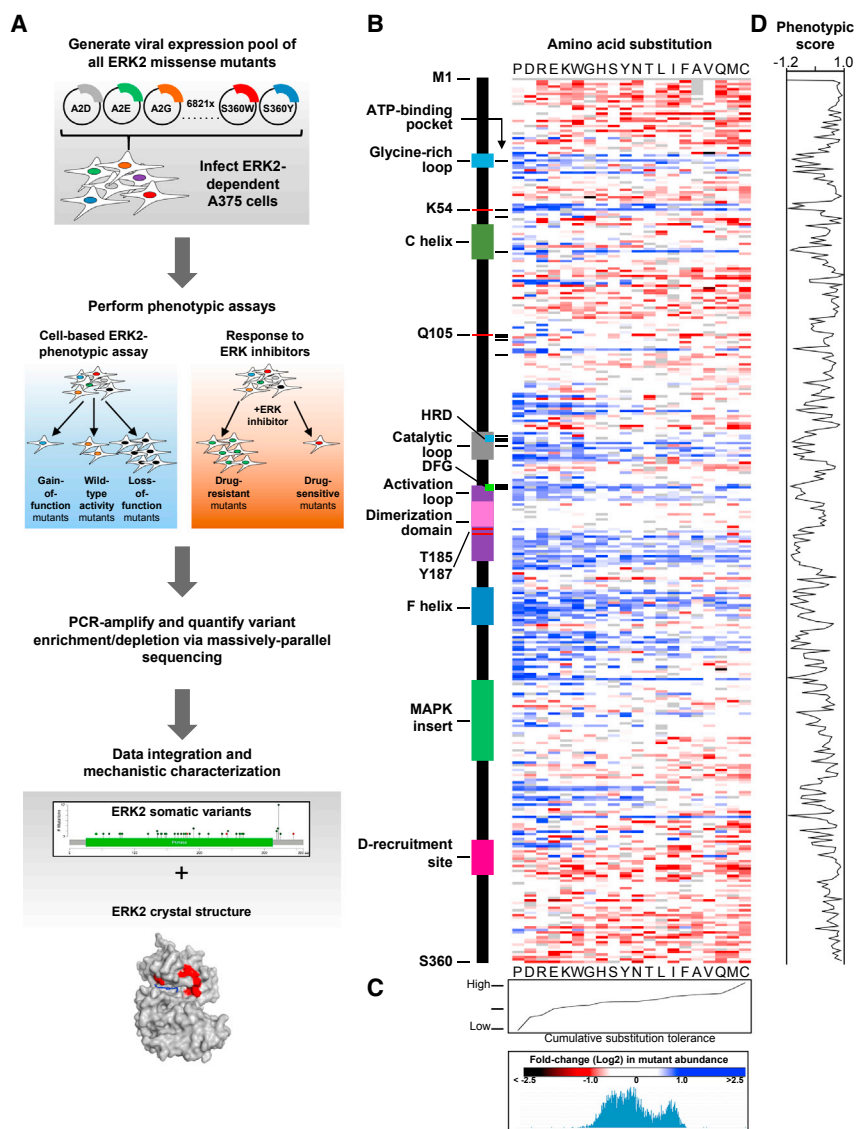
Characterizing tumor-associated variants of uncertain significance (VUS) is imperative for druggable therapeutic targets that lack genomic indicators of clinical response. For example, ATP-competitive inhibitors of the Ser/Thr kinase *MAPK1/ERK2* are in early stage clinical trials (Infante et al., 2015, J. Clin. Oncol., abstract). Tumor-sequencing studies have identified a single mutational hotspot in ERK2 (ERK2<sup>E322K</sup>) and many VUS. However, the infeasibility of characterizing mutant proteins at massive scale has precluded the identification of functionally impactful ERK2 mutants. In addition, this limitation has prevented the comprehensive association of mutants with response to RAF-, MEK- and ERK- (MAPK-pathway) directed therapies.

To address the challenge of interpreting mutations in ERK2, we employed saturation mutagenesis to comprehensively characterize the activity and drug responsiveness of 6,810 ERK2 missense mutants. We identify rare ERK2 mutants found in human tumors that have gain- or loss-of-function activity and drive differential responses to MAPK-pathway-directed therapies. Collectively, this method provides a scalable framework for mutant characterization that can be used to deepen our understanding of disease-associated mutants.

## RESULTS

### Generation of an ERK2 Mutant Library

To enable the functional characterization of all possible missense mutations in cancer-associated genes, we established Mutagenesis by Integrated Tiles (MITE), a DNA-synthesis-based approach optimized for use in mammalian cells (Melnikov et al., 2014). We generated a pooled, virally delivered, doxycycline-induced, cDNA expression library containing all 19 amino acid substitutions at residues 2–360 of ERK2 (Figures 1A and S1A). Massively parallel sequencing confirmed the presence of 6,810 of 6,821 possible (99.84%) ERK2 mutants in both plasmid DNA



**Figure 1. Functional Characterization of 6,810 ERK2 Mutants**

(A) A pooled-format proliferation screen in A375 cells to measure the functional impact of 6,810 MAPK1/ERK2 mutants.

(B) Heatmap of the enrichment/depletion of ERK2 mutants in a pooled assay in which the proliferation of A375 cells serves as an indirect measure of ERK2 function. Data points represent the mean of four biological replicates. Gray boxes identify wild-type residues (see also Tables S1 and S2).

(C) The aggregate impact of amino acid substitutions on ERK2 function in A375 cells.

(D) Composite metric of ERK2 function when mutated at each amino acid, based on mutant enrichment/depletion in A375 cells.

See also Figures S1 and S2 and Tables S1, S2, and S3.

