Title: The role of APOBEC3B in lung tumour evolution and targeted therapy resistance

Authors: Deborah R. Caswell[a*†], Manasi K. Mayekar[b†], Philippe Gui[b†], Emily K. Law[e-h], Natalie I. Vokes[c-d], Carlos Martinez Ruiz[k,r], Michelle Dietzen[k,r], Mihaela Angelova[a], , Chris Bailey[a], Oriol Pich[a], Bjorn Bakker[a], Wei Wu[b], Timothy J. Humpton[u], D. Lucas Kerr[b], William Hill[a], Wei-Ting Lu[a], Franziska Haderk[b], Collin M. Blakely[b], Maise Al Bakir[a], Ai Nagano[a], Francisco Gimeno-Valiente[r], Clare Weeden[a], Andrew Rowan[a], Caroline E. McCoach[b], Bruna Almeida[l], Mary Green[l], Carlos Gomez[b], Beatrice Gini[b], Shigeki Nanjo[b], Dora Barbosa[b], Chris Moore[m], Joanna Przewrocka[a], Eva Grönroos[a], Simon Priestnall[t], Alejandro Suarez-Bonnet[t], Caroline Zverev[s], Scott Lighterness[s], James Cormack[s], Victor Olivas[b], Lauren Cech[b], Brandon Rule[a], Paul Ashford[w], Cameron Durfee[e-f], Nuri Alpay Temiz[i], Lisa Tan[b], Lindsay K. Larson[e-g], Prokopios P. Argyris[e-h,n], William L. Brown[e-g], Elizabeth A. Yu[a], Julia K. Rotow[j], Nitin Roper, Johnny Yu[o], Rachel I. Vogel[f,p], Nicholas J. Thomas[b], Subramanian Venkatesan[a,r], Samuel F. Bakhoum[x], Su Kit Chew[r], Mariam Jamal-Hanjani[r], Karen Vousden[u], Nicholas McGranahan[k,r], Eliezer M. Van Allen[q], Nnennaya Kanu[r], Reuben S. Harris[e-h], Julian Downward[m], Trevor G. Bivona[b,v*], Charles Swanton[a,r]

Affiliations:
[a]Cancer Evolution and Genome Instability Laboratory, The Francis Crick Institute, London, UK
[b]Department of Medicine, University of California, San Francisco, San Francisco, CA 94158, USA
[c]Department of Thoracic and Head and Neck Medical Oncology, The University of Texas MD Anderson Cancer Center, Houston, Texas
[d]Department of Genomic Medicine, The University of Texas MD Anderson Cancer Center, Houston, Texas
[e]Department of Biochemistry, Molecular Biology and Biophysics, University of Minnesota, Minneapolis, MN, USA
[f]Department of Biochemistry and Structural Biology, University of Texas Health San Antonio, San Antonio, TX 78229, USA
[g]Howard Hughes Medical Institute, University of Texas Health San Antonio, San Antonio, TX 78229, USA
[h]Howard Hughes Medical Institute, University of Minnesota, Minneapolis, MN, USA
[i]Health informatics, University of Minnesota, MN, USA
[j]Lowe Center for Thoracic Oncology, Dana-Farber Cancer Institute, Boston, MA, USA
[k]Cancer Genome Evolution Research Group, University College London, Cancer Institute, London UK
[l]Experimental Histopathology, The Francis Crick Institute, London, UK
[m]Oncogene Biology Laboratory, The Francis Crick Institute, London, UK
[n]Division of Oral and Maxillofacial Pathology, School of Dentistry, University of Minnesota, Minneapolis, MN, USA
[o]Biomedical Sciences Program, University of California, San Francisco, San Francisco, CA 94158, USA

[p]Department of Obstetrics, Gynecology, and Women's Health, University of Minnesota, Minneapolis, MN, USA

[q]Department of Medical Oncology, Dana-Farber Cancer Institute, Boston, MA, USA

[r]Cancer Research UK Lung Cancer Centre of Excellence, UCL Cancer Institute, London, UK

[s]Biological Research Facility, The Francis Crick Institute, London, UK

[t]Department of Pathobiology & Population Sciences, The Royal Veterinary College, London, UK

[u]p53 and Metabolism Laboratory, The Francis Crick Institute, London, UK

[v]Chan-Zuckerber Biohub

[w]Institute of Structural and Molecular Biology, University of College London, Gower Street, London, UK

[x]Human Oncology and Pathogenesis Program, Memorial Sloan Kettering Cancer Center, New York, NY, 10065

[y]Department of Radiation Oncology, Memorial Sloan Kettering Cancer Center, New York, NY, 10065

[†]Authors contributed equally

[*]Correspondence: trever.bivona@ucsf.edu, deborah.caswell@crick.ac.uk

Summary:

63
Apolipoprotein B mRNA-editing catalytic subunit-like (APOBEC) enzymes are cytidine
deaminases that play an important role in intrinsic responses to infection by viruses where they
inhibit infection by deaminating deoxycytidine residues in viral single-stranded DNA[1,2].
APOBEC3 enzymes can act as potent host genome mutagens in multiple cancer types including
non-small cell lung cancer (NSCLC)[3,4]. There are seven human APOBEC3 family members
(APOBEC3A-H) and all but one (G) preferentially deaminate TC dinucleotide substrates[3]. In
patients, both APOBEC3A (A3A)[5] and APOBEC3B (A3B)[6] have been implicated to play a major
role in NSCLC[3]. In this study, the impact of A3B on epidermal growth factor receptor (EGFR)-
driven lung cancer evolution was assessed. EGFR mutant NSCLC mouse models containing a
human A3B transgene[7] were generated, and the effect of enforced A3B expression was evaluated
at multiple timepoints. Enforced A3B expression was detrimental to tumour initiation and
progression in the absence of targeted therapy due to elevated chromosomal instability (CIN) and
p53 activation, which increased significantly in tumours with A3B expression. This finding was
substantiated in the TRACERx421 study demonstrating a significant correlation between CIN and
A3B in patients with NSCLC. In contrast, A3B expression with targeted therapy resulted in a
significant increase in treatment resistance in mouse models and human preclinical models of
EGFR mutant lung cancer. In specimens collected from patients with lung adenocarcinoma,
targeted therapy upregulated A3B expression, and induced significantly more APOBEC-
associated mutations including variants associated with therapy resistance. Analyses of human
NSCLC models revealed that targeted therapy induced A3B upregulation in part via treatment-
mediated activation of nuclear factor (NF)-κB signalling, and downregulation of the DNA repair
enzyme uracil-DNA glycosylase (UNG). This study uncovers the multifaceted roles of A3B on
tumour evolution and identifies APOBEC deaminases as future targets for eliciting more durable
responses to targeted cancer therapy.

Main Text:

89
The mechanisms underlying cancer genome heterogeneity and evolution prior to and during
therapy remain an active and important area of investigation. Recent work has established the
adaptive mutability of cancer cells in response to targeted therapy through suppression of the
mismatch repair (MMR) pathway and up-regulation of error-prone polymerases in drug-tolerant

cells[8]. This emerging paradigm holds important implications for the mechanistic understanding of

tumourigenesis as well as the evolution of tumours during therapy.

Prior tumour genome sequencing studies, including work from the multi-region sequencing

NSCLC TRACERx study, revealed subclonal enrichment for mutations in an APOBEC-preferred

substrate context, suggesting a possible role for this enzyme family in adaptive mutability later in

tumour evolution[9-12]. Gene expression analysis of the entire APOBEC3 family across multiple

stages of lung adenocarcinoma progression revealed the significantly elevated expression of A3B

at multiple timepoints (adenocarcinoma in situ and invasive lung adenocarcinoma) compared to

normal tissue[4].

Mouse models are one key system for the advancement of our understanding of cancer evolution

and drug response[13-16]. However, recent findings demonstrate that these models lack the mutational

heterogeneity present in human tumours[17-19]. This may be due, in part, to the fact that mice encode

only a single, cytoplasmic and non-genotoxic APOBEC3 enzyme[20,21]. To understand the role of

A3B in tumour evolution and therapy response, several new mouse strains incorporating a human

A3B transgene were engineered to mimic clonal and subclonal induction of A3B and to evaluate

the potential role of A3B in tumour evolution and therapy resistance in oncogene-driven NSCLC.

Finally, patient-derived NSCLC models and clinical specimens were also examined to further

establish the role of A3B in tumour evolution and therapy resistance.

A3B is detrimental to tumour initiation in an EGFR mutant lung cancer mouse model.

The role of A3B in tumour initiation was first investigated in a mouse strain that we engineered

by combining a novel Cre-inducible model for human *A3B* expression (*Rosa26::LSL-A3Bi*)[7] with

an established EGFR[L858R]-driven lung cancer mouse model (*TetO-EGFR[L858R]*) [13,14,22] and then

crossing with a Cre-inducible tetracycline controlled transactivator strain (*R26[LNL-tTA]*). Tumours

were induced in *TetO-EGFR[L858R];R26[LNL-tTA/+]* *(E)* and *TetO-EGFR[L858R];R26[LNL-tTA/LSL-APOBEC3B]*

(*EA3B)* mice using viral vector mediated Cre recombinase (Fig. 1a) and measured at 3 months

post-induction. Unexpectedly, the tumour number per mouse, total tumour volume per mouse, and

the fraction of mice with tumours was significantly lower in *EA3B* mice compared to *E* control

mice as measured by microCT imaging (Fig. 1b-c and Extended Data Fig. 1a). To verify this result,

and to assess tumour burden at a higher resolution, the experiment was repeated but animals were

culled at 3 months and tumour burden was assessed by immunohistochemistry (IHC) staining of

EGFR^{L858R}. This revealed a significantly decreased number of EGFR^{L858R}-positive cells per lung

area per mouse in *EA3B* mice compared to *E* control mice, substantiating the detrimental effect of

continuous *A3B* expression at tumour initiation (Fig. 1d). This was further confirmed by staining

for the programmed cell death marker caspase-3, which showed a significantly higher level of

tumour cell death in *EA3B* mice (Fig. 1e-f).

We hypothesized that enforced *A3B* expression at tumour initiation in *EA3B* mouse models may

induce increased CIN, p53 pathway activation, and cell death. This hypothesis is based on recent

work from our group revealing in a p53-deficient EGFR^{L858R} mouse model that expression of the

human *A3B* transgene resulted in a significant increase in CIN[4]. In our models, a significantly

higher fraction of lagging chromosomes and chromatin bridges were observed in anaphase tumour

cells of *EA3B* mice compared with *E* mice at 3 months post-initiation[4] (Fig. 1g). At this same early

timepoint, there was also a significant increase in p53 nuclear positivity in tumours of *EA3B* mice

compared with *E* mice (Fig. 1h, and Extended Data Fig. 1b). No difference was observed in

proliferation (Ki67+ cells) or in the level of the DNA damage marker γH2AX+ between *E* and

EA3B mice (Extended Data Fig. 1c-d). Taken together, these data suggest that enforced *A3B*

expression impedes tumourigenesis through increased CIN, p53 pathway activation, and cell

death.

We hypothesized that enforced *A3B* expression at tumour intiation could also drive the detrimental

effect on tumour growth through enhanced immune surveillance in response to ongoing

mutagenesis[23]. To explore this, CD4 and CD8 T-cell infiltrates were examined at early (3 months

post induction) and late timepoints (at termination, ~6-17 months). At the early timepoint, a

significant increase in both CD4 (Extended Data Fig. 1e) and CD8 T-cells (Extended Data Fig. 1f-

g) in *EA3B* mice compared with *E* control mice was observed. In contrast, at the late timepoint a

lower level of both CD4 and CD8 T-cells was observed (Extended Data Fig. 1h-i) compared to the

early timepoint, and a significant increase in CD4 (Extended Data Fig. 1h), but not CD8 T-cells

(Extended Data Fig. 1i) in *EA3B* mice compared with *E* control mice was observed. These data

suggest immune evasion mechanisms to enforced *A3B* expression as tumours progress[24].

To examine if the connection between *A3B* and CIN observed in our mouse models was also present in patients with lung adenocarcinoma from the TRACERx421 (TX421) cohort, the correlation between *A3B* expression and multiple measures of CIN was assessed, expanding on previously published analysis of the TRACERx100 (TX100) dataset. First the CIN70 score in TX421 patient samples was examined. CIN70 score is an estimate of the extent of CIN in a sample based on a 70-gene CIN signature[4,25]. Confirming and expanding on previous findings from TX100[4], a significant correlation between *A3B* expression and CIN70 score was observed in the TX421 cohort at patient tumour level (Extended Data Fig. 2a) and tumour region level (Extended Data Fig. 2b). Although CIN70 can sometimes be an imperfect measure of CIN that also reflects tumour proliferation status[4,25], we gained confidence in its utilisation after further confirming a positive correlation between the percent missegregation errors quantified using H&E slides in the anaphases of TRACERx tumours (TRACERx300, 300 H&E patient samples) and matched CIN70 score (Spearman p = 0.0038) (Extended Data Fig. 2c). A correlation between *A3B* expression and subclonal CIN fraction was also observed in TX421 patients (Spearman p = 0.00087) (Extended Data Fig. 2d).

When subsetting for patients with EGFR mutant lung adenocarcinoma in this expanded TX421 dataset, significant positive correlations were observed between *A3B* expression and multiple measures of CIN at both the patient tumour level (Extended Data Fig. 2e) and tumour region level (Extended Data Fig. 2f). A trend towards significance between the percent missegregation errors quantified using haematoxylin and eosin (H&E) slides in the anaphases of TRACERx tumours (TRACERx300 cohort) and matched CIN70 score (Extended Data Fig. 2g) was found, and a significant correlation between *A3B* expression and subclonal CIN fraction was also observed (Extended Data Fig. 2h). Finally, a significant correlation between the percentage of the genome altered subclonally and APOBEC-driven mutations (TCN/TCW C>T/G) in patients with EGFR mutant lung adenocarcinoma was shown (Extended Data Fig. 2i). These data together suggest that the increased CIN observed with *A3B* expression in EGFR mutant mouse models is reflected in NSCLC patients in the TX421 dataset.

Despite the detrimental effect observed at tumour initiation in *EA3B* mice, overall survival was
not significantly longer in the *EA3B* model compared with the *E* model (Fig. 1i). At a late
timepoint (termination), no significant difference in the fraction of chromosome missegregation
errors (Extended Data Fig. 3a) or p53 activation between *E* and *EA3B* mice was observed (Fig. 1j
and Extended Data Fig. 3b-g). These data suggest that tumours can overcome initial growth
disruption by *A3B* and tolerate its continuous expression, through selection for a lower fraction of
chromosome missegregations in anaphase tumours of *EA3B* mice (Extended Data Fig. 3a). This
kind of adaptation to excessive CIN through alterations that optimize cancer cell fitness in tumour
evolution, was shown in a previous publication from our lab illustrating that disruption of APC/C
activity occurs as a result of excessive CIN, to reduce CIN and restore equilibrium[26].
196
Loss of *A3B* expression was ruled out as an explanation for this lack of difference in survival, as
no significant difference was observed in *A3B* expression levels by IHC analyses between tumours
at 3 months post-induction and tumours at termination (~6-17 months) (Extended Data Fig. 4a-b).
Additionally, assessment of the recombination efficiency of the *LSL-A3Bi* transgene revealed a
similar fraction (~80%) of recombination in *EA3B* tumours harvested from mice at endpoint
compared to the fraction of tumours expressing *A3B* by IHC assessment at early timepoints
(Extended Data Fig. 4c), supporting that *A3B* expression is not lost with tumour progression in this
model.
205
To assess if inactivation of the p53 pathway is sufficient to decrease the detrimental effect observed
at tumour initiation with continuous *A3B* expression, tumours were induced in an EGFR[L858R] p53-
deficient mouse model either with or without *A3B* expression (*EP* and *EPA3B*) (Extended Data
Fig. 5a). No difference in either the number of tumours at 3 months post-induction (Extended Data
Fig. 5b), or in overall survival (Extended Data Fig. 5c) between *EP* and *EPA3B* mice was observed.
These data suggest that in a p53-deficient model of EGFR-driven lung cancer, continuous *A3B*
expression is tolerated. Thus, p53 in this model limits the tolerance of cancer cells to the
detrimental effects of early and continuous A3B expression during tumour initiation.
214
215   **Subclonal *A3B* inhibits tumour progression and increases overall survival in an EGFR**
216   **mutant lung cancer mouse model.**

Data from analysis of the TRACERx421 (TX421) cohort revealed that APOBEC-mediated mutagenesis is enriched subclonally during tumour evolution in *EGFR* mutant disease (Extended Data Fig. 6a-b) and the wider cohort[11]. Based on these findings from TX421 and on our findings that enforced clonal expression of *A3B* was detrimental at tumour initiation, we generated mice in which *A3B* expression could be temporally separated from $EGFR^{L858R}$ expression to mirror subclonal APOBEC induction (Extended Data Fig. 7a). A tetracycline-inducible pneumocyte specific mouse model of $EGFR^{L858R}$-dependent lung cancer[13,14,22] was combined with a Cre recombinase-steroid receptor fusion ($Rosa26CreER^{T2}$)[27], with or without the conditional human *APOBEC3B* minigene used above to generate $CCSP\text{-}rtTA;TetO\text{-}EGFR^{L858R};Rosa26^{CreER(T2)/LSL\text{-}APOBEC3B}$ (*EA3Bi* or *Ei*) mice (Extended Data Fig. 7a). As expected, subclonal A3B-positive tumour cells were observed in *EA3Bi* mice but not in *Ei* control mice, reproducing the subclonal expression of *A3B* in human NSCLC (Extended data Fig. 7b).

In this model, $EGFR^{L858R}$-positive hyperplasias pervade the lung tissue, forcing the termination of mice prior to progression of the majority of $EGFR^{L858R+}$ lesions. Despite this, a fraction of $EGFR^{L858R}$-positive hyperplasia progress to form tumour nodules. Tumour nodules per lung section and tumour area per lung area were measured and found to be significantly lower in *EA3Bi* mice compared with *E* control mice at termination (all culled within 2 weeks of one another) (Extended Fig. 7c-d). Lung weight and $EGFR^{L858R}$ positivity per lung area, measures that include the $EGFR^{L858R}$-positive hyperplasia, were quantified at termination in *Ei* and *EA3Bi* mice and no significant difference was found (Extended Data Fig. 7e-f). These data suggest that *Ei* and *EA3Bi* mice have a similar tumour burden at termination, but that a higher fraction of the $EGFR^{L858R}$-positive hyperplasia in *Ei* control mice had progressed to form tumour nodules. Overall survival in *Ei* and *EA3Bi* mice was also measured, and a significant increase in survival of *EA3Bi* mice compared with *E* control mice was observed (Extended Fig. 7g). These data suggest that subclonal *A3B* in p53 wildtype mice also has a detrimental effect on tumourigenesis substantiating the unfavourable effects of continuous *A3B* expression at tumour initiation in a p53 wild-type background.

