ARTICLE OPEN (Inhibitor resistance in lung adenocarcinoma is associated with addiction to sustained ERK suppression

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MEK inhibitors (MEKi) have limited efficacy in KRAS mutant lung adenocarcinoma (LUAD) patients, and this is attributed to both intrinsic and adaptive mechanisms of drug resistance. While many studies have focused on the former, there remains a dearth of data regarding acquired resistance to MEKi in LUAD. We established trametinib-resistant KRAS mutant LUAD cells through dose escalation and performed targeted MSK-IMPACT sequencing to identify drivers of MEKi resistance. Comparing resistant cells to their sensitive counterparts revealed alteration of genes associated with trametinib response. We describe a state of "drug addiction" in resistant cases where cells are dependent on continuous culture in trametinib for survival. We show that dependence on ERK2 suppression underlies this phenomenon and that trametinib removal hyperactivates ERK, resulting in ER stress and apoptosis. Amplification of *KRAS^{G12C}* occurs in drug-addicted cells and blocking mutant-specific activity with AMG 510 rescues the lethality associated with trametinib withdrawal. Furthermore, we show that increased KRAS^{G12C} expression is lethal to other KRAS mutant LUAD cells, consequential to ERK hyperactivation. Our study determines the drug-addicted phenotype in lung cancer is associated with *KRAS* amplification and demonstrates that toxic acquired genetic changes can develop de novo in the background of MAPK suppression with MEK inhibitors. We suggest that the presence of mutant *KRAS* amplification in patients may identify those that may benefit from a "drug holiday" to circumvent drug resistance. These findings demonstrate the toxic potential of hyperactive ERK signaling and highlight potential therapeutic opportunities in patients bearing *KRAS* mutations.

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INTRODUCTION

Activating mutations in KRAS occur in ~30% of lung adenocarcinoma (LUAD), the major molecularly-defined subtype of lung cancer^{1,2}. Patients bearing tumors with KRAS mutations display shorter median survival, due in part to the lack of available targeted therapies³. In contrast, for patients with tumors driven by alterations in EGFR, MET, ALK, or ROS1, selective inhibitors have improved outcomes^{4–6}. The presence of KRAS mutations has also been associated with decreased benefit from chemotherapy⁷, as well as overall poor prognosis. AMG 510 is the first KRAS mutant-specific agent to enter clinical trials in humans and was recently granted Breakthrough Therapy designation from the FDA. AMG 510 is specific for KRAS with the G12C substitution, which is detected in ~30-40% of KRAS-mutant LUAD tumors⁸. However, in a recent phase 1 trial of AMG 510, only 32% of LUAD patients (19/59) had a confirmed objective response and the median progression-free survival was 6.3 months⁹. It is likely that the poor response of LUAD patients with KRAS^{G12C} to AMG 510 could be due to the ability of these cancers to quickly adapt to this targeted therapy or to the presence of pre-existing drug-resistant clones, as has been described in the context of other targeted therapies¹⁰. Indeed, in vitro studies have shown that resistance to KRASG12C-specific inhibitors may develop rapidly^{11,12}. These early results suggest that there remains an urgent need for new therapeutic strategies for LUAD patients with KRAS-driven cancers.

One previously explored avenue for the treatment of KRASdriven lung cancers is through the inhibition of downstream pathway effectors. The RAS-RAF-MEK-ERK (MAPK) signaling pathway is a key pathway activated by mutant KRAS and plays a critical role in cell proliferation, survival, and differentiation^{13,14}. Analysis of IC_{50s} for growth inhibition across multiple cell lines shows that when compared to KRAS-wild type cells, KRAS-mutant cell lines are most sensitive to MEK inhibitors compared to inhibitors of other cancer-associated pathways⁸. In mouse models of *KRAS* mutant lung cancer, MEK inhibitors display strong antitumor activity^{15,16}. Despite these promising pre-clinical data, MEK inhibitors have failed to demonstrate efficacy in patients. In separate phase II and III trials, treatment with MEK inhibitors did not result in significant improvement in response rates or survival compared to standard chemotherapy in patients with *KRAS* mutant lung cancer^{17,18}.

Mirroring the experience with other targeted therapies, resistance is a major limitation of MEK inhibition in the clinical setting. Studies have discovered several intrinsic mechanisms of resistance to MEK inhibitors, defined as resistance observed at the initiation of treatment. These include increased AKT signaling to bypass inhibition of the MAPK pathway^{19–21}, activation of STAT3^{22,23}, induction of ERBB3²⁴ and KRAS dimerization²⁵, all of which may contribute to the low objective response rate observed in KRAS mutant NSCLC^{17,18}. While intrinsic resistance is well examined, acquired resistance to MEK inhibitors, defined as resistance that develops in patients that initially respond to therapy, remains less understood, with ERK reactivation by FGFR upregulation the best characterized mechanism described to date²⁶.

Trametinib was initially discovered to induce cell cycle arrest in colorectal cancer cell lines in a *RB1* dependent manner²⁷. Additionally, recent findings in lung cancer have found that RB1



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Fig. 1 Impact of RB1 on trametinib resistance. a, b Isogenic H358 and H1972 clones with RB knockout were grown in the indicated concentrations of trametinib (1 nM to 10 μ M) for 3 days. Cell viability was assayed with alamarBlue and relative viability was calculated as a percent of the 0.1% DMSO-treated control. Error bars are SEM from three independent experiments. c, d Resistant RB knockout and control H358 and H1792 clones were grown in the indicated concentrations of trametinib (1 nM to 10 μ M) for 3 days. Cell viability was assayed with alamarBlue and viability was calculated relative to 0.1% DMSO vehicle control. Error bars are SEM from three independent experiments.

and p16/CDKN2A are activated by trametinib, and have implicated RB status in sensitivity to MEK inhibitors in KRAS mutant lung cancer cells; however, the underlying processes responsible for this observation remain poorly understood^{28,29}. Understanding both intrinsic and acquired resistance to MEK inhibitors will be essential for defining effective clinical strategies that employ MEK inhibitors in KRAS mutant lung and other cancers, and improving overall patient outcomes.

Here, we investigated acquired resistance to MEK inhibition by generating isogenic pairs of trametinib-sensitive and -resistant KRAS mutant lung cancer cell lines through trametinib dose escalation studies. These models of acquired resistance to MEKtargeted agents in KRAS mutant lung cancer afforded the opportunity to investigate genetic mechanisms of resistance in this important clinical context. Through targeted DNA sequencing, we identified mutations associated with resistance and assessed the impact of RB loss via CRISPR-mediated genetic knockout. Importantly, we characterize a paradoxical "drug-addicted" state in one of our models where survival is dependent on sustained MEK inhibition and demonstrate that amplification of the KRAS-mutant allele mediates toxicity. This work provides insight towards better understanding trametinib resistance and improving the clinical utilization of MEK inhibitors for the treatment of patients with KRAS mutant lung cancer.