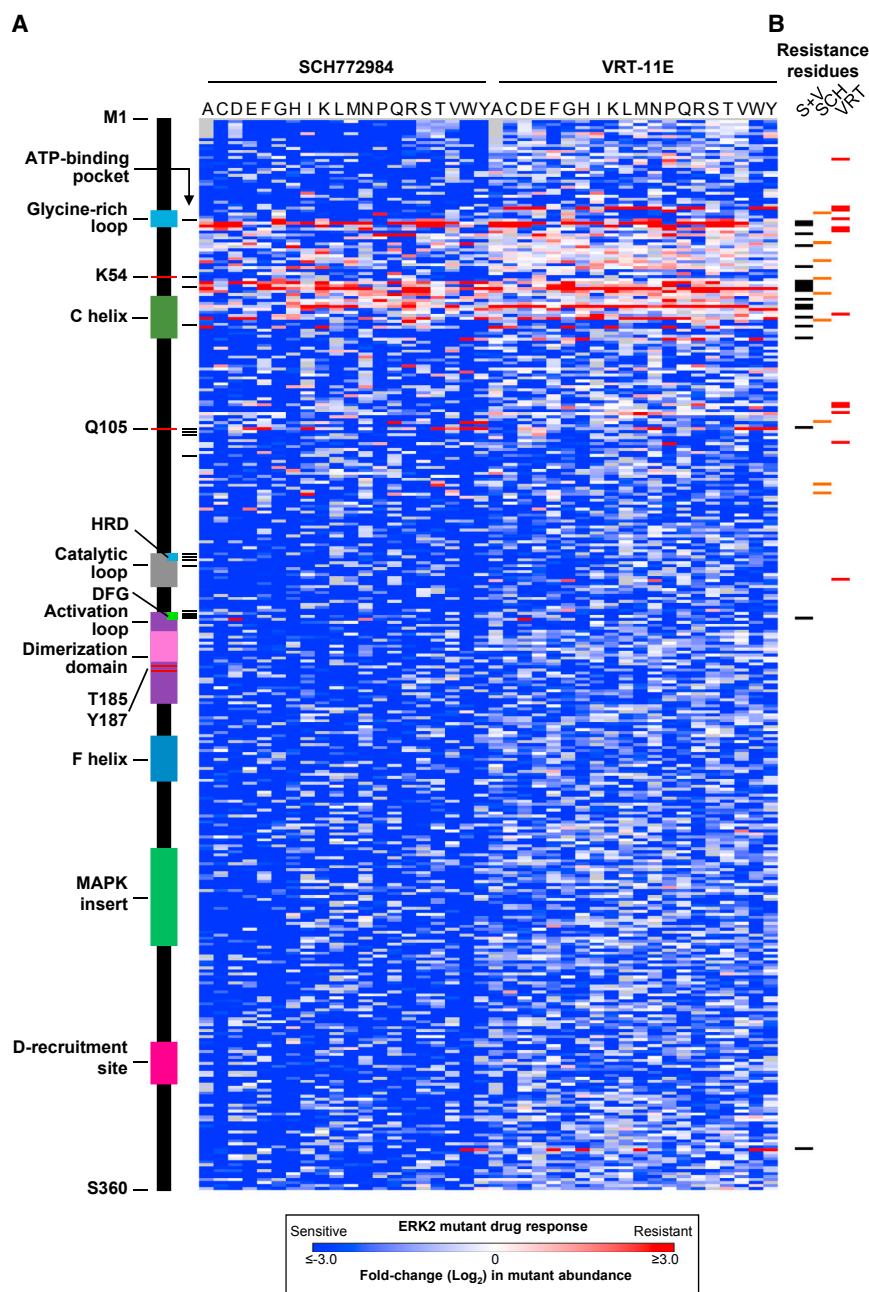
Toward this goal, the A375 cell line is a useful model for studying ERK2 function. A375 cells harbor a BRAF<sup>V600E</sup> mutation that leads to constitutive activation of ERK1/2. In this context, ERK activity is homeostatic and is required for sustained proliferation. As a result, increases or decreases in ERK function affect A375 proliferation. For example, treating A375 cells with RAF, MEK, or ERK inhibitors reduces ERK signaling and impairs cellular proliferation (Emery et al., 2009). However, increased pathway activity also negatively affects cellular proliferation. For instance, expression of constitutively active BRAF, MEK1, or wild-type ERK2 decreases cell growth as a function of MAPK-pathway output (Figure 1A) (Goetz et al., 2014). We took advantage of this system to assess the function of all 6,810 ERK2 point mutants. We hypothesized that, in A375, cells expressing GOF ERK2 mutants will proliferate slower than cells expressing wild-type ERK2, whereas cells expressing LOF ERK2 mutants will proliferate faster than cells expressing wild-type ERK2 (Figure 1A). Thus, in a pooled competition assay, we predicted that LOF ERK2 mutants would be enriched relative to those with wild-type activity, whereas GOF mutants would be depleted.

We induced mutant library expression with doxycycline in A375 cells and quantified the relative abundance of each mutant after 96 hr via massively parallel sequencing (see Supplemental Experimental Procedures; Figure S2A). Enrichment and depletion of ERK2 variants was calculated relative to their initial abundance in non-induced A375 (Figures 1B, S2B, and S2C; Table S1). We predicted that LOF mutants would be enriched and GOF mutants would be depleted in this assay. Consistent with this notion, mutations expected to disrupt ERK2 protein function, including charged (arginine, aspartate, glutamate, and lysine) and rigid (proline) substitutions, were the most widely enriched

and in genomic DNA from transduced A375 cells (Figures S1B and S1C). MITE produced a library with a 4.7-fold increase in the abundance of ERK2 mutants and improved variant representation relative to bacterial mutagenesis (Figures S1A and S1D).

### Comprehensive Assessment of Mutant ERK2 Phenotypes

Most cancer-associated mutations are extraordinarily rare. As a result, the functional impact of these mutations are unknown, and their contribution to disease biology is poorly understood. As an initial step toward disambiguating functionally impactful ERK2 mutants from inert mutants, we sought to test the function of all possible ERK2 point mutants and use these data to comprehensively identify cancer-associated gain-of-function (GOF) and loss-of-function (LOF) mutants. Testing the function of many thousands of ERK2 variants requires scalable assays that employ simple phenotypes to measure ERK2 function.



**Figure 2. Comprehensive Identification of ERK2 Mutants that Induce Resistance to ERK-Directed Kinase Inhibitors**

(A) Heatmap displaying the normalized enrichment/depletion of individual ERK2 mutants expressed in A375 cells in the presence of the ERK inhibitors SCH772984 or VRT-11E. Data points represent the mean of four to six biological replicates. Gray boxes identify wild-type residues. (B) Annotation of ERK2 amino acids that when mutated confer resistance to VRT-11E (VRT, red), SCH772984 (SCH, orange), or both inhibitors (S+V, black) when expressed in A375 cells. See also [Figure S3](#) and [Tables S1, S3, S4, and S5](#).

acid and normalized them to that of the most depleted residue. In total, we identify 37 ERK2 residues that, when mutated, lead to mutant enrichment greater than or equal to Thr-185—an essential phosphorylation site in the ERK2 active site ([Table S3](#)). Moreover, substitutions at Lys-54, the kinase-essential “active lysine” traditionally mutated to create kinase-impaired ERK2 were also widely enriched (albeit to varying degrees) collectively suggesting that variant enrichment might serve as a proxy for decreased ERK2 activity ([Figures 1B](#) and [S2E](#)). However, we cannot conclude that all mutants that underwent enrichment are in fact LOF, as depletion may arise as a consequence of additional mechanisms.

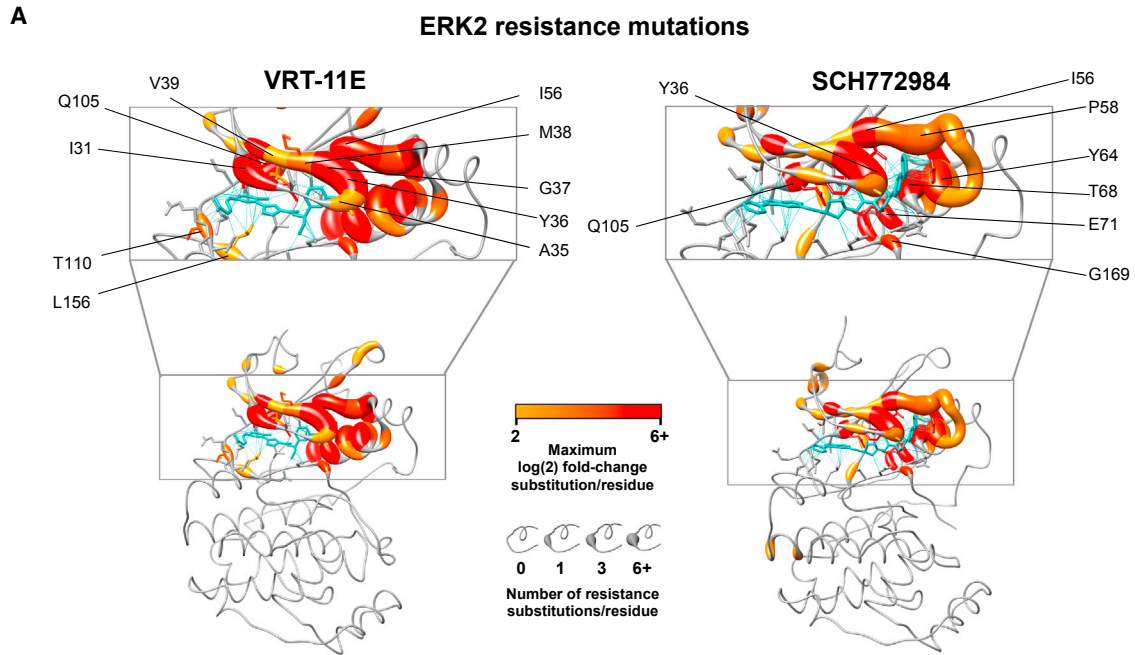
To further test the hypothesis that proliferative changes induced by a subset of ERK2 mutants may reflect altered ERK2 function, we asked whether mutation of highly conserved ERK2 residues were enriched in our assay. To do this, we generated a cumulative phenotypic score for each ERK2 residue by summing the log<sub>2</sub> depletion/enrichment of all substitutions at each amino acid and normalizing this value to the residue with the highest cumulative depletion ([Figures 1D](#) and [S2E](#); [Table S3](#)). We observed that substitutions

across all ERK2 mutant proteins ([Figure 1C](#)). Additionally, variants encoding substitutions in functionally essential ERK2 protein domains, including a subset of residues in the ATP-binding pocket, regulatory phosphorylation sites, the glycine-rich loop, the catalytic loop, the activation loop, and the F-helix were universally enriched and captured a number of previously reported LOF ERK2 mutants ([Goetz et al., 2014](#); [Madhani et al., 1997](#); [McReynolds et al., 2016](#); [Shin et al., 2010](#)) ([Figures 1B](#) and [S2D](#); [Table S2](#)). We generated a composite, phenotypic score for each residue that summarizes the impact of ERK2 mutation on phenotypic behavior. Briefly, we summed the log(2) enrichment/depletion values for all substitutions across each amino