Subclonal A3B promotes tyrosine kinase inhibitor (TKI) resistance

Having established that continuous clonal or subclonal expression of *A3B* is detrimental to tumour
initiation in p53 wildtype; *EGFR^L858R* mouse models, the effect of *A3B* on tumour evolution under
the selective pressure of targeted therapy was examined next. *A3B* was expressed subclonally in
the tumours of mice treated with TKI therapy in our *EA3Bi* mouse model (Fig. 2a). A significant
increase in tumour grade (Fig. 2b), tumour nodules per lung section (Fig. 2c), and tumour area per
tissue area (Fig. 2d) was observed in TKI-treated *EA3Bi* mice compared with TKI-treated *Ei*
control mice. Heterogeneous A3B tumour positivity was observed, consistent with subclonal
induction of A3B (Fig. 2e), and a significant increase in A3B positivity with TKI therapy compared
to untreated *EA3Bi* mice was also observed (Fig. 2f), suggesting a selection for *A3B* expression
with TKI therapy.

Tumour growth and progression was also compared in *Ei* versus *EA3Bi* mice in an additional
experiment with continuous administration of TKI therapy (erlotinib) to more closely model the
treatment regimens of patients with lung cancer (Fig. 2g). The mice were culled once the maximum
oral gavage number had been reached at 10 months, and a significant increase in tumour nodules
(Fig. 2h) and an increase in tumour grade (Fig. 2i) were observed in *EA3Bi* mice compared with
Ei control mice.

Based on previous work illustrating an important role for uracil DNA glycosylase (UNG) in
repairing APOBEC-induced uracil lesions[28], we evaluated UNG expression in *A3B* expressing
EA3Bi tumours. IHC staining for UNG revealed a significant decrease in UNG-positive cells per
tumour in *EA3Bi* mice compared with *Ei* mice treated with TKI therapy (Extended Data Fig. 8a-
b). Taken together, these findings suggest that subclonal *A3B* expression with TKI therapy in
conjunction with *UNG* downregulation contributes to increased tumour growth and TKI resistance
in EGFR mutant mouse models.

To validate our findings from the mouse models in human systems, cell viability under targeted
therapy was assessed in established patient-derived cell line models of oncogenic *EGFR*-driven
lung adenocarcinoma in which *A3B* was depleted in both clonal and polyclonal populations using
RNAi or CRISPR-Cas9 technologies. Depletion of *A3B* by shRNA treatment resulted in a
significant decrease in cell viability upon treatment with the EGFR TKI osimertinib compared to

an empty vector control in two EGFR mutant cell lines, HCC827 (*EGFR^exon19del*) (Extended Data

Fig. 9a-b) and H1975 (*EGFR^L858R+T790M*) (Extended Data Fig. 9c-d), suggesting that *A3B* confers

enhanced survivability during targeted therapy. To further verify this, multiple single cell clones

were generated from PC9 cells (*EGFR^exon19del*) with CRISPR depletion of *A3B*, which also showed

a significant decrease in cell viability with *A3B* loss upon treatment (Extended Data Fig. 9e-f).

Additionally, a similar result was also observed in the *EML4-ALK* cancer cell line H3122 treated

with crizotinib (Extended Data Fig. 9g-h) suggesting that these observations are not limited to

EGFR-mutant lung adenocarcinoma models. These data in human cell line models support our *in*

vivo mouse findings that *A3B* expression is advantageous to tumour growth and resistance during

TKI therapy.

Targeted therapy induces A3B upregulation and UNG downregulation.

Our mouse lung cancer models demonstrated that *UNG* expression is downregulated with targeted

therapy, and that *A3B* expression is selected for and promotes targeted therapy resistance. We

hypothesized that targeted therapy may also induce adaptations that increase *A3B* expression and

decrease *UNG* expression in human models. Targeted therapy-induced transcriptional changes of

both *A3B* and *UNG* were assessed in established human lung cancer cell line models present in

publicly available datasets (GEO2R). Treatment of multiple EGFR-mutant cell lines (HCC827 and

PC9 harbouring *EGFR^exon19del* and HCC4006 harbouring EGFR^L747-E749del, A750P) with the EGFR

TKI erlotinib was associated with transcriptional upregulation of *A3B* and downregulation of the

repair factor *UNG*, both acutely (6-hour to 1-day treatment) and at later timepoints (8-day

treatment) (Extended Data Fig. 10a). To confirm these transcriptional changes, an independent

RNA-seq dataset was examined[29], generated from EGFR-mutant PC9 cells treated with the EGFR

TKI osimertinib for 9 days. These EGFR TKI-treated cells also displayed a significant

upregulation of *A3B* and downregulation of *UNG* transcripts (Extended Data Fig. 10b). The

transcriptional effects identified were therefore a conserved consequence of EGFR pharmacologic

inhibition in *EGFR*-driven lung adenocarcinomas and not specific to the class of EGFR inhibitor,

as similar effects were observed with a first generation TKI (erlotinib) (Extended Data Fig. 10a)

and a third generation TKI (osimertinib) (Extended Data Fig. 10b). A3B induction was observed

with either lower physiological doses of erlotnib or osimertinib (data not shown), or higher doses

previously used to study clinically relevant mechanisms of acquired resistance[30-35]. These findings

were subsequently validated in multiple oncogenic *EGFR*-driven (Fig. 3a-b) and *EML4-ALK*-

driven (Fig. 3c) cellular models of lung adenocarcinoma at both the RNA (Fig. 3a-c) and protein

level (Fig. 3d, Extended Data Fig. 11g). To rule out the possibility that these observations could

be due to off-target pharmacological effects of EGFR TKIs, genetic inhibition of EGFR through

siRNA-mediated silencing in an oncogenic EGFR-driven model was performed, confirming

significant *A3B* upregulation and *UNG* downregulation (Fig. 3e). Furthermore, induction of A3B

was also observed upon treatment with an inhibitor of mitogen-activated protein kinase enzymes

MEK1, selumetinib, (Extended Data Fig. 10a). The induction of A3B by different inhibitors of

oncogenic RTKs and their downstream signalling components, such as MEK1, indicates that

upregulation of A3B is likely a consequence of inhibition of oncogenic signalling, and not specific

to EGFR TKIs. TKI-induced changes at the functional level were validated using established

assays to quantify APOBEC activity[36] and uracil excision capacity[28]. Consistent with RNA and

protein level changes, TKI treatment resulted in a significant increase in nuclear APOBEC activity

and a decrease in nuclear uracil excision capacity of UNG in multiple *EGFR*-driven cell line

models of lung adenocarcinoma, including $EGFR^{exon19del}$ cells (PC9 and HCC827), and

$EGFR^{L858R+T790M}$ cells (H1975) (Fig. 3f-g, Extended Data Fig. 10c-f). Increased *A3B* expression

and activity and decreased *UNG* expression and activity were also observed in *EML4-ALK*-driven

cellular models (H3122 and H2228) (Extended Data Fig. 10g-j).

To exclude an indirect effect of targeted therapy on cell cycle arrest which might alter APOBEC

and DNA repair enzyme expression, PC9 cells were treated with the CDK4/6 cell cycle inhibitor

palbociclib[37] to induce a G0/G1 cell cycle arrest and *A3B* and *UNG* expression levels were

measured. Palbociclib treatment induced G0/G1 cell cycle arrest as expected (Extended Data Fig.

11a). While *UNG* expression decreased upon palbociclib treatment, there was a substantial decline

in *A3B* expression, in contrast to the increased expression observed upon TKI therapy (Extended

Data Fig. 11b). These data suggest that TKI-mediated induction of *A3B* is unlikely to be a

consequence of TKI treatment-induced cell cycle inhibition.

To confirm our findings, *A3B* and *UNG* expression levels were examined in multiple human

tumour xenograft models: three cell line-derived tumour xenografts (CDXs) and one patient-

derived tumour xenograft (PDX). An increase in A3B protein levels and a decrease in UNG protein

levels were detected by western blot and immunohistochemistry (IHC) analyses in EGFR TKI-
treated tumour tissues from three distinct oncogenic *EGFR*-driven CDX models of human lung
adenocarcinoma: osimertinib-treated H1975 xenografts (*EGFR$^{L858R+T790M}$*) (Fig. 3h), osimertinib-
treated PC9 xenografts (*EGFR^{exon19del}*) (Extended Data Fig. 12a) and erlotinib-treated 11-18
xenografts (*EGFR^{L858R}*) (Extended Data Fig. 12b-e). Additionally, RNA-seq analyses from an
EGFR^{L858R}-harbouring PDX model of lung adenocarcinoma[38] treated with the EGFR inhibitor
erlotinib (Extended Data Fig. 12f) or the EGFR inhibitor osimertinib[29] (Extended Data Fig. 12g)
also revealed an increase in *A3B* mRNA levels and a trend towards decrease in *UNG* mRNA levels
upon treatment. The collective findings from these multiple independent human tumour xenograft
cohorts support a model whereby EGFR oncoprotein inhibition induces *A3B* upregulation and
UNG downregulation.
351
To examine if the increase in *A3B* expression observed during TKI therapy is directly linked to
A3B activity, nuclear APOBEC activity was measured during both acute and long term TKI
therapy. Osimertinib treatment for up to 9 days resulted in a periodic induction of APOBEC
activity, with peaks corresponding to over 4-fold increase compared to non-treated cells at day 1,
and an almost 5-fold increase at the 8-day timepoint (Extended Data Fig. 13a-b). The pattern of
A3B expression upon TKI treatment was assessed and was found to be significantly correlated
with the dynamics of nuclear APOBEC activity (Extended Data Fig. 13c). Accordingly, both
baseline and TKI-induced nuclear APOBEC activity were abrogated by RNAi depletion of *A3B* in
the *EGFR^{exon19del}* human lung cancer cell line PC9, which was confirmed with both acute siRNA
(Extended Data Fig. 14d-f) and stable shRNA methods (Extended Data Fig. 13g-h). To further
confirm the predominant role of A3B in APOBEC activity, following the depletion of *A3B*, either
wild-type A3B (A3B WT-HA tagged) or a catalytically inactive A3B containing a mutation in the
C-terminal deaminase domain (A3B E225A-HA tagged) were reconstituted[39]. Accordingly,
expression of the wild-type catalytically active, but not of the mutant catalytically inactive A3B,
rescued the decline in nuclear APOBEC activity caused by *A3B* depletion (Extended Data Fig.13i-
j). The collective findings support a model whereby EGFR targeted therapy induces conditions in
cancer cells that are favourable for *A3B* expression and activity.
369
370 **NF-κB signalling is critical for TKI-induced A3B upregulation.**

Previous work from us and others revealed that NF-κB signalling is activated upon EGFR oncogene inhibition in human lung cancer as a stress and survival response[38], and that NF-κB signaling may be one prominent inducer of *A3B* gene expression[40,41]. To test the hypothesis that NF-κB signaling that is activated upon targeted therapy and promotes *A3B* upregulation, an established RNA-seq dataset generated from *EGFR*-driven human lung adenocarcinoma cells treated acutely with either erlotinib or an established NF-κB inhibitor, PBS-1086, or both in combination was examined[38]. TKI treatment-induced transcriptional upregulation of *A3B* was attenuated by co-treatment with the NF-κB inhibitor[38] (Extended Data Fig. 14a). Upon TKI treatment, an increase in nuclear levels of NF-κB subunit RELB tracked in synchrony and episodically with *A3B* expression, peaking at 1 and 7 days (Extended Data Fig. 14b). These data suggest that the NF-κB pathway may induce *A3B* expression. To confirm this, first the NF-κB pathway was activated with increasing concentrations of TNFα, which elevated nuclear RELA and RELB as well as A3B protein levels (Extended Data Fig. 14c) and cellular *A3B* mRNA expression (Extended Data Fig. 14d). Furthermore, inhibition of the NF-κB pathway by simultaneous depletion of both RELA and RELB (Extended Data Fig. 14e) reduced TKI-induced *A3B* mRNA expression (Extended Data Fig. 14f) and protein levels (Extended Data Fig. 14g). Consistent with these data from *in vitro* studies, co-inhibition of EGFR and NF-κB pathways blocked EGFR inhibition-induced *A3B* upregulation in oncogenic EGFR-driven NSCLC xenografts (Extended Data Fig. 12c). To determine if NF-κB could promote TKI-induced A3B-driven nuclear APOBEC activity, we examined the effects of co-depletion of RELA and RELB transcription factors on TKI-induced nuclear APOBEC activity. Consistent with our hypothesis, co-depletion of both NF-κB transcription factors impaired TKI-induced nuclear APOBEC activity (Extended Data Fig. 14h). These data support NF-κB activation resulting from EGFR TKI treatment as an inducer of *A3B* upregulation in response to therapy. The intermittent nature of NF-κB activation is a classic feature of NF-κB signalling[42-46], and likely leads to the downstream episodic A3B upregulation observed during targeted therapy.

To investigate the clinical relevance of these findings, we examined single-cell RNA-seq data in an established dataset obtained from clinical specimens of NSCLC procured from patients at 3 timepoints: 1) prior to initiation of systemic targeted therapy (classified as treatment naïve, TN), 2) while on targeted therapy when the tumour was regressing or at stable state as evaluated by

standard clinical imaging (classified as residual disease, RD), and 3) at clear progressive disease (acquired resistance) as determined by standard clinical imaging (classified as progressive disease, PD). The classification of response was based on RECIST criteria[47]. In total, 49 samples obtained from patients pre- or post-TKI therapy (erlotinib, osimertinib and crizotinib being the most frequent targeted therapies) from 30 lung cancer patients were analysed (Supplementary Table 1a). We observed that mRNA expression of A3B and of the NF-κB components and targets RELA and RELB, as well as an NF-κB gene signature[48], were significantly increased in tumours exposed to EGFR TKI treatment, in particular at tumour progression during therapy (Extended Data Fig. 15a-d).

UNG downregulation is associated with _c-JUN_ suppression during TKI treatment.

Having noted that a key DNA repair enzyme UNG, that counteracts APOBEC-mediated mutagenesis was downregulated during targeted therapy in both our mouse and pre-clinical models, we investigated the potential mechanism by which this occurs. _UNG_ gene promoter analysis (using PROMO)[49] revealed the presence of predicted c-Jun consensus binding sites. Our RNA-seq data from EGFR TKI-treated PC9 EGFR-mutant NSCLC cells indicated that like _UNG_, _c-JUN_ was also transcriptionally downregulated upon TKI treatment, which we validated using RT-qPCR analysis (Extended Data Fig. 16a). These data are consistent with the expectation that _c-JUN_ expression should decrease upon inhibition of the MAPK pathway that occurs as a result of EGFR inhibition by TKI treatment[50]. Thus, the possibility that TKI treatment-induced _UNG_ downregulation might be caused by _c-JUN_ downregulation was investigated. Consistent with this hypothesis, _c-JUN_ depletion alone was sufficient to suppress _UNG_ expression, suggesting that _UNG_ downregulation may be a consequence, in part, of the _c-JUN_ suppression that occurs during MAPK signalling suppression that is a classic effect of TKI treatment (Extended Data Fig. 16b).

A3B generates genetic diversity that helps to fuel resistance to oncogene-targeted therapy.

We next tested the hypothesis that _A3B_ upregulation and activity (and _UNG_ downregulation) could create conditions conducive to cancer genome mutagenesis, genetic diversity, and targeted therapy resistance. We sought to identify evidence for this and putative TKI resistance mutations induced by _A3B_ in both pre-clinical human and mouse models together with human NSCLC specimens.

Whole exome and whole genome sequencing (WES and WGS) was performed in our cell line

models and patient datasets collected from current and prior studies[31,51].

To examine the effects of TKI-induced A3B expression and activity on mutagenesis, doxycycline-

inducible CRISPR-Cas9 depletion of A3B was introduced in multiple clones of the human PC9

EGFR^exon19del cell line (Fig. 4a, and Extended Data Fig. 17a). WES analysis of these cells revealed

that TKI treatment of A3B-proficient PC9 cells for close to 3.5 months induced a significantly

higher mutation burden and a significantly higher number APOBEC-associated mutations in TKI-

treated samples (Fig. 4a). WGS sequencing analysis was also performed on an additional A3B-

proficient and A3B-deficient PC9 clone, treated with DMSO or with Osimertinib, again illustrating

a higher mutational burden and higher number of APOBEC-associated mutations specifically in

A3B-proficient osimertinib-treated sample and not in the A3B-proficient DMSO treated sample

(Fig. 4b, and Extended Data Fig. 17b-c). This data suggests that the accumulation of mutations in

an APOBEC context in the A3B-proficient osimertinib-treated sample is likely due to the induction

of A3B expression upon treatment with TKI therapy, rather than intermittent mutagenesis that in

some cases might naturally occur[52].

In the EGFR mutant human lung cancer cell line PC9, an A3B-proficient PC9 TKI resistant clone

acquired an early stop codon mutation in the tumour suppressor gene NRXN3 (Q54*)[53,54] in the

APOBEC-preferred context (T[C>T]A). The impact of this potential loss-of-function change was

validated by depleting NRXN3 (given the early stop codon mutation detected, which is likely a

loss-of-function event) in a naïve PC9 lung cancer cell line, which increased levels of

phosphorylated AKT and conferred resistance to EGFR TKI treatment (Extended Data Fig. 18a-

c).