RESULTS

Establishment of KRAS-mutant lung adenocarcinoma cells demonstrating acquired resistance to trametinib

Acquired resistance to MEK inhibition in lung cancer has previously been associated with p16/RB1/CDK4 regulatory status^{28,29}. Thus, in order to model this scenario in KRAS mutant LUAD, we first generated isogenic clones of H358 and H1792 cell lines with CRISPR/Cas9-mediated *RB1* knockout. H358 and H1792 both bear

Table 1.Summary table of calculated IC_{50} values for parental and trametinib-resistant cell lines.		
Cell line	Parental IC $_{50}$ nM	TramR IC ₅₀ μ M
H1792 sgControl	20.3 (14.4–28.5)	>10
H1792 sg <i>RB1</i> #7	22.4 (16.4–30.4)	>10
H1792 sg <i>RB1</i> #14	37.6 (28.6–49.4)	>10
H358 sgControl	3.7 (2.7–5.1)	>10
H358 sgRB1#3	5.9 (3.9–8.9)	>10
H358 sg <i>RB1</i> #4	6.8 (5.1–9.1)	>10

KRAS^{G12C} activating mutations and are highly dependent on signaling through the RAS-RAF-MEK-ERK pathway for survival. Two single cell derived clones from H358 (H358 sgRB1#3 and H358 sgRB1#4) and H1792 (H1792 sgRB1#7 and H1792 sgRB1#14) were chosen based on the degree of RB1 knockout displayed. An empty vector control cell line was also established for each cell line (Supplementary Fig. 1A). Dose response curves and IC_{50} values were calculated for all cell lines by non-linear regression with fitting by least squares method, and demonstrate that all clones were sensitive to low doses of trametinib (H1792 sgControl = 20.3 nM, H1792 sg*RB1*#7 = 22.4 nM, 95% CL 14.4-28.5; 95% CI H1792 sq*RB1*#14 = 37.6 nM, 95% CI 28.6-49.4; 16.4-30.4: H358 sqControl = 3.7 nM, 95% CI 2.7-5.1; H358 sqRB1#3 = 5.9 nM, 95% CI 3.9-8.9; and H358 sgRB1#4 = 6.8 nM, 95% CI 5.1-9.1; Fig. 1a, b and Table 1). IC_{50s} calculated for *RB1* KO clones were compared to the IC₅₀ calculated for the control clone by extra sum-of-squares F test. In H1792 clones, RB1 knockout resulted in a modest increase in IC₅₀ for RB1 KO clones, which was found to be significant in H1792 sgRB1#14 (p < 0.0001) when compared by extra-sum-ofsquares F test. In both H358 clones, RB1 knockout resulted in

modest but consistent increases in trametinib IC₅₀ relative to the vector control, which was significant for both clones (p = 0.0305and p = 0.0002 for H358 sgRB1#3 and H358 sgRB1#4 respectfully). This is consistent with previous observations of RB1 loss decreasing sensitivity to trametinib in H358 cells^{28,29}. Each clonally expanded cell line was treated with escalating doses of trametinib until they were able to consistently grow in a concentration of $1 \,\mu$ M, at which point they were considered resistant. We observed no difference in the rate at which RB1 KO or control clones acquired resistance (Supplementary Fig. 1B). The IC_{50s} for inhibition of growth by trametinib were then re-assessed and found to be $>10 \,\mu$ M for each resistant clone (referred to from this point with "tramR" after the cell line name; Fig. 1c, d and Table 1). Growth of parental cells was inhibited when cultured in 1 µM trametinib over a 5-day period (Supplementary Fig. 1C-H), while in contrast, resistant clones proliferated under these conditions (Supplementary Fig. 1C-H). H358 sgRB1#3^{tramR} and H358 sqRB1#4^{tramR} display faster growth in 1 μ M trametinib than their parental counterparts in 0.1% DMSO (Supplementary Fig. 1D, E). All other resistant clones grow at relatively similar rates to their parental counterparts in the absence of drug. Of note, doseresponse assays on H358 sgRB1#4^{tramR} produce a bell-shaped curve, suggesting these cells are more viable when grown in a certain range of drug concentration than when grown in 0.1% DMSO (Fig. 1c).

To assess the status of KRAS-related signaling pathways and previously reported mechanisms of MEK inhibitor resistance in the trametinib-resistant cells, we performed immunoblot analysis of key downstream effectors. All resistant clones except for H358 sgRB1#4^{tramR} - displayed dramatically decreased phospho-ERK in comparison to their parental counterparts, suggesting that these cell lines have bypassed the requirement for the MAPK signaling pathway for growth (Supplementary Fig. 1J). H358 sqRB1#3^{tramR}, H358 sqRB1#4^{tramR}, and H1792 sqRB1#14^{tramR} display increased pAKT levels, indicating that PI3K/AKT activation, a common mechanisms of adaptive resistance to MEK inhibition, may compensate for diminished MAPK activity and mediate cell survival in the presence of trametinib¹⁹. ERBB3 is also upregulated in all three H358^{tramR} clones (Supplementary Fig. 1J) and has previously been shown to activate PI3K signaling and drive resistance to targeted therapy²⁴. Lastly, increased expression of FGFR1 due to feedback inhibition has been reported to induce resistance to MEK inhibition²⁶, and was observed in H358 sgControl^{tramR} and H358 sgRB1#4^{tramR} cells (Supplementary Fig. 1J). Activation of epithelial to mesenchymal transition (EMT) genes has also been reported in cases of resistance to targeted therapies in lung cancer³⁰⁻³². Treatment naïve H358 and H1792 cells have differing expression of EMT genes, with the latter being more mesenchymal like, which may influence mechanisms of resistance. H358 sgRB1#4^{tramR} also displayed upregulation of Ncadherin, vimentin, snail, and slug as well as downregulation of E-cadherin (Supplementary Fig. 1J), all of which are associated with an FGFR1-regulated mesenchymal-like state in KRAS mutant LUAD³². This suggests that H358 sgRB1#4^{tramR} may have undergone EMT while developing resistance to trametinib. Images of parental and resistant H358 sqRB1#4 cells also suggest a morphological shift to a more mesenchymal-like phenotype (Supplementary Fig. 11). However, the lack of phosphorylated FGFR1 indicates that the cells may not be reliant on FGFR1 signaling for survival. Overall, these data suggest that the trametinib-resistant cell lines have bypassed the requirement for MAPK pathway signaling, and instead may rely on activated ERBB3-PI3K-AKT pathways to sustain cancer cell survival in the face of MEK inhibition.

Drug removal leads to cell death in selected trametinibresistant lung cancer cells

Assessment of known mechanisms of resistance to MEK inhibitors offered potential insights into the processes driving acquired resistance in our isogenic model systems. Upon further characterization, we found that H358 sgRB1#4^{tramR} was dependent on continued culture in trametinib for survival. Using the IncuCvte S3 live-cell imaging system, we measured well confluence and nuclei count over time. We performed logistic growth regression using confluence measurements to determine the growth rate of cells under different treatments with calculated growth rates compared by extra sum-of-squares F test. Paradoxically, H358 sgRB1#4^{tramR} cells have a significantly higher growth rate (p < 0.0001) when cultured in 1 μ M trametinib $(0.03734 h^{-1}, 95\%)$ Cl 0.03547 h^{-1} -0.03927 h^{-1}) than when the drug is withdrawn $(0.02395 h^{-1}, 95\% CI 0.02106 h^{-1}-0.02692 h^{-1})$, in contrast to the parental counterpart (Fig. 2a and Supplementary Fig. 2A). This relationship is also seen when assessing nuclei counts (Supplementary Fig. 2C). H358 sg*RB1*#4^{tramR} cells also display significantly poorer colony forming ability relative to their parental counterpart (Fig. 2b). While parental H358 sgRB1#4 cells can proliferate in 0.1% DMSO but are inhibited by 1 µM trametinib, H358 sgRB1#4^{tramR} only grow in 1 μ M trametinib and not in 0.1% DMSO (Fig. 2c). Together, this suggests that the cells - which were initially sensitive to trametinib - have subsequently become "addicted" to the drug in the process of acquiring resistance. When H358 sgRB1#4^{tramR} is grown without trametinib, cells develop vacuoles, similar to the phenotype we have previously reported that coincides with hyperactive MAPK signaling in KRAS mutant lung cancer cells³³ (Fig. 2d). Bright field images from the IncuCyte assays confirmed the increased proliferation in 1 µM trametinib, as well as appearance of vacuoles ~72 h following drug removal (Supplementary Fig. 2A). Withdrawal of trametinib also corresponds to activation of caspases 3 and 7, as well as PARP cleavage, suggesting that drug removal induces apoptosis (Fig. 2e). The drug addiction phenotype was only observed in H358 sgRB1#4^{tramR}, with all other resistant clones demonstrating no adverse effects when trametinib was removed. Parental and resistant H358 sgRB1#4 cells were submitted for STR profiling and were confirmed to be H358 cells (Supplementary Fig. 2B). Interestingly, H358 sqRB1#4^{tramR} was the only trametinibresistant clone with appreciable levels of pERK (Supplementary Fig. 1J), suggesting activation of this pathway may play a role in mediating the drug-addicted state.