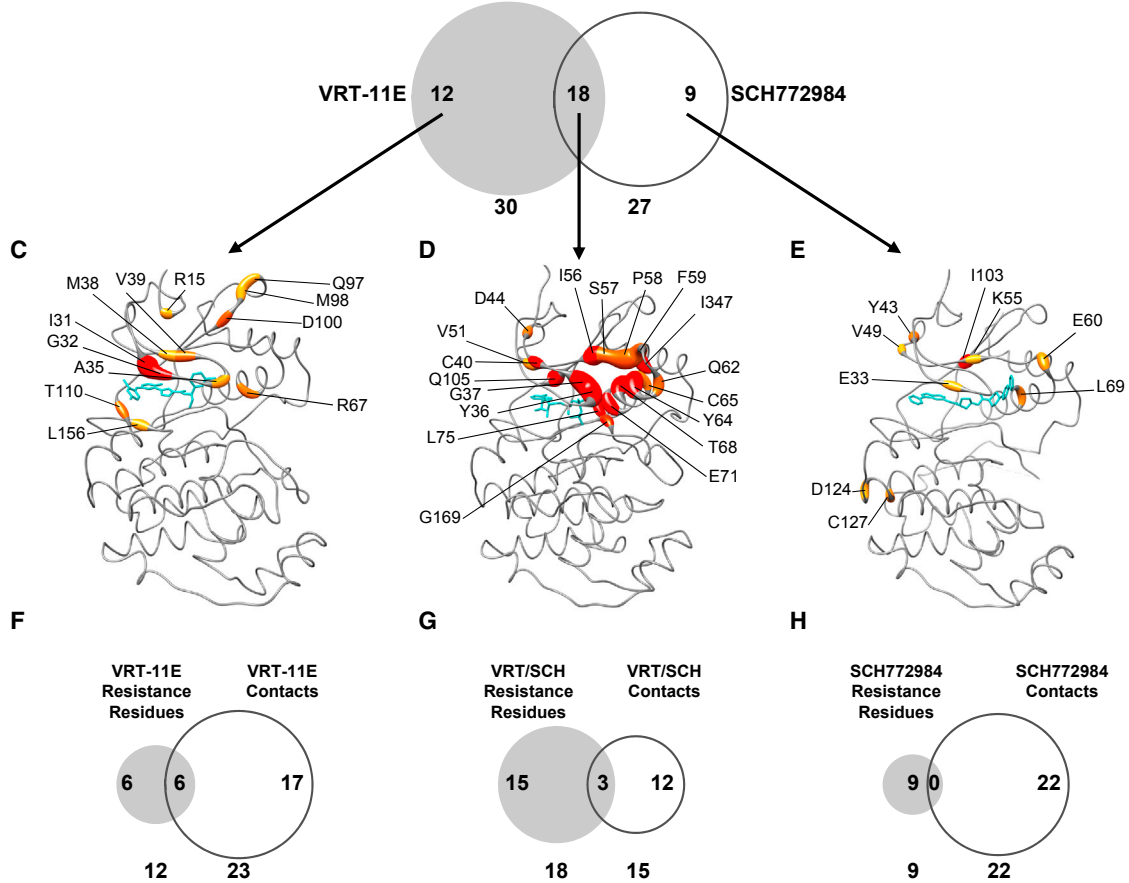
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in highly conserved residues of ERK2 homologs have a significantly greater propensity to be enriched and have a low phenotypic score (and therefore may be damaging) compared to substitutions in lowly conserved residues ([Figure S2F](#)). Expression of ERK2 mutants found in the germlines of healthy individuals—and therefore expected to be inert—were neither enriched nor depleted ([ExAC, 2015](#)) ([Figure S2G](#)). Moreover, we found that mutations in internally buried residues presumed to maintain ERK2 structure were enriched ([Figure S2D](#)). Collectively, these observations suggested that variant enrichment may serve as a proxy for reduced ERK2 activity and can rediscover previously characterized ERK2 functional domains.



**B Drug-specific ERK2 resistance residues**



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A number of catalytically active ERK2 mutants have been previously identified (Bott et al., 1994; Chu et al., 1996; Emrick et al., 2001, 2006; Goetz et al., 2014; Levin-Salomon et al., 2008, 2009; Robinson et al., 1998; Shin et al., 2010; Smorodinsky-Atias et al., 2016) (Table S2). However, the identification of tumor-associated ERK2 mutants with GOF in-cell phenotypes has remained elusive in spite of the prevalence of constitutively active oncogenic missense mutants in upstream pathway members, including Ras-family members, BRAF, and MEK1/2 that signal through ERK1/2 (Roskoski, 2012). Only a small subset of GOF ERK2 mutants, including the *sevenmaker* mutation (human ERK2<sup>D321N</sup>) and ERK2<sup>E322K</sup> has been found in human tumors or cancer cell lines (Bott et al., 1994; Chu et al., 1996; Goetz et al., 2014). We observed extensive depletion of previously identified ERK2 GOF mutants in our assay (Table S2). For example, Glu-322 and Asp-321 exhibited high phenotypic scores and were 11<sup>th</sup> and 19<sup>th</sup>, respectively, of all 360 ERK2 amino acids ranked from most depleted (#1) to least depleted (#360) (Figures 1D and S2E; Table S3). In addition, we found an additional 19 mutant ERK2 residues that were depleted to a degree equivalent to or greater than that of Glu-322 and Asp-321 (Figure S2E; Table S3). The observation that previously characterized GOF ERK2 mutants are depleted in this assay suggests (but does not prove) that a subset of uncharacterized, highly depleted ERK2 mutants may also be GOF. However, until a comprehensive validation of all such mutants is complete, we cannot conclude that all such mutants are in fact GOF, nor that they have increased catalytic activity. These data raise the possibility that comprehensive approaches can be employed to discover additional, cancer-associated mutants for deeper validation. In addition, a complete mapping of residues required for normal ERK2 function may ultimately be useful for the design of allosteric ERK2 inhibitors.

### Comprehensive Identification of ERK-Inhibitor-Resistant ERK2 Mutants

Guiding treatment strategies with tumor-specific genomic data requires an understanding of how each mutant impacts response to cancer therapeutics. Thus, we wished to discover all possible ERK2 point mutants that could confer resistance to ERK-directed small molecule inhibitors. In BRAF<sup>V600E</sup> mutant melanoma cell lines, exposure to small-molecule ERK inhibitors