The increase in mutational burden and APOBEC-associated mutations with targeted therapy was

confirmed again in mouse tumour cell lines derived from *EGFR^L858R* p53-deficient *A3B*-expressing

mouse models (Extended Fig. 6a, *EP* and *EPA3B* naïve mouse tumour cell lines), treated with

targeted therapy (erlotinib or osimertinib). A significantly higher number of mutations overall were

detected in TKI resistant A3B expressing EGFR mutant tumour cell lines (*EPA3B*) compared with

both treatment naïve *EPA3B* tumour cell lines and TKI resistant cell lines lacking A3B expression

(EP) (Extended Data Fig. 19a). A significantly higher number of APOBEC-associated mutations
were also detected in TKI resistant *A3B*-expressing *EPA3B* cell lines compared with TKI resistant
EP cell lines (Extended Data Fig. 19b). No EGFR T790M mutations were detected in any of the
naïve or TKI resistant mouse tumour cell lines. These data in mouse preclinical models strengthen
the hypothesis that A3B can promote genetic diversity during targeted therapy treatment, as these
models lack all other human APOBEC3 family enzymes.
469
In two of the TKI-resistant *A3B*-expressing mouse lung cancer cell lines, two unique A3B-
mediated de novo putative loss-of-function mutations in the *Ptprs* gene were identified (Extended
Data Fig 19c). Loss of PTPRS function through mutation or deletion has been shown to
significantly increase levels of active phosphorylated EGFR and is linked to resistance to targeted
therapy in human preclinical cancer models[55-57]. Additionally, loss of PTPRS expression has been
shown to drive significantly more rapid disease progression and worse overall survival in patients
with EGFR-driven lung adenocarcinoma[55-57]. Both *Ptprs* mutations were in the second Ig domain
that is conserved between the mouse and human PTPRS[58]. Loss of Ig domains in PTPRS has been
shown to reduce the phosphatase activity of PTPRS resulting in increased phospho-ERK levels[59].
Ig domains are conserved across all three human type IIa PTPs, including PTPRS, PTPRD, and
PTPRF[58]. One of the A3B-driven mutations in the mouse *Ptprs* gene, D138N, (Ptprs_mut1,
Extended Fig 19c) was also identified in patients with lung, colorectal, and bladder cancer,
including one lung cancer TRACERx patient with an *EGFR^{L858R}* driver mutation. Subclonal
enrichment of APOBEC-associated mutation signatures 2 and 13 was observed in this TRACERx
patient compared with all other patients with EGFR mutant lung adenocarcinoma in the TX421
cohort dataset (Extended Data Fig. 19d). These findings suggest that the A3B-driven D138N
mutation could be a novel APOBEC hotspot mutation.
487
To verify the clinical relevance of our findings, *A3B* expression was also examined in the NSCLC
clinical dataset at TN, RD and PD timepoints (Supplementary Table 1b)[47,60]. Over 50% of human
tumours that were exposed to targeted therapy showed increased *A3B* expression with a significant
increase at PD (P = 0.0318) (Fig. 4c). No significant difference was observed between PD tumours
treated with single agent TKI therapy compared with PD tumours treated with single agent TKI
therapy combined with chemotherapy (Extended Data Fig. 20a). IHC analyses performed on these

clinical samples revealed a significant increase in A3B protein levels in EGFR TKI-treated tumour

samples both at RD and PD timepoints (P = 0.0113) (Fig. 4d-e). Thus, A3B was elevated not only

in human and mouse cellular models of oncogene-driven lung cancer but also in human clinical

tumours exposed to targeted therapy.

To further test whether *A3B* induction during targeted therapy fuels resistance development, the

overall mutation burden (SNV count) (Fig. 4f), and number of APOBEC-associated mutations

(C>T or C>G mutations in a TCN context) (Fig. 4g) examined in patients prior to and post-TKI.

Consistent with the increase of *A3B* expression, a significant increase was observed in both overall

mutation burden and APOBEC-associated mutations post-treatment (Fig. 4f-g). Moreover, known

APOBEC signature-associated mutations were identified in genes previously associated with TKI

resistance in tumours of patients who had progressed on or shown incomplete response to EGFR

inhibitor therapy (Fig. 4h). These mutations include an activating mutation in *PIK3CA* (E545K)[61],

WNT signalling-activating mutations in β-catenin at a GSK-3β phosphorylation site[62], MAPK

pathway reactivating-mutations through inactivation of *PP2A*, a negative regulator of MAPK

signalling[63,64], as well as an ALK inhibitor desensitizing mutation in *ALK* (E1210K)[65] in the

tumours of some patients who had progressed on or shown incomplete response to EGFR or ALK

inhibitor therapy (Fig. 4h). AKT, WNT and MAPK pathway activation have previously been

shown to cause EGFR and ALK inhibitor resistance[66-71].

All but one of these APOBEC-associated putative resistance mutations were detected selectively

post-treatment in tumours that have developed resistance, suggesting not only that these mutations

are induced by APOBEC during targeted therapy but also that they could in fact be promoting

resistance. Furthermore, all samples containing these APOBEC-associated mutations except for

one did not also harbour the EGFR T790M mutation, which has been reported to be present in

approximately 50 to 60% of first- and second-generation EGFR TKI-resistant cases[72,73] and arising

from a non-APOBEC clock-like mutation signature (Signature 1[74]) (Fig. 4h). The observation that

APOBEC-mediated mutations in resistance genes detected in post-treatment samples and the

EGFR T790M mutation appear to be mutually exclusive suggests that these APOBEC-mediated

mutations could be the principal mechanisms of resistance to targeted therapy in these patients.

Taken together, these data illustrate the diverse effects of A3B at different stages of tumour evolution with or without the selective pressure of therapy, demonstrating the dual role of A3B, both as an inhibitor of tumour progression at initiation, and a contributor to genetic diversity that helps to promote resistance during the selective pressure of targeted therapy (Extended Data Fig. 21a-b)

Discussion:

Our collective findings shed light on the important, context-specific roles of APOBEC on lung cancer pathogenesis and tumour evolution, from initiation to resistance development. Our mouse models and human datasets suggest that A3B-driven adaptive mutability[8] is specific to a TKI therapeutic context; for instance in the mouse models, enforced A3B expression in the absence of TKI therapy at initiation promotes increased T-cell infiltrate, as well as increased CIN, p53 activation and cell death, resulting in reduced tumour growth. Later in tumour evolution in the mouse models, we no longer observe a significant difference in p53 activation or CIN between *E* and *EA3B* mice (Fig. 1j and Extended Data Fig. 3a-g), which could be due to selection for a lower chromosome missegregation rate to optimize cell fitness enabling survival of A3B expressing cells. As mentioned previously, attenuation of the chromosome segregation error rate has been shown to occur over time in the presence of persistent spindle assembly checkpoint dysfunction due to selection of APC/C mutations in cell models[26]. We also see a reduced immune infiltrate overall and no significant difference in cytotoxic CD8 T cell infiltrate between *E* and *EA3B* mice later in tumour evolution, in contrast to significant increase in both CD4 and CD8 T-cells in EA3B at tumour initiation (Extended Data Fig. 1e-i). These data may reflect selection for adaptive immune evasive mechanisms over time with enforced A3B expression[75].

Our data reinforce the idea that targeted therapies can induce changes that promote genome mutagenesis, including that which is APOBEC-mediated, which was not previously appreciated. This A3B induction during therapy helps to fuel the development of treatment resistance and appears to be clinically relevant based on our clinical specimen datasets obtained from targeted therapy-treated patient datasets, which are challenging to obtain and analyse. Based on our findings here, additional clinical cohort analysis will be important to conduct as further human tumours obtained from patients on targeted therapy become available in the future.

While APOBEC has been implicated in drug resistance previously[39,76], our study reveals a distinct

mechanism by which targeted cancer therapy is actively responsible for the upregulation of

APOBEC via NF-κB-mediated transcriptional induction that occurs in response to therapy. This

process then helps to promote tumour genetic evolution to facilitate the development of resistance.

Examination of single-cell RNA-seq data of cancer cells isolated from clinical samples of patients

with NSCLC before or whilst on targeted therapy[47] revealed, similar to A3B, significant increases

in the expression of the NF-κB transcriptional subunits RELA and RELB, and an established NF-

κB gene signature, in tumours exposed to EGFR TKI treatment (Extended Data Fig.15a-d),

reinforcing the relevance of NF-κB-mediated transcriptional upregulation of A3B as a mechanistic

feature of this evolutionary process. Our study increases the understanding of why co-treatment

with an NF-κB pathway inhibitor is more effective than EGFR inhibitor treatment alone at

preventing the emergence of resistance, as previously observed in multiple *in vitro* and *in vivo*

models of oncogenic-EGFR driven lung adenocarcinomas[38].

We demonstrated that expression of *A3B* helps to promote resistance in preclinical human and

mouse models of lung adenocarcinoma. Although we focused on oncogenic *EGFR*-driven lung

adenocarcinomas, our findings appear to extend to other molecular subsets as well such as *EML4-*

ALK-driven lung cancer (Fig. 3c and Extended Data Fig. 10g-j) and likely reflect a more general

principle of therapy-induced genetic evolution. Our analysis of patient data suggests an increase

in *A3B* expression in the post-TKI setting. We also identified specific APOBEC-associated

mutations that can promote resistance to targeted therapy. Our work is consistent with, and

expands upon, prior studies suggesting a potential association between APOBEC-mediated

mutagenesis and acquisition of putative resistance mutations in the APOBEC-preferred context

during treatment of EGFR-driven lung cancers[77,78]. The collective data suggest that inhibiting

APOBEC3B-driven tumour evolution could suppress the emergence of one key class of resistance

mutations and thereby improve response to targeted therapy. It is also possible and likely that other

APOBEC3 family members beyond A3B contribute to genetic evolution of resistance[5,52], although

A3B has been shown to be a contributor to mutagenesis in a human cell line model system[6]. We

must also not discount the potential contribution of chromosomal instability induced by A3B to

TKI resistance. We decided in this manuscript to focus specifically on TKI resistance mechanisms

driven by APOBEC-associated mutations but believe that disentangling the different contributions
of CIN and mutagenesis driven by APOBEC enzymes to TKI resistance is an important area of
future research. Finally, it is certain that APOBEC-mediated resistance is one of many paths to
resistance development.
591
Recent work has also demonstrated that decreased mismatch repair capacity and increased
expression of error-prone DNA polymerases may contribute to increased adaptability of colorectal
cancer to EGFR inhibition therapy[8]. While we observed downregulation of *UNG*, we did not
observe upregulation of these error-prone polymerases by gene expression analysis of EGFR TKI-
treated PC9 cells. Thus, our findings describe a distinct mode and mechanism of therapy-induced
genetic adaptability in cancer. Our evidence here and these emerging collective findings[5,8,39,79]
suggest that endogenous drivers of mutagenesis play diverse roles that are both detrimental and
beneficial to tumour evolution depending on context of tumour pathogenesis, and that treatment-
induced genetic mutability may be a general principle by which tumours evolve in response to
treatment.
602

Author contributions:
Conception and design of the study: D.R.C., M.K.M., P.G., E.K.L., N.K., R.S.H., J.D. T.G.B,
C.S.; **Data acquisition (cell line and animal studies)**: D.R.C., M.K.M., P.G., F.H., B.G., S.N.,
C.G., E.G., M. A. B., A.N., F.G.V., W.H., W.T.L., B.A., M.G., C.M., J.P., E.G., C.Z., S.L., J.C.,
B.R., W.B., A.R., B.A., R.I.V., M.M., N.J.T., T.J.H., C.W., N.K., S.V., K.V., S.H., V.O., D.B.;
Data acquisition for clinical studies: C.M.R., M.D., M.A., C.B., O.P., B.B., C.E.M., C.M.B.,
D.L.K., J.K.R., M.J.H., P.A., E.A.Y., L.T.; **Mutational Signature Analysis and/or other**
computational analysis: C.B., O.P., B.B., M.D., M.A., N.I.V., N.A.T., W.W., L.C., E.M.V.A.,
J.Y.; **Analysis and interpretation of data**: D.R.C,. M.K.M., P.G., N.I.V., T.G.B., C.S., E.K.L,
R.S.H., W.L.B, L.K.L., C.D., P.P.A., J.P., M.A.B., A.N., M.D., C.M.R., S.F.B., S.K.C., S.P.,
A.S.B., N.M., C.M., B.R., B.B., W.W., K.V., D.L.K, F.H., C.B., O.P., B.B., N.K., N.A.T., N.R.;
Manuscript writing and revision: D.R.C., M.K.M., P.G., M.D, M.A., C.B., O.P., B.B., K.V.,
N.M., E.M.V.A, N.K., R.S.H. J.D., T.G.B., C.S.
616

Acknowledgements:

This project is supported by the NIH/NCI U54CA224081, R01CA169338, R01CA211052,
R01CA204302, U01CA217882 and the Chan-Zuckerberg Biohub (to T.G.B). Pfizer, as well as
the University of California Cancer League (United States) (to C.E.M), AstraZeneca (United
Kingdom), The Damon Runyon Cancer Research Foundation P0528804 (United States), Doris
Duke Charitable Foundation P2018110 (United States), V Foundation P0530519 (United States),
and NIH/NCI R01CA227807 (to C.M.B.), F.H. was supported by the Mildred Scheel postdoctoral
fellowship from the German Cancer Aid. E.A.Y is supported by T32 HL007185 from the NHLBI.
Cancer studies in the Harris lab are supported in part by the National Cancer Institute P01-
CA234228. R.S.H. is the Ewing Halsell President's Council Distinguished Chair at University of
Texas San Antonio and an Investigator of the Howard Hughes Medical Institute.

D.R.C was supported by the Francis Crick Institute which receives its core funding form Cancer
Research UK (FC001169), the UK Medical Research Council (FC002269), and the Wellcome
Trust (FC001169), as well as an NC3Rs training fellowship (NC/S001832/1). C.S. acknowledges
grant support from Pfizer, AstraZeneca, Bristol Myers Squibb, Roche-Ventana, Boehringer-
Ingelheim, Archer Dx Inc (collaboration in minimal residual disease sequencing
technologies) and Ono Pharmaceutical, is an AstraZeneca Advisory Board member and Chief
Investigator for the MeRmaiD1 clinical trial, has consulted for Pfizer, Novartis,
GlaxoSmithKline, MSD, Bristol Myers Squibb, Celgene, AstraZeneca, Illumina, Genentech,
Roche-Ventana, GRAIL, Medicxi, Bicycle Therapeutics, and the Sarah Cannon Research
Institute, has stock options in Epic Bioscience, GRAIL, and has stock options and is co-founder
of Achilles Therapeutics. The other University of Minnesota authors have no competing interests
to declare. T.G.B. is an advisor to Novartis, Astrazeneca, Revolution Medicines, Array/Pfizer,
Springworks, Strategia, Relay, Jazz, Rain, EcoR1 and receives research funding from Novartis and
Revolution   Medicines   and   Strategia.
N.I.V. served on an Advisory Board for Sanofi Genzyme. E.M.V.A. is a consultant for Tango
Therapeutics, Genome Medical, Invitae, Enara Bio, Janssen, Manifold Bio, Monte Rosa; receives
research funding from Novartis, BMS; has equity in Tango Therapeutics, Genome Medical,
Syapse, Enara Bio, Manifold Bio, Microsoft, Monte Rosa; has received travel reimbursement from
Roche/Genentech and own institutional patents filed on chromatin mutations and immunotherapy
response, and methods for clinical interpretation. C.E.M. is on advisory board of Genentech;

receives honoraria from Novartis, Guardant, Research and receives funding from Novartis,

Revolution Medicines. C.M.B. is a consultant for Amgen, Foundation Medicine, Blueprint

Medicines, Revolution Medicines; receives research funding from Novartis, AstraZeneca, Takeda;

and institutional research funding from Mirati, Spectrum, MedImmune and Roche.

Journal Editorial Board membership: C.S. is editorial board member for *Cell* and *PLOS*

medicine, associate editor and editorial board member for *Annals of Oncology*, scientific editor

for *Cancer Discovery* and advisory board member for *Nature Reviews Clinical*

Oncology and *Cancer Cell*. T.G.B is editor-in-chief of *npj Precision Oncology* and an editorial

board member of *Molecular and Cellular Biology*.

Patents: C.S. holds European patents relating to assay technology to detect tumour recurrence

(PCT/GB2017/053289); to targeting neoantigens (PCT/EP2016/059401), identifying patent

response to immune checkpoint blockade (PCT/EP2016/071471), determining HLA LOH

(PCT/GB2018/052004), predicting survival rates of patients with cancer

(PCT/GB2020/050221), identifying patients who respond to cancer treatment

(PCT/GB2018/051912), a US patent relating to detecting tumour mutations

(PCT/US2017/28013) and both a European and US patent related to identifying

insertion/deletion mutation targets (PCT/GB2018/051892).

C.S. is Royal Society Napier Research Professor (RP150154). His work is supported by the

Francis Crick Institute, which receives its core funding from Cancer Research UK (FC001169),

the UK Medical Research Council (FC001169), and the Wellcome Trust (FC001169). C.S. is

funded by Cancer Research UK (TRACERx, PEACE and CRUK Cancer Immunotherapy

Catalyst Network), Cancer Research UK Lung Cancer Centre of Excellence, the Rosetrees

Trust, Butterfield and Stoneygate Trusts, NovoNordisk Foundation (ID16584), Royal Society

Research Professorship Enhancement Award (RP/EA/180007), the NIHR BRC at University

College London Hospitals, the CRUK-UCL Centre, Experimental Cancer Medicine Centre and

the Breast Cancer Research Foundation, USA (BCRF). His research is supported by a Stand Up

To Cancer-LUNGevity-American Lung Association Lung Cancer Interception Dream Team

Translational Research Grant (SU2C-AACR-DT23-17). Stand Up To Cancer is a program of

the Entertainment Industry Foundation. Research grants are administered by the American
Association for Cancer Research, the Scientific Partner of SU2C. C.S. also receives funding
from the European Research Council (ERC) under the European Union's Seventh Framework
Programme (FP7/2007-2013) Consolidator Grant (FP7-THESEUS-617844), and ERC
Advanced Grant (PROTEUS) from the European Research Council under the European Union's
Horizon 2020 research and innovation program (835297) and Chromavision from the European
Union's Horizon 2020 research and innovation programme (665233).

Special thanks to the Biological Research Facility at the Francis Crick Institute, specifically to Ade
Adekoya, James Cormack, Antony Horwood, and Scott Lighterness for their hard work and
support. Special thanks also to the Experimental Histopathology Laboratory at the Francis Crick
Institute, specifically to Emma Nye, Bruna Almeida, Mary Green, and Richard Stone for their help
and support. Special thanks to all the members of the Bivona laboratory (former and current),
Dmitry Gordenin, Alejandro Sweet-Cordero, Sourav Bandyopadhyay, Marcus Breese, Swati
Kaushik, Brandon Leonard and Sharath Raju for their insights and support and Sarah Elmes,
Ashley Maynard, David V. Allegakoen and Abhik Tambe for their technical support.

696
Methods:
Cell line and growth assays: Cell lines were grown in RPMI-1640 medium supplemented with
1% penicillin-streptomycin solution (10,000 Units/ml) and 10% FBS or in Iscove's Modified
Dulbecco's Medium (IMDM) supplemented with 1% penicillin-streptomycin solution (10,000
Units/ml), L-Glutamine (200 mM) and 10% FBS in a humidified incubator with 5% CO_2
maintained at 37°C and fresh media was added to cells every 3-4 days. Drugs used for treatment
except PBS-1086[38] were purchased from Selleck Chemicals or from MedKoo Biosciences. For
growth assays, cells were exposed to the indicated drugs for few days-2.5 months (long-term
growth assays) or DMSO for 3-4 days (controls used for long-term growth assays) in 6 well plates
or 96 well plates (details in the figure legends) and assayed using crystal violet staining or Celltiter-
Glo luminescent viability assay (Promega) according to manufacturer's instructions.