Addiction to MEK inhibitor treatment is mediated by ERK2

Our observation that MEK inhibitor withdrawal leads to cancer cell death mirrors similar reports of targeted therapy addiction in melanoma^{34–38}, lung cancer³⁹, and lymphoma⁴⁰. In these reports, resistant cells have become dependent on suppression of the MAPK signaling pathway for survival, implicating hyperactivation of the MAPK pathway - and in some instances hyperphosphorylation of ERK2 specifically - as the driver of the drug addiction phenotype. Our previous work has demonstrated that hyperactivation of ERK2 is toxic to lung adenocarcinoma cells bearing KRAS or EGFR oncogenic mutations⁴¹. Given that H358 sqRB1#4^{tramR} demonstrates addiction to a MEK inhibitor, and that MEK1/2 directly activates ERK1/2, we next assessed the effects of drug withdrawal on ERK1/2 phosphorylation. We observed that removal of trametinib corresponds to a major rebound in pERK levels within 30 minutes and persists past 72 hours, decreasing with time (Fig. 3a). Trametinib removal also corresponds with an increase in downstream targets of pERK including pRSK after 30 minutes, increases in cFOS and p-cJun after 1 hour and upregulation of FRA1 after 3 hours (Supplementary Fig. 3A). While p-cJun and cFOS increases appear to be transient, pRSK and FRA1 increases are sustained past 72 hours.



Fig. 2 H358 sgRB1#4^{tramR} cells are addicted to trametinib. a H358 sgRB1#4^{tramR} grow slower in 0.1% DMSO then in 1 µM trametinib as measured by IncuCyte S3 live-cell imaging system. Error bars represent SD from four independent experiments. *P* value from extra sum-of-squares F test on calculated logistic growth rate are indicated. ****p < 0.0001. b Clonogenic growth assay performed on H358 sgRB1#4^{tramR} grown in 0.1% DMSO or 1 µM trametinib. Cells were fixed and stained with crystal violet following 14-day treatment under the indicated conditions. Representative images from four independent replicates. Error bars represent SD from four independent experiments. Colonies were quantified using Fiji. *P* value from Student's *t* test on colony number shown, ****p < 0.0001. c H358 sgRB1#4^{tramR} cells were grown in either 0.1% DMSO or 1 µM trametinib for 7 days, then stained with crystal violet. H358 sgRB1#4^{tramR} can proliferate better in 1 µM trametinib than in 0.1% DMSO vehicle, the opposite of what is seen in their parental counterparts. d ×10 microscope images were taken after 11 days. Vacuoles form in H358 sgRB1#4^{tramR} cells when grown without trametinib. Scale bar shown represents 400 µm. e H358 sgRB1#4 parental and resistant cells were grown in either 0.1% DMSO or 1 µM trametinib. H358 sgRB1#4^{tramR} cells display upregulation of apoptosis markers when grown without trametinib.

Markers of apoptosis are also induced after the pERK increase, 48 hours after drug removal, and coinciding with pH2AX, a marker of double stranded DNA breaks (Fig. 3a). We investigated makers of ER stress in H358 sgRB1#4^{tramR} and found that removal of trametinib results in upregulation of BiP, a chaperone protein upregulated in response to unfolded proteins in the ER, and of CHOP, a transcription factor known to activate apoptosis in response to ER stress (Supplementary Fig. 3B). CHOP is upregulated 12 hours after drug removal along with ATF4 and p-eIF-2A, two activators of the protein, suggesting an ER stress response may be driving subsequent apoptosis.

To validate pERK as the effector of this paradoxical drug addiction phenotype, we attempted to rescue H358 sg*RB1*#4^{tramR} cells from trametinib withdrawal by treatment with SCH772984,



Fig. 3 ERK2 hyperactivation mediates trametinib addiction. a H358 sg*RB1*#4^{tramR} were treated with 0.1% DMSO or 1 µM trametinib, harvested after the indicated time periods, and immunoblotted for the proteins shown. Starting at 30 minutes after drug removal, and persisting past 72 hours, there is a strong pERK rebound, as well as induction of markers of apoptosis and DNA damage. **b** H358 sg*RB1*#4^{tramR} cells were seeded in the indicated concentrations. Inhibition of ERK with 0.5 µM SCH772984 rescues H358 sg*RB1*#4^{tramR} cell growth after trametinib removal, as measured by IncuCyte S3 live-cell imaging system. Error bars represent SD from four independent replicates. *P* value from extra sum-of-squares F test on calculated logistic growth rate is indicated. ****P < 0.0001. **c** H358 sg*RB1*#4^{tramR} cells were treated with indicated drug concentrations for indicated time, harvested, lysed, and immunoblotted. Treatment with 0.5 µM SCH772984 rescues induction of pERK and apoptosis markers. **d** siRNA targeting ERK1 and/or ERK2 were transfected into H358 sg*RB1*#4^{tramR}. Knockdown of ERK2 alone, or ERK1 and ERK2, rescues cells from death after trametinib removal. Knockdown of ERK1 alone further inhibits cell growth following trametinib removal. Confluence was measured by IncuCyte S3 live-cell imaging system. Error bars represent SEM from four independent experiments. *P* values from Student's *t* test on confluence at endpoint growth rate are indicated. ***p* < 0.01, *****p* < 0.0001.

an ERK1/2 inhibitor⁴². Treatment with 0.5 μ M SCH772984 results in full rescue of cell death following trametinib removal as indicated by logistic growth regression analysis (0.5 μ M SCH772984 = 0.03975 h⁻¹, 95% CI 0.03716 h⁻¹ to 0.04244 h⁻¹; 0.1% DMSO = 0.02395 h⁻¹, 95% CI 0.02106 h⁻¹ to 0.02692 h⁻¹; p < 0.0001; Fig. 3b). Treatment with SCH772984 reduces pERK to levels similar to treatment with 1 μ M trametinib, highlighting the suppression of ERK hyperactivation after MEK inhibitor withdrawal (Fig. 3c). SCH772984 treatment also rescues cells from induction of apoptosis markers. To assess the role of ERK2 specifically, we performed siRNA knockdown of ERK1 and ERK2 alone or in combination in the drug-addicted cells. We observed that knockdown of ERK2 rescued cell growth following trametinib removal, whereas knockdown of ERK1 alone further inhibited cell growth under this condition (Fig. 3d). At endpoint, confluence of cells grown in 0.1% DMSO and treated with siERK2, siERK1 + siERK2, or siERK1 were significantly different than confluence of cells grown in 0.1% DMSO treated with siNT (p = 0.0016, p = 0.0023, and p < 0.0001, respectively). Together, these findings demonstrate that MEK inhibitor withdrawal leads



Fig. 4 MAPK pathway components are amplified in H358 sgRB1#4^{tramR}. a MSK-IMPACT profiling reveals *RAC1*, *RAF1*, *MAP2K2*, and *KRAS* copy number gains and amplifications. Alteration status for each gene is indicated by color for each cell line **b** H358 sg*RB1*#4 parental and resistant cells were cultured in 0.1% DMSO or 1 µM trametinib respectively, harvested, and immunoblotted for the indicated proteins. Genes that were amplified in **a** were validated at the protein level. **c** Proteins are amplified at three different nodes above ERK1/2 in the MAPK pathway.

to acute hyperactivation of ERK2, which causes ER stress and subsequent apoptosis in MEK inhibitor-addicted resistant cells.