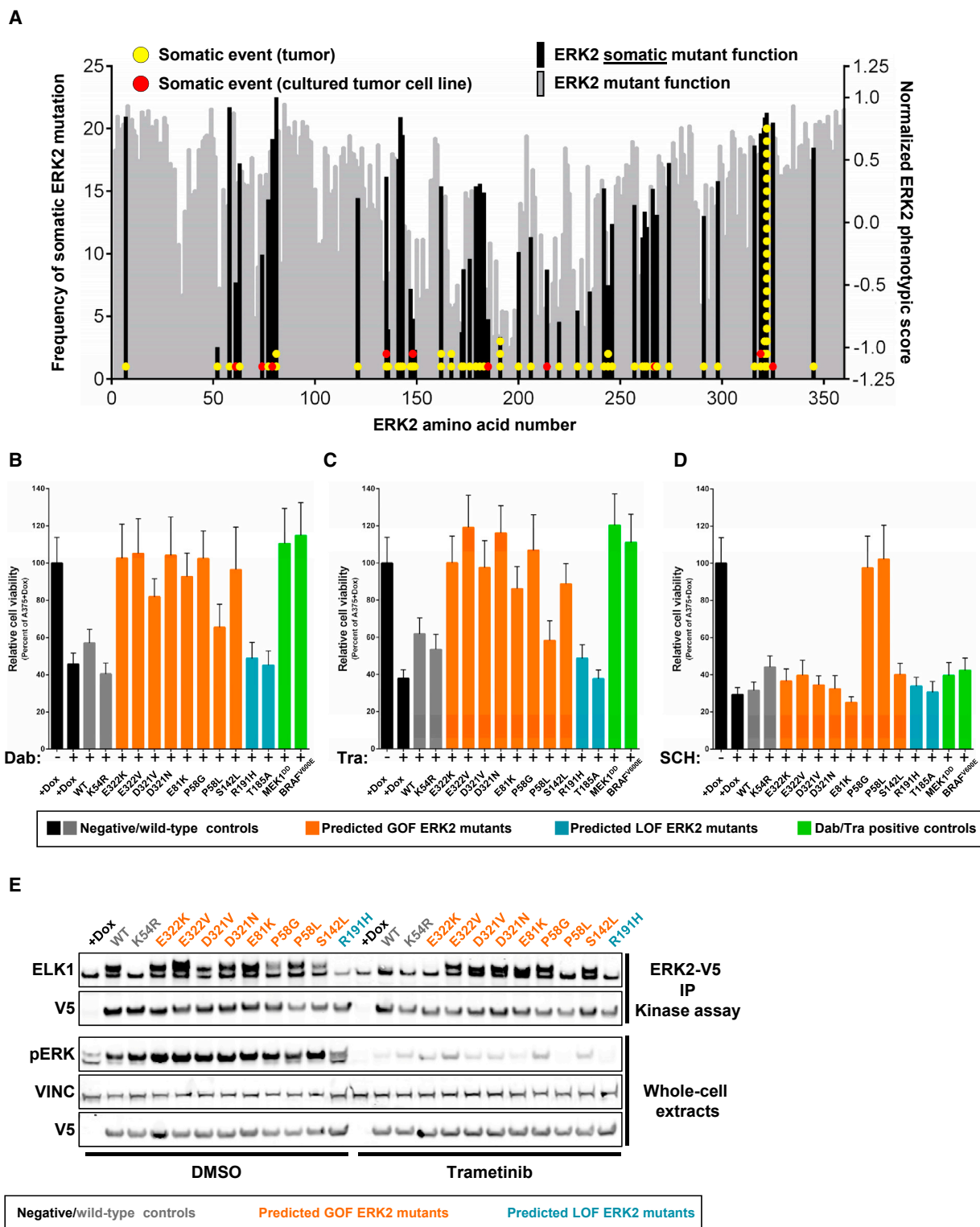
suppresses proliferation. However, this phenotype can be rescued by restoring MAPK signaling to baseline levels by expressing drug-resistant ERK2 mutants (Figure 1A) (Goetz et al., 2014). By performing these experiments in the presence of ERK2 inhibitors, and therefore in a background of reduced ERK activity and cell proliferation, expression of drug-resistant ERK2 mutants are sufficient to restore ERK signaling and rescue cell proliferation. To discover ERK2 mutants that are resistant to ERK inhibitors, we induced expression of mutant ERK2 proteins in BRAF<sup>V600E</sup> mutant A375 cells and exposed them to sub-lethal doses of two small molecule ERK1/2 kinase inhibitors, VRT-11E or SCH772984 (Aronov et al., 2009; Morris et al., 2013) (Figure S3A). After 12 days of drug exposure, enrichment of ERK2 mutants was quantified relative to initial populations (Figures S3B and S3C). The majority of ERK2 mutants were depleted from the population when exposed to drug (Figures S3B and S3C). The observation that most ERK2 mutants were depleted is a result of calculating the ratio of ERK2 mutants exposed to drug relative to their initial abundance prior to drug exposure.

We considered ERK2 variants that were enriched 4-fold or greater ( $p \leq 0.025$ ) in drug to be candidate resistance mutants. We identified 134 substitutions in 30 residues that conferred resistance to VRT-11E and 105 mutants in 36 residues that conferred resistance to SCH772984 (Figure 2A; Table S4). Among these, 59 substitutions in 18 residues conferred resistance to both VRT-11E and SCH772984 (Figure 2B; Table S4). We recovered all of the ERK2 variants previously discovered using traditional mutagenesis approaches but increased ERK2 drug-resistant mutant discovery by 15- to 19-fold (Goetz et al., 2014). Surprisingly, resistance-conferring events were uncorrelated with ERK2 enrichment/depletion in the absence of ERK inhibition (Table S3).

We identified resistance mutants that map to residues in the ATP binding pocket (Figures 2A and 3A). However, we also found drug-resistant mutants in other ERK2 protein domains, including substitutions in the  $\alpha_{L16}$ -helix (ERK2<sup>I347W</sup>, ERK2<sup>I347Y</sup>), the DFG motif (ERK2<sup>G169D</sup>), and mutations in uncharacterized regions of ERK2, including ERK2<sup>R15P</sup>, ERK2<sup>D124T</sup>, ERK2<sup>C127I</sup>, and 11 substitutions at Pro-58 (Figures 2A and 3A). A single mutation in the MAPK3/ERK1 DFG motif (ERK1<sup>G186D</sup>) was recently discovered in a SCH772984-resistant mutagenic cell line (Jha et al., 2016). Encouragingly, we found that a G  $\rightarrow$  D substitution at the orthologous residue in ERK2 (ERK2<sup>G169D</sup>) was the only

### Figure 3. Spatial Mapping of ERK2 Mutants that Induce Resistance to ERK-Directed Kinase Inhibitors

- (A) Projection of ERK2 mutant enrichment in A375 cells in the presence of VRT-11E or SCH772984 on the structure of drug-bound ERK2 (PDB ID: 4QTE and 4QTA, respectively). All mutants displaying a log(2) fold change of  $\geq 2$  are represented. Blue lines identify intramolecular contacts between ERK2 and inhibitor. Inhibitors are shown in blue.
- (B) Venn diagram highlighting the overlap of ERK2 residues that, when mutated, confer resistance to either VRT-11E only, SCH772984 only, or both VRT-11E and SCH772984.
- (C) Structural representation of ERK2 residues that, when mutated, confer resistance to VRT-11E (PDB ID: 4QTE). VRT-11E is shown in blue; residues are colored and sized as in (A).
- (D) Structural representation of ERK2 residues that, when mutated, confer resistance to VRT-11E and SCH772984 (PDB ID: 4FMQ). Phosphoaminophosphonic acid-adenylate ester (ANP) is shown in blue, MAPK-docking peptide is not shown; residues are colored and sized as in (A).
- (E) Structural representation of ERK2 residues that, when mutated, confer resistance to SCH772984 (PDB ID: 4QTE). SCH772984 is shown in blue, residues are colored and sized as in (A).
- (F) Venn diagram highlighting the overlap of VRT-11E-specific residues with residues that form direct contacts with VRT-11E.
- (G) Venn diagram highlighting the overlap of VRT-11E/SCH772984-specific residues with residues that form direct contacts with both inhibitors.
- (H) Venn diagram highlighting the overlap of VRT-11E-specific residues with residues that form direct contacts with SCH772984.
- See also Figures S3 and S4 and Tables S1, S3, S4, and S5.



**Figure 4. Identification of Somatic ERK2 Mutants with Non-Wild-Type Function**

(A) Bars represent the composite ERK2 function score for each residue of ERK2. Each circle represents an annotated ERK2 mutant found in human tumors. Data bars represent the mean of four biological replicates.

