



Published in final edited form as:

*Cell Chem Biol.* 2019 September 19; 26(9): 1315–1321.e3. doi:10.1016/j.chembiol.2019.06.006.

## Engineering forward genetics into cultured cancer cells for chemical target identification

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### Summary

Target identification for biologically active small molecules remains a major barrier for drug discovery. Cancer cells exhibiting defective DNA mismatch repair (dMMR) have been used as a forward genetics system to uncover compound targets. However, this approach has been limited by the dearth of cancer cell lines that harbor naturally arising dMMR. Here, we establish a platform for forward genetic screening using CRISPR-Cas9 to engineer dMMR into mammalian cells. We demonstrate the utility of this approach to identify mechanisms of drug action in mouse and human cancer cell lines using *in vitro* selections against three cellular toxins. In each screen, compound-resistant alleles emerged in drug-resistant clones, supporting the notion that engineered dMMR enables forward genetic screening in mammalian cells.

### Graphical Abstract

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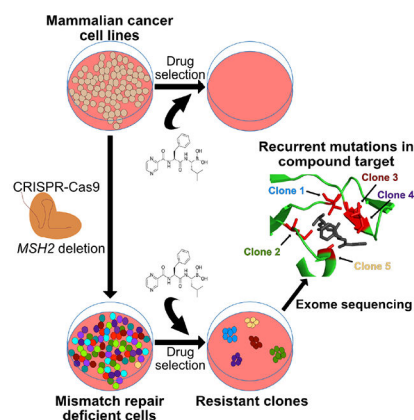
#### Author contributions

D.G.M. and D.N. conceived this study. D.G.M. supervised all aspects of the work, and Y.X. supervised data analysis. J.M.P. designed, performed and led all experiments. J.L., D.W., and A.S. performed experiments. J.K. analyzed exome sequencing data. D.G.M. and J.M.P. wrote the manuscript.

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#### Declaration of Interest

The authors declare no competing interests.



## eTOC

Target identification of small molecules remains a barrier for drug discovery. Here, Povedano et al. establish a platform for forward genetic screening using CRISPR-Cas9 to engineer DNA mismatch repair deficiency in cancer cell lines and demonstrate the feasibility of this approach to identify the known targets of three anti-cancer toxins.

## Keywords

Forward genetics; phenotypic screening; target identification; mismatch repair deficiency; hypermutation; mismatch repair

## Introduction

The identification of therapeutic targets in cancer can be divided into two complementary approaches. Target-based approaches use tumor sequencing or laboratory-based genetic studies to identify cancer driver genes followed by screening for small molecules that impair the protein products of cancer driver genes. Phenotypic high-throughput small molecule screens (HTS) first identify drug-like chemicals that selectively impair the growth of cancer cells. The latter approach has been limited by the technical challenge of identifying the direct protein targets of small molecules exhibiting anti-cancer effects. One strategy to identify chemical targets is through the identification of compound resistant alleles that impair compound-target interaction. Cancer cells with dMMR exhibit mutation rates increased as much as 50-750-fold compared to cells with intact MMR (Glaab and Tindall, 1997). As a result, these cells are predisposed to develop resistance through the acquisition of compound resistant alleles. Following selection, these compound resistant alleles can be identified by transcriptome or whole exome sequencing of multiple independent drug-resistant clones (Han et al., 2017, Han et al., 2016, Wacker et al., 2012). However, it is not clear whether this approach can be applied to other cancer cell lines, particularly those established from cancers without MMR deficiency or those harboring low mutation frequencies, such as pediatric malignancies. To date, a single cancer cell line, HCT116, derived from a human colorectal cancer harboring a naturally-arising mutation in the MMR protein MLH1, has been used successfully for these studies. Here, we sought to determine if

somatic deletion of the MMR protein MSH2 using CRISPR-Cas9 could be used to expand the repertoire of dMMR cancer cell lines for use in forward genetic screens.

## Results

### ***MSH2* deletion in cancer cell lines induces MSI and hypermutation**

We sought to develop cancer cell lines with engineered loss of *MSH2* in order to establish forward genetics screening in other cancer types, including Ewing sarcoma (EWS) and small cell lung cancer (SCLC). Ewing sarcoma is a pediatric malignancy without approved targeted therapies, and the overall mutational burden in these tumors is extremely low, similar to other pediatric malignancies (Pishas and Lessnick, 2016, Yu et al., 2017, Tirode et al., 2014, Brohl et al., 2014, Crompton et al., 2014). We used CRISPR-Cas9 to generate *MSH2*-null Ewing sarcoma A673 cells (Figure 1A, Methods). We examined multiple microsatellite regions by PCR and capillary electrophoresis for evidence of microsatellite instability (MSI), a hallmark of dMMR cells, in two independently generated *MSH2*-null A673 lines (A673-M1, A673-M8). MSI was observed in three out of five loci analyzed in both A673-M1 and A673-M8 clones compared to the parental, MMR-proficient, A673 cell line (Fig. 1B,C)(Boland et al., 1998).

We next tested whether MMR deletion would facilitate MSI in tumor cell lines derived from genetically-engineered mouse cancer models (GEMMs), which also exhibit very low mutation frequencies compared to many human malignancies (McFadden et al., 2014, McFadden et al., 2016). *Msh2* was deleted in a cell line generated from a small cell lung cancer (SCLC) GEMM initiated by loss of the p53, retinoblastoma (Rb), and p130 tumor suppressors (319-N1 cell line) (Figure S1A)(Schaffer et al., 2010). *Msh2*-null murine SCLC (mSCLC) cells also exhibited evidence of MSI, with two of three microsatellite loci exhibiting instability (Figure S1B, C)(Bacher et al., 2005).

Following observation of MSI in MMR-edited human and murine cells, we sought direct evidence of an increased mutation frequency using whole exome sequencing (WES). Two *MSH2*-null A673 clones (M1 and M8) and three independent *MSH2*-wild-type parental A673 clones (CL1, CL2, and CL3) were subjected to WES. Because a reference germline genome was not available for A673 cells, we used the parental A673 cell line as the germline reference (Methods). We observed an increased frequency of somatic mutations in M1 (n=221) and M8 (n=198) clones, compared to *MSH2*-wild-type parental clones (n= 77, 74, 64) (Table S1).