Deriving clonal populations and generating APOBEC3B knockout cells: Clonal cells were
derived by sorting single cells into 96-well plates and expanding them over a few weeks. We then

derived pools of one of the clones expressing either a non-targeting guide or APOBEC3B targeting guide along and puromycin marker and CRISPR/Cas9 by lentiviral transduction as done in a previously published study[80]. A couple of gRNA target sequences, which were designed by the Zhang lab to specifically target APOBEC3B[81] were first subcloned into the all-in-one lentiCRISPR v2 plasmid (Addgene plasmid # 52961- a gift from Feng Zhang)[81]. They were then lentivirally transduced into PC9 clonal cells, tested and the one that showed better APOBEC3B-depletion in western blot analysis was selected for further analysis. Additionally, we also generated APOBEC3B knockout clones from clonal derivatives of PC9 cells (C2 and E4). For this we used the Dox-inducible version of LentiCRISPR v2 (Addgene plasmid # 87360 - a gift from Adam Karpf) and subcloned the APOBEC3B-targeting sgRNA that worked well, into it[82]. The plasmid was then lentivirally transduced into PC9 clonal cells, subjected to puromycin selection and then half the cells were treated with 1 ug/ml doxycycline (dox) to induce the expression of Cas9 and thereby generate APOBEC3B knockouts. Induction of APOBEC3B deletion was confirmed by western blot analysis. Clonal cells were then derived from these cells using single cell sorting as indicated earlier and the clonal populations that deleted APOBEC3B were identified by western blot analysis and tested further. The cells not treated with dox served as APOBEC3B-proficient control for the APOBEC3B-knockout clones.

Transductions and transfections: Hek293T cells were co-transfected with lentiviral packaging plasmids pCMVdr8 and pMD2.G plasmid, along with the plasmid of interest using Fugene 6 transfection reagent (Promega). All shRNA plasmids used were purchased from Sigma. APOBEC3B shRNA (TRCN0000142875). Cells were transduced by incubation with 1:1 diluted lentivirus for 1- 2 days and then selected with the antibiotic marker (puromycin or hygromycin) until untransduced control plate was clear. Negative control siRNA and other siRNA cocktails used were purchased from GE Dharmacon. siRNAs were transfected using Lipofectamine RNAi Max according to manufacturer's protocol and the cells were harvested 48 hr of transfection for subsequent assays. or western blot analysis were used to confirm the shRNA, siRNA of CRISPR-mediated depletions.

RT-qPCR: Total RNA was extracted using GeneJet RNA purification kit (Thermo Fisher) or RNeasy Mini kit (Qiagen) and cDNA was synthesized from it using sensiFast cDNA synthesis kit

or Applied Biosystems High-Capacity cDNA Reverse Transcription Kit in accordance with the

manufacturer's instructions. qPCR reactions were performed using PowerUP SYBR Green Master

Mix (Applied Biosystems) or TaqMan Universal PCR Master Mix (Applied Biosystems) and

previously validated primers[83] (PrimerBank) on a QuantStudio. GAPDH, Actin, 18S RNA or

β2Microglobulin were used as reference genes. The following primers were used for p53 pathway

activation: Actin: Mm02619580_g1, Bax: Mm00432051_m1, Cdkn1a/p21: Mm04205640_g1,

Mdm2: Mm01233138_m1, Pmaip1/Noxa: Mm00451763_m1, Sesn2: Mm00460679_m1. Data

was analyzed using QuantStudio 12K Flex Software V1.3 and GraphPad Prism 7.

Western Blot Assay: Cells were treated with the indicated drugs the day after plating on a 6 well

plate or 10 cm plates for the indicated duration. Whole cell extracts were made with the former

were harvested by first washing with ice cold PBS and then lysing using ice cold RIPA buffer

containing protease and phosphatase inhibitors followed by sonication and centrifugation for

clarification of extracts. Cells grown on 10 cm plates were used for making nuclear-cytoplasmic

extracts as described previously using ice-cold 0.1% NP-40 in PBS[84]. Equal amounts of extracts

(quantified using Lowry assay) were subjected to SDS-PAGE analysis on 4-15% Criterion TX

gels (Bio-Rad), transferred to nitrocellulose membranes using semi-dry transfer apparatus and

Tans-Blot Turbo RTA Midi Nitrocellulose Transfer kit (Bio-Rad). The membranes were then

blocked with 3% milk in TBST, probed with primary antibody overnight at 4°C and then with the

corresponding secondary antibody- either HRP-conjugated or fluorescently labelled for 1-2 hr at

room temperature. They were then imaged on a Li-Cor imager or ImageQuant LAS 4000 (GE

Healthcare). anti-APOBEC3B (5210-87-13)[85] and anti-UNG[28] antibodies were kindly provided by

Reuben Harris and anti-GAPDH (sc-59540) was purchased from Santa Cruz Biotechnology. All

other primary antibodies including anti-EGFR (#4267), anti-phospho-EGFR (Y1068, #3777 or

#2236), anti-STAT3 (#9139), anti-phospho-STAT3 (Y705, #9145), anti-AKT (#2920), anti-

phospho-AKT (S473, #4060), anti-phospho-ERK (T202, Y204; #4370 or #9106), anti-ERK

(#9102), anti-RELA (#8242), anti-RELB (#4922), anti-Hsp90 (#4874), anti-TUBB (#2146) and

anti-histone H3 (#9715) were purchased from Cell Signaling Technology.

Enzymatic assays: APOBEC assays or Uracil Excision assays were performed by incubating

nuclear extracts made using REAP method [59] with either of the following DNA oligo substrates

(IDT): 5' – ATTATTATTATTCAAATGGATTTATTTATTTATTTATTTATTT-FAM-3' or 5'-

AGCAGTATTUGTTGTCACGA-FAM-3', respectively using established protocols[28,36]. Upon

completion of the reactions, they were heated at 95 degrees for 5 minutes after addition of TBE

Urea buffer (Novex) and immediately run on a 15% TBE-Urea gel (Bio-Rad). The gels were then

imaged using Cy2 filter on ImageQuant LAS 4000 (GE Healthcare) and quantified using ImageJ

and Microsoft Excel or GraphPad Prism 7.

Subcutaneous Tumour Xenografts and PDX Studies: All animal experiments were conducted

under UCSF IACUC-approved animal protocols. PC-9 tumour xenografts were generated by

injection of one million cells in a 50/50 mixture for matrigel and PBS into 6- to 8-wk-old female

NOD/SCID mice. Once the tumours grew to ∼200 mm^3, the mice were then treated with vehicle

or 5 mg/kg osimertinib once daily for 4 days and the tumours were harvested on day 4 and

subsequently analyzed by western blot analysis. For H1975 xenografts, 1 million cells were

injected into SCID mice and the indicated treatment were initiated (once daily, oral gavage) when

the tumours were about 100 mm^3. The tumour tissues were harvested on day 4 of treatment. PDX

was generated as indicated in a previous study[38]. Tumours were passaged in SCID mice and

treatment was initiated after the tumours were about 400 mm^3. Tumours were harvested after 2

days of treatment with 25 mg/kg erlotinib, administered once daily by oral gavage.

Mouse strains and tumour induction: The Cre-inducible *Rosa26::LSL-APOBEC3Bi* mice are

described[7]. The *TetO-EGFR^{L858R}; Rosa26^{LNL-tTA} (E)* and *CCSP-rtTA;TetO-*

EGFR^{L858R};Rosa26^{CreER(T2)} mice have been described[13,14,86,87]. Tumours were initiated in *E, EA3B,*

EP, and EPA3B mice by intratracheal infection with adenoviral vectors expressing Cre

recombinase as described[88]. Adenoviral-Cre (Ad-Cre-GFP) was from the University of Iowa Gene

Transfer Core. Tumours were initiated in *EA3Bi* mice using chow containing doxycycline (625

ppm) obtained from Harlan-Tekland. All animal regulated procedures were approved by the

Francis Crick Institute BRF Strategic Oversight Committee that incorporates the Animal Welfare

and Ethical Review Body and conformed with the UK Home Office guidelines and regulations

under the Animals (Scientific Procedures) Act 1986 including Amendment Regulations 2012. To

assess recombination efficiency of the LSL allele upstream of APOBEC3B, PCR primers

targeting the R26 site, the LSL cassette and the APOBEC3B transgene were used as described[7].

In vivo treatment with Erlotinib: Erlotinib was purchased from Selleckchem (Erlotinib Osi-744),

dissolved in 0.3% methylcellulose and administered intraperitoneally at 25 mg/kg, 5 days a week.

In vivo treatment with tamoxifen: Tamoxifen was administered by oral gavage 3 times in one

week with at a 2-4 day intervals (3 injections total). Mice received tamoxifen at 150 mg/kg

dissolved in sunflower oil.

Assessment of recombination efficiency: PCR was performed to assess recombination of the LSL

cassette upstream of the _A3B_ allele in six tumours harvested at progression. Five out of six (5/6)

of the tumours had a recombination efficiency above 90% and one tumour out of six was

unrecombined (Extended Fig. 2c). This rate of recombination aligns with the rate of recombination

observed by IHC staining at 3 months and at termination (Extended Fig. 2a) and suggests that a

lack of recombination of the LSL cassette upstream of the A3B transgene explains A3B negative

tumours.

MicroCT Imaging: Mice were anaesthetized with isoflurane/oxygen for no more than an hour

each. They were minimally restrained whilst anaesthetized during the actual imaging (usually 8-

10 minutes). After scanning mice were observed and if necessary, placed in cages in a recovery

chamber/rack until they regained consciousness and start to eat/drink. Tumour burden in each

animal was quantified by calculating the tumour volume of visible tumours using AnalyzeDirect.

Histological preparation and immunohistochemical staining: Tissues were fixed in 10%

formalin overnight and transferred to 70% ethanol until paraffin embedding. IHC was performed

using the following primary antibodies: EGFR^{L858R} mutant specific (Cell Signaling: 3197, 43B2),

APOBEC3B (5210-87-13)[85], Ki67 (Abcam: Ab15580), Caspase 3 (R&D (Bio-Techne): AF835),

p-Histone H2AX (Sigma-Aldrich, Ref. no. 05-636), Phospho-Histone H3 (Ser10) (Cell Signaling

Technology, 9706), CD4 (Abcam: ab183685, EPR19514), CD8 (Thermo Fisher Scientific, cod14-

0808-82, 4SM15), and UNG (NB600-1031, Novus Biologicals). Sections were developed with

DAB and counterstained with hematoxylin. The number of EGFR^{L858R}, APOBEC3B, Ki67,

Caspase 3, and gH2AX positive cells were quantified using QuPath.

P53 Immunohistochemistry (IHC) staining: Staining for p53 was performed on a Dako Autostainer Link 48 (Agilent, UK) as previously described[89]. Briefly, formalin-fixed paraffin embedded (FFPE) sections were dewaxed and subjected to heat induced epitope retrieval (HIER) on-board using a Dako PT module. Once loaded, sections were heated to 97⁰C for 20 minutes in high pH Target Retrieval Solution (Agilent, UK). Sections then underwent peroxidase blocking (Agilent, UK) before application of primary antibody (Leica, cat # NCL-L-p53-CM5p) for 40 minutes at a previously optimised dilution (1:750). Sections were then incubated with rabbit envision secondary antibody (Agilent, UK) for 30 minutes. Signal was detected with liquid DAB reagent (Agilent, UK). After detection, sections were counterstained with haematoxylin, coverslipped using DPX mountant (CellPath, UK), and allowed to dry overnight. Slides were then scanned at 20X magnification using an Aperio AT2 slide scanner (Leica).

Evaluation of Chromosome Missegregation Errors in H&E and/or pH3 Stained Samples:
Lung sections were evaluated for anaphases with chromosome missegregation events using a 100x objective light microscope. For *E* and *EA3B* mice at early and late timepoints, the percentage of missegregation errors was calculated and averaged across all mice using the harmonic mean. For *EA3B* mice the percent error was normalised to an A3B recombination efficiency of 82% based on observed recombination efficiency observed (Extended Fig. 4). For E and EA3Bi mice with subclonal A3B expression, normalisation for the recombination efficiency was not possible so the percentage of missegregation errors was calculated based on the number of errors verses normal anaphases observed.

Tumour processing Mouse: Tumour tissue was collected form -80° freezer and placed on dry ice. Tissue was placed on a petri dish and cut into pieces. RLT Buffer with β-Mercaptoethanol was dispensed into 15 ml reaction vessels. A small part of the tumour was added to the lysis buffer, and remaining parts were refrozen. TissueRuptor was used for disruption and homogenization of tissue. The tip of the disposable probe was placed into the vessel and the TissueRuptor was turned to speed 1 until the lysate was homogeneous (usually about 10 seconds). Lysate was added to a previously prepared QIAshredder tube and centrifuged at full

speed for 1 minute. The homogenised solution was then added to AllPrep DNA spin columns.

The Qiagen AllPrep DNA/RNA Mini Kit (80204).

Histopathological Examination Mouse: Four μm-thick, formalin-fixed, paraffin-embedded

(FFPE) sections from lung lobes were stained with haematoxylin & eosin (HE) and examined by

two board-certified Veterinary Pathologists (ASB & SLP). Sections were histopathologically

assessed and graded for the presence and type of proliferative epithelial lung lesions using the

INHAND guide for non-proliferative and proliferative lesions of the respiratory tract of the

mouse[90]. Histopathological assessment was performed blind to experimental grouping using a

conventional light microscope (Olympus BX43). Tissue sections were examined individually by

ASB & SLP and in case of discordance in diagnosis a consensus was reached using a double-head

microscope.

Proliferative lesions were diagnosed when the following histopathological characteristics were

observed involving the alveolar lining epithelium:

- Alveolar hyperplasia: Isolated plump pneumocytes which frequently involved locally extensive-

flat areas of lung parenchyma, mostly located subpleurally. Cytologically hyperplastic

pneumocytes lacked cellular atypia and had a single regular ovoid nucleus with homogeneous

chromatin. Cellular atypia was absent and mitotic figures were not observed.

- Bronchiolo-alveolar adenoma: A well-circumscribed expansile focus of neoplastic cells, ranging

from 100 μm to 500 μm in diameter. Neoplastic cells arranged in either a lepidic or arboriform

pattern. Cellular atypia was minimal and mitoses were absent.

- Well differentiated bronchiolo-alveolar adenocarcinoma: Similar histological features and size

as in adenomas but with increased cellular atypia and occasional mitotic figures.

- Moderately and poorly-differentiated bronchiolo-alveolar adenocarcinoma: A moderately well-

demarcated neoplastic focus, ranging from 100 μm to 3 mm or more in diameter. Poorly-

differentiated neoplasms normally exhibited densely packed sheets of neoplastic cells without

evidence of arboriform or trabecular growth. Frequent cellular and nuclear atypia and increased
mitotic activity.

Neoplastic foci where manually quantified in all lung lobe sections. The total area of neoplastic
infiltration was semi-quantitatively assessed and expressed as a percentage of the lung parenchyma
affected, avoiding areas of alveolar hyperplasia.

Whole exome sequencing – mouse data: WES was performed by the Advanced Sequencing
Facility at The Francis Crick Institute using the Twist BioScience Human Core Exon Kit for library
preparation and Agilent SureSelectXT Mouse All Exon, 16, Kit for library preparation
respectively. Sequencing was performed on HiSeq 4000 platforms.

RNA sequencing – mouse data: RNA-seq was performed by the Advanced Sequencing Facility
at the Francis Crick Institute using the KAPA mRNA HyperPrep Kit (KK8581 – 96 Libraries)
and KAPA Dual-Indexed Adapters (Roche-KK8720). Sequencing was performed on HiSeq 4000
platforms. The processed fastq files were mapped to mm10 reference genome using STAR
(version 2.4) algorithm and transcript expressions were quantified using RSEM (version 1.2.29)
algorithm with the default parameters. The read counts were used for downstream analysis.

Alignment – mouse: All samples were de-multiplexed and the resultant FASTQ files aligned to
the mm10 mouse genome, using bwa mem (bwa v0.7.15). De-duplication was performed using
Picard (v2.1.1) (http://broadinstitute.github.io/picard). Quality control metrics were collated using
FASTQC (v0.10.1 - http://www.bioinformatics.babraham.ac.uk/projects/fastqc/), Picard and
GATK (v3.6). SAMtools (v1.3.1) was used to generate mpileup files from the resultant BAM files.
Thresholds for base phred score and mapping quality were set at 20. A threshold of 50 was set for
the coefficient of downgrading mapping quality, with the argument for base alignment quality
calculation being deactivated. The median depth of coverage for all samples was 92x (range: 58-
169x).

Variant detection & annotation – mouse: Variant calling was performed using
VarScan2(v2.4.1), MuTect(v1.1.7) and Scalpel(v0.5.4)[91-93].

The following argument settings were used for variant detection using VarScan2:

--min-coverage 8 --min-coverage-normal 10 --min-coverage-tumor 6 --min-var-freq 0.01 --min-

freq-for-hom 0.75 --normal-purity 1 --p-value 0.99 --somatic-p-value 0.05 --tumor-purity 0.5 --

strand-filter 0

For MuTect, only "PASS" variants were used for further analyses. With the exception of allowing

variants to be detected down to a VAF of 0.001, default settings were used for Scalpel

insertion/deletion detection.

To minimise false positives, additional filtering was performed. For single-nucleotide variants

(SNVs) or dinucleotides detected by VarScan2, a minimum tumor sequencing depth of 30, variant

allele frequency (VAF) of 5%, variant read count of 5, and a somatic p-value <0.01 were required

to pass a variant. For variants detected by VarScan2 between 2 and 5% VAF, the mutation also

needs to be detected by MuTect.

As for insertions/deletions (INDELs), variants need to be passed by both Scalpel ("PASS") and

VarScan2 (somatic p value <0.001). A minimum depth of 50x, 10 alt reads and VAF of 2% was

required.

For all SNVs, INDELs and dinucleotides, any variant also detected in the paired germline sample

with more than 5 alternative reads or a VAF greater than 1% was filtered out.

The detected variants were annotated using Annovar[94].