(B) Suppression of proliferation in A375 cells expressing ERK2 mutants after treatment with 10 nM dabrafenib (Dab, 96 hr of treatment). Data are represented as a mean ( $\pm$ SD) of at least six replicates.

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alteration at Gly-169 sufficient to induce resistance to ERK inhibitors (Figures 2A and 2B).

Given the propensity for resistance mutations to arise in drug targets during the course of treatment, a comprehensive catalog of resistance mutants to mechanistically distinct inhibitors may guide the choice of therapies at relapse. To identify inhibitor-specific resistance mutants, we looked for ERK2 mutants that drove resistance to either VRT-11E or SCH772984 (fold change  $\geq 4$ ) but additionally had a differential fold enrichment between inhibitors of 4-fold or greater. We identified 66 mutants that uniquely confer resistance to VRT-11E and 24 mutants that uniquely confer resistance to SCH772984 (Figures 2B and S3D; Table S4). When mutated, only a subset of amino acids conferred mutually exclusive drug resistance to VRT-11E (12 residues) or SCH772984 (nine residues), whereas mutation of 18 residues conferred resistance to both small molecules (Figures 3B–3E; Table S5). While 50% of the ERK2 VRT-11E-specific resistance residues make direct contacts with VRT-11E, none of the SCH772984-specific ERK2 resistance residues make direct contact with SCH772984 (Figures 3F–3H; Table S6). Collectively, these observations suggest that drug-specific resistance alterations cannot be fully explained by direct drug-protein interactions alone. In the aggregate, these efforts have revealed an unappreciated diversity of ERK2 drug-resistant mutants that may ultimately guide the choice of therapy at initial diagnosis or relapse.

### Massively Parallel Characterization of ERK2 Mutants Found in Human Tumors

Sequencing of many thousands of human tumors has revealed the landscape of genetic variation across cancer. However, disambiguating inert mutations from mutations that are functionally impactful remains a challenge. Guided by the rediscovery of mutants known to impact ERK2 function, we sought to identify unappreciated, functionally relevant, cancer-associated ERK2 mutants with the ultimate goal of informing initial therapeutic strategies in patients whose tumors harbor these mutants. To do this, we aggregated all tumor-associated ERK2 mutations from The Cancer Genome Atlas, the Catalogue Of Somatic Mutations In Cancer or individual sequencing studies (Figure 4A; Table S7), identifying 83 unique missense mutations or small insertion/deletions in ERK2 (Cerami et al., 2012; Forbes et al., 2015; Gao et al., 2013; Ojesina et al., 2014). We then projected our phenotypic data onto these cancer-associated mutants and identified those that were depleted in our screen (Figure 4A). Using our composite ERK2 phenotypic score, we ranked all 359 ERK2 residues from most depleted (#1) to most enriched (#359). Within the top 20 most depleted ERK2 residues, we found five ERK2 residues that contain missense mutations observed

in patient tumors or tumor-derived cell lines, including ERK2<sup>E322K</sup> (n = 19), ERK2<sup>E322V</sup> (n = 1), ERK2<sup>D321N</sup> (n = 2), ERK2<sup>D321V</sup> (n = 1), ERK2<sup>E81K</sup> (n = 2), ERK2<sup>P58L</sup> (n = 1), and ERK2<sup>S142L</sup> (n = 1) (Figures 4A and S2E). Collectively, these five ERK2 residues contain 32% (27/84) of all observed ERK2 cancer-associated mutants, none of which have yet to be found in the germline of healthy patients (ExAC, 2015). Many ERK2 cancer-associated mutants are observed in only a single patient and would be missed by frequency-based methods. Among these somatic events, substitutions at Pro-58 were associated with a drug-resistance phenotype (Figures 2A, 3A, and S3E). These data highlight the capacity of comprehensive variant characterization to nominate unappreciated candidate GOF mutants for subsequent validation.

Mutational frequency is often used to nominate oncogenic, activating somatic mutations. However, recurrent ERK2 mutations were not universally depleted in A375. For example, Arg-191 is recurrently mutated to His/Cys in ERK2 (n = 3). However, in this phenotypic assay, mutation of Arg-191 was as enriched as mutation of the kinase-essential phosphorylation sites Thr-185/Tyr-187 or the active lysine (Lys-54) (Figure S2E). In fact, somatic variants that encode enriched ERK2 proteins are not uncommon: we identified a number of ERK2 mutants that are enriched and disrupt highly conserved ERK2 residues previously characterized as critical for ATP binding or ERK2 activation but have not been observed in the germline of healthy humans, including ERK2<sup>T185A</sup> (n = 1), ERK2<sup>D167E/G</sup> (n = 2), ERK2<sup>D149Y</sup> (n = 1), ERK2<sup>R148L/S</sup> (n = 2), and ERK2<sup>H147Y</sup> (n = 1). These data suggested that, in the contextual constraints of this assay, a subset of enriched, tumor-associated ERK2 mutants may be kinase impaired, highlighting the need for functional approaches to complement frequency-based computational methods.

### Validation of Candidate GOF or LOF ERK2 Mutants

High-throughput assays permit comprehensive characterization of mutant behavior in simple assays (e.g., enrichment/depletion) but are not optimized to the nuances of each mutant and cannot identify more complex phenotypes (e.g., GOF/LOF) a priori. As such, validation of presumed mutant function is critical if we wish to interpret the consequences of mutant function and/or use this information to guide patient treatment strategies. ERK2 mutants with presumed GOF activity should retain function in the context of limited upstream MAPK-pathway activity. Thus, candidate ERK2 GOF mutants should rescue the proliferative effects of RAF or MEK inhibition, whereas mutants with wild-type or LOF activity should not. To test our functional predictions of ERK2 mutants found both in (1) human tumors and (2) displaying depletion/enrichment phenotypes in our screen, we expressed ERK2 mutants in A375 cells and tested

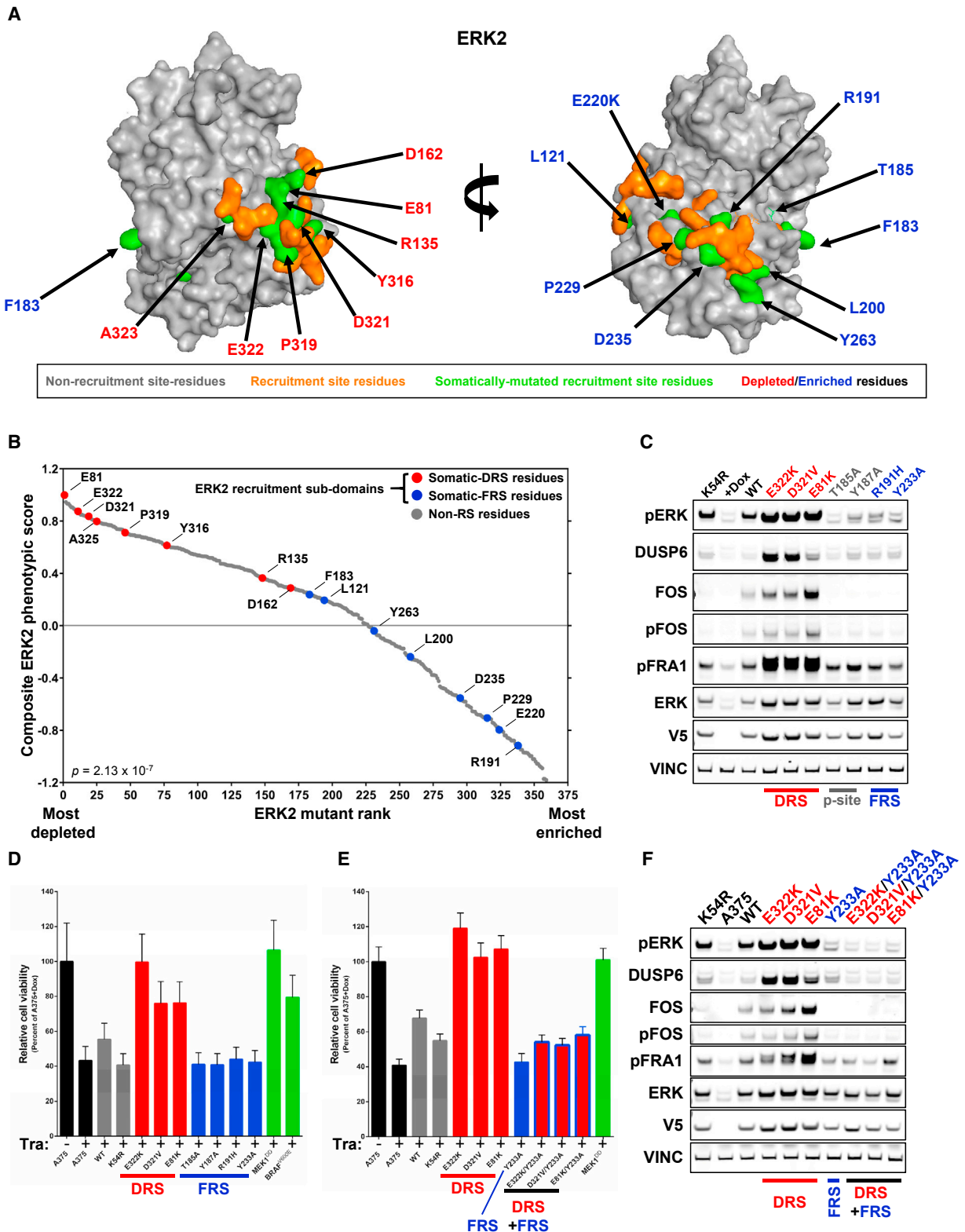
(C) Suppression of A375 proliferation with 2 nM trametinib (Tra, 96 hr of treatment) and proliferative rescue with GOF ERK2 mutants. Data are represented as a mean ( $\pm$ SD) of at least six replicates.