To investigate the role RB1 may play in the drug addiction phenotype, we re-expressed RB1 cDNA possessing silent mutations at the sgRNA binding sequence to avoid cleavage using a doxycycline inducible vector, with inducible GFP serving as a control (Supplementary Figs. 3C and 20). Induction of RB1 expression has no effect on pERK when the cells are grown in trametinib (Supplementary Fig. 3C). To assess if RB1 affects cell proliferation, we treated cells with doxycycline and cultured them with or without 1 µM trametinib for 9 days and noted no significant change upon induction of RB1, either in the presence or absence of trametinib (Supplementary Fig. 3D). Crystal violet staining reveals no differences in proliferation when RB1 is induced either with or without 1 µM trametinib, relative to GFP control states (Supplementary Fig. 3E). Together, these results suggest that RB1 does not play a role in the drug addiction phenotype and that the drug-addicted phenotype could have developed in RB proficient cells.

Acquired genetic alterations in the MAPK signaling pathway in drug addicted cells

In order to elucidate mechanisms of acquired resistance and addiction to trametinib, we performed targeted sequencing using the MSK-IMPACT panel⁴³ (Supplementary Tables 1 and 2). Sequencing detected CRISPR induced RB1 mutations in the two resistant H358 clones as P28Qfs*35 and E30* for H358 sgRB1#3^{tramR} and H358 sgRB1#4^{tramR} respectively. In addition to a candidate F53V mutation identified in MAP2K1 (encoding MEK1) that could potentially mediate resistance in H1792 sgControl^{tramR} cells (Supplementary Fig. 4B), this analysis revealed copy number alterations of key MAPK regulators in H358 sgRB1#4^{tramR} that could potentially regulate the MEKi withdrawal phenotype. This included copy number amplification of KRAS and RAF1 (encoding c-Raf), as well as gains of MAP2K2 (encoding MEK2) and RAC1 (Fig. 4a). All of these genes have been reported to play a role in ERK activation, which we demonstrated has a crucial function in trametinib addiction. We found that H358 sgRB1#4^{tramR} has increased RAS, CRAF, RAC1 and MEK2 protein levels, confirming the downstream consequence of genomic amplification (Fig. 4b). H358 cells are heterozygous for mutant KRAS with one wild type and one mutant allele. MSK-IMPACT reveals that the KRAS^{G12C} mutant allele is the one amplified in both parental and resistant H358 sgRB1#4. Overall, we found that the MAPK pathway is potentially activated in H358 sqRB1#4^{tramR} cells at three different nodes above ERK (Fig. 4c), suggesting that one or more of these alterations may drive ERK hyperactivation after trametinib withdrawal.

KRAS^{G12C} amplification results in ERK hyperactivation following trametinib withdrawal

We have previously shown that overexpression of KRASG12V in H358 cells leads to ERK hyperactivation and cellular toxicity⁴¹. To evaluate mutant KRAS amplification as a potential mediator of the drug-addicted phenotype, we first compared RAS activity levels in H358 sgRB1#4 parental and resistant cell lines by affinity purification for active GTP-bound RAS. This revealed a major increase in RAS activity in the resistant cells (Fig. 5a). We performed gPCR on both parental and tramR H358 sgRB1#4 cells and confirmed that KRAS is the only RAS isoform overexpressed in the resistant context (Fig. 5c). Based on this observation, we hypothesized that inhibiting KRAS may circumvent the toxic effects of MEK inhibitor withdrawal in H358 sgRB1#4^{tramR} cells. To test this hypothesis, we knocked down KRAS with siRNAs and observed no difference in cell viability after removal of trametinib (Fig. 5b). However, KRAS knockdown did re-sensitize H358 sgRB1#4^{tramR} to trametinib, suggesting KRAS amplification mediates trametinib resistance (Fig. 5b). We rationalized that while H358 sgRB1#4^{tramR} are no longer as dependent on MAPK signaling as their parental counterparts, they are likely still dependent on KRAS signaling that is tuned within an appropriate level. Additionally, H358 sgRB1#4^{tramR} may be dependent on KRAS signaling though the AKT pathway by activation of PI3K. Thus, complete knockdown of KRAS may lead to cell death, regardless of MEK inhibition. We next sought to specifically suppress KRAS^{G12C} signaling using AMG 510, a small molecule inhibitor specific to the G12C form of the oncoprotein⁴⁴. By inhibiting KRAS^{G12C} with 0.5 µM AMG 510, we achieved full rescue of H358 sqRB1#4^{tramR} proliferation following trametinib removal, with a growth rate $(0.03308 h^{-1}, 95\% CI 0.03131 h^{-1}$ to 0.03488 h⁻¹) significantly higher (p < 0.0001) than observed in 0.1% DMSO (0.02395 h^{-1} , 95% Cl 0.02106 h^{-1} to 0.02692 h^{-1}) and comparable to that seen with 1 µM trametinib (Fig. 5d). Similar to treatment with the ERK1/2 inhibitor SCH772984, treatment with AMG 510 also suppressed the pERK rebound following removal of trametinib and partially prevented induction of cleaved PARP, cleaved caspase 3 and cleaved caspase 7 (Fig. 5e).

To rule out the involvement of other pathways in regulating the trametinib addiction phenotype, we performed similar experiments attempting to rescue H358 sg*RB1*#4^{tramR} cells from trametinib withdrawal by inhibiting other proteins that are amplified upon the acquisition of resistance, or pathways previously implicated in reports of drug addiction. In the only previous report of drug addiction in lung cancer cells, the authors demonstrate the rescue of this phenotype with AKT inhibition³⁹. To test this in our model, we attempted to rescue H358 sg*RB1*#4^{tramR} cells with an AKT inhibitor, MK-2206⁴⁵, but found no effect (Supplementary Fig. 5A). FGFR1 was also found to



Fig. 5 (continued)

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Fig. 5 Mutant KRAS amplification drives hyperactivation of ERK and drug addiction following trametinib removal. a Active GTP-bound RAS was isolated by affinity purification. H358 sg*RB1*#4^{tramR} cells have much higher levels of active RAS compared to their parental counterparts. Protein levels were quantified by densitometry using FJJ. Normalized active and total RAS levels relative to H358 sg*RB1*#4^{tramR}, as measured by IncuCyte S3 live-cell imaging system. The loading control used for this figure (GAPDH) is the same as the one used in Fig. 3d. Error bars are SEM from four independent experiments. *p* value from Student's *t* test on confluence at endpoint growth rate are indicated. NS = not significant. **c** KRAS RNA levels are increased in H358 sg*RB1*#4^{tramR} cells compared to parental counterparts. Error bars represent SEM from three technical replicates. **d** Inhibition of KRAS^{G12C} with 0.5 µM AMG 510 rescues H358 sg*RB1*#4^{tramR} cell growth after removal trametinib, as measured by IncuCyte S3 live-cell imaging system. Error bars represent SD from four independent experiments. *P* value from Student's *t* test on calculated logistic growth rate is indicated. *****P* < 0.0001. **e** Treatment with 0.5 µM AMG 510 partially rescues induction of pERK and apoptosis markers in H358 sg*RB1*#4^{tramR}. **f**-**h** H358, H23, and H1792 were engineered to stably express KRAS^{G12C} under the control of a doxycycline inducible as described in the methods. GFP or KRAS^{G12C} expression was induced by adding 200 ng/mL doxycycline to the media for the indicated amounts of time. Induction of KRAS^{G12C} after 24 h leads to increases in pERK levels. Cell viability measured by adding 200 ng/mL doxycycline, calculated relative to no doxycycline control. Induction of KRAS^{G12C} after 24 h. After 9 days, treatment with 1 nM trametinib or 1 nM AMG 510 apartially rescues pERK by KRAS^{G12C} after 24 h. After 9 days, treatment with 1 nM trametinib or 1 nM AMG 510 apartially rescues pERK by kRAS^{G12C} after 24 h. After 9 days, t

be upregulated in in H358 sg*RB1*#4^{tramR}, however treatment with the FGFR1 inhibitor infigratinib⁴⁶ did not rescue cell death following trametinib removal (Supplementary Fig. 5B). Indeed, higher concentrations of infigratinib inhibited proliferation following drug removal and points to FGFR1 upregulation mediating trametinib resistance in this cell line, but not trametinib dependence. We also attempted to rescue the drug-addicted phenotype with dabrafenib⁴⁷ and NSC 23766⁴⁸, inhibitors of c-Raf and Rac1, respectively, which, like KRAS, were amplified in H358 sg*RB1*#4^{tramR} cells. However, as with AKT and FGFR1 inhibition, these inhibitors could not circumvent cell death after trametinib removal at any concentration tested (Supplementary Fig. 5C, D).