We performed WES on multiple mSCLC tumor cell lines generated from independent tumors isolated from the same mouse in order to accurately compare mutation frequencies between MMR-proficient and dMMR cell lines (Figure S2A). Common variants between two independent primary tumor cell lines (319-T1, T2) represented germline variants, whereas variants unique to individual cell lines represented somatic mutations. The *Msh2*-wild type cell line 319-N1 exhibited 25 high-confidence somatic mutations (Table S2). In contrast, 319-N1-Cl31 cells with engineered *Msh2* loss exhibited 352 somatic mutations. Therefore, elevated somatic mutation frequencies were observed following MMR editing in both human and murine cancer cell lines. (Figure 1D, Figure S2B,C).

## Engineered dMMR enables forward genetic screening in mammalian cancer cells

After establishing the dMMR phenotype of CRISPR-edited *MSH2*-null cell lines, we determined whether CRISPR-mediated dMMR facilitated the emergence of compound-resistant clones. We performed drug selections using *MSH2*-wild type A673 cells (parental A673), *MSH2*-null A673 cells (A673-M1 and A673-M8), and HCT116 cells. Selections were performed against three cellular toxins: bortezomib (an inhibitor of the subunit  $\beta 5$  of the proteasome, PSMB5), MLN4924 (a NEDD8-activating enzyme (NAE) inhibitor), and CD437 (a DNA polymerase alpha (POLA1) inhibitor)(Soucy et al., 2009, Han et al., 2016, Lu and Wang, 2013, Chen et al., 2011). Following compound selection at lethal doses, resistant colonies growing in the presence of compound were visualized by crystal violet staining. Consistent with the notion that CRISPR-mediated *MSH2* loss enabled acquisition and emergence of compound resistant clones, colonies were observed following selection only on the *MSH2*-null A673 and HCT116 plates (Figure 1E). No colonies were observed on the parental *MSH2*-wild type A673 plates.

We next performed additional selections using bortezomib, CD437, and MLN4924. We selected *MSH2*-null A673 cells and *Msh2*-null mSCLC cells using bortezomib at three concentrations close to the lethal dose, as determined by one week of compound exposure ( $EC_{100}^{1wk}$ ) for bortezomib (see methods). Following 2 weeks of selection, compound-resistant colonies emerged and were expanded from both A673-M1 (4 clones) and *Msh2*-null mSCLC cells (11 clones).

Bortezomib-resistant alleles have been reported within exon 2 of *PSMB5*, which encodes a binding pocket for the drug (Lu and Wang, 2013, Chen et al., 2011). We therefore amplified and sequenced exon 2 in bortezomib-resistant *MSH2*-null A673 and *Msh2*-null mSCLC clones. These regions were also amplified and sequenced from the parental A673 and mSCLC cell lines to ensure these mutations did not exist prior to MMR impairment. We identified *PSMB5* mutations in MMR-deficient A673 (4 out of 4 clones harbored mutations) and mSCLC cell lines (11 out of 11 clones harbored *PSMB5* exon 2 mutations), including mutations previously reported to mediate bortezomib resistance (Fig. 2B, D, E) (Lu and Wang, 2013, Wacker et al., 2012). All mutations identified in *PSMB5* mapped to the bortezomib binding pocket (Huber et al., 2016) (Fig. 2F). We confirmed in vitro resistance to bortezomib in all 4 clones harboring putative compound-resistant alleles from A673-M1 by cell viability assay (CellTiter Glo, Promega) following 72 hours of drug exposure (Figure 2A, B). We also tested 7 out of the 11 mSCLC clones that harbored *Psmb5* mutations and confirmed in vitro resistance to bortezomib (Figure 2C, D). We confirmed that all clones harboring *PSMB5* mutations exhibited bortezomib resistance (2.36 to 13.84-fold increase in  $EC_{50}$ ), whereas resistance to etoposide was not observed (Figure 2A–D; Figure S3A, B).

To further confirm that CRISPR-dMMR cells exhibited the capacity to acquire compound resistant alleles to different classes of cellular toxins, we performed additional selections using *MSH2*-null A673 cells and *Msh2*-null mSCLC cells against the DNA polymerase-alpha inhibitor CD437. After 2 weeks of selection, compound-resistant colonies emerged and were expanded from both A673-M1 (4 clones) and *Msh2*-null mSCLC cells (17 clones). For CD437-selected clones, cDNA flanking exons 19 to 25 was amplified and sequenced after clonal expansion. We identified *POLA1* mutations in the MMR-deficient A673 (4 out

of 4 clones harbored mutations) and mSCLC lines (11 out of 17 clones harbored mutations) (Figure 3B, D, E) (Han et al., 2016). None of these mutations were detected in the parental, MMR proficient, cell lines. Mutations impacted five amino acids that clustered within the POLA1 structure (Coloma et al., 2016) (Figure 3F).

We confirmed CD437-resistance in all 4 clones from A673-M1 cell line and 11 out of 17 mSCLC clones harboring putative compound-resistant alleles to CD437 (Figure 3A, B). The six mSCLC resistant clones that did not harbor *POLA1* mutations exhibited resistance to both CD437 and etoposide, which suggested a generalized mechanism of acquired resistance drove expansion of these clones during compound selection (Figure S3C, D). The ten mSCLC clones harboring *POLA1* mutations all exhibited CD437 resistance (5.31 to 15.05-fold increase in EC50), whereas no difference in sensitivity to etoposide was observed (Figure 3C, D; Figure S3E, F).

The selections performed with bortezomib and CD437 demonstrate that engineered *MSH2* loss in enables the emergence of compound resistant alleles during drug selections in A673 and mSCLC cells. We finally tested whether prospective identification of compound targets could be accomplished using exome sequencing of compound resistant clones. Therefore, we performed selections using MLN4924 in the *MSH2*-null clone, A673-M1, at three concentrations for MLN4924 (see Methods). Following two weeks of selection, six colonies emerged and were expanded. To confirm *in vitro* resistance, we determined the EC50 for both parental A673-M1 cells and six resistant clones (Figure 4A,B). To identify potential clones exhibiting general resistance, including increased expression of drug efflux pumps, we assessed sensitivity to the topoisomerase II-inhibitor, etoposide (Figure S3F). We validated that all MLN clones exhibited resistance to MLN4924 (21.75 to 135.03-fold increase in EC50), while no difference in etoposide resistance was observed (Figure 4A,B; Figure S3F).