(D) Suppression of A375 proliferation with 500 nM SCH772984 (SCH, 96 hr of treatment) and proliferative rescue with ERK2 resistance mutants. Data are represented as a mean ( $\pm$ SD) of at least six replicates.

(E) In vitro kinase assay using V5-tagged ERK2 mutants immunoprecipitated from A375 cells treated with DMSO or 4 nM trametinib for 4 hr. Kinase activity is determined by the capacity to phosphorylate purified ELK1 (pERK, phosphorylated ERK; VINC, vinculin; V5 IP KA, immunoprecipitated V5 epitope followed by kinase assay).

See also Figures S2 and S4 and Tables S1, S2, S3, and S7.





**Figure 5. Somatic ERK2 Mutants Co-cluster in Effector Recruitment Domains but Have Opposite Phenotypes**

(A) ERK2 residues containing tumor-associated mutations are enriched and cluster in ERK2 effector recruitment domains ( $p = 4.303 \times 10^{-5}$ , Fisher's exact test) (PDB ID: 2ERK).

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their response to inhibitors of RAF or MEK (Figures 4B and 4C). Expression of wild-type ERK2, kinase-impaired ERK2 (ERK2<sup>K54R</sup>), and candidate LOF mutants (ERK2<sup>R191H</sup> and ERK2<sup>T185A</sup>) were insufficient to rescue the anti-proliferative effects of RAF or MEK inhibitors (Figures 4B and 4C). In contrast, putative GOF mutant ERK2 proteins (ERK2<sup>E322K</sup>, ERK2<sup>E322V</sup>, ERK2<sup>D321N</sup>, ERK2<sup>D321V</sup>, ERK2<sup>E81K</sup>, and ERK2<sup>S142L</sup>) all restored cell proliferation to levels comparable to cells expressing constitutively active MEK1 (MEK1<sup>S218/222D</sup> or MEK1<sup>DD</sup>) or ectopic BRAF<sup>V600E</sup> (Figures 4B and 4C). Only two ERK2 mutants tested here, ERK2<sup>P58L</sup> and ERK2<sup>P58G</sup>, were able to confer ERK-inhibitor resistance (Figures 4D and S3E). ERK2<sup>P58L</sup> had a modest capacity to rescue RAF inhibition, whereas other substitutions at the same Pro-58 residue, including ERK2<sup>P58G</sup>, had more prominent phenotypes (Figures 4B and 4C). Consistent with these data, immunoprecipitates from candidate GOF ERK2 mutants were able to induce a mobility shift of recombinant ELK1 (a surrogate for ELK1 phosphorylation) in vitro following treatment with trametinib at a concentration that suppressed wild-type ERK2 activity (Figure 4E). In this assay, the candidate LOF mutants, including ERK2<sup>R191H</sup> and kinase-dead ERK2<sup>K54R</sup>, were unable to induce ELK1 phosphorylation or mobility shift at baseline or in the presence of trametinib (Figures 4E and S4A). These data suggested that a subset of ERK2 somatic mutants possess GOF activity and that RAF and MEK inhibitors may be contraindicated for patients whose tumors harbor these mutants. Moreover, in spite of their contextual limitations, these studies demonstrate that high-throughput approaches can identify unappreciated GOF and LOF mutants found in human tumors.

### Spatially Proximal ERK2 Mutations Encode Mutants with Opposite Phenotypes

Computational approaches have dramatically improved our ability to identify functionally impactful cancer-associated mutants (Kamburov et al., 2015; Lawrence et al., 2014; Porta-Pardo and Godzik, 2014; Tamborero et al., 2013; Vogelstein et al., 2013). These approaches identified a “hotspot” mutation in ERK2 (E322K) that displays GOF properties in validation experiments (Figures 4B, 4C, and 4E). Orthogonal computational approaches, including CLUMPS, additionally identified enrichment ( $p = 0.0053$ ) of mutant residues (including E322K) within ERK2 effector recruitment domains (Alexa et al., 2015; Kamburov et al., 2015; Lawrence et al., 2014). This observation was buttressed by the finding that additional ERK2 tumor-associated mutations not found within the CLUMPS mutational search space were also enriched ( $p = 4.303 \times 10^{-5}$ , Fisher’s exact test) in ERK2 effector recruitment domains (Figure 5A) (Lee

et al., 2004; Zhang et al., 2003). While these approaches universally nominated ERK2 recruitment domain mutants as functionally important, we were surprised to observe that both depleted and enriched ERK2 mutants, including validated ERK2 GOF and LOF mutants, clustered in ERK2 recruitment domains (Figure 5A). This phenotypic distinction was not random: mutant activity was dictated by their localization within two distinct, well-characterized recruitment regions; alterations in the D-recruitment site (DRS, alternatively known as the common docking domain) contained both depleted and validated GOF proteins, whereas alterations in the F-recruitment site (FRS, alternately known as the DEF [docking site for ERK and FXFP] pocket) encoded enriched and validated LOF proteins (Roskoski, 2012) (Figures 5B and S5A).

To validate the hypothesis that FRS mutants are LOF and that DRS mutants are GOF, we expressed ERK2 domain mutants in A375 cells and exposed them to the MEK inhibitor trametinib. DRS mutants displayed an increased capacity to phosphorylate downstream pathway components (Figure 5C) and could rescue the proliferative decrement caused by MEK inhibition (Figure 5D). In contrast, ERK2 FRS mutants behaved equivalently to kinase-impaired ERK2 (ERK2<sup>K54R</sup>), were unable to signal to DUSP6, FOS, and FRA1 (Figures 5C and S5B), and could not rescue the anti-proliferative effects of MEK inhibition (Figure 5D). Compound mutation of the FRS (ERK2<sup>Y233A</sup>) in DRS mutants abrogated their capacity to rescue upstream MEK inhibition and curtailed downstream signaling to DUSP6, FOS, and FRA1 similar to kinase-impaired ERK2 (ERK2<sup>K54R</sup>), suggesting that an intact FRS is required for GOF DRS mutants (Figures 5E and 5F). Given the proximity of the FRS to the activation loop and catalytic residues, it is likely that mutations in the FRS would negatively impact ERK2 kinase activity. Consistent with this prediction, FRS LOF ERK2 mutants have no activity in vitro (Figures 4E and S4A). Thus, although ERK2 mutations found in human tumors frequently cluster within ERK2 recruitment sites, they produce proteins with opposing phenotypes.