To validate KRAS^{G12C} amplification as the determinant of ERK hyperactivation and cellular toxicity in the absence of MEK inhibition, we introduced exogenous KRAS^{G12C} under the control of a doxycycline inducible promoter into H358, H23, and H1792 cells, which all harbor a single endogenous mutant allele of KRAS^{G12C}. Stable polyclonal populations of H358, H23, and H1792 were created by lentiviral infection and subsequent selection. Mutant KRAS or GFP control, were subsequently induced by adding doxycycline to culture media. In H358, H23 and H1792 cells, induction of exogenous KRAS^{G12C} resulted in a significant decrease in cell viability (Fig. 5f-h). Induction of KRAS^{G12C} also resulted in increased pERK after 24 hours in the three cell lines. The loss of viability resulting from increased KRASG12C was rescued by treating the cells with 1 nM trametinib or 1 nM AMG 510 (Fig. 5i-k). Treatment with 10 nM or 1 nM AMG 510 and trametinib resulted in decreased pERK levels suggesting rescue may be due to buffering of ERK activity (Supplementary Fig. 5E). We also observed toxicity in HCT 116, a colon cancer cell line bearing KRAS^{G13D}, when overexpressing KRAS^{G12D} (Supplementary Fig. S5I, J). As in LUAD cell lines, treatment with the ERK inhibitor SCH772984 rescues both the loss of viability and the induction of pERK (Supplementary Fig. S5I, J).

This confirms that amplification of $KRAS^{G12C}$ can result in lethality in the absence of MAPK inhibition, further implicating this as a determinant of trametinib addiction in our model system. These findings also suggest that KRAS signaling – and subsequently ERK activity – must be finely tuned for optimal lung cancer cell growth. Complete suppression of KRAS with siRNA or high concentrations of AMG 510 results in cell death (Supplementary Fig. 5F–H). However, increased KRAS signaling through amplification of $KRAS^{G12C}$ also leads to cell death through ERK hyperactivation, which can be rescued through buffering p-ERK to tolerable levels with modest concentrations of AMG 510 or trametinib. A similar phenomenon is observed in H358 sgRB1#4^{tramR}. Cells are initially addicted to MAPK pathway signaling, and highly sensitive to MEK inhibitor treatment. In response to chronic treatment with trametinib, mutant KRAS becomes amplified and reactivates pERK signaling. When trametinib is removed, however, high levels of mutant KRAS signaling lead to excessive pERK and apoptosis (Fig. 6). This balance of KRAS signaling and pERK levels leads to therapeutic vulnerabilities, which can be exploited to both prevent and counteract acquired MEK inhibitor resistance.

KRAS^{G12C} amplification in a lung adenocarcinoma patient with resistance to AMG-510

We next sought to evaluate the potential for drug addiction in the context of treatment with AMG-510, the only KRAS-specific inhibitor currently approved for lung adenocarcinoma patients⁹. Clinical studies have revealed diverse mechanisms of resistance to AMG-510 in patients, including acquisition of secondary *KRAS* mutations and *EGFR* amplification^{49–51}. One study detailed highlevel, focal amplification of *KRAS^{G12C}* – without any other identifiable mechanisms – in two patients after the development of resistance⁴⁹. Our own investigation of patient samples uncovered a patient that developed *KRAS^{G12C}* amplification following treatment with sotorasib, at the onset tumor progression (Fig. 7). As with the drug-addicted cell line in our model of trametinib resistance, amplification of mutant *KRAS* in response to AMG-510 may render these tumor cells sensitive to hyperactivation of MAPK signaling if AMG-510 is withdrawn.

DISCUSSION

Due to promising pre-clinical data, targeting the MAPK signaling pathway through MEK inhibition remains an attractive option for treatment of KRAS mutant LUAD, despite recent clinical setbacks^{17,18}. Here we sought to model acquired resistance to MEK inhibitors in KRAS mutant LUAD cells through dose escalation in order to define strategies to increase treatment effectiveness. We observed upregulation of ERBB3 and FGFR1 (Supplementary Fig. 1J), as well as increased AKT levels, suggesting cells employed previously described avenues of intrinsic resistance to bypass MEK inhibition^{19,23,24,26}. Increased expression of EMT genes, as was observed in some of our cells (Supplementary Fig. 1J), has been associated with a more invasive phenotype⁵² and could be studied further in our models of trametinib resistance. In H1792 sgControl^{tramR} cells, we noted increased pERK levels coincident with a MAP2K1 F53V (Supplementary Fig. 4B) missense mutation. MAP2K1 F53 mutations have been previously documented in cancer patients and validated as functional driver mutations^{53,54}. Our cell line bearing the MAP2K1 F53V mutation





may therefore provide important insight into the role of *MAP2K1* in driving MEK inhibitor resistance upon future investigation.

Based on previous observations, we aimed to assess the role of RB inactivation in the development of MEK inhibitor resistance and found that one H1792 RB knockout clone and RB proficient cells were equally sensitive to trametinib while the other H1792 RB1 KO and both H358 RB1 KO cells had modestly higher IC_{50s} relative to the control line (Fig. 1a, b and Table 1). This mirrors previous results linking RB1 loss to trametinib resistance^{28,29}, although we observed a lesser effect using CRISPR/Cas9 to knockout *RB1* instead of acute siRNA mediated knockdown as

previously reported^{28,29}. However, H358 *RB1* knockout and control clones both remained sensitive to low doses of trametinib with IC_{50s} in the nanomolar range. In addition, H358 and H1792 clones developed resistance to trametinib at the same rate (Supplementary Fig. 1B), regardless of RB status, and both control and RB knockout resistant clones were resistant to >10 μ M trametinib (Table 1). This contrasts previous reports where RB deficient KRAS mutant H358 cells developed resistance to MEK inhibition faster than cells with normal RB levels²⁹. We observed that RB inactivation may slightly decrease trametinib sensitivity of parental H358 cells, but did not have an impact on acquired



Fig. 6 Mutant KRAS amplification is associated with resistance and dependence to trametinib. Parental H358 cells are sensitive to trametinib. In H358 sg*R*D1#4^{tramR} cells, *KRAS^{G12C}* amplification is associated with resistance to trametinib. In these same cells, when trametinib is removed, *KRAS^{G12C}* amplification drives ERK hyperactivation and cell death. Figure made with BioRender, adapted from "RAS Pathway", by BioRender.com (2021). Retrieved from https://app.biorender.com/biorender-templates.



Fig. 7 KRAS^{G12C} amplification in a lung adenocarcinoma patient following sotorasib treatment. A 67-year-old female former smoker (25 pack year history) presented with a 3-month history of chronic dry cough. A chest CT scan revealed a 1.7 cm right upper lobe lobulated nodule and bilateral lung nodules with accompanying diffuse infiltration of the surrounding mediastinal soft tissue. Subsequent imaging including a PET scan and brain MRI showed liver and nodal metastases and multiple subcentimeter enhancing brain metastases. The patient underwent a liver biopsy which revealed high-grade lung adenocarcinoma with a PD-L1 staining of 75%. MSK IMPACT of the liver tumor revealed a *KRAS^{G12C}* mutation. Patient initiated treatment on pembrolizumab monotherapy and received palliative radiation therapy to the mediastinum. Patient experienced strong radiographic response to pembrolizumab. Patient underwent stereotactic radiosurgery for a frontal lobe brain metastasis. Pembrolizumab was held due to pneumonitis and the patient continued on observation for 21 months. An MRI of the spine showed L4 vertebral body metastasis with epidural and possible leptomeningeal disease, which was confirmed by a lumbar puncture. MSK IMPACT once again showed a *KRAS^{G12C}* mutation. The patient underwent radiation therapy to the L4 metastasis and started systemic therapy with carboplatin and pemetrexed with radiographic response, but persistent leptomenigeal disease. She underwent radiation therapy to T12-S3 spinal metastases and whole brain radiation. She them commenced therapy with sotorasib with minimal response. IMPACT of a CSF sample taken 2.5 months into treatment with sotorasib once again showed the *KRAS^{G12C}* mutation and a new KRAS amplification. The patient died of disease progression 3.5 weeks later.

resistance to trametinib in our model system, which we confirmed by re-expressing RB in knockout cells with no observed effects on trametinib sensitivity (Supplementary Fig. 3D, E).