Functional annotation of SNVs – mouse: Murine gene mutation callings from whole exome

sequencing were parsed with some modification including genomic coordinates (removing 'chr'

before chromosomal numbers, only 'SNV' was selected). The modified files were fed into

PROVEAN (Protein Variation Effect Analyzer)[95-97] software tool

(http://provean.jcvi.org/index.php) to predict whether an amino acid substitution has an impact

on the biological function of a protein (SIFT score). The predict files were merged with original

files at gene level annotation using R program.

Human *EGFR* transgene amplicon sequencing of mouse: FASTQ files were aligned to hg19

obtained from the GATK bundle (v2.8) using bwa mem (bwa v0.7.15)[98,99]. Analyses were

performed using R (version 3.3.1) and deepSNV (v1.18.1)[100]. The median depth of coverage of

sequenced EGFR exons (19,20,21) was 5290x (range: 2238-8040). Variants associated with

resistance to EGFR tyrosine kinase inhibitors were queried using deepSNV's bam2R function,

with the arguments q=20 & s=2. The variants explored include: T790M, D761Y, L861Q, G796X,

G797X, L792X, L747S. L858R was identified in every sequenced sample.

Generation of EGFR^{L858R} mutant mouse tumour cell lines: To generate mouse tumour cell

lines, a tumour was micro-dissected from mouse lungs. A portion of the tumour was then cut from

dissected (1/3 to 1/2 of the original tumour depending on size) and placed into a 15 ml tube and

cut into small pieces with scissors. Tumours chunks were then digested for 30 minutes in an oven

at 37 degrees while rotating at full speed in digestion media (1400 ul HBSS-free (w/o Ca2+), 200

ul Collagenase IV, and 40 U/ml DNase). Next tumour cells were pelleted down in a centrifuge

(1100 rpm for 4 minutes) and resuspended in Iscove's Modified Dulbecco's Medium (IMDM)

supplemented with 1% penicillin-streptomycin solution (10,000 Units/ml), L-Glutamine (200

mM) and 10% FBS. This cell suspension was then plated in a 10 cm plate and passaged over a

period of 1 to 3 months until consistent growth was observed.

Generation of tyrosine kinase inhibitor (TKI) resistant mouse tumour cell lines: TKI naïve

cell lines were cultured in increasing levels of the TKIs Erlotinib or Osimertinib until growing

with minimal cell death in 1500 nM TKI therapy, which was considered fully resistant.

Cell line Whole Genome Mutational Signature Analysis: Sequences were aligned to the human

genome (hg38) using the Burrows-Wheeler Aligner (version 0.7.17). PCR duplicates were

removed using Picard (version 2.18.16). Reads were locally realigned around InDels using

GATK3 (version 3.6.0) tools RealignerTargetCreator to create intervals, followed by

IndelRealigner on the aligned bam files. MuTect2 from GATK3 (version 3.6.0) was used in

tumour/normal mode to call mutations in test vs control cell lines. Single nucleotide variants

(SNVs) that passed the internal GATK3 filter with read depths over 30 reads at called positions,

at least 4 reads in the alternate mutation call and an allele frequency greater than 0.05 were used

for downstream analysis. Figures were plotted using the deconstructSigs R package[101].

DNA and RNA isolation from cell line models for sequencing: DNA or RNA were extracted
using from frozen cell pellets using Qiagen's DNeasy Blood and tissue kit or Qiagen's RNeasy
mini kit, respectively, as per the manufacturer's instructions. The isolated DNA or RNA was
quantified and qualitatively assessed using Qubit Fluorometer (Thermo Fisher) and a Bioanalyzer
(Agilent) as per the manufacturer's instructions. The DNA or RNA were then sent to BGI for
whole genome sequencing (30X) or Novogene for mRNA or whole exome sequencing.
988

Cell cycle analysis: Cell cycle analysis was performed by propidium iodide (PI) staining. Briefly,
PC9 cells were treated for 24h with DMSO, 2 µM osimertinib or 1 µM palbociblib, and then fixed
in ice cold 70% ethanol and stained with a 50 ug/mL PI (Millipore Sigma, P4864) + 0.1% Triton
X-100 (Millipore Sigma, X100) solution. PI fluorescence was then measured on a flow cytometer
(BD FACSAria II).

Human Subjects: All patients gave informed consent for collection of clinical correlates, tissue
collection, research testing under Institutional Review Board (IRB)-approved protocols (CC13-
6512 and CC17-658, NCT03433469). Patient demographics are listed in Supplemental Tables.
Patient studies were conducted according to the Declaration of Helsinki, the Belmont Report, and
the U.S. Common Rule."

Studies with specimens from lung cancer patients: Frozen or formalin-fixed paraffin embedded
(FFPE) tissues from lung cancer patients for DNA or RNA Sequencing (Bulk and Single Cell)
studies were, processed and sequenced as described previously[47,66]. We obtained tumor tissues
from advanced stage NSCLC patients prior to initiation of systemic targeted therapy (classified as
treatment naïve, TN), while on targeted therapy while the tumor was regressing or at stable state
as evaluated by standard clinical imaging (classified as residual disease, RD) and upon clear
progressive disease (acquired resistance) as determined by standard clinical imaging (classified as
progressive disease, PD). The classification of response was based on RECIST (Response
Evaluation Criteria in Solid Tumors) criteria. Some of these biopsies were subjected to whole
exome sequencing at the QB3-Berkley Genomics for which library preparation was performed
using IDT's xGen exome panel. For additional specimens, tumour DNA from formalin-fixed
paraffin embedded (FFPE) tissues and matched non-tumour from blood aliquots or stored buffy
coats were collected as part of University of California, San Francisco's (UCSF) biospecimen

resource program (BIOS) in accordance with UCSF's institutional review board approved

protocol. DNA from blood aliquots were isolated at the BIOS. Other non-tumour samples and

FFPE tumour tissues were sent for extraction, assessment of quality and quantity to Novogene and

those meeting the required samples standards were subjected to whole exome sequencing at

Novogene's sequencing facility.

1018

Mutation analysis:

Paired-end reads were aligned to the hg19 human genome using the Picard pipeline

(https://gatk.broadinstitute.org/). A modified version of the Broad Institute Getz Lab CGA WES

Characterization pipeline (https://docs-google-com.ezp-

prod1.hul.harvard.edu/document/d/1VO2kX_fgfUd0x3mBS9NjLUWGZu794WbTepBel3cBg08

) was used to call, filter and annotate somatic mutations. Specifically, single-nucleotide variants

(SNVs) and other substitutions were called with MuTect (v1.1.6)[92]. Mutations were annotated

using Oncotator[102]. MuTect mutation calls were filtered for 8-OxoG artifacts, and artifacts

introduced through the formalin fixation process (FFPE) of tumour tissues [67]. Indels were called

with Strelka (v1.0.11). MuTect calls and Strelka calls were further filtered through a panel of

normal samples (PoN) to remove artifacts generated by rare error modes and miscalled germline

alterations[92]. To pass quality control, samples were required to have <5% cross-sample

contamination as assessed with ContEst[92]; mean target coverage of at least 25x in the tumour

sample and 20x in the corresponding normal as assessed using GATK3.7 DepthOfCoverage; and

a percentage of tumour-in-normal of < 30% as determined by deTiN[103]. This pipeline was modified

for analysis of cell lines rather than tumour-normal pairs as follows: indels were called through

MuTect2 alone rather than Strelka; deTiN was not performed; and a common variant filter was

applied to exclude variants present in The Exome Aggregation Consortium (ExAC) if at least 10

alleles containing the variant were present across any subpopulation, unless they appeared in a list

of known somatic sites[104,105].

1039

Mutational signature analysis

Active mutational processes[106] were determined using the *deconstructSigs* R package[64], with a

signature contribution cutoff of 6%. This cutoff was chosen because it was the minimum

contribution value required to obtain a false-positive rate of 0.1% and false-negative rate of 1.4%

per the authors' in-silico analysis, and is the recommended cutoff[101]. Samples with < 10 mutations

were excluded from analysis due to poor signature discrimination with so few mutations and a

sample with less than 15 days of exposure to TKI therapy was excluded because it is too short a

time to accumulate detectable mutations due to therapy. For TRACERx data analysis data

processing were performed in the R statistical environment version > = 3.3.1.

1049

1050   **RNA-Seq analyses**: PDX-tissue and mouse tumour cell line RNA extractions were carried using

1051   RNeasy micro kit (Qiagen). RNA-Seq was performed on PDX-tissue using replicate samples on

1052   the Illumina HiSeq4000, paired-end 100-bp reads at the Center for Advanced Technology (UCSF).

1053   For the differential gene expression analysis, DESeq program was used to compare controls to

1054   erlotinib samples as previously described[107].

1055

RNAseq samples from patients and cell lines were sequenced by Novogene

(https://en.novogene.com/) with paired-end sequencing (150bp in length). There were ~20 million

reads for each sample. The processed fastq files were mapped to hg19 reference genome using

STAR (version 2.4) algorithm and transcript expressions were quantified using RSEM (version

1.2.29) algorithm. The default parameters in the algorithms were used. The normalized transcript

reads (TPM) were used for downstream analysis. Gene set enrichment analysis was performed

using GSEA software[108].

1063

For single cell RNA Seq analyses the data from a previously published study (all cancer cells from

advanced lung cancer patients) was used and analyzed in a similar manner[47]. All cells used are

identified as malignant by marker expression and CNV inference and originated in from various

biopsy sites (adrenal, liver, lymph node, lung, pleura/pleural fluid). Nonparametric, pairwise

comparisons (Wilcoxon Rank Sum Test) was used to determine the statistical significance of the

pairwise comparisons of different timepoints for their average scaled expression.

1070

1071   **Statistical Analysis**

1072   One-way or two-way ANOVA test with Holm's Sidak correction for multiple comparisons (>2

1073   groups) or two-tailed t-test (2 groups) were used to determine the statistical significance of the

1074   differences between groups for RT-qPCR, growth and enzymatic assays and Bulk RNA Seq

analysis. Normality of immunohistochemical and microCT data was determined using multiple testing methods (Anderson-Darling test, D'Agostino & Pearson test, Shapiro-Wilk test, and Kolmogorov-Smirnov test). A two-sided t-test or two-sided Mann-Whitney test was used for immunohistochemical and microCT data depending on the normality tests to determine the statistical significance of the differences between groups. Analysis for these assays was done using Graphpad Prism 7.

Data availability

The Whole Exome Sequencing (WES) data and RNAseq data (from the TRACERx study) generated, used or analysed during this study are available through the Cancer Research UK and University College London Cancer Trials Centre (ctc.tracerx@ucl.ac.uk) for academic non-commercial research purposes only, and subject to review of a project proposal that will be evaluated by a TRACERx data access committee, entering into an appropriate data access agreement and subject to any applicable ethical approvals. For the single cell RNA-Seq analyses shown in Ext. Fig. 15a-d the data from a previously published study (all advanced lung cancer cell data) were used and analyzed in a similar manner[47]. This data is available as an NCBI Bioproject # PRJNA591860. The RNA-Seq data for Ext. Fig. 14a was from a previously published study[38]. These data are available at NCBI GEO under accession number GSE65420. Related RNA-Seq and WES sequencing data will be deposited into NCBI GEO and SRA database.

References:

1   Cheng, A. Z. *et al.* APOBECs and Herpesviruses. *Viruses* **13**, doi:10.3390/v13030390 (2021).

2   Harris, R. S. & Liddament, M. T. Retroviral restriction by APOBEC proteins. *Nat Rev Immunol* **4**, 868-877, doi:10.1038/nri1489 (2004).

3   Swanton, C., McGranahan, N., Starrett, G. J. & Harris, R. S. APOBEC Enzymes: Mutagenic Fuel for Cancer Evolution and Heterogeneity. *Cancer discovery* **5**, 704-712, doi:10.1158/2159-8290.CD-15-0344 (2015).

4   Venkatesan, S. *et al.* Induction of APOBEC3 Exacerbates DNA Replication Stress and
Chromosomal Instability in Early Breast and Lung Cancer Evolution. *Cancer Discov* **11**,
2456-2473, doi:10.1158/2159-8290.CD-20-0725 (2021).
5   Isozaki, H. *et al.* APOBEC3A drives acquired resistance to targeted therapies in non-
small cell lung cancer. *biorxiv.org*, doi:10.1101/2021.01.20.426852 (2021).
6   Jarvis, M. C. *et al.* Mutational impact of APOBEC3B and APOBEC3A in a human cell
line. *biorxiv.org*, doi:10.1101/2022.04.26.489523 (2022).
7   Boumelha, J. *et al.* An immunogenic model of KRAS-mutant lung cancer for study of
targeted therapy and immunotherapy combinations. *biorxiv.org*,
doi:10.1101/2020.12.22.423126 (2020).
8   Russo, M. *et al.* Adaptive mutability of colorectal cancers in response to targeted
therapies. *Science* **366**, 1473-1480, doi:10.1126/science.aav4474 (2019).
9   de Bruin, E. C. *et al.* Spatial and temporal diversity in genomic instability processes
defines lung cancer evolution. *Science* **346**, 251-256, doi:10.1126/science.1253462
(2014).
10   Chen, J. *et al.* Genomic landscape of lung adenocarcinoma in East Asians. *Nature*
Genetics **52**, 177-186, doi:10.1038/s41588-019-0569-6 (2020).
11   Jamal-Hanjani, M. *et al.* Tracking the Evolution of Non-Small-Cell Lung Cancer. *The*
New England journal of medicine, doi:10.1056/NEJMoa1616288 (2017).
12   Henderson, S., Chakravarthy, A., Su, X., Boshoff, C. & Fenton, T. R. APOBEC-mediated
cytosine deamination links PIK3CA helical domain mutations to human papillomavirus-
driven tumor development. *CellReports* **7**, 1833-1841, doi:10.1016/j.celrep.2014.05.012
(2014).
13   Politi, K. *et al.* Lung adenocarcinomas induced in mice by mutant EGF receptors foundin
human lung cancers respondto a tyrosine kinase inhibitor orto down-regulation of the
receptors. *Genes & Development* **20**, 1496-1510, doi:10.1101/gad.1417406 (2006).
14   Politi, K., Fan, P.-D., Shen, R., Zakowski, M. & Varmus, H. Erlotinib resistance in
mouse models of epidermal growth factor receptor-induced lung adenocarcinoma.
Disease Models & Mechanisms **3**, 111-119, doi:10.1242/dmm.003681 (2010).

15   Starrett, J. H. *et al.* Drug Sensitivity and Allele Specificity of First-Line Osimertinib

Resistance EGFR Mutations. *Cancer Research* **80**, 2017-2030, doi:10.1158/0008-

5472.CAN-19-3819 (2020).

16   de Bruin, E. C., McGranahan, N. & Swanton, C. Analysis of intratumor heterogeneity

unravels lung cancer evolution. *Molecular & Cellular Oncology* **2**, e985549,

doi:10.4161/23723556.2014.985549 (2015).

17   Westcott, P. M. K. *et al.* The mutational landscapes of genetic and chemical models of

Kras-driven lung cancer. *Nature Publishing Group* **517**, 489-492,

doi:10.1038/nature13898 (2015).

18   McFadden, D. G. *et al.* Mutational landscape of EGFR-, MYC-, and Kras-driven

genetically engineered mouse models of lung adenocarcinoma. **113**, E6409-E6417,

doi:10.1073/pnas.1613601113 (2016).

19   Chung, W.-J. *et al.* Kras mutant genetically engineered mouse models of human cancers

are genomically heterogeneous. *Proceedings of the National Academy of Sciences of the*

United States of America, 201708391, doi:10.1073/pnas.1708391114 (2017).

20   Jónsson, S. R. *et al.* Evolutionarily conserved and non-conserved retrovirus restriction

activities of artiodactyl APOBEC3F proteins. *Nucleic acids research* **34**, 5683-5694,

doi:10.1093/nar/gkl721 (2006).

21   MacMillan, A. L., Kohli, R. M. & Ross, S. R. APOBEC3 inhibition of mouse mammary

tumor virus infection: the role of cytidine deamination versus inhibition of reverse

transcription. *Journal of Virology* **87**, 4808-4817, doi:10.1128/JVI.00112-13 (2013).

22   Ji, H. *et al.* The impact of human EGFR kinase domain mutations on lung tumorigenesis

and in vivo sensitivity to EGFR-targeted therapies. *Cancer cell* **9**, 485-495,

doi:10.1016/j.ccr.2006.04.022 (2006).

23   DiMarco, A. V. *et al.* APOBEC mutagenesis inhibits breast cancer growth through

induction of a T cell mediated antitumor immune response. *biorxiv.org*,

doi:10.1101/2021.02.13.431068 (2021).

24   Facciabene, A., Motz, G. T. & Coukos, G. T-regulatory cells: key players in tumor

immune escape and angiogenesis. *Cancer Res* **72**, 2162-2171, doi:10.1158/0008-

5472.CAN-11-3687 (2012).

25 Carter, S. L., Eklund, A. C., Kohane, I. S., Harris, L. N. & Szallasi, Z. A signature of
chromosomal instability inferred from gene expression profiles predicts clinical outcome
in multiple human cancers. *Nat Genet* **38**, 1043-1048, doi:10.1038/ng1861 (2006).

26 Sansregret, L. *et al.* APC/C Dysfunction Limits Excessive Cancer Chromosomal
Instability. *Cancer Discov* **7**, 218-233, doi:10.1158/2159-8290.CD-16-0645 (2017).

27 Seibler, J. Rapid generation of inducible mouse mutants. *Nucleic acids research* **31**, 12e-
12, doi:10.1093/nar/gng012 (2003).

28 Serebrenik, A. A. *et al.* The deaminase APOBEC3B triggers the death of cells lacking
uracil DNA glycosylase. *Proceedings of the National Academy of Sciences of the United*
States of America **116**, 22158-22163, doi:10.1073/pnas.1904024116 (2019).

29 Haderk, F. *et al.* A focal adhesion kinase-YAP signaling axis drives drug tolerant
persister cells and residual disease in lung cancer. *bioRxiv*, 2021.2010.2023.465573,
doi:10.1101/2021.10.23.465573 (2021).

30 Finn, K. J., Martin, S. E. & Settleman, J. A Single-Step, High-Dose Selection Scheme
Reveals Distinct Mechanisms of Acquired Resistance to Oncogenic Kinase Inhibition in
Cancer Cells. *Cancer Res* **80**, 79-90, doi:10.1158/0008-5472.CAN-19-0729 (2020).

31 Ramirez, M. *et al.* Diverse drug-resistance mechanisms can emerge from drug-tolerant
cancer persister cells. *Nature Communications* **7**, ncomms10690,
doi:doi:10.1038/ncomms10690 (2016).