We next determined if the target of MLN4924, NAE subunit encoded by *UBA3*, could be identified by WES of MLN4924-resistant clones. Indeed, *UBA3* was identified as the single gene mutated in 6/6 *MSH2*-null clones (Figure 4C). This gene encodes the NAE subunit targeted by MLN4924, and three of the mutations observed, A171T, E204K, and Y352H, were previously reported as MLN4924-resistant alleles (Figure 4D) (Michael et al., 2012, Xu et al., 2014). We compared somatic mutations in MLN4924-resistant A673 clones to establish whether the MLN4924-resistant clones arose independently (see Methods). A673-MLN-D and A673-MLN-H shared a majority of mutations (783/965), establishing that these two clones arose from the same founder cell. However, no other clones shared more than 6 somatic mutations, suggesting that the other clones arose independently, including A673-MLN-A and A673-MLN-C that shared the A171T mutation in *UBA3*.

## Discussion

We establish that induced MMR deficiency using CRISPR-Cas9 methods is sufficient to induce MSI, hypermutation, and facilitate the emergence of compound resistant alleles in established human and murine cancer cell lines derived from diverse cancer lineages. This approach offers the potential to significantly expand the use of forward genetics to identify

the mechanisms of action of compounds with anticancer activity. In particular, we demonstrate that this strategy can be employed in cancers with low mutation rates such as pediatric malignancies. Therefore, cell lines with engineered MMR deficiency represent an experimental tool to facilitate the identification of mechanisms of action of selective cancer toxins identified by HTS campaigns, and to model genetic mechanisms of acquired resistance to anti-cancer therapies in current use. However, we recognize limitations of the current study. First, following identification of candidate compound-resistant alleles (i.e., recurrent mutations in compound-resistant clones), additional biochemical studies are necessary to establish the direct molecular target. Second, the forward genetics approach requires that the small molecule target a protein essential for viability of the cancer cell. In addition, we cannot from our current data establish a frequency of mutation necessary to facilitate the emergence of compound-resistant clones. Hypermutation due to endogenous defects in DNA repair might also be more broadly applied to other phenotypic genetic screens, including in vivo screens in GEMMs. Therefore, cancer cell lines with induced MMR deficiency and hypermutation represent a tool with wide potential application in cancer genetics and drug discovery.

## STAR METHODS

### LEAD CONTACT AND MATERIALS AVAILABILITY

Further information and requests for resources and reagent should directed to and will be fulfilled by the Lead Contact, David McFadden (david.mcfadden@utsouthwestern.edu)

### EXPERIMENTAL MODEL AND SUBJECT DETAILS

Ewing sarcoma A673 cell line were cultured at 37°C and 5% CO<sub>2</sub> in RPMI (R8758, Sigma-Aldrich) supplemented with 10% FBS (#35-150-CV, Corning), 2 mM L-glutamine (G7513, Sigma-Aldrich), and penicillin streptomycin (P0781, Sigma-Aldrich). Cells were expanded using Trypsin (T4049, Sigma-Aldrich) every 3-4 days. A673 cell lines are derived from a female subject and were authenticated by STR profiling.

The *Trp53<sup>fl/fl</sup>*; *Rb1<sup>fl/fl</sup>*; *Rbl2<sup>fl/fl</sup>*; *Rosa<sup>LSL-Tomato/+</sup>* mouse model of small cell lung cancer mice has been previously described (Schaffer et al., 2010). 319-T1 and 319-T2 were established from primary tumors in the lung, and 319-N1 was established from a lymph node metastasis, all developed in a PRP female mouse. 319-N1 as well as clones derived from those cell lines were cultured with DMEM (D6429, Sigma-Aldrich) supplemented with 5% FBS (#35-150-CV, Corning), 2 mM L-glutamine (G7513, Sigma-Aldrich), and penicillin streptomycin (P0781, Sigma-Aldrich). Cells were expanded using Trypsin (T4049, Sigma-Aldrich) diluted in PBS (2:1 ratio) every 3-4 days.

All animal experiments were approved by the UTSW IACUC 2018-102383 (D.G.M., P.I.).

## METHOD DETAILS

### sgRNAs, surveyor, CRISPR KO of MSH2, MLH1.

Single-guide RNA (sgRNA) targeting human *MSH2* and murine *Msh2* were designed by “sgRNA Designer: CRISPR KO” (<https://portals.broadinstitute.org/gpp/public/analysis-tools/sgrna-design>) from the Broad Institute (Doench et al., 2016). sgRNAs were cloned into LentiCRISPR V2 plasmid (Addgene plasmid #52961) as previously described (Ran et al., 2013), and validated by T7 endonuclease assay (*T7 endonuclease I* from NEB, Cat. #M0302). sgRNA sequences used were as follows: human MSH2 5'-TGAGAGGCTGCTTAATCCAC-3'; murine Msh2 5'-GGTTAATACCCT GATACAGT-3'. For the generation of lentiviral vectors, 293T/17 cell were transfected with LentiCRISPR V2, psPAX2 (Addgene plasmid #12260), and pMD2.G (Addgene plasmid #12259) in a ratio (4:3:1) using TransIT®-LT1 Transfection reagent (MIR 2304, Mirus Bio) as described by manufacturer. Mouse SCLC and Ewing sarcoma cell lines were plated at 10<sup>6</sup> cells in a 10 cm dish and cultured overnight. The next day, cells were transduced with lentiviruses (MOI<0.5 determined by visual assessment) using 8µg/mL of polybrene transfection agent (TR-1003-G, EMD Millipore). Cells were selected with 2 mg/ml of Puromycin (P8833, Sigma-Aldrich) for 72 hours. Then surviving clones were picked and expanded for validation by western-blotting.