### Tumor-Associated ERK2 DRS Mutants Are Refractory to Dephosphorylation by DUSP6

High-throughput approaches can identify GOF mutants with equivalent phenotypes. However, determining the mechanism(s) of GOF mutants remains a challenge. ERK2<sup>D321N</sup> was originally discovered as a GOF mutant that has sustained kinase activity resulting from disrupted negative regulation by the DUSP6 phosphatase—an ERK2 effector that inhibits ERK2 activity through direct dephosphorylation (Bott et al., 1994; Chu et al., 1996;

(B) Alteration of residues in the DRS of ERK2 are associated with GOF phenotypes, whereas alterations in FRS residues are associated with LOF phenotypes ( $p = 2.13 \times 10^7$ , Student’s *t* test). Data points represent the mean of four biological replicates in A375 cells.

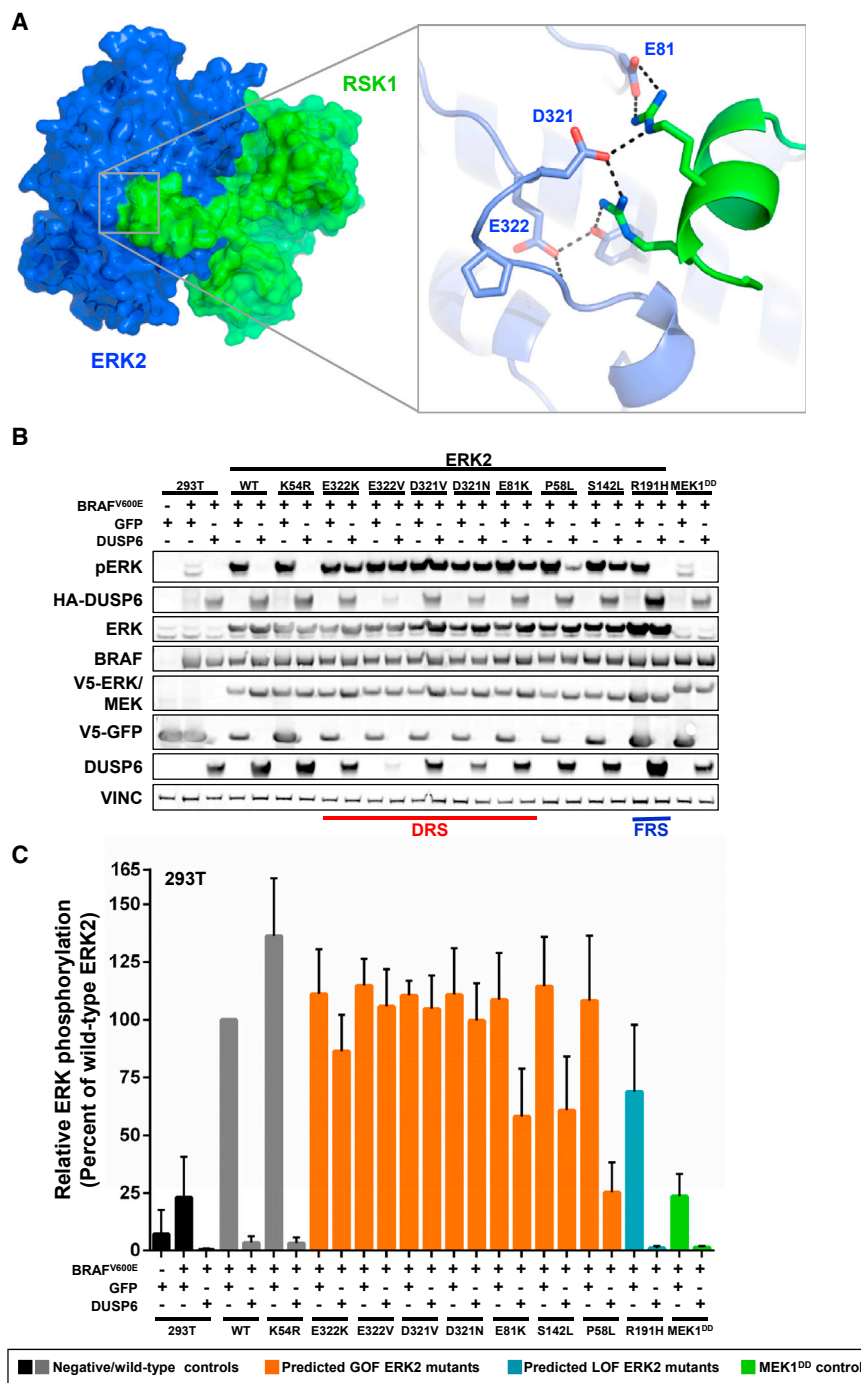
(C) Western blot of lysates from A375 cells showing that ERK2 DRS mutants induce DUSP6 expression, whereas FRS mutants behave like kinase impaired ERK2<sup>K54R</sup> or the phosphorylation site (p-site) mutants ERK2<sup>T185A</sup> ERK2<sup>T187A</sup> (pERK, phosphorylated ERK; VINC, vinculin).

(D) ERK2 DRS mutants rescue the anti-proliferative effects of trametinib in A375 cells (Tra, 96 hr of treatment), whereas FRS mutants do not. Data are represented as a mean ( $\pm$ SD) of at least six replicates.

(E) Compound mutation of the FRS (Y233A) in ERK2 DRS mutants abrogate their capacity to rescue the anti-proliferative effects of trametinib (Tra, 96 hr of treatment) in A375 cells. Data are represented as a mean ( $\pm$ SD) of at least six replicates.

(F) Western blot showing that compound mutation of the FRS (Y233A) in DRS ERK2 mutants abrogate their capacity to signal to downstream effectors in A375 cells.

See also Figure S5 and Table S3.



**Figure 6. Somatic DRS ERK2 Mutants Are Refractory to De-phosphorylation by the DUSP6 Phosphatase**

(A) Somatic mutated residues in the DRS of ERK2 (blue) form direct contacts with ERK2 effectors, including RSK1 (green, PDB ID: 4NIF).

(B) Somatic DRS ERK2 mutants are refractory to dephosphorylation by the DUSP6 phosphatase in transfected HEK293T cells (pERK, phosphorylated ERK; VINC, vinculin).

(C) Quantification of phosphorylated mutant ERK2 when co-expressed with DUSP6, as in (B). Data are represented as the mean ( $\pm$ SD) from three independent experiments in HEK293T cells. Values are normalized to wild-type ERK2.

and measured ERK2 phosphorylation. Co-expression of DUSP6 abrogated phosphorylation of wild-type ERK2, kinase-impaired ERK2 (ERK2<sup>K54R</sup>), ERK2<sup>R191H</sup>, and endogenous ERK2 (Figures 6B and 6C). In contrast, DRS mutants all displayed sustained ERK2 phosphorylation in the presence of ectopic DUSP6. Surprisingly, ERK2<sup>S142L</sup> showed an equivalent degree of sustained phosphorylation when compared to known DRS ERK2 mutants, suggesting that impaired dephosphorylation by DUSP6 might underlie the GOF properties of DRS mutants and ERK2<sup>S142L</sup>. Given the physical proximity of Ser-142 to the DRS, these data suggest that Ser-142 may be an unappreciated component of the ERK2 DRS (Figure S5C). Notably, sustained phosphorylation was not a universal property of GOF ERK2 mutants—ERK2<sup>P58L</sup> exhibited a marked reduction in phosphorylation in the presence of DUSP6 (Figures 6B and 6C). Collectively, these studies suggest that rare cancer mutants, such as ERK2<sup>E81K</sup>, ERK2<sup>S142L</sup>, and ERK2<sup>D321N</sup>, can achieve GOF properties through the same mechanisms as recurrent alterations (ERK2<sup>E322K</sup>). These observations are corroborated by the fact that ERK2 mutants that abrogate DUSP6 dephosphorylation are rarely

Li et al., 2007). As DUSP6 interacts with ERK2 via the DRS, we hypothesized that disrupted negative regulation by DUSP6 may represent a generalizable mechanism for ERK2 DRS GOF properties (Farooq et al., 2001). This hypothesis was supported by the observation that ERK2<sup>E322K</sup>, ERK2<sup>D321N</sup>, and ERK2<sup>E81K</sup> establish the charged surface of the ERK2 DRS and form direct contacts with ERK2 effectors (Figure 6A).