Of greatest interest, one of the cell lines, H358 sg*RB1*#4^{tramR}, was found to be both resistant to, and dependent on, trametinib for survival (Fig. 2A–E). In this cell line, trametinib removal resulted in induction of ER stress signaling and apoptosis (Supplementary Fig. 3B). Further investigation revealed that continued suppression of pERK2 is required for survival of this cell line and that cell death following drug removal could be rescued by genetic or pharmacological inhibition of ERK2 (Fig. 3B–D). We subsequently found that hyperactivation of ERK2 upon

drug withdrawal was driven by amplification of the KRAS^{G12C} allele in this context (Fig. 5D, E). We observed KRAS driven toxicity in multiple cancer types, and with different KRAS mutant alleles, including through ectopic expression of KRAS^{G12C} in H358, H23, and H1792 cells, and of KRAS^{G12D} in HCT 116 cells, which lead to decreased cell viability in all instances (Fig. 5F–K and Supplementary Fig. S5J). In previous work, our group also observed lethal effects when overexpressing KRAS^{G12V} in H1975 (*EGFR^{L858R/T790M}*), PC9 (*EGFR^{exon19del}*), and H358 cells, consistent with these findings⁴¹. Our observations add to a growing body of evidence demonstrating that hyperactive MAPK signaling, specifically through ERK2, is toxic to cancer cells, in particular those already

dependent on this pathway for survival^{36,37,41,55,56}. The distinction between ERK1 and ERK2 signaling is clear in our model, as inhibition of ERK1 alone further decreases viability of H358 sg*RB1*#4^{tramR} cells when trametinib is removed, whereas ERK2 inhibition rescues this effect. Comparison of downstream targets of ERK1 vs ERK2 might provide insight into which effectors drive cell death upon hyperactivation and which pathways the cells are dependent on for growth and survival. RB status was not found to affect the drug addiction phenotype (Supplementary Fig. 3D, E), suggesting that the genetic alterations resulting in drug addiction could also arise in cells without RB loss.

Our observations of "drug addiction" closely mirror reports from melanoma^{34–38,57}, where amplification of components of the MAPK pathway lead to BRAF and MEK inhibitor resistance and also results in dependence on continued ERK suppression for survival. Here we present an instance of drug addiction resulting from KRAS amplification. Our previous work has established that oncogenic mutations in EGFR and KRAS are mutually exclusive in LUAD due to toxicity induced by excessive ERK signaling when co-expressed⁴¹. Here, we build on this finding by demonstrating that genetic alteration otherwise toxic to cancer cells can develop de novo as a response to treatment with a MAPK pathway inhibitor. While these acquired genetic alterations, in our instance amplification of the heterozygous mutant KRAS^{G12C} allele, confer drug resistance, this is only possible due to continued MEK/ERK suppression by trametinib, and upon removal of the drug, these alterations result in lethality due to ERK hyperactivation. The observation of addiction to MEK inhibitors in vitro suggests that this phenotype may also develop in patients undergoing treatment with inhibitors of this pathway. In a melanoma xenograft model, resistance to vemurafenib, a BRAF^{V600E} specific inhibitor, was forestalled by using an intermittent dosing strategy⁵⁸. A similar approach of intermittent dosing of trametinib in patients known to have tumors with mutant KRAS amplification may also prolong drug response by both killing cells dependent on MEK for survival when on drug, and extinguishing drug resistant clones with toxic acquired genetic alterations. Probing for KRAS amplification may be an indicator of potential response to such "drug holiday" management.

Successful implementation of such a strategy will require further preclinical work and characterization of biomarkers indicative of hyperactivation, as well as careful planning of dosing timing in patients, to be successful. In melanoma, there are reports of tumors that initially acquired resistance to BRAF inhibitor, responding to a rechallenge following a period where therapy was discontinued, suggesting that this phenotype can arise in patients⁵⁹. As KRAS amplification resulting in drug addiction is an acquired mechanism of resistance, treatments schedules with longer intervals will likely be more effective. A recent phase 2 trial in melanoma compared continuous versus intermittent dosing of BRAF and MEK inhibitors and found intermittent dosing of inhibitors did not improve progressionfree survival⁶⁰. In preclinical models of melanoma, drug addiction occurred only after BRAF^{V600E} was amplified to a level where it activated the MAPK pathway beyond toleration. In the above trial, the investigators did not assess BRAF amplification status in patients before removing them from drug and follow a dosing schedule standardized for imaging. Different patients may develop drug-addicted cells at different rates and removing drug for patients without sufficient BRAF amplification to promote drug addiction may instead promote tumor growth. Personalized timing based on assessment of mutant BRAF or KRAS amplification levels by sampling cfDNA for example, may be required to better elicit MAPK hyperactivation to forestall drug resistance using an intermittent dosing strategy in lung and melanoma patients. Evaluation of the frequency of mutant BRAF or KRAS in subsequent biopsies should also be used to inform a decision to halt treatment. If there is only a small subpopulation of the tumor that is drug addicted, there will be only minor effects after drug withdrawal.

Finally, it has been demonstrated that mutant KRAS amplification can occur in the absence of any targeted therapies, without leading to lethality⁶¹⁻⁶³. We suggest that some cancer cells may survive the acquisition of such alterations by compensating in other ways. For example, previous work from our group has found that DUSP6, a ERK specific phosphatase, is significantly uprequlated in tumors with EGFR or KRAS activating mutations relative to tumors not bearing these mutations⁴¹. Inhibition of DUSP6 in mutant EGFR or mutant KRAS cell lines resulted hyperactivation of ERK and cell death⁴¹, suggesting that these cells have developed a dependence on DUSP6 for suppressing the signaling driven by these activating mutations. Thus, upregulating DUSP6 or other phosphatases may allow cancer cells to harbor amplification of mutant KRAS alleles. In our model, the presence of a MAPK targeted therapy such as trametinib could act as a substitute for DUSP6. By providing a background of suppressed MAPK signaling, it allows for the development of otherwise lethal genetic alterations. Thus, we expect KRAS^{G12C} amplification to result in drug addiction specifically when it develops de novo in response to treatment with a MAPK pathway targeted therapy.

Our discovery of drug addiction resulting from MEK inhibition has implications for both the treatment of KRAS mutant lung cancers and the continued study of MAPK pathway activation as a potential therapeutic target. Although MEK inhibitors alone or in combination with standard chemotherapy have not proven effective in the clinic, these compounds are still being investigated in combination with other targeted agents. Following the approval of AMG-510, genetic profiling of patients has revealed a wide range of resistance mechanisms⁴⁹⁻⁵¹. Importantly, the reactivation of RAS-MAPK signaling has been reported as a key mechanism by which tumors overcome KRAS^{G12C} inhibition in this context. For this reason, trametinib is currently being tested in combination with AMG 510 in clinical trials (NCT04185883) to block reactivation of MAPK signaling and the resulting resistance. Combination of KRAS-specific inhibitors with MEK inhibitors may sensitize cells that initially displayed intrinsic resistance to MEK inhibitors alone, which would result in more cases of adaptive resistance to MAPK pathway inhibition. This is analogous to the use of MEK inhibitors with BRAF targeted therapy in melanoma, a setting where drug addiction has been reported³⁵, underscoring the continued importance of defining avenues of trametinib resistance in LUAD. Probing for KRAS amplification in patients treated with MEK inhibitors alone or in combination with other therapies may help identify those who might benefit most from a drug holiday. KRAS^{G12C} amplification has been detected in patients resistant to AMG-510, by ourselves and others⁴⁹. Our cell line provides a model system for further study into how drug addiction may develop in patients, as well as how we can induce or further potentiate the effects of hyperactive ERK2 by inhibiting negative regulators of that pathway, such as DUSP6⁴¹.