### Western-blotting

Western-blotting for Ewing sarcoma and mouse SCLC protein samples was performed using standard methods. Odyssey Nitrocellulose membrane (*LICOR*, #926-31092) were used for protein transference and then blocked using Odyssey® Blocking Buffer in PBS (*LICOR*, #927-40000) for 1h at RT. Primary antibodies were incubated for 1h at RT diluted 1:1,000 in Odyssey® Blocking Buffer : PBS-Tween (0.1%). Antibodies used were anti-Msh2 [D24B5] XP rabbit mAb (#2017, Cell Signaling Technology), and anti-β-actin (8H10D10) mouse mAb (#3700, Cell Signaling Technologies). Membrane was washed with PBS-Tween (0.1%) three times for 5 minutes each wash. Secondary antibodies were incubated for 30 min at RT using IRDye 800CW donkey anti-rabbit IgG (H+L) (#926-32213, LI-COR), and IRDye 680RD donkey anti-mouse IgG (H+L) (#926-68072, LI-COR), at dilution 1:10,000. Visualization was performed with Odyssey CLx Imaging System (LI-COR).

### Compounds

Bortezomib was purchased from Selleck Chemicals (#S1013). Etoposide was purchased from Sigma-Aldrich (#E1383-100MG). CD437 was purchased from Sigma-Aldrich (#C5865). MLN4924 was purchased from ApexBio (#B1036). Compounds were diluted using DMSO (Sigma-Aldrich, D650-100ML) and aliquoted at 10 mM and aliquots were exposed to a maximum of three freeze-thaw cycles.

### Dose response curves

Mouse SCLC cell lines were plated in 96-well plates, 6,600 cells per well in 200 µL of media. Ewing sarcoma cell lines were plated in 96-well plates, 10,000 cells per well in 200 µL of media. After overnight incubation, compounds were dispensed using a D300e Digital

Dispenser (TECAN). Cell viability assay was assessed after 72 hours using CellTiter-Glo luminescent cell viability assay (Promega, #G7571). The CellTiter-Glo reagent was diluted by adding PBS-Triton-X (1%) (1:1 ratio). EC100<sup>1wk</sup> determination for bortezomib was performed in a 12-well plate seeding 25,000 cells per well. After 24h, Bortezomib was dispensed using TECAN D300e setting up a minimum concentration of EC50<sup>72h</sup> and a maximum concentration of EC100<sup>72h</sup>. Media was changed every 3-4 days to refresh compounds. Cell viability was determined visually following seven days.

### Selection of resistant clones.

10 cm plates for each MMR deficient cell lines (1 million cells per plate) were treated with bortezomib or CD437 at EC100<sup>1wk</sup> ÷ 1.5, EC100<sup>1wk</sup>, and EC100<sup>1wk</sup> × 1.5 concentrations. Media with bortezomib or CD437 was replenished every 3 – 4 days over the course of 2 weeks. Surviving clones were expanded. Exon 2 of PSMB5 from both human and mouse cell lines was amplified and sequenced using primers specified in Table S3.

Amplification and sequence of exon 19 to 25 of POLA1 from both human and mouse cell lines was amplified and sequenced using primers specified in Table S3.

### Crystal Violet experiment

10 cm plates for each MMR deficient cell lines (3 million cells per plate) were treated with bortezomib, MLN4924, and CD437 at EC100<sup>1wk</sup> ÷ 1.5, EC100<sup>1wk</sup> ÷ 1.25, EC100<sup>1wk</sup>, and EC100<sup>1wk</sup> × 1.25, EC100<sup>1wk</sup> × 1.5 concentrations. Media with either bortezomib, MLN4924, or CD437 was replenished every 3 – 4 days over the course of 2 weeks followed by growth in media without compound for 1 week.

Staining solution was prepared with 1% (weight/volume ratio) crystal violet from Sigma-Aldrich (#C6158-50G) in 10% ethanol.

### Whole Exome Sequencing Analysis

Whole-exome sequencing of cell line samples was performed by BGI Genomics using SureSelect Human All Exon V5 (Ewing sarcoma samples) and SureSelect Mouse All Exon V1 (mSCLC) and BGISEQ-500. The analysis workflow was based on Genome Analysis Toolkit (GATK, v3.8-0) best practices (McKenna et al., 2010, DePristo et al., 2011). The qualities of sequencing reads were evaluated using NGS QC Toolkit (v2.3.3) (Patel and Jain, 2012) and the extracted high-quality reads were mapped to human and mouse reference genome (UCSC hg19 and Ensembl 91) using Burrows-Wheeler Aligner (BWA, v0.7.15a) (Li and Durbin, 2009). Picard (v2.12.0) (<https://broadinstitute.github.io/picard/>) was used to remove PCR duplicates and GATK was used to recalibrate base qualities. For murine SCLC cell lines, calling variants and joint genotyping together were performed using HaplotypeCaller and the variant calls were filtered by applying the following criteria: QD (Variant Confidence/Quality by Depth) < 2, FS (Phred-scaled p-value using Fisher's exact test to detect strand bias) > 60, MQ (RMS Mapping Quality) < 40, DP (Approximate read depth) < 10, GQ (Genotype Quality) < 20, maximum VAF (variant allele fraction) < 0.2. For each murine SCLC cell lines, the somatic mutations in 319-N1 were defined by the VAF > 0.15 and VAF < 0.05 for 319-T1 and 319-T2. Somatic mutations in 319-N1-CI31 were



defined by the  $VAF > 0.15$  and  $VAF < 0.05$  for the other cell lines. For human cell lines, MuTect2(Cibulskis et al., 2013) was used to identify somatic mutations in clones A673-M1 and A673-M8 comparing to the A673 parental cell line. Somatic mutations for each clones (A673-M1 and A673-M8) were defined by  $VAF > 0.15$  and  $VAF < 0.05$  for the other human cell lines.

### Identification of recurrently mutated genes in MLN4924-resistant clones

We defined acquired somatic mutations for each A673-M1 MLN-resistant clone by  $VAF > 0.01$  and  $VAF < 0.01$  for the parental A673-M1 cell line. Non-coding mutations were excluded.

## QUANTIFICATION AND STATISTICAL ANALYSIS

Data were analyzed using Prism 8.0 by GraphPad. Dose response curves were fitting in Figure 2A, 2C, 3A, 3C and 4A, to calculate IC50. Hill coefficients and standard error were done using Log [inhibitor] vs Normalized response. Quantitative data are presented as mean.

## DATA AND CODE AVAILABILITY

The variants were annotated using a custom Perl script (<https://github.com/jiwoongbio/Annomen>) with mouse transcripts, proteins, and variations (Ensembl 91 for mouse, RefSeq and dbSNP build 150 for human). The variant allele frequencies were calculated using a custom Perl script and SAMtools (v1.4) (Gonczarenko et al., 2017, Li et al., 2009) (all analysis scripts are available at <https://github.com/jiwoongbio/Annomen>).