32 Hashida, S. *et al.* Acquisition of cancer stem cell-like properties in non-small cell lung
cancer with acquired resistance to afatinib. *Cancer Sci* **106**, 1377-1384,
doi:10.1111/cas.12749 (2015).

33 Shah, K. N. *et al.* Aurora kinase A drives the evolution of resistance to third-generation
EGFR inhibitors in lung cancer. *Nat Med* **25**, 111-118, doi:10.1038/s41591-018-0264-7
(2019).

34 Shien, K. *et al.* Acquired resistance to EGFR inhibitors is associated with a manifestation
of stem cell-like properties in cancer cells. *Cancer Res* **73**, 3051-3061, doi:10.1158/0008-
5472.CAN-12-4136 (2013).

35 Poulikakos, P. I. *et al.* RAF inhibitor resistance is mediated by dimerization of aberrantly
spliced BRAF(V600E). *Nature* **480**, 387-390, doi:10.1038/nature10662 (2011).

36   Vieira, V. C. *et al.* Human papillomavirus E6 triggers upregulation of the antiviral and

cancer genomic DNA deaminase APOBEC3B. *mBio* **5**, doi:10.1128/mBio.02234-14

(2014).

37   Bollard, J. *et al.* Palbociclib (PD-0332991), a selective CDK4/6 inhibitor, restricts tumour

growth in preclinical models of hepatocellular carcinoma. *Gut* **66**, 1286-1296,

doi:10.1136/gutjnl-2016-312268 (2017).

38   Blakely, C. M. *et al.* NF-κB-activating complex engaged in response to EGFR oncogene

inhibition drives tumor cell survival and residual disease in lung cancer. *CellReports* **11**,

98-110, doi:10.1016/j.celrep.2015.03.012 (2015).

39   Law, E. K. *et al.* The DNA cytosine deaminase APOBEC3B promotes tamoxifen

resistance in ER-positive breast cancer. *Science Advances* **2**, e1601737-e1601737,

doi:10.1126/sciadv.1601737 (2016).

40   Leonard, B. *et al.* The PKC/NF-κB signaling pathway induces APOBEC3B expression in

multiple human cancers. *Cancer Research* **75**, 4538-4547, doi:10.1158/0008-5472.CAN-

15-2171-T (2015).

41   Maruyama, W. *et al.* Classical NF-κB pathway is responsible for APOBEC3B expression

in cancer cells. *Biochemical and biophysical research communications* **478**, 1466-1471,

doi:10.1016/j.bbrc.2016.08.148 (2016).

42   Nelson, D. E. *et al.* Oscillations in NF-kappaB signaling control the dynamics of gene

expression. *Science* **306**, 704-708, doi:10.1126/science.1099962 (2004).

43   Tay, S. *et al.* Single-cell NF-kappaB dynamics reveal digital activation and analogue

information processing. *Nature* **466**, 267-271, doi:10.1038/nature09145 (2010).

44   Cheng, Q. J. *et al.* NF-kappaB dynamics determine the stimulus specificity of epigenomic

reprogramming in macrophages. *Science* **372**, 1349-1353, doi:10.1126/science.abc0269

(2021).

45   Zambrano, S., Bianchi, M. E. & Agresti, A. High-throughput analysis of NF-kappaB

dynamics in single cells reveals basal nuclear localization of NF-kappaB and spontaneous

activation of oscillations. *PLoS One* **9**, e90104, doi:10.1371/journal.pone.0090104

(2014).

46   Inoue, K. *et al.* Oscillation dynamics underlie functional switching of NF-kappaB for B-

cell activation. *NPJ Syst Biol Appl* **2**, 16024, doi:10.1038/npjsba.2016.24 (2016).

47   Maynard, A. *et al.* Therapy-Induced Evolution of Human Lung Cancer Revealed by
Single-Cell RNA Sequencing. *Cell* **182**, 1232-1251.e1222,
doi:10.1016/j.cell.2020.07.017 (2020).

48   Gilmore, T. D. Introduction to NF-kappaB: players, pathways, perspectives. *Oncogene*
25, 6680-6684, doi:10.1038/sj.onc.1209954 (2006).

49   Farré, D. *et al.* Identification of patterns in biological sequences at the ALGGEN server:
PROMO and MALGEN. *Nucleic acids research* **31**, 3651-3653, doi:10.1093/nar/gkg605
(2003).

50   Hollenhorst, P. C. RAS/ERK pathway transcriptional regulation through ETS/AP-1
binding sites. *Small GTPases* **3**, 154-158, doi:10.4161/sgtp.19630 (2012).

51   Jia, P. *et al.* Next-generation sequencing of paired tyrosine kinase inhibitor-sensitive and
-resistant EGFR mutant lung cancer cell lines identifies spectrum of DNA changes
associated with drug resistance. *Genome Research* **23**, 1434-1445,
doi:10.1101/gr.152322.112 (2013).

52   Petljak, M. *et al.* Characterizing Mutational Signatures in Human Cancer Cell Lines
Reveals Episodic APOBEC Mutagenesis. *Cell* **176**, 1282-1294 e1220,
doi:10.1016/j.cell.2019.02.012 (2019).

53   Sun, H. T., Cheng, S. X., Tu, Y., Li, X. H. & Zhang, S. FoxQ1 promotes glioma cells
proliferation and migration by regulating NRXN3 expression. *PLoS One* **8**, e55693,
doi:10.1371/journal.pone.0055693 (2013).

54   Kusinska, R. *et al.* Influence of genomic variation in FTO at 16q12.2, MC4R at 18q22
and NRXN3 at 14q31 genes on breast cancer risk. *Mol Biol Rep* **39**, 2915-2919,
doi:10.1007/s11033-011-1053-2 (2012).

55   Veeriah, S. *et al.* The tyrosine phosphatase PTPRD is a tumor suppressor that is
frequently inactivated and mutated in glioblastoma and other human cancers. *Proc Natl*
Acad Sci U S A **106**, 9435-9440, doi:10.1073/pnas.0900571106 (2009).

56   Ortiz, B. *et al.* Loss of the tyrosine phosphatase PTPRD leads to aberrant STAT3
activation and promotes gliomagenesis. *Proc Natl Acad Sci U S A* **111**, 8149-8154,
doi:10.1073/pnas.1401952111 (2014).

57   Morris, L. G. *et al.* Genomic dissection of the epidermal growth factor receptor
(EGFR)/PI3K pathway reveals frequent deletion of the EGFR phosphatase PTPRS in

1256  head and neck cancers. *Proc Natl Acad Sci U S A* **108**, 19024-19029,
1257  doi:10.1073/pnas.1111963108 (2011).

1258 58 Nikolaienko, R. M., Agyekum, B. & Bouyain, S. Receptor protein tyrosine phosphatases
1259  and cancer: new insights from structural biology. *Cell Adh Migr* **6**, 356-364,
1260  doi:10.4161/cam.21242 (2012).

1261 59 Davis, T. B. *et al.* PTPRS Regulates Colorectal Cancer RAS Pathway Activity by
1262  Inactivating Erk and Preventing Its Nuclear Translocation. *Sci Rep* **8**, 9296,
1263  doi:10.1038/s41598-018-27584-x (2018).

1264 60 Roper, N. *et al.* Clonal Evolution and Heterogeneity of Osimertinib Acquired Resistance
1265  Mechanisms in EGFR Mutant Lung Cancer. *Cell Rep Med* **1**,
1266  doi:10.1016/j.xcrm.2020.100007 (2020).

1267 61 Samuels, Y. *et al.* Mutant PIK3CA promotes cell growth and invasion of human cancer
1268  cells. *Cancer cell* **7**, 561-573, doi:10.1016/j.ccr.2005.05.014 (2005).

1269 62 Kim, S. & Jeong, S. Mutation Hotspots in the beta-Catenin Gene: Lessons from the
1270  Human Cancer Genome Databases. *Mol Cells* **42**, 8-16, doi:10.14348/molcells.2018.0436
1271  (2019).

1272 63 Ruvolo, P. P. The broken "Off" switch in cancer signaling: PP2A as a regulator of
1273  tumorigenesis, drug resistance, and immune surveillance. *BBA Clin* **6**, 87-99,
1274  doi:10.1016/j.bbacli.2016.08.002 (2016).

1275 64 Silverstein, A. M., Barrow, C. A., Davis, A. J. & Mumby, M. C. Actions of PP2A on the
1276  MAP kinase pathway and apoptosis are mediated by distinct regulatory subunits. *Proc*
1277  *Natl Acad Sci U S A* **99**, 4221-4226, doi:10.1073/pnas.072071699 (2002).

1278 65 Gainor, J. F. *et al.* Molecular Mechanisms of Resistance to First- and Second-Generation
1279  ALK Inhibitors in ALK-Rearranged Lung Cancer. *Cancer discovery* **6**, 1118-1133,
1280  doi:10.1158/2159-8290.CD-16-0596 (2016).

1281 66 Blakely, C. M. *et al.* Evolution and clinical impact of co-occurring genetic alterations in
1282  advanced-stage EGFR-mutant lung cancers. *Nature Genetics* **49**, 1693-1704,
1283  doi:10.1038/ng.3990 (2017).

1284 67 Shen, S. *et al.* Upregulation of miR-136 in human non-small cell lung cancer cells
1285  promotes Erk1/2 activation by targeting PPP2R2A. *Tumour biology : the journal of the*

International Society for Oncodevelopmental Biology and Medicine **35**, 631-640,

doi:10.1007/s13277-013-1087-2 (2014).

68	Engelman, J. A. *et al.* Effective use of PI3K and MEK inhibitors to treat mutant Kras

G12D and PIK3CA H1047R murine lung cancers. *Nature Medicine* **14**, 1351-1356,

doi:10.1038/nm.1890 (2008).

69	Ercan, D. *et al.* Reactivation of ERK signaling causes resistance to EGFR kinase

inhibitors. *Cancer discovery* **2**, 934-947, doi:10.1158/2159-8290.CD-12-0103 (2012).

70	Hrustanovic, G. *et al.* RAS-MAPK dependence underlies a rational polytherapy strategy

in EML4-ALK-positive lung cancer. *Nature Medicine* **21**, 1038-1047,

doi:10.1038/nm.3930 (2015).

71	Papadakis, A. I. *et al.* SMARCE1 suppresses EGFR expression and controls responses to

MET and ALK inhibitors in lung cancer. *Cell research* **25**, 445-458,

doi:10.1038/cr.2015.16 (2015).

72	Yu, H. A. *et al.* Analysis of tumor specimens at the time of acquired resistance to EGFR-

TKI therapy in 155 patients with EGFR-mutant lung cancers. *Clin Cancer Res* **19**, 2240-

2247, doi:10.1158/1078-0432.CCR-12-2246 (2013).

73	Sequist, L. V. *et al.* Genotypic and histological evolution of lung cancers acquiring

resistance to EGFR inhibitors. *Sci Transl Med* **3**, 75ra26,

doi:10.1126/scitranslmed.3002003 (2011).

74	Nik-Zainal, S. *et al.* Mutational processes molding the genomes of 21 breast cancers. *Cell*

149, 979-993, doi:10.1016/j.cell.2012.04.024 (2012).

75	Ribas, A. Adaptive Immune Resistance: How Cancer Protects from Immune Attack.

Cancer Discov **5**, 915-919, doi:10.1158/2159-8290.CD-15-0563 (2015).

76	Sieuwerts, A. M. *et al.* Elevated APOBEC3B correlates with poor outcomes for estrogen-

receptor-positive breast cancers. *Hormones & cancer* **5**, 405-413,

doi:10.1007/s12672-014-0196-8 (2014).

77	Leshchiner, I. *et al.* Comprehensive analysis of tumour initiation, spatial and temporal

progression under multiple lines of treatment. *biorxiv.org*, doi:10.1101/508127.

78	Lee, J.-K. *et al.* Clonal History and Genetic Predictors of Transformation Into Small-Cell

Carcinomas From Lung Adenocarcinomas. *Journal of Clinical Oncology*,

JCO.2016.2071.2909, doi:10.1200/JCO.2016.71.9096 (2017).

79   Ma, W. *et al.* APOBEC3B promotes hepatocarcinogenesis and metastasis through novel

deaminase-independent activity. *Mol Carcinog* **58**, 643-653, doi:10.1002/mc.22956

(2019).

80   Xie, S., Cooley, A., Armendariz, D., Zhou, P. & Hon, G. C. Frequent sgRNA-barcode

recombination in single-cell perturbation assays. *PLoS ONE* **13**, e0198635,

doi:10.1371/journal.pone.0198635 (2018).

81   Sanjana, N. E., Shalem, O. & Zhang, F. Improved vectors and genome-wide libraries for

CRISPR screening. *Nature Methods* **11**, 783-784, doi:10.1038/nmeth.3047 (2014).

82   Barger, C. J., Branick, C., Chee, L. & Karpf, A. R. Pan-Cancer Analyses Reveal

Genomic Features of FOXM1 Overexpression in Cancer. *Cancers* **11**,

doi:10.3390/cancers11020251 (2019).

83   Burns, M. B. *et al.* APOBEC3B is an enzymatic source of mutation in breast cancer.

494, 366-370, doi:10.1038/nature11881 (2013).

84   Suzuki, K., Bose, P., Leong-Quong, R. Y., Fujita, D. J. & Riabowol, K. REAP: A two

minute cell fractionation method. *BMC research notes* **3**, 294, doi:10.1186/1756-0500-3-

294 (2010).

85   Brown, W. L. *et al.* A Rabbit Monoclonal Antibody against the Antiviral and Cancer

Genomic DNA Mutating Enzyme APOBEC3B. *Antibodies (Basel, Switzerland)* **8**,

doi:10.3390/antib8030047 (2019).

86   Murillo, M. M. *et al.* Disruption of the Interaction of RAS with PI 3-Kinase Induces

Regression of EGFR-Mutant-Driven Lung Cancer. *CellReports* **25**, 3545-3553.e3542,

doi:10.1016/j.celrep.2018.12.003 (2018).

87   Tichelaar, J. W., Lu, W. & Whitsett, J. A. Conditional expression of fibroblast growth

factor-7 in the developing and mature lung. *The Journal of biological chemistry* **275**,

11858-11864, doi:10.1074/jbc.275.16.11858 (2000).

88   Dupage, M., Dooley, A. L. & Jacks, T. Conditional mouse lung cancer models using

adenoviral or lentiviral delivery of Cre recombinase. *Nature Protocols* **4**, 1064-1072,

doi:10.1038/nprot.2009.95 (2009).

89   Humpton, T. J. *et al.* A noninvasive iRFP713 p53 reporter reveals dynamic p53 activity

in response to irradiation and liver regeneration in vivo. *Sci Signal* **15**, eabd9099,

doi:10.1126/scisignal.abd9099 (2022).

90   Renne, R. *et al.* Proliferative and nonproliferative lesions of the rat and mouse respiratory
tract. *Toxicol Pathol* **37**, 5S-73S, doi:10.1177/0192623309353423 (2009).
91   Koboldt, D. C. *et al.* VarScan 2: somatic mutation and copy number alteration discovery
in cancer by exome sequencing. *Genome Res* **22**, 568-576, doi:10.1101/gr.129684.111
(2012).
92   Cibulskis, K. *et al.* Sensitive detection of somatic point mutations in impure and
heterogeneous cancer samples. *Nature biotechnology* **31**, 213-219, doi:10.1038/nbt.2514
(2013).
93   Fang, H. *et al.* Indel variant analysis of short-read sequencing data with Scalpel. *Nat*
Protoc **11**, 2529-2548, doi:10.1038/nprot.2016.150 (2016).
94   Wang, K., Li, M. & Hakonarson, H. ANNOVAR: functional annotation of genetic
variants from high-throughput sequencing data. *Nucleic Acids Res* **38**, e164,
doi:10.1093/nar/gkq603 (2010).
95   Choi, Y., Sims, G. E., Murphy, S., Miller, J. R. & Chan, A. P. Predicting the functional
effect of amino acid substitutions and indels. *PLoS One* **7**, e46688,
doi:10.1371/journal.pone.0046688 (2012).
96   Choi, Y. in *Proceedings of the ACM Conference on Bioinformatics, Computational*
Biology and Biomedicine - BCB '12   414-417 (2012).
97   Choi, Y. & Chan, A. P. PROVEAN web server: a tool to predict the functional effect of
amino acid substitutions and indels. *Bioinformatics* **31**, 2745-2747,
doi:10.1093/bioinformatics/btv195 (2015).
98   McKenna, A. *et al.* The Genome Analysis Toolkit: a MapReduce framework for
analyzing next-generation DNA sequencing data. *Genome Res* **20**, 1297-1303,
doi:10.1101/gr.107524.110 (2010).
99   Li, H. *et al.* The Sequence Alignment/Map format and SAMtools. *Bioinformatics* **25**,
2078-2079, doi:10.1093/bioinformatics/btp352 (2009).
100   Gerstung, M. *et al.* Reliable detection of subclonal single-nucleotide variants in tumour
cell populations. *Nat Commun* **3**, 811, doi:10.1038/ncomms1814 (2012).
101   Rosenthal, R., McGranahan, N., Herrero, J., Taylor, B. S. & Swanton, C.
DeconstructSigs: delineating mutational processes in single tumors distinguishes DNA

repair deficiencies and patterns of carcinoma evolution. *Genome Biology* **17**, 31-11,

doi:10.1186/s13059-016-0893-4 (2016).

102   Ramos, A. H. *et al.* Oncotator: cancer variant annotation tool. *Human mutation* **36**,

E2423-2429, doi:10.1002/humu.22771 (2015).

103   Taylor-Weiner, A. *et al.* DeTiN: overcoming tumor-in-normal contamination. *Nature*

Methods **15**, 531-534, doi:10.1038/s41592-018-0036-9 (2018).

104   Lek, M. *et al.* Analysis of protein-coding genetic variation in 60,706 humans. *Nature*

536, 285-291, doi:10.1038/nature19057 (2016).

105   Consortium, A. P. G. AACR Project GENIE: Powering Precision Medicine through an

International Consortium. *Cancer discovery* **7**, 818-831, doi:10.1158/2159-8290.CD-17-

0151 (2017).

106   Alexandrov, L. B. *et al.* Signatures of mutational processes in human cancer. **500**, 415-

421, doi:10.1038/nature12477 (2013).

107   Anders, S. & Huber, W. Differential expression analysis for sequence count data.

Genome Biology **11**, R106-112, doi:10.1186/gb-2010-11-10-r106 (2010).

108   Subramanian, A. *et al.* Gene set enrichment analysis: a knowledge-based approach for

interpreting genome-wide expression profiles. *Proc Natl Acad Sci U S A* **102**, 15545-

15550, doi:10.1073/pnas.0506580102 (2005).