METHODS

Cells lines and reagents

All cells were cultured at 37°; air; 95%; CO₂, 5%. H358 (NCI-H358), H23 (NCI-H23), H1792 (NCI-H1792) and 293T cells were obtained from American Type Tissue Culture (ATCC). Cells were regularly checked for mycoplasma contamination by polymerase chain reaction⁶⁴ and found to be negative. H358 sg*RB1*#4 parental and resistant cell lines were verified by STR profiling (Labcorp, Burlington, NC, USA). LUAD cells were grown in RPMI–1640 medium (Gibco, 11875119) supplemented with 10% fetal bovine serum (FBS) (Gibco, 12483020) and 1% Pen/Strep (Gibco, 15140-122). 293T cells were grown in DMEM medium complete with 10% FBS and 1% Pen/Strep (Gibco, 15140-122). For cells and

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experiments with doxycycline-inducible constructs, cells were grown in RPMI-1640 medium (Gibco, 11875119) supplemented with 10% tetracycline-free FBS (Clontech, 631101) and Pen/Strep (Gibco, 15140-122). Doxycycline hyclate (Sigma-Aldrich, D9891) was added to cells at 200 ng/mL when indicated. Trametinib (Selleckchem, S2673), SCH772984 (Selleckchem, S7101), AMG 510 (Selleckchem, S8830), SB 747651 A (Tocris, 4630), MK-2206 (Selleckchem, S1078), NSC 23766 (Selleckchem, S8031), dabrafenib (Selleckchem, S8031), infigratinib (Selleckchem, S2183) and N-acetyl-L-cysteine (Sigma-Aldrich, A7250) were added to cells when indicated. Experiments were performed on cells between passages 4-20.

CRISPR/Cas9 modification

The sgRNA sequence for *RB1* (5'-GCTCTGGGTCCTCCAGGA-3') was cloned into lentiCRISPRv2 (Addgene #52961) plasmid and the co-transfected with psPAX2 (Addgene #12260) and pMD2.G (Addgene #12259) into 293T cells with Lipofectamine 2000 (Life Technologies, 11668019) to generate lentiviral particles. Empty lentiCRISPRv2 without sgRNA was used as control for *RB1* guide during lentivirus infection and later studies. H1792 and H358 cells were infected with viral supernatant and then selected with puromycin (Sigma-Aldrich, 540222) to generate stable lines. Single cell-derived clonal cells and polyclonal cells were established after *RB1* knockout. H358 sg*RB1*#3, H358 sg*RB1*#4, H1792 sg*RB1*#17 and H1792 sg*RB1*#14 displayed the best *RB1* knockout and were selected for continued studies along with an empty vector control for each cell line.

Plasmids and generations of stable cell lines

pBABE GFP was a gift from William Hahn (Addgene #10668). GFP was subcloned into pENTR/D-TOPO (Invitrogen, K240020). pDONR223_KRAS_p.G12C was a gift from Jesse Boehm, William Hahn and David Root (Addgene #816665,). GFP and KRASG12C were cloned by Gateway LR Clonase II enzyme mix (Life Technologies, 11791020) into plnducer20 (gift from Stephen Elledge, Addgene # 44012⁶⁶). The custom RB1 construct was ordered from Twist Biosciences (See Supplementary for full sequence). The custom sequence was printed directly into a Twist Cloning Vector, and was directly cloned into pInducer20 by Gateway LR Clonase II enzyme mix. Lentivirus was generated by transfecting 239T cells with psPAX2 (Addgene #12260) and pMD2.G (Addgene #12259) and according expression vector with Lipofectamine 2000 (Life Technologies, 11668019). H358, H23, H1792, H358 sg*RB1*#4^{tramR} and HCT116 cells were infected with lentivirus and selected with 500 µg/mL G418 (Gibco, 10131027) for 2 weeks. Cells expressing GFP, KRAS^{G12D} or KRAS^{G12C} were maintained as polyclonal populations.

Generation of trametinib-resistant cells

To generate trametinib-resistant cell lines, we cultured H358 and H1792 single cell clones in trametinib starting at 10 nM or 30 nM for H1792 and H358 cells, respectively, and ending with 1 μ M. Trametinib-containing media was refreshed every 2 or 3 days. Resistant cells were maintained as single cell-derived clones under constant exposure to the drugs. No vehicle-treated cell control was maintained in parallel.

RNA interference

 5×10^5 cells were transfected with ON-TARGETplus siRNA pools (Dharmacon) targeting *MAPK3* (L-003592-00), *MAPK1* (L-003555-00), *KRAS* (L-005069-00-0005), or a non-targeting control (D-001810-10) at concentrations of 50 nM with DharmaFECT 1 transfection reagent (Dharmacon, T-2001-03). Target sequences are available in Supplementary Table 3. Cells were cultured for 48 h after transfection and before subsequent analysis.

Immunoblotting

Cells were harvested and lysed in RIPA buffer (G-Biosciences, CA95029-284) complete with protease/phosphatase inhibitor cocktail (Thermo, PI78446). Lysates were sonicated and protein concentration was determined by BCA protein assay kit (Pierce Protein Biology Products, 23225). Samples were denatured by boiling for 5 min in 4X loading buffer (Thermo Scientific, NP0008). Lysates were loaded on 4-12% Bis-Tris NuPage Protein Gels (NuPage, NP0336BOX), run in MOPS SDS buffer (NuPage, NP000102), transferred to PVDF Immobilon (Millipore, IPVH00010), and blocked in tris-buffered saline (BioRad, 170-6435) supplemented with 0.1% Tween20 (Fisher Scientific, BP337-500) (TBST) and 5% milk. Membranes were incubated in primary antibodies (1:1000) overnight at 4° in 5% bovine serum albumin (BSA) (Sigma, A9647-100G), washed with TBST, and then incubated in HRPlinked secondary anti-mouse or anti-rabbit (1:15000) (CST, 7076S and 7074S respectively) in 2.5% BSA for 1 h at room temperature. The following antibodies were obtained from CST: pERK (9101S; 1:1000), ERK (4695S; 1:1000), pAKT (4060L; 1:1000), AKT (4691L; 1:1000), p-mTOR (5536S; 1:1000), mTOR (2983S; 1:1000), pFGFR Y653/654 (3471S; 1:1000), FGFR1 (9740S; 1:1000), pErbB3 Y1289 (4791S; 1:1000), ErbB3 (12708S; 1:1000), cleaved PARP (5625S; 1:1000), cleaved caspase 3 (9661S; 1:1000), cleaved caspase 7 (9491S: 1:1000), pH2AX (2577S: 1:1000), Rac1 (8631: 1:1000), cRAF (9422S; 1:1000), MEK1/2 (9122S; 1:1000), RAS (8955S; 1:1000), RB (9309S; 1:1000), E-cadherin (3195S; 1:1000), N-cadherin (13116S; 1:1000), vimentin (5741S; 1:1000), Snail (3879S; 1:1000), Slug (9585S; 1:1000), BiP (3183S; 1:1000), CHOP (2895S; 1:1000), ATF4 (11815S; 1:1000), p-elF2A (9721S; 1:1000), pJNK (4668S; 1:1000), Elk1 (9182S; 1:1000), c-Fos (9F6) (2250S; 1:1000), c-Myc (D84C12) (5605S; 1:1000), RSK1/RSK2/RSK3 (D7A2H) (14813S; 1:1000), Phospho-p90RSK S380 (D3H11) (11989S; 1:1000), c-Jun (60A8) (9165S; 1:1000), Phospho-c-Jun S73 (D47G9) (3270S; 1:1000), FRA1 (D80B4) (5281S; 1:1000), p27 Kip1 (D69C12) (3686 T; 1:1000), p21 Waf1/Cip1 (12D1) (2947S; 1:1000), and p16 INK4A (D7C1M) (80772S; 1:1000) & vinculin (E1E9V) (13901S; 1:1000). GAPDH (sc-47724; 1:3000) was obtained from Santa Cruz Biotechnology. TTF1 (MA5-16406: 1:1000) was obtained from ThermoScientific. Densitometry was performed using FIJI software⁶⁷. All lysates from the same experiment were processed in parallel. Uncropped immunoblots blots of the main figures are included as Supplementary Figs. 6–19.