The sequencing datasets exposed in this study have been deposited in SRA under accession code PRJNA543281.

## Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

## Acknowledgements

The authors thank Florentina Moreno for technical support and Anderson Frank, James McGinnis and Alberto Bremauntz Enriquez for reviewing the manuscript. LentiCRISPR v2 was a gift from Feng Zhang (Addgene plasmid #52961). psPAX2 and pMD2.G were a gift from Didier Trono (Addgene plasmids #12260 and #12259, respectively). J.K. and Y.X. were supported by the Cancer Prevention and Research Institute of Texas (RP150596). D.G.M. was supported by a St. Baldrick's Foundation Scholar Award (524523), the Cancer Prevention and Research Institute of Texas (RR140084) and a Disease-Oriented Scholar Award from UT Southwestern Medical Center. D.N. is supported by Welch Foundation I-1879-20180324, NIH R37CA226771-02, NIH RO1CA217333-02.

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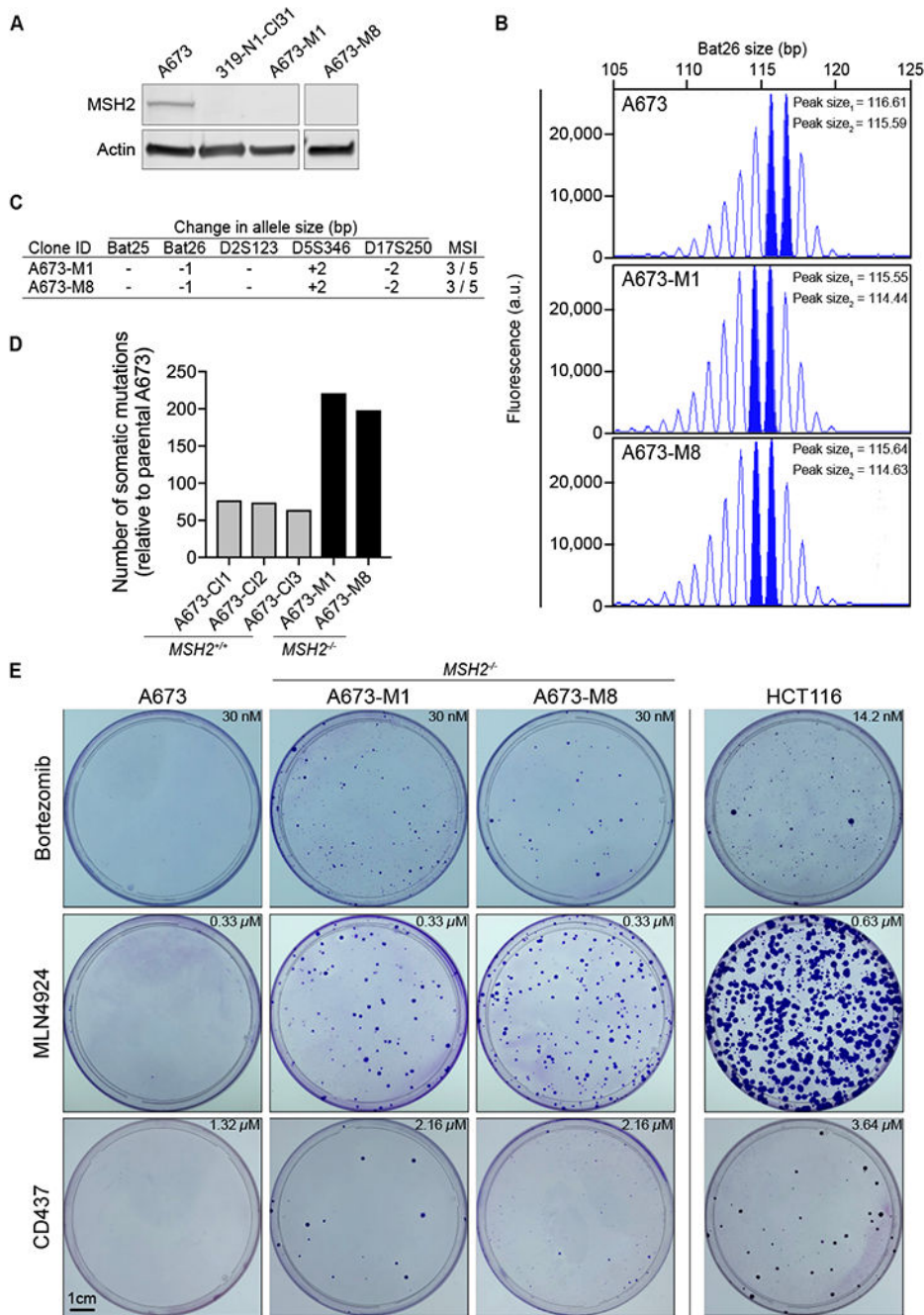
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**HIGHLIGHTS**

1. *MSH2* deletion induces hypermutation in mammalian cancer cell lines.
2. Compound-resistant clones emerged in DNA mismatch repair deficient cell lines.
3. This approach expands forward genetic screening in mammalian cancer cell lines.

### Significance

Phenotypic small molecule screens can identify chemicals that selectively kill subsets of cancers. In theory, these molecules target a protein uniquely required for viability by the cancer cells. This selective toxicity is the hallmark feature of molecular targeted therapies in cancer. However, identifying the mechanism of action of chemicals identified in phenotypic screens has remained a major barrier for drug discovery and development. Cancer cells harboring defective DNA mismatch repair have been used to identify targets of selective cancer toxins. However, naturally-arising DNA mismatch repair defects are infrequent in many types of cancer. Here, we demonstrate that CRISPR-Cas9-mediated mutation of *MSH2* is sufficient to induce hypermutation and enable forward genetic screening for drug targets in mammalian cells. We propose that this approach offers the potential to expand the repertoire of cell lines and small molecules suitable for forward genetics screening.