1396

Supplementary Tables

Supplementary Table 1: a, Metadata of patient tumour samples analyzed using single-cell RNA-Seq analysis. **b,** Metadata of patient tumour samples analyzed using bulk RNA-Seq analysis. **c**, Metadata of human tumour samples stained for APOBEC3B via immunohistochemistry.

Supplementary Table 2: GSEA analysis of long-term osimertinib-treated APOBEC3B-proficient PC9 E4 derivatives compared to APOBEC3B-deficient derivatives.

Supplementary Table 3: Metadata of patient tumor samples processed for whole exome sequencing and subsequent mutational signature analysis.

Supplementary Table 4: a, Mutations observed in EGFR- and ALK-driven lung cancer patients. **b**, Selective putative resistance mutations observed in *EGFR*- and *ALK*-driven lung cancer patients.

Fig. 1| APOBEC3B is detrimental for tumourigenesis in an _EGFR^L858R_ mouse model of lung cancer. a, Tumourigenesis in _E_ and _EA3B_ mice was induced using the indicated viral titer (2.5×10⁷ viral particles/mouse). Tumour growth was assessed by microCT analysis. **b,** Total tumour volume per mouse at 3 months post-induction quantified by microCT analysis (_E_ = 15, _EA3B_ = 24, mean with SD, two-sided Mann-Whitney Test, P = 0.0163, each dot represents a mouse). **c**, Total tumour number per mouse at 3 months post-induction quantified by microCT analysis (_E_ = 15, _EA3B_ = 24, mean with SD, two-sided Mann-Whitney Test, P = 0.0236, each dot represents a mouse). **d,** Quantification of EGFR^L858R-positive cells per lung area (mm²) by immunohistochemical (IHC) staining at 3 months post-induction (_E_ = 9, _EA3B_ = 10, mean with SD, two-sided Mann-Whitney Test, P =0.0435, each dot represents a mouse). **e,** Quantification of caspase-3-positive cells per mm² of tumour at 3 months post-induction (_E_ = 9, _EA3B_ = 10, mean with SD, two-sided Mann-Whitney Test, P<0.0001, each dot represents a tumour). **f,** Representative IHC stainings of EGFR^L858R, APOBEC3B, and caspase-3 (scale bar = 20 µm, arrow indicates positive cell). **g**, Percent chromosome missegregation errors at 3 months post-induction (two-sided Fisher's exact test, p = 0.016, _E_ = 9, _EA3B_ =10). **h,**Quantification of p53 positive cells per lung area by IHC staining at 3 months post-induction (_E_ = 5, _EA3B_ = 5, mean with SD, two-sided Mann-Whitney Test, p = 0.0159). **i**, Survival curve of _E_ versus _EA3B_ mice (_E_ =15, _EA3B_ = 24, each dot represents a mouse). **j,** Quantification of p53 positive cells per lung area by IHC staining at late timepoint (termination) (_E_ = 8, _EA3B_ = 8, mean with SD).

Fig. 2| Expression of hA3B in combination with TKI therapy induces adaptations favorable for A3B expression and TKI resistance. **a,** Experimental set up of A3B induction post-initiation of TKI therapy using *TetO-EGFR^L858R;CCSP-rtTA;R26^LSL-APOBEC3B/Cre-ER(T2)(EA3Bi)* mice. **b,** Fraction of tumour grade, divided into no tumours present (not present) or hyperplasia only and bronchioloalveolar adenoma or carcinoma, in *Ei* and *EA3Bi* mice at 5 months post-induction post-TKI treatment (*Ei* = 19, *EA3Bi* = 19, two sided Fisher's exact test, **P= 0.0044). **c,** Tumour nodules per lung section per mouse at 5 months post induction post-TKI treatment (*Ei* =19, *EA3Bi* = 19,median = dashed line, 1st and 3rd quartiles = dotted lines, two-sided Mann-Whitney Test, *P =0.0443). **d,**Tumour area per lung area per mouse at 5 months post-induction post-TKI treatment (*Ei*=19, *EA3Bi* = 19, median = dashed line, 1st and 3rd quartiles = dotted lines, two-sided Mann-Whitney Test, *P =0.0212). **e,** Representative immunohistochemical staining of EGFR^L858R and A3B. Scale bar = 100 µm and 20 µm. **f,** A3B positive cells/mm² of tumour per mouse (*EA3Bi* - TKI = 151, *EA3Bi* + TKI = 52, median = dashed line, 1st and 3rd quartiles = dotted lines, two sided Mann Whitney Test, **** P = <0.0001) **g**, Experimental set up of induction of subclonal APOBEC3B using *TetO-EGFR^L858R;CCSP-rtTA;R26^LSL-APOBEC3B/Cre-ER(T2)(EA3Bi)* or *TetO-EGFR^L858R;CCSP-rtTA;R26^Cre-ER(T2)/+(Ei)* mice with continuous TKI therapy (erlotinib). **h,** Tumour nodules per lung section per mouse (*Ei* = 13, *EA3Bi* = 17, median = dashed line, 1st and 3rd quartiles = dotted lines, two sided Mann Whitney Test, ** P = 0.0086). **i**, Fraction of tumour grade in *Ei* and *EA3Bi* mice (*E* =13, *EA3Bi* = 17, NP = not present, H = hyperplasia, A =bronchioloalveolar adenoma, WDC = bronchioloalveolar carcinoma, well differentiated, Fisher's exact test).

Fig. 3| Treatment with tyrosine kinase inhibitors (TKIs) induces A3B upregulation and UNG downregulation. **a,** RT-qPCR analysis of PC9 cells treated with DMSO or 2 μM osimertinib (osi) for 18 hours or 10 days (n = 4 biological replicates, mean ± SEM, ANOVA test, *P = 0.0349, ***P = 0.0006, ****P < 0.0001). **b**, RT-qPCR analysis of HCC827 cells treated with DMSO or 0.4 μM osi for 18 hours or 7 days (n = 4 biological replicates, mean ± SEM, ANOVA test, ***P = 0.0008, **P = 0.0014, **P = 0.0011). **c**, RT-qPCR analysis of H3122 cells treated with DMSO or 0.5 μM crizotinib (criz) for 18 hours or 10 days (n = 4 biological replicates, mean ± SEM, ANOVA test, ****P < 0.0001, **P = 0.0086, *P = 0.0219). **d**, Western blot analysis of cells treated in a and b (CYTO: cytoplasmic extracts, NUC: nuclear extracts, H3: Histone H3) with quantification of A3B levels in PC9 cells (n = 3 biological replicates, mean ± SEM, ANOVA test, **P = 0.0012, **P = 0.0058) and HCC827 cells (n = 3 biological replicates, mean ± SEM, ANOVA test, *P = 0.0186). **e,** RT-qPCR analysis of PC9 cells treated with non-targeting siRNA (siNTC) or EGFR siRNA (siEGFR) for 18 hours and grown for 2 days (n = 4 biological replicates, mean ± SEM, t-test, **P = 0.0075, ***P = 0.0002, **P = 0.0027). **f,** APOBEC activity assay performed using nuclear extracts of PC9 cells treated as in panel a (n = 3 biological replicates, mean ± SD, ANOVA test, **P = 0.0036, **P = 0.0073). **g,** Uracil excision capacity assay using nuclear extracts of PC9 cells treated as in panel a (n = 3 biological replicates, mean ± SD, ANOVA test, **P = 0.0077, **P = 0.0017). **h**, Western blot analysis using extracts of *EGFR*-mutant H1975 human NSCLC xenografts harvested after 4 days of treatment with vehicle or the indicated doses of osimertinib (TUBB: Tubulin Beta Class I).

Fig. 4| APOBEC3B generates genetic diversity that fuels resistance to oncogene-targeted therapy. **a**, Whole exome sequencing analysis of mutation burden and APOBEC-associated mutations (TCN, C>T/C>G) acquired during osimertinib treatment of A3B proficient or deficient PC9 cells (Knockout verified in Ext. Data. Fig18a, unpaired t-test, ***P < 0.0005). **b,** Whole genome sequencing analysis of mutation burden and APOBEC-associated mutations (TCN, C>T/C>G) acquired with DMSO or osimertinib treatment of A3B proficient or deficient PC9 cells (Knockout verified in Ext. Data. Fig. 18b-c, DMSO 1 month, osimertinib 2.5 months). **c**, Comparison of APOBEC3B expression levels (Exp: batch corrected TPM) measured using RNA-Seq analysis in human NSCLC specimens obtained before treatment (treatment naïve, TN), or on-treatment at residual disease (RD) or at progressive disease (PD) stages from lung cancer patients undergoing treatment with tyrosine kinase inhibitors (all data points shown; ANOVA test, mixed effects model, *P = 0.0318). **d**, Representative images of IHC analysis of A3B protein levels in patients with NSCLC at TN, RD and PD stages, red arrows indicate positive stained cells (scale bar: 30 μM). **e**, IHC quantification of human NSCLC samples obtained before treatment (Pre-TKI) or after treatment (Post-TKI) (all data points shown, unpaired t-test, *P = 0.0113, patients treated with single agent TKI). **f,** Quantification of total mutation burden (SNV count) in human NSCLC samples obtained before (Pre-TKI) or after (Post-TKI) treatment (Wilcoxon matched-pairs signed rank test, two tailed, ** P = 0.0023). **g,** Quantification of APOBEC-associated mutation count in human NSCLC samples obtained before treatment (Pre-TKI) or after treatment (Post-TKI) (Wilcoxon matched-pairs signed rank test, two tailed, ** P = 0.0152). **h**, Mutation signature associated with each putative de novo TKI resistance mutation detected in clinical patient samples analyzed post-TKI at progressive disease. *Denotes sample from patient having received prior chemotherapy.

Extended Data Fig. 1| APOBEC3B is detrimental for tumourigenesis in an *EA3B* mouse model of lung cancer. a, Two by two contingency table of the number of mice with visible tumours (VT) or no visible tumours (NVT) by microCT at 3 months post-induction (two-sided Fisher's exact test, P<0.05). **b**, Representative images of p53 nuclear immunohistochemical staining. Scale bar = 10 μm, arrows indicates positive cells. **c,** Quantification of Ki67-positive cells per mm² of tumour at 3 months post-induction (*E* = 9, *EA3B* = 10, each dot represents a tumour). **d,** Quantification of γH2AX-positive cells per mm² of tumour at 3 months post-induction (*E* = 9, *EA3B* = 10, each dot represents a tumour). **e,** Quantification of CD4+ cells per mm² of tumour at 3 months post-induction (Mice *E* =8 *EA3B* = 7, each dot represents a tumour, mean with SD, two-sided Mann-Whitney Test, P = 0.0086). **f,** Quantification of CD8+ cells per mm² of tumour at 3 months post-induction (Mice *E* =8 *EA3B* = 8, each dot represents a tumour, mean with SD, two-sided Mann-Whitney Test, P = 0.0003). **g**, Representative IHC stainings of EGFR[L858R], APOBEC3B, and CD4 and CD8 T cells (scale bar = 50 μm). **h,** Quantification of CD4+ cells per mm² of tumour at late timepoint (termination) (Mice *E* =8 *EA3B* = 7, each dot represents a tumour, mean with SD, two-sided Mann-Whitney Test, P < 0.0001). **i,** Quantification of CD8+ cells per mm² of tumour at late timepoint (termination)(Mice *E* =6 *EA3B* = 6, each dot represents a tumour, mean with SD).

Extended Data Fig. 2| APOBEC3B expression correlates multiple measures of chromosomal instability in TRACERx 421. **a,** Significant correlation between A3B expression and CIN70 GSEA score calculated using tumours from patients with lung adenocarcinoma in the TRACERx421 cohort (n = 188 tumours, Spearman, rho = 0.56, p <2e-16). **b,** Significant correlation between A3B expression and CIN70 GSEA score calculated using tumour regions in patients with lung adenocarinoma in the TRACERx421 cohort (n=466 tumour regions, Spearman, rho =0.54 p <2e-16). **c,** Significant correlation between percent missegregation errors (anaphase bridges (bridges) and lagging chromosomes (lagging)) and CIN70 score calculated using tuours from patients in the TRACERx300 cohort (n = 112 tumours, Spearman, rho =0.27, p=0.0038). **d,** Correlation between A3B expression and subclonal CIN fraction calculated patients with lung adenocarcinoma in the TRACERx421 cohort (n= 168 tumours, Bootstrapped Spearman, rho = 0.26 p=0.00087). **e,** Significant correlation between A3B expression and CIN70 GSEA score calculated using EGFR mutant (mut) tumours from patients with lung adenocarcinoma in the TRACERx421 cohort (n = 19 tumours, Spearman, rho = 0.59, p =0.009). **f**, Significant correlation between A3B expression and CIN70 GSEA score calculated using EGFRmut tumour regions in patients with lung adenocarinoma in the TRACERx421 cohort (n=42 tumour regions, Spearman, rho =0.64 p <9e-6). **g**, Correlation between percent missegregation errors and CIN70 score calculated using EGFRmut tumours from patients in the TRACERx300 cohort (n = 13 tumours, Spearman, rho =0.53, p=0.064). **h**, Correlation between A3B expression and subclonal CIN fraction calculated in EGFRmut patients with lung adenocarcinoma in the TRACERx421 cohort (n= 168 tumours, Bootstrapped Spearman, rho = 0.5 p=0.032). **i**, Comparisons between C>T and C>G mutation counts at TCN and TCW trinucleotide context and % genome altered subclonally (Pearson, TCW rho = 049, p =0.015, TCN rho = 0.52, p=0.0092).

Extended Data Fig. 3| No increase in CIN or p53 activation is observed with continous A3B expression late in tumour evolution . a, Percent chromosome missegregation errors at late timepoint (termination) (*E* = 9, *EA3B* =10)**. b,** *A3B* expression in *E* and *EA3B* tumours at termination (*E* =6, *EA3B* = 7, $\log_2$ fold change). **c**, *Bax* expression in *E* and *EA3B* tumours at termination (*E* =6, *EA3B* = 6, $\log_2$ fold change, A3B negative tumour in EA3B mouse identified in b removed from subsequent analysis of p53 activation). **d**, *Cdkn1/p21* expression in *E* and *EA3B* tumours at termination (*E* =6, *EA3B* = 6, $\log_2$ fold change, A3B negative tumour in EA3B mouse identified in b removed from analysis). **e**, *Mdm2* expression in *E* and *EA3B* tumours at termination (*E* =6, *EA3B* = 6, $\log_2$ fold change, A3B negative tumour in EA3B mouse identified in b removed from analysis). **f**, *Pmaip1/Noxa* expression in *E* and *EA3B* tumours at termination (*E* =6, *EA3B* = 6, $\log_2$ fold change, A3B negative tumour in EA3B mouse identified in b removed from analysis). **g**, *Sesn2* expression in *E* and *EA3B* tumours at termination (*E* =6, *EA3B* = 6, $\log_2$ fold change, A3B negative tumour in EA3B mouse identified in b removed from analysis).

Extended Data Fig. 4| Recombination efficiency of LSL-APOBEC3B. a, Fraction of tumours positive for A3B at early and late timepoints measured by IHC staining (Early E = 3, EA3B = 3, Late E = 8, EA3B = 8). **b,** Representative IHC staining of EGFR^{L858R}, and APOBEC3B. Scale bar = 50 μm. **c,** PCR analysis of recombination efficiency of LoxP-Stop-LoxP site upstream of human APOBEC3B transgene. Primer 1 (P1) in LoxP, Primer 2 (P2) in stop codon, Primer 3 (P3) in human APOBEC3B transgene. P1+P2 = LSL 500 bp, P1+P3 = 598 bp. *EA3B* tumours at a late timepoint (termination). LSL = unrecombined tail DNA, Loxp = fully recombined cell line DNA. Ratios represent fraction of unrecombined tail DNA to fully recombined cell line DNA.

Extended Data Fig. 5| TP53 pathway inactivation rescues tumour growth with continous A3B expression. a, Tumours in *EP* and *EPA3B* mice were induced using the indicated viral titer (2.5×10^7 viral particles/mouse). Tumour growth was assessed by microCT analysis. **b,** Total tumour number per mouse at 3 months post-induction quantified by microCT analysis (*EP* = 21, *EPA3B* = 30, median = dashed line, 1st and 3rd quartiles = dotted lines. Combined from two separate experiments). **c,** Survival curve of *EP* versus *EPA3B* mice (*EP* =8, *EPA3B* = 7, each dot represents a mouse).

Extended Data Fig. 6| Subclonal APOBEC mutagenesis in EGFR mutant patients from TRACERx 400 dataset. a, Comparison of clonal and subclonal APOBEC-associated mutation signature (clonal APOBEC - subclonal APOBEC) in patients with EGFR driver mutations (1, 1a, exon 19 deletion). Grey bars indicate the patient is TP53 wildtype or has a subclonal TP53 mutation. Red bars indicate that the patient has a clonal TP53 mutation. (P = 1e^-4). **b,** Number of APOBEC-associated mutations in patients with EGFR driver mutations (1, 1a, exon 19 deletion). Colors indicate clonal or subclonal APOBEC or non APOBEC-associated mutations.

Extended Data Fig. 7| APOBEC3B expression without TKI therapy inhibits tumour growth. *a*, Experimental set up of induction of subclonal APOBEC3B using *TetO-EGFR^L858R;CCSP-rtTA;R26^LSL-APOBEC3B/Cre-ER(T2)(EA3Bi)* or *TetO-EGFR^L858R;CCSP-rtTA;R26^Cre-ER(T2)/+(CCSP_Ei)* mice. **b**, Average A3B positive cells/mm² of tumour per mouse (*Ei* = 9, *CCSP_EA3Bi* = 10, median = dashed line, 1st and 3rd quartiles = dotted lines, two sided Mann-Whitney Test, **P = 0.0041, each dot represents a mouse, dots below A3B^neg line are A3B negative). **c,**Tumour nodules per lung section per mouse at termination (*Ei* =10, *CCSP_EA3Bi* = 10, median = dashed line, 1st and 3rd quartiles = dotted lines, two-sided Mann-Whitney Test, *P = 0.0494). **d**, Tumour area per lung area at termination (*Ei* =10, *EA3Bi* = 10, median = dashed line, 1st and 3rd quartiles = dotted lines, two-sided Mann-Whitney Test, *P = 0.0216). **e**, EGFR^L858R positive cells per lung area per mouse in *Ei* and *EA3Bi* mice at termination. **f,** Lung weight in *Ei* vs *EA3Bi* mice at termination *Ei* = 13, *EA3Bi* = 12, median = dashed line, 1st and 3rd quartiles = dotted lines, each dot represents a mouse). **g,** Survival curve of *Ei* versus *EA3Bi* mice (*Ei* = 14, *EA3Bi* = 17, each dot represents a mouse, Log-rank (Mantel-Cox) test, *P = 0.0358).