Measurement of cell viability

To assess IC_{50s} to trametinib, H358 and H1792 clones were seeded in 96-well plates at 5000 or 1500 cells per well, respectively, on day 0. On day 1, trametinib was added at the indicated concentrations. Seventy-two hours following trametinib treatment, cell viability was assessed by incubation in 10% alamarBlue viability dye (Life Technologies, Dal1100) for 2 hours. Absorbance was measured using a Cytation 3 Multi Modal Reader with Gen5 software (BioTek). For experiments involving doxycycline inducible constructs, H358, H23, H1792 and HCT116 tetO GFP, KRAS^{G12D} or KRAS^{G12C} cells were seeded at 6000 cells per well in a 6-well plate. H358 sgRB1#4^{tramR} tetO GFP and RB1 cells were seeded at 5000 cells per well in a 6-well plate. Doxycycline (200 ng/mL), trametinib or AMG 510 was added at the time of seeding. Media was changed on day 3 and on day 7. On day 9, alamarBlue cell viability agent was added to the media at 10%. Absorbance was measured using a Cytation 3 Multi Modal Reader with Gen5 software (BioTek).

For proliferation assay, cells were seeded at 1×10^5 cells per well. Trametinib was added at the time of seeding. Media was changed on day 3. On day 7, media was aspirated, and cells were washed with PBS. A 0.5% crystal violet (Sigma, HT90132), 20% methanol solution was added to cells. Cells were incubated with

rocking for 15 min, after which crystal violet was discarded and plates were left to dry overnight.

Clonogenic assays

H358 sg*R*B1#4^{tramR} cells were seeded at 100 cells per well in a 6-well plate in either 0.1% DMSO or 1 μ M trametinib and propagated for 11 days. Trametinib or DMSO was refreshed every 3 days. At endpoint, media was washed out and cells were stained with crystal violet. Colonies in the scanned images of the crystal violet stained plates were quantified using FJJI software⁶⁷. Briefly, colonies on the plate were identified using the "Color Threshold" and "Watershed" commands. Identified particles were subsequently counted using the "Analyze Particles..." function (Size filter = 5-infinity, circularity filter = 0.5–1.0).

IncuCyte growth assays

Cells were seeded at 5000 cells per well in a clear bottom 96-well plate and treated with drugs at the indicated concentrations on day 0. On day 1, cells were placed in an IncuCyte S3 live-cell imaging system contained in an incubator kept at 37 °C and 5% CO₂. Images were taken at a 4-hour intervals in quadruplicate for 120 hours. For experiments with nuclei quantification, cells were treated with Incucyte[®] Nuclight Rapid Red Dye for Live-Cell Nuclear Labeling (Sartorius, 4717) at time of experiment seeding for a final concentration of 1:750. For experiments with siRNA, cells were cultured for 48 h after siRNA transfection before being seeded into a 96-well plate and placed in the IncuCyte imaging system. Cells were imaged for 136 h.

MSK-IMPACT sequencing

We extracted DNA from trametinib-resistant clones and their parental counterparts using a DNeasy Blood & Tissue Kit (Qiagen, 69506). DNA was submitted for profiling on the MSK-IMPACT (Integrated Mutation Profiling of Actionable Cancer Targets) platform, a hybridization capture-based next generation sequencing (NGS) platform for targeted deep sequencing of exons and selected introns from 468 cancer-associated genes and selected gene fusions⁴³. The assay detects mutations and copy-number alterations in samples. We compared resistant cells to their parental controls, and considered alterations detected only in the resistant cells as potential genes associated with resistance to trametinib.

Quantitative RT-PCR

Cells were lysed and RNA was extracted using RNeasy Mini kit (Qiagen, 74106) according to manufacturer's protocol. cDNA was prepared using the High-Capacity RNA-to-cDNATM Kit (Applied Biosystems, 4387406). RT-PCR reactions were performed using the TaqMan Gene Expression Master Mix (Thermo Fisher, 4369016). The following TaqMan Gene Expression Assays primers were obtained from Thermo Scientific: KRAS (Hs00364284_g1, 4331182, Reference sequence NM_004985.4, amplicon length 111), NRAS (Hs00180035_m1 S, 4331182, Reference sequence NM_002524.4, amplicon length 86), HRAS (Hs00978051_g1, 4331182, Reference sequence NM_001318054.1, amplicon length 63) and β Actin (4333762 F). Reactions were performed on an Applied Biosystems 7500 Fast Real-Time PCR System (Thermo Fisher). Relative expression was quantified using the $\Delta\Delta$ Ct method and using the average cycle threshold.

RAS-GTP pulldown

Cells were treated with either 0.1% DMSO or 1 μ M trametinib in media containing 10% FBS for 24 hours. Cells were harvested, lysed and active RAS levels were measured by affinity purification using an Active Ras Detection Kit (Cell Signaling Technologies,

Ethics approval

Study protocols were approved by the MSKCC Institutional Review Board. Written informed consent was obtained from all patients and the study was conducted in accordance with the guidelines of the Declaration of Helsinki.

Statistical analysis

Statistical analyses were performed using GraphPad Prism version 8.2.1 (GraphPad Software, San Diego, CA, USA). Non-linear regression with fitting by least squares method was performed to determine IC₅₀ (nM) and growth rate constant k (hours⁻¹). Mean and profile likelihood 95% CI are reported. Parameters calculated for treatment conditions were compared to control parameters by Extra sum-of-squares F test. Differences in continuous variables were evaluated with a two-sided Student's *t* test. *P* values < 0.05 were considered statistically significant, indicated as following; **p* < 0.05, ***p* < 0.01, ****p* < 0.001, *****p* < 0.0001, NS not significant.

Reporting summary

Further information on research design is available in the Nature Research Reporting Summary linked to this article.

DATA AVAILABILITY

All mutations and copy number alterations identified in the cell lines assessed by IMPACT analysis are available in Supplementary Tables 1 and 2. RB1 re-expression sequence used is available in Supplementary Fig. 20. Due to HIPAA requirements, we are not consented to share individualized raw patient genomic data, which contains potentially identifying or sensitive patient information. Data can be made available for non-commercial use if if IRB approval for collaboration or data usage is obtained. Uncropped immunoblots blots of the main figures are included as Supplementary Figs. 6–19. Target sequences for siRNAs are available in Supplementary Table 3.

CODE AVAILABILITY

No code or scripts were used in this study.

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AUTHOR CONTRIBUTIONS

Conceptualization by D.A.F., Y.I., A.M.U., and W.W.L.; methodology by D.A.F., Y.I., F.D.J., A.M.U. R.S., M.L., and W.W.L.; investigation by D.A.F., Y.I., F.D.J., G.D.R., R.S., D.L., R.S., L.I.J.M., M.L., and W.W.L.; formal analysis, D.A.F., Y.I., M.S.M., and W.W.L. visualization by Y.I., A.N., D.A.F., and W.W.L.; writing – original draft by D.A.F. and W.W.L.; writing – review & editing by D.A.F., Y.I., R.S., M.L., A.M.U., and W.W.L.; funding acquisition by W.W.L.; resources by M.L. and W.W.L; supervision by W.W.L.

COMPETING INTERESTS

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ADDITIONAL INFORMATION

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