**Figure 1. CRISPR-mediated MMR loss in Ewing sarcoma cells induces MSI and hypermutation.**

(A) MSH2 and Actin protein levels showed for A673 (*MSH2*-wild-type), 319-N1-CI31 (*Msh2*-edited mouse small cell lung cancer cell line (see Figure S1)), and *MSH2*-edited A673-M1 and A673-M8 (right panel for A673-M8 cells performed in an independent blot, as stated by the break between the first three lanes and A673-M8). (B) Capillary electrophoresis histogram of microsatellite Bat26 locus for A673, A673-M1 and A673-M8. The most prominent peaks in the histogram determine the allele size is shown (solid blue). (C) Table of microsatellites assessed in A673 cells. Difference in the dominant allele size

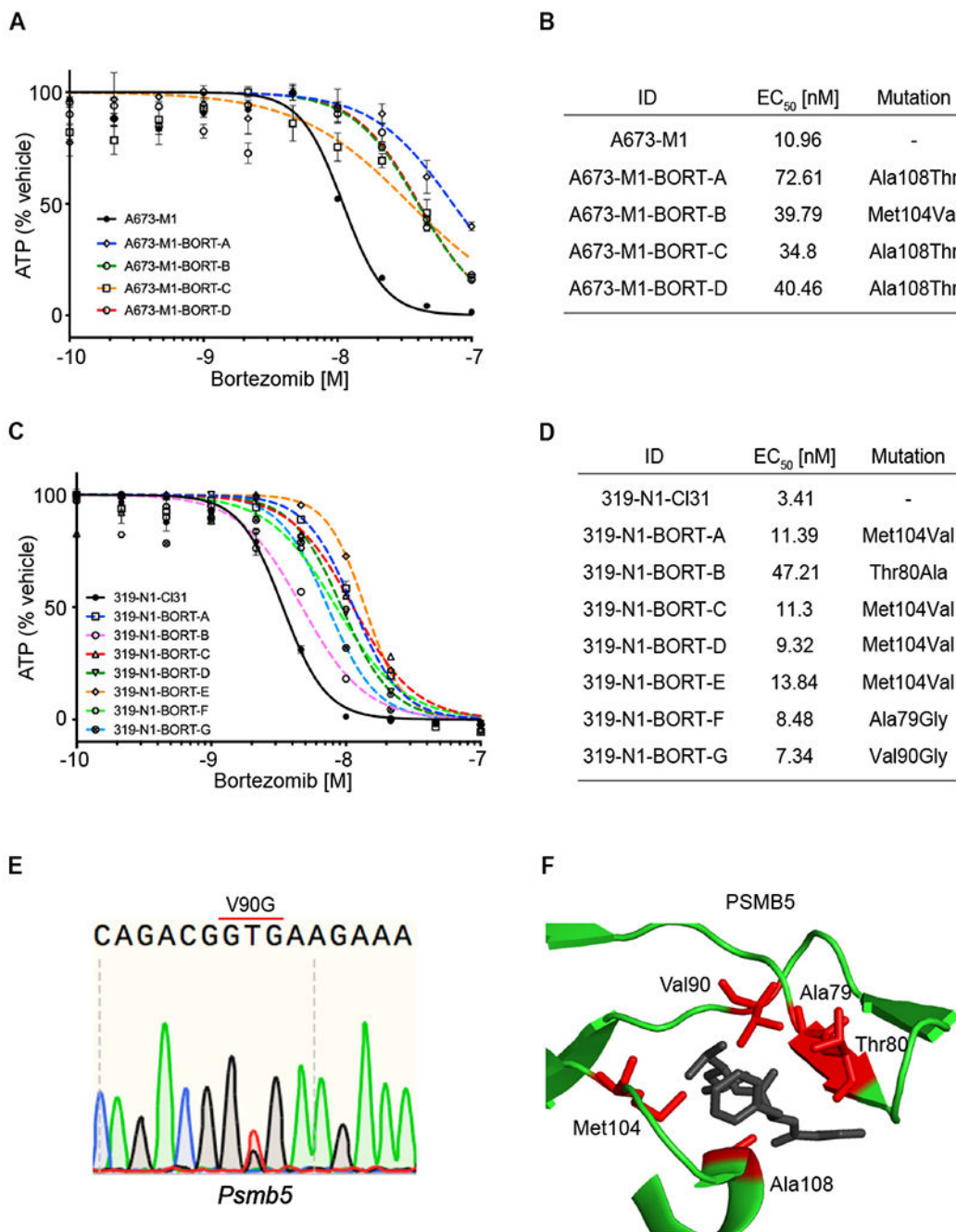
between the parental A673 and each MMR deficient cell line is indicated. Number of microsatellites affected in relation to the number of microsatellites studied displayed in the last column. (D) Number of somatic mutations present in A673-M1, and A673-M8 identified by exome sequencing. Parental A673 cells were used as a normal reference. Mutations with an allelic fraction (AF) higher or equal to 0.15 were reported. (E) Crystal violet staining of A673 (*MSH2*-wild-type), A673-M1 (*MSH2*-null), A673-M8 (*MSH2*-null), and HCT116 (*MLH1*-null) cells following compound selection. Concentrations used for selection shown in each panel. See also Figure S1 and S2.

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**Figure 2. Emergence and validation of *PSMB5*-resistant alleles following bortezomib selection.** (A) Cell Titer Glo assay of bortezomib 10-point dose response curve (DRC) for parental A673 cells and bortezomib-resistant clones A, B, C, and D. Data are represented as mean ± SD. (B) Table showing EC<sub>50</sub> for bortezomib from parental A673-M1 and each bortezomib-resistant clone. Mutations detected in exon 2 of *PSMB5* reported for each resistant clone. (C) Cell Titer Glo assay of bortezomib in 10-point dose response curve (DRC) for parental 319-N1 cells and bortezomib-resistant clones A, B, C, D, E, F and G. Data are represented as mean ± SD. (D) Table showing EC<sub>50</sub> for bortezomib from parental 319-N1-CI31 and