Extended Data Fig. 8| Significant decrease in UNG expression in A3B expressing tumours with TKI treatment. **a,** Representative immuno-histochemical staining of EGFR[L858R] and UNG. Scale bar = 50 μm. **b,** Quantification of UNG+ cells per mm^2 of tumour at 5 months post-induction (*E* n=10, *EA3Bi* n=10, median = dashed line, 1st and 3rd quartiles = dotted lines, two-sided t-test, P = 0.0226, each dot represents a tumour).

Extended Data Fig. 9| Depletion of A3B impairs survival of lung adenocarcinoma cells subjected to TKI treatment. a, CellTiter-Glo (CTG) viability assays performed on A3B-deficient or A3B-proficient HCC827 cells treated with osimertinib (osi; day 1 to 5: 2 μM; day 6 to 22: 100 nM) (n = 4 biological replicates, data normalized to respective DMSO conditions, mean ± SD, t-test, *P = 0.0306). **b**, Immunoblot confirming A3B knockdown in HCC827 (CYTO: cytoplasmic extracts, NUC: nuclear extracts, H3: Histone H3). **c,** CTG viability assays performed on A3B-deficient or A3B-proficient H1975 cells treated with osi (day 1 to 8: 4 μM) (n = 4 biological replicates, data normalized to respective DMSO conditions, mean ± SD, t-test, ****P < 0.0001). **d,** Immunoblot confirming A3B knockdown in H1975. **e,** CTG viability assays performed on derivatives of PC9 single cell clones transduced with pTLCV2 plasmid derivative expressing sgRNA targeting A3B with or without Cas9 induction and treated with osi (day 1 to 4: 100 nM; day 5 to 42: 500 nM-2 μM, day 42 to 2.5 months: 100 nM) (n = 30, whiskers: min to max, ANOVA test). **f,** Immunoblot confirming knockout of A3B in PC9 clones. **g,** Crystal violet growth assay performed on A3B-deficient or A3B-proficient H3122 cells treated with crizotinib (day 1 to 8: 100 nM; day 8 to 11: 50 nM; day 11 to 15: 100 nM; day 15 to 32: 1-2 μM) (n = 3 biological replicates, data normalized to respective DMSO conditions, mean ± SD, t-test, *P = 0.0206). **h,** Immunoblot confirming A3B knockout in H3122.

a HCC827 6 hr erlotinib vs DMSO (GSE51212)

Gene symbol	logFC	p-value	adj. p-val.
APOBEC3B	1.97	5.37E-10	2.98E-06
UNG	-0.656	5.67E-06	0.000337

HCC4006 1 day erlotinib vs DMSO (GSE57156)

Gene symbol	logFC	p-value	adj. p-val.
APOBEC3B	1.29	0.000226	0.009784
UNG	-0.907	0.000888	0.022115

PC9 8 days erlotinib vs DMSO (GSE67051)

Gene symbol	logFC	p-value	adj. p-val.
APOBEC3B	0.494	7.64E-03	0.039366
UNG	-0.204	0.0673	0.176893

HCC827 6 hr MEK inhibitor (AZD6244) vs DMSO (GSE51212)

Gene symbol	logFC	p-value	adj. p-val.
APOBEC3B	0.572	1.08E-05	4.69E-03
UNG	-0.135	5.73E-02	3.62E-01

b PC9 9 days osimertinib vs DMSO

Gene symbol	logFC	p-value	adj. p-val.
APOBEC3B	2.25	5.69E-71	4.28E-69
UNG	-0.797	2.26E-09	1.68E-08

Extended Data Fig. 10| Treatment with tyrosine kinase inhibitors (TKIs) induces increased A3B expression and activity and decreased UNG expression and activity in multiple pre-clinical models of lung adenocarcinoma. **a,** GEO2R analysis of the indicated GSEA datasets of *EGFR*-driven cellular models of human lung adenocarcinoma treated with erlotinib or a MEK inhibitor (AZD6244). **b,** RNA-Seq analysis of gene expression changes in PC9 cells treated with 2 µM osimertinib (osi) for 9 days relative to DMSO-treated cells identified using (n = 3 biological replicates, mean ± SEM, ANOVA test). **c**, APOBEC activity assay using nuclear extracts of HCC827 cells treated with DMSO or 0.4 µM osi for 18 hours (n = 3 biological replicates, mean ± SD, t-test, *P = 0.0213). **d**, APOBEC activity assay using nuclear extracts of H1975 cells treated with DMSO or 1 uM osi for 18 hours (n = 3 biological replicates, mean ± SD, t-test, **P = 0.0084). **e**, Uracil excision capacity assay using extracts from panel c (n = 3 biological replicates, mean ± SD, t-test, ****P < 0.0001). **f,** Uracil excision capacity assay using extracts from part d (n = 3 biological replicates, mean ± SD, t-test, **P = 0.0054). **g**, Western blot analysis of extracts from H3122 cells treated with DMSO or 1 µM crizotinib (criz) for the indicated durations. **h,** APOBEC activity assay performed using nuclear extracts of H3122 cells treated with DMSO or 0.5 µM crizotinib for 18 hours or 10 days (n = 3 biological replicates, mean ± SD, ANOVA, *P = 0.0204, ****P < 0.0001). **i,** Uracil excision capacity assay using extracts from part h (n = 3 biological replicates, mean ± SD, t-test, *P = 0.0123). **j,** Western blot analysis of EML4-ALK positive H2228 human NSCLC cells treated with DMSO or 0.5 µM alectinib (alec) for 18 hours (CYTO: cytoplasmic extracts; NUC: nuclear extracts; H3: Histone H3).

Extended Data Fig. 11| Cell cycle inhibition with palbociclib significantly decreases A3B expression. a, Cell cycle analysis of PC9 cells treated with DMSO, 2 µM osimertinib (osi) or 1 µM palbociclib (palbo) for 18 hours. Teal: G2/M phase; Pink: S phase; Black: G0/G1 phase (n = 4 biological replicates, mean $\pm$ SEM, ANOVA test, **P = 0.0010, **P = 0.0049, ***P = 0.0009, ****P < 0.0001, ***P = 0.0003). **b,** RT-qPCR analysis of PC9 cells treated as in panel a, (n = 2 or 3 biological replicates, mean $\pm$ SD, ANOVA test, ****P < 0.0001, *P = 0.0215, **P = 0.0018).

Extended Data Fig. 12| EGFR inhibition induces A3B upregulation and UNG2 downregulation in xenograft models. a, Western blot analyses of extracts of PC9 tumour xenografts treated with vehicle or 5 mg/kg osimertinib (n = 2 biological replicates). **b,** Representative images of IHC analysis of A3B protein levels in 11-18 xenografts treated with vehicle, 12.5 mg/kg/day erlotinib, 7.5 mg/kg/day NF-κB inhibitor (NF-κBi, PBS-1086) or combination (Erlotinib + NF-κBi) for 2 months (scale: 60 μM)[17]. **c,** Quantification of immunohistochemical staining for A3B in 11-18 xenografts treated with vehicle, erlotinib (Erl), NF-κB inhibitor (NF-κBi, PBS-1086) or combination (Erl + NF-κBi) for 2 months (n = 2 biological replicates, mean, ANOVA test, erlotinib vs. NF-κBi **P = 0.0095, erlotinib vs. erl + NF-κBi **P = 0.0072). **d,** Representative images of IHC analysis of UNG protein levels in 11-18 xenografts treated with vehicle or 12.5 mg/kg/day erlotinib for 2 months. **e,** Quantification of immunohistochemical staining for UNG in 11-18 xenografts treated with vehicle or erlotinib for 2 months (n = 2 biological replicates). **f,** RNA-Seq analysis upon treatment of a PDX model of human *EGFR*-driven lung adenocarcinoma with vehicle or erlotinib (2 days, 25 mg/kg) (n = 2 biological replicates, mean ± SD, t-test, *P = 0.0203). **g,** RNA-Seq analysis upon treatment of a PDX model of human *EGFR*-driven lung adenocarcinoma with vehicle or osimertinib (6 days, 10 mg/kg) (n = 3 biological replicates, mean ± SD, t-test, *P = 0.0267).

Extended Data Fig. 13| A3B drives a TKI-induced increase in nuclear APOBEC activity. a, APOBEC activity assay performed using nuclear extracts of PC9 cells treated with increasing doses of osimertinib (osi; day 1 to 3: 200 nM; day 3 to 6: 1 μM; day 6 to 14: 2 μM). **b**, Western blot analysis of pERK from extracts in panel a (C: cytoplasmic extracts; N: nuclear extracts). **c,** Comparison of nuclear APOBEC activity and A3B expression of cells in a and b (assayed in triplicate, Spearman's correlation). **d,** RT-qPCR validation of A3B siRNA knockdown (n = 3 technical replicates, t-test performed on ΔCt values shown, ****P < 0.0001). **e,** APOBEC activity assay performed using nuclear extracts of PC9 cells treated with non-targeting siRNA (siNTC) or A3B siRNA (siA3B), DMSO or 500 nM osi for 18 hours. **f,** Western blot analysis of pEGFR using treated control and A3B knockdown cells in d-e. **g,** RT-qPCR validation of A3B shRNA knockdown (n = 3 technical replicates, t-test performed on ΔCt values shown, ****P < 0.0001). **h,** APOBEC activity assay performed using nuclear extracts of PC9 cells transduced with pLKO vector or its derivatives encoding an shRNA against A3B and treated with DMSO or 1 μM erlotinib (erl) for 18 hours. **i,** Western blot analysis performed using nuclear extracts of PC9 cells transduced with pLKO vector or A3B knockdown vector alone or together with wild-type HA-tagged A3B or HA-tagged catalytic-icly-inactive A3B mutant (E255A) expression plasmid. **j,** APOBEC activity assay performed using PC9 cells as in panel i, in the absence of RNase A.

Extended Data Fig. 14| NF-κB signalling is critical for TKI-induced A3B upregulation. a, RNA-Seq analysis of *EGFR*-mutant 11-18 NSCLC cells treated with DMSO, 100 μM erlotinib (erl), 5 μM NF-κB inhibitor (NF-κBi, PBS-1086) or combination (Erl + NF-κBi) (n = 3 biological replicates, mean ± SEM, ANOVA test, ****P < 0.0001). **b,** Western blot analysis of extracts from PC9 cells treated with DMSO or 4 μM osimertinib (osi) for the indicated durations (CYTO: cytoplasmic extracts; NUC: nuclear extracts), with quantifications of relative nuclear A3B and RELB levels (Spearman's r = 0.9, P = 0.002). **c,** Western blot analysis of extracts from PC9 cells treated with DMSO or with TNFα for 8.5 hours. **d,** RT-qPCR analysis of TNFα-treated PC9 cells (n = 3 biological replicates, t-test, *P = 0.0406, *P = 0.0299, **P = 0.0024). **e,** RT-qPCR validation of RELA and RELB knockdown in PC9 cells transfected with non-targeting vector plasmid or combination of either shRELA-1 + shRELB-1 (mix1) or shRELA-2 + shRELB-2 (mix2) (n = 3 biological replicates; mean ± SD, ANOVA test, ****P < 0.0001). **f,** RT-qPCR analysis of A3B expression in PC9 cells transfected with non-targeting vector plasmid or combination of either shRELA-1 + shRELB-1 (mix1) or shRELA-2 + shRELB-2 (mix2), treated with DMSO or 500 nM osi for 1 or 8 days (n = 3 biological replicates; mean ± SD, ANOVA test, *P = 0.0130, ***P = 0.0005, ****P < 0.0001, **P = 0.0028). **g,** Western blot analysis of A3B, RELA, and RELB protein expression of PC9 cells used in f. **h,** APOBEC activity assay performed using nuclear extracts of PC9 cells used in f.

Extended Data Fig. 15| A3B expression and NF-κB pathway activation in patients with NSCLC. a, Box plots showing single cell RNA-Seq analysis of A3B expression in lung cancer cells from patient tumors at treatment naive (TN), residual disease (RD), and progressive disease (PD) timepoints (Wilcoxon Rank Sum test, ****P < 0.0001). **b**, Box plots showing single cell RNA-Seq analysis of RELA expression in lung cancer cells from panel a (Wilcoxon Rank Sum test, ****P < 0.0001). **c,** Box plots showing single cell RNA-Seq analysis of RELB expression in lung cancer cells from panel a (Wilcoxon Rank Sum test, ****P < 0.0001). **d,** Box plots showing single cell RNA-Seq analysis of NF-κB signature (from Gilmore_Core_NFκB_Pathway, GSEA, C2) in lung cancer cells from panel a (Wilcoxon Rank Sum test, ****P < 0.0001).

Extended Data Fig. 16| Mechanisms inducing adaptations favoring APOBEC-mutagenesis after TKI treatment. **a**, RT-qPCR analysis of c-Jun expression of PC9 cells treated with 2 μM osimertinib for 9 days relative to DMSO-treated cells using (3 biological replicates from Ext. Data Fig.11b, mean $\pm$ SEM, t-test, ***P = 0.0009). **b**, RT-qPCR analysis of PC9 cells transfected with non-targeting siRNA (siNTC) or c-Jun siRNA, and treated with DMSO or 2 μM osimertinib for 18 hours (n = 3 biological replicates; mean $\pm$ SD, ANOVA test, ****P < 0.0001).

a

PC9 (osimertinib-treated)

DMSO | Osi

CYTO | NUC | CYTO | NUC

sgCtrl | No Dox | Clone 1 | Clone 2 | Clone 3 | sgCtrl | No Dox | Clone 1 | Clone 2 | Clone 3 | sgCtrl | No Dox | Clone 1 | Clone 2 | Clone 3 | sgCtrl | No Dox | Clone 1 | Clone 2 | Clone 3

A3B
pERK
ERK
pEGFR
EGFR
H3
GAPDH

A3B (C) 1.0|0.3|0.0|0.0|0.0   0.1|0.0|0.0|0.0|0.0
A3B (N)   1.0|0.8|0.0|0.0|0.1   0.7|1.0|0.0|0.0|0.0

b

PC9 (osimertinib-treated)

sgCtrl | sgA3B

DSMO | 10 days | 2.5 months | DSMO | 10 days | 2.5 months

Substrate (S)
Product (P)
Relative P/S   1 | 7.2 | 5.9 | 0.4 | 0.5 | 0.12

c

PC9 (osimertinib-treated)

CYTO | NUC

sgCtrl | sgA3B | sgCtrl | sgA3B

DSMO | 10 days | 2.5 months | DSMO | 10 days | 2.5 months | DSMO | 10 days | 2.5 months | DSMO | 10 days | 2.5 months

A3B
pERK
ERK
pEGFR
EGFR
H3
GAPDH
A3B   1.0|5.9|8.6|0.4|0.8|0.5

Extended Data Fig. 17| Confirmation of APOBEC3B deficiency in A3B knockout cancer cell clones. a, Western blot analysis for A3B, ERK, and EGFR of A3B proficient or A3B deficient PC9 cells treated with DMSO or osimertinib (Treatment: 113 days; dosing: 100 nM day 1-4, 500 nM-2 μM day 5 - 42, 50-100 nM day 43-76) (CYTO [C] - cytoplasmic extracts, NUC [N] - nuclear extracts). **b,** Nuclear APOBEC activity assay of A3B proficient control or A3B knockout PC9 clones treated with DMSO or osimertinib for the indicated duration. **c**, Western blot analysis for A3B, ERK and EGFR of clonal PC9 cells (Treatment: 2.5 months; dosing: 100 nM day 1-4, 1 μM - 2 μM day 5 - 52, 100 nM day 52 - 70, 25 nM day 70 -71) (CYTO - cytoplasmic extracts, NUC - nuclear extracts).

Extended Data Fig. 18| Loss of NRXN3 reduces sensitivity to TKI therapy. a, Western blot analysis of PC9 cells treated with non-targeting (siNTC) or NRXN3-targeting (siNRXN3) siRNA and treated with DMSO or 500 nM osimertinib for 2 days. **b,** RT-qPCR-based validation of NRXN3 knockdown in cells shown in a (n = 3 technical replicates, t-test performed on ΔCt values shown, ***P = 0.0007). **c,** IC50 analysis of PC9 siNTC or siNRXN3 after 3 day treatment (5 biological replicates for each of the following doses of osimertinib- 0 nM, 5 nM, 50 nM, 100 nM, 500 nM and 5000 nM, t-test, ***P = 0.0004).

Extended Data Fig. 19| An increase in the number of mutations in an APOBEC context in genes previously associated with TKI resistance in EPA3B mouse tumour cell lines. a, Comparison of EP and EPA3B mutation burdens in TKI naive and TKI resistant mouse lung cancer cell lines (median = dashed line, 1st and 3rd quartiles = dotted lines, two-sided Mann-Whitney Test, *P = 0.0162 **P = 0.008). **b,** Comparison of EP and EPA3B APOBEC driven mutations (TCN, C>T or C>G SNVs) in TKI naive and TKI resistant mouse lung cancer cell lines (median = dashed line, 1st and 3rd quartiles = dotted lines, two-sided Mann-Whitney Test, **P = 0.004). **c,** Functional annotation of TCN mutations in TKI resistance genes with change in variant allele frequency shown (x = TCN, Red square = deleterious mutation, yellow square = mixed (neutral and deleterious), orange square = neutral). **d**, Significant subclonal enrichment of the APOBEC-associated mutation signature in the TRACERx patient with A3B driven D129N mutation in the type IIa PTP PTPRD (equivalent to D138N mutation in PTPRS ***P = 0.0002, one-sample Wilcoxon test).

Extended Data Fig. 20| A3B expression in patients prior to and post therapy . a, Comparison of APOBEC3B expression levels (Exp: Batch corrected TPM) measured using RNA-Seq analysis in human NSCLC specimens obtained before treatment (TN), or on-treatment at residual disease (RD) or at progressive disease (PD) stages from lung cancer patients undergoing treatment with single agent tyrosine kinase inhibitors (TKI) or a combination of chemo- and TKI therapy (all data points shown).

Extended Data Fig. 21| The role of APOBEC3B in EGFR driven tumour evolution. a, At tumour initiation continous APOBEC3B expression induces, chromosomal instability and p53 pathway activation, resulting in cell death. **b**, With targeted therapy, APOBEC3B expression is induced in an NF-κB dependent manner, and UNG2 expression is lost driving genetic diversity and TKI resistance.