To test this hypothesis, we co-expressed ERK2 mutants with BRAF<sup>V600E</sup> and either eGFP or DUSP6 in 293T cells

found in tumors that simultaneously contain alterations leading to frank MAPK pathway activation—in this context, there would be little preference for ERK2 mutations that impede ERK2 phosphorylation.

## DISCUSSION

Comprehensive saturation mutagenesis has set the stage for mutant protein characterization at scale. We applied these

technological advances to characterize mutants of ERK2 and identified a number of functionally consequential ERK2 mutants found in human tumors, including rare GOF ERK2 mutants. We also identified recurrent LOF ERK2 mutants, potentially indicating that these mutants can confer a selection advantage in certain contexts or possess kinase-activity-independent functions for ERK2 (Rodríguez and Crespo, 2011). Although it remains to be determined whether GOF or LOF alterations impact tumorigenesis or engender a dependency on ERK signaling in tumors, these data raise the possibility that presumed oncogenes can have both GOF or LOF mutations and challenge the gene-centric paradigm in which the classification of cancer genes is driven by the functions of a few deeply studied mutants. Moreover, these results imply that the mutational frequency of individual mutants is not a universal predictor of mutant protein function.

Collectively, these efforts represent an initial step toward comprehensive genome-guided oncology and suggest a general framework for disease-associated mutant classification. As genome sequencing studies multiply, these data remain stable and can continue to serve as a reference for newly discovered mutations. Moreover, as a resource, this library (and future libraries) can be publically deployed in multiple assays and cellular lineages to identify context-specific mutant function not feasible in these initial studies (Kim et al., 2016; Berger et al., 2016). Moving forward, one could imagine public repositories of aggregated somatic mutations alongside comprehensive phenotypic annotation.

The *sevenmaker* mutation (ERK2<sup>D321N</sup>) was discovered in *D. melanogaster* over 20 years ago and has been extensively characterized as a GOF mutant. However, since its discovery, the *sevenmaker* mutation has rarely been found in human tumors and, as a consequence, its role in oncology has remained unappreciated. Here, we identify additional cancer-associated GOF ERK2 mutants that mechanistically copy the *sevenmaker* mechanism of activation, are refractory to negative regulation by DUSP-family phosphatases, and lead to sustained ERK2 function in the presence of limiting upstream MEK activation. Thus, while the *sevenmaker* mutant itself is quite rare in human tumors, the discovery of additional “*sevenmaker*-like” mutants suggests that an unexpectedly large fraction of all cancer associated ERK2 mutants utilize similar mechanisms of activation, supporting a larger-than-appreciated role for the *sevenmaker* mutant in cancer. In contrast, we observed that alterations at Pro-58 achieve equivalent GOF phenotypes through mechanistically distinct mechanisms, despite the fact that this mutant has only been observed in a single patient sample.

Our comprehensive, unbiased approach to annotating ERK2 mutants allowed us to uncover unappreciated GOF or LOF somatic missense mutations in a heavily investigated gene and signaling pathway whose activation is long appreciated in cancer. These studies illustrate the potential of comprehensive mutant-characterization strategies to accelerate GOF mutant discovery, preemptively identify drug-resistant mutants, deepen our understanding of gene-regulatory mechanisms, and clarify how their disruption contributes to tumorigenesis.

## EXPERIMENTAL PROCEDURES

### High-Throughput ERK2 Mutant Screens

A375 cells were infected in six biological replicates ( $5.1 \times 10^7$  cells/replicate, 19% infection efficiency) with the lentiviral ERK2 mutant library followed by selection with puromycin. Post selection, we achieved an allelic representation of  $\sim 1171$ – $1482$  cells per variant. Each replicate was split into four experimental arms: (1) 24-hr un-induced early time point, (2) 96 hr of 1  $\mu\text{g/ml}$  doxycycline and 16 hr of 1  $\mu\text{g/ml}$  doxycycline followed by treatment with (3) 2  $\mu\text{M}$  SCH722984 or (4) 3  $\mu\text{M}$  VRT11E for 12 days of continuous culture. Genomic DNA was prepared from cell pellets ( $2.0 \times 10^7$  cells/replicate) and treated with RNase and ERK2 variants amplified with vector-specific primers (forward: TGGGAGGCCTATATAAGCAGAGCTCG, reverse: CGGAACCACGCC AGAGC). Indexed Nextera libraries were generated from PCR products and subjected to massively parallel sequencing on four lanes of HighSeq2500, resulting in a minimum of 200 million reads per lane and an average coverage of  $\sim 0.3\times$  per sample. ERK2 protein structures were all retrieved from PDB: 4NIF, 2ERK, 4QTE, 4QTA, and 4FMQ. Mapping of phenotypic data onto the crystal structure of ERK2 was performed using UCSF Chimera (Pettersen et al., 2004).

### Creation of Individual ERK2 Mutants

Full-length wild-type ERK2 (NM\_002745.4) was synthesized (GenScript), and site-directed mutagenesis was performed in pDONOR223 to all reported ERK2 mutants. All mutants were sequence confirmed using Sanger sequencing and transferred by LR-mediated recombination into the lentiviral vectors pLIX403 (Addgene) for inducible gene expression or pLVX307 (Addgene) for constitutive expression in mammalian cells.

### Drug-Sensitivity Measurements

Inducible ERK2 mutant-expressing A375 cells were seeded into 96-well, white-walled, clear-bottom plates at a density of 2500 cells/well. Twenty-four hours after seeding, doxycycline was added to the wells at a concentration of 1  $\mu\text{g/ml}$ , and drugs were added using an HP D300 Digital Dispenser at the following concentrations: trametinib at 2 nM, SCH722984 at 500 nM, and dabrafenib at 10 nM, with the final volume of DMSO not exceeding 0.5%. After the addition of drugs, cells were incubated for 96 hr, and cell viability was measured using CellTiterGlo viability assay (Promega). Viability was calculated as a percentage of control (DMSO-treated A375 cells with 1  $\mu\text{g/ml}$  doxycycline). A minimum of six replicates were performed for each independent experiment.

### Immunoblots

Adherent cells were washed once with ice-cold PBS and lysed with 1% NP-40 buffer (150 mM NaCl, 50 mM Tris [pH 7.5], 2 mM EDTA [pH 8], 25 mM NaF, and 1% NP-40) containing 2  $\times$  protease inhibitors (Roche) and 1  $\times$  Phosphatase Inhibitor Cocktails I and II (Calbiochem). Lysate protein content was quantified (BCA assay) and normalized, and then proteins were reduced and denatured (95°C) and resolved by SDS gel electrophoresis on 4%–20% Tris/Glycine gels (Invitrogen). Resolved protein was transferred to nitrocellulose membranes, blocked in LiCOR blocking buffer and probed with primary antibodies.

## SUPPLEMENTAL INFORMATION

Supplemental Information includes Supplemental Experimental Procedures, six figures, and seven tables and can be found with this article online at <http://dx.doi.org/10.1016/j.celrep.2016.09.061>.

## AUTHOR CONTRIBUTIONS

Conceptualization, C.M.J.; Methodology, T.S.M., F.P., and A.K.; Validation, L.B. and A.A.; Formal Analysis, N.S.P., O.C., A.K., C.Z., and A.B.B.; Investigation, L.B., A.A., S.P., M.B., D.C., E.M.G., and N.S.P.; Resources, T.S.M.; Writing – Original Draft, C.M.J.; Writing – Review & Editing, C.M.J., L.B., A.A., D.E.R., F.P., C.Z., O.C., A.K., E.M.G., and N.S.P.; Supervision, C.M.J., L.A.G., G.G., D.E.R., and F.P.

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