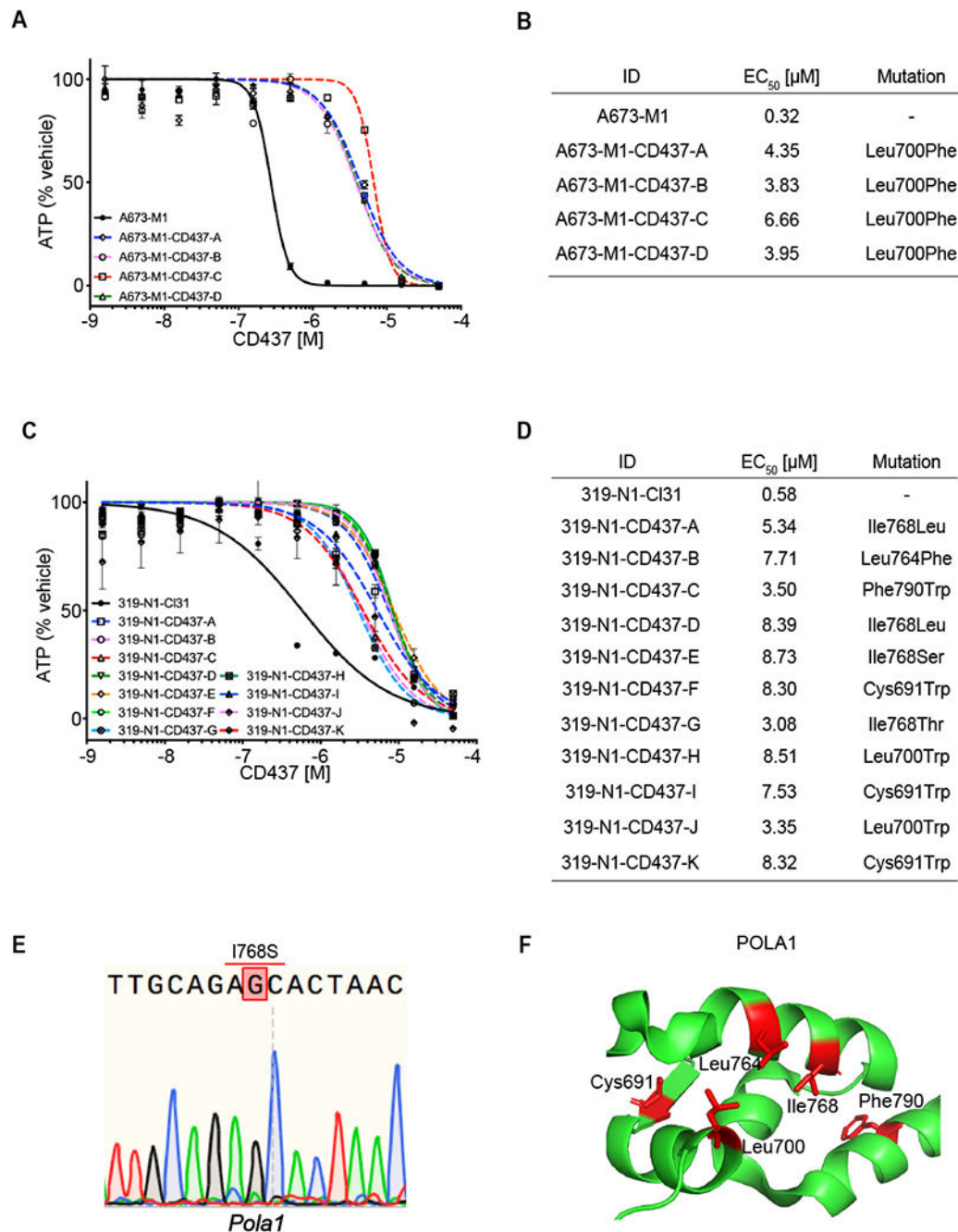
each bortezomib-resistant clone. Mutations found in exon 2 of *Psmb5* showed for each resistant clone. (E) Sequencing trace for V90G mutation found in *Psmb5* from mSCLC clone G. (F) Crystal structure of PSMB5 bound to bortezomib (Protein Data Bank accession 5L5Z). Depicted all mutated codons found in bortezomib-resistant clones from Ewing sarcoma and mSCLC clones (red). See also Figure S3 A–B.

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**Figure 3. Emergence and validation of *POLA1*-resistant alleles following CD437 selection.**

(A) Cell Titer Glo assay of CD437 10-point DRC for parental cell line and CD437-resistant clones A, B, C, and D. Data are represented as mean  $\pm$  SD. (B) Table showing EC<sub>50</sub> for CD437 from parental A673-M1 and each CD437-resistant clone. *POLA1* mutations reported for each resistant clone. (C) Cell Titer Glo assay of CD437 10-point DRC for parental cell line and clones A, B, C, D, E, F, G, H, I and J. Data are represented as mean  $\pm$  SD. (D) Table showing EC<sub>50</sub> for CD437 from parental 319-N1-CI31 and each CD437-resistant clone. *Polal* mutations detected in each resistant clone. (E) Sequencing trace for I768S mutation

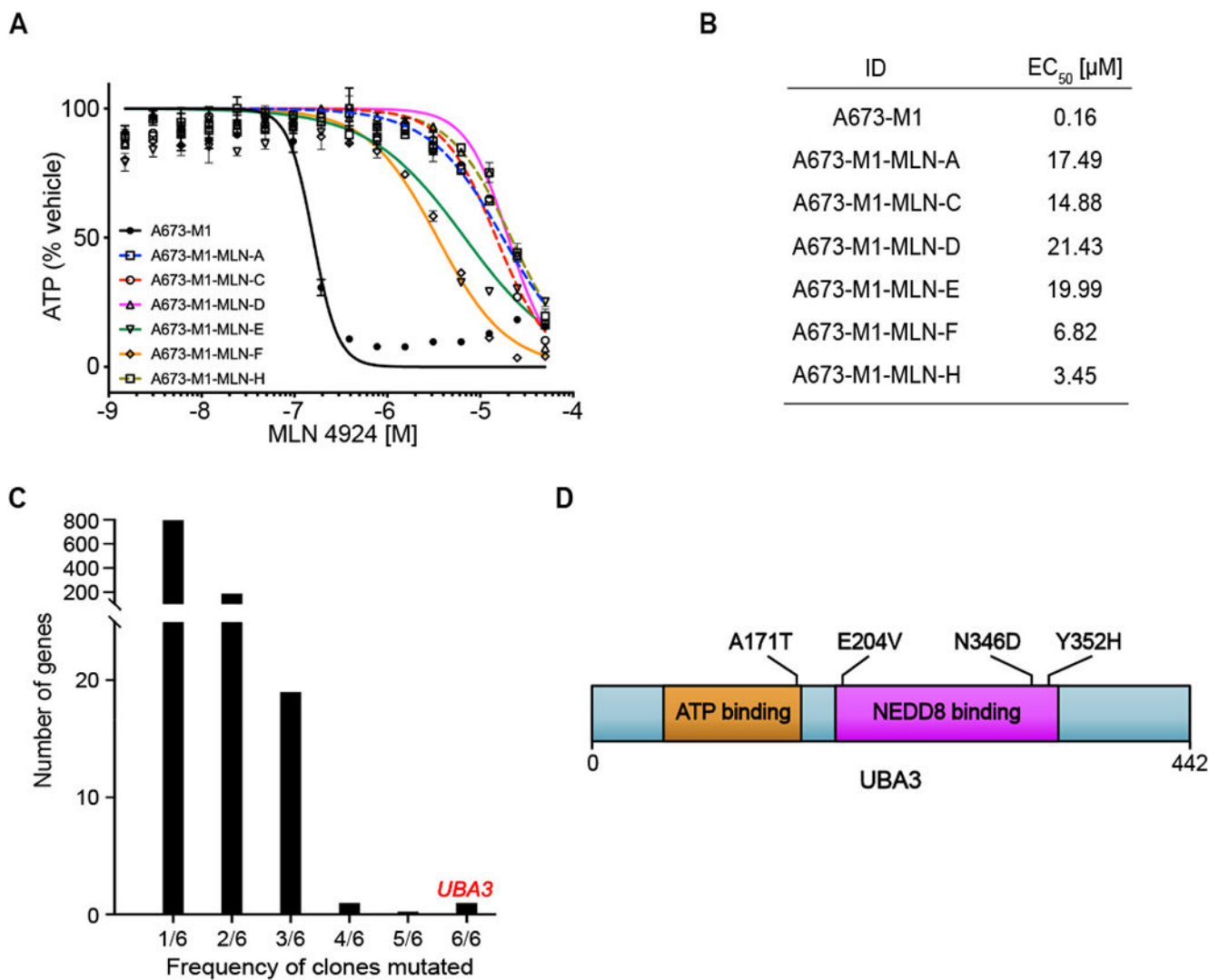
found in *Pola1* from mSCLC clone A. (F) Crystal structure of POLA1 (Protein Data Bank accession 5IUD). Mutated codons found in CD437-resistant clones from Ewing sarcoma and mSCLC (red). See also Figure S3 C–D.

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**Figure 4. WES of MLN4924 resistant clones uncovers recurrent compound-resistant alleles in *UBA3*.**

(A) Cell Titer Glo assay of MLN4924 10-point DRC for parental A673-M1 cells and MLN4924-resistant clones A, C, D, E, F, and H. Data are represented as mean  $\pm$  SD. (B) Table showing EC<sub>50</sub> for MLN4924 from parental A673-M1 and each resistant clone. (C) *UBA3* is the only gene mutated in all six clones. (D) *UBA3* mutations identified in MLN4924-resistant clones. DRC, dose response curve.

## KEY RESOURCES TABLE

REAGENT or RESOURCE	SOURCE	IDENTIFIER
Antibodies		
Anti-Msh2 [D24B5] XP rabbit mAb	Cell Signaling Technology	Cat#2017
Anti- $\beta$ -actin (8H10D10) mouse mAb	Cell Signaling Technologies	Cat#3700
IRDye 800CW donkey anti-rabbit IgG (H+L)	LI-COR	Cat#926-32213
IRDye 680RD donkey anti-mouse IgG (H+L)	LI-COR	Cat#926-68072
Bacterial and Virus Strains		
Biological Samples		
Chemicals, Peptides, and Recombinant Proteins		
Bortezomib	Selleck Chemicals	Cat#S1013; CAS ID: 179324-69-7
Etoposide	Sigma-Aldrich	Cat#E1383; CAS ID: 33419-42-0
CD437	Sigma-Aldrich	Cat#C5865; CAS ID: 125316-60-1
MLN4924	ApexBio	Cat#B1036; CAS ID: 905579-51-3
Critical Commercial Assays		
CellTiter-Glo luminescent cell viability assay	Promega	Cat#G7571
Deposited Data		
WES from human and mouse cell lines	This paper	SRA ID: PRJNA543281
Experimental Models: Cell Lines		
Ewing sarcoma A673 cell lines	ATCC	ATCC® CRL-1598™
Trp53 <sup>fl/fl</sup> ; Rb1 <sup>fl/fl</sup> ; Rb12 <sup>fl/fl</sup> ; RosaLSL-Tomato/+ murine SCLC cell lines	This paper	N/A
293T/17	ATCC	ATCC® CRL-11268™
Experimental Models: Organisms/Strains		
Mouse: <i>Trp53<sup>fl/fl</sup> Rb<sup>fl/fl</sup> P130<sup>fl/fl</sup></i>	Schaffer et al., 2010	Mouse: <i>Trp53<sup>fl/fl</sup></i> JAX: 008462 Mouse: <i>Rb<sup>fl/fl</sup></i> JAX: 008186 Mouse: <i>P130<sup>fl/fl</sup></i> JAX: 008177
Oligonucleotides		
Primers for PCR and sequencing of <i>PSMB5</i> and <i>POLA1</i> , see Table S3	This paper	N/A
Recombinant DNA		
LentiCRISPR V2 plasmid	Addgene	Cat#52961
psPAX2 plasmid	Addgene	Cat#12260
pMD2.G plasmid	Addgene	Cat#12259
Software and Algorithms		
Genome Analysis Toolkit (GATK, v3.8.0)	DePristo et al., 2011; McKenna et al., 2010	N/A
NGS QC Toolkit (v2.3.3)	Patel and Jain, 2012	N/A
Burrows-Wheeler Aligner (BWA, v0.7.15a)	Li and Durbin, 2009	N/A
Picard (v2.12.0)	N/A	<a href="https://broadinstitute.github.io/picard">https://broadinstitute.github.io/picard</a>

REAGENT or RESOURCE	SOURCE	IDENTIFIER
HaplotypeCaller	N/A	N/A
MuTect2	Cibulskis et al., 2013	N/A
Annomen	N/A	<a href="https://github.com/jiwoongbio/Annomen">https://github.com/jiwoongbio/Annomen</a>
SAMtools	(Li et al., 2009)	N/A
Other		

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