



# Inhibition of TXNRD or SOD1 overcomes NRF2-mediated resistance to $\beta$ -lapachone



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## ABSTRACT

Alterations in the NRF2/KEAP1 pathway result in the constitutive activation of NRF2, leading to the aberrant induction of antioxidant and detoxification enzymes, including NQO1. The NQO1 bioactivatable agent  $\beta$ -lapachone can target cells with high NQO1 expression but relies in the generation of reactive oxygen species (ROS), which are actively scavenged in cells with NRF2/KEAP1 mutations. However, whether NRF2/KEAP1 mutations influence the response to  $\beta$ -lapachone treatment remains unknown. To address this question, we assessed the cytotoxicity of  $\beta$ -lapachone in a panel of NSCLC cell lines bearing either wild-type or mutant KEAP1. We found that, despite overexpression of NQO1, KEAP1 mutant cells were resistant to  $\beta$ -lapachone due to enhanced detoxification of ROS, which prevented DNA damage and cell death. To evaluate whether specific inhibition of the NRF2-regulated antioxidant enzymes could abrogate resistance to  $\beta$ -lapachone, we systematically inhibited the four major antioxidant cellular systems using genetic and/or pharmacologic approaches. We demonstrated that inhibition of the thioredoxin-dependent system or copper-zinc superoxide dismutase (SOD1) could abrogate NRF2-mediated resistance to  $\beta$ -lapachone, while depletion of catalase or glutathione was ineffective. Interestingly, inhibition of SOD1 selectively sensitized KEAP1 mutant cells to  $\beta$ -lapachone exposure. Our results suggest that NRF2/KEAP1 mutational status might serve as a predictive biomarker for response to NQO1-bioactivatable quinones in patients. Further, our results suggest SOD1 inhibition may have potential utility in combination with other ROS inducers in patients with KEAP1/NRF2 mutations.

## 1. Introduction

It is estimated that 38% of lung squamous cell carcinomas (LuSC) and 18% of lung adenocarcinomas (LuAD) harbor mutations in Nuclear factor erythroid 2-related factor 2 (NRF2), or its negative regulator Kelch-like ECH-associated protein 1 (KEAP1) [1–3], making this pathway one of the most commonly mutated in non-small cell lung cancer (NSCLC). The transcription factor NRF2 acts as the primary cellular barrier against the deleterious effects of oxidative stress by regulating the expression of cytoprotective genes. In healthy tissues, KEAP1 binds to and harnesses the activity of NRF2, thereby promoting NRF2 ubiquitination and destruction by the proteasome [4–6]. Loss-of-function mutations in KEAP1 and gain-of-function mutations in NRF2 found in NSCLC abolish this control and lead to constitutive NRF2 activity [1,7–9]. Cancer cells that hijack NRF2 activity are equipped with

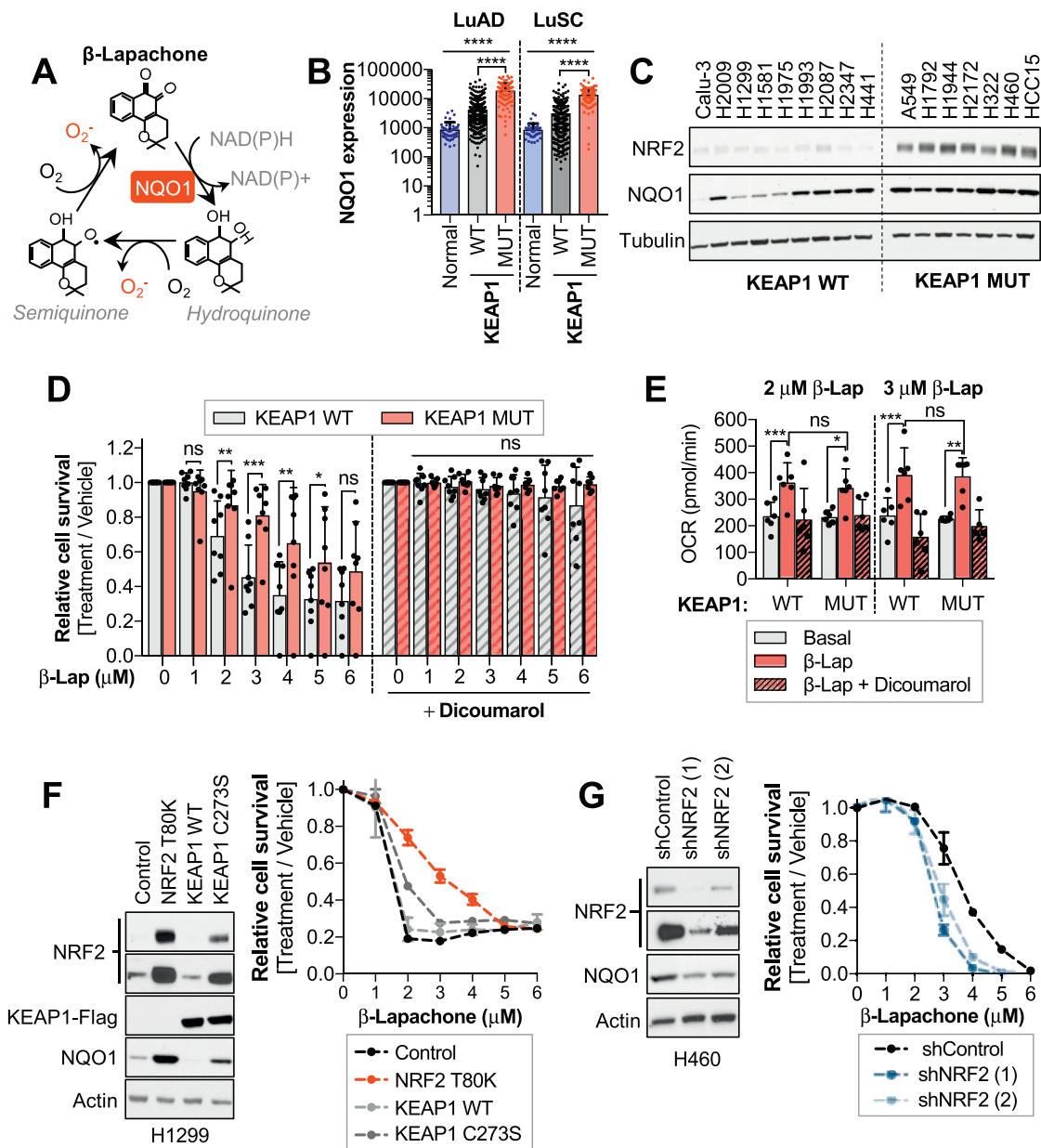
a reinforced cytoprotective system through the induction of antioxidant and drug detoxification pathways, thereby rendering them resistant to oxidative stress and chemo/radio-therapy [10–12].

High expression of the detoxification enzyme and *bona fide* NRF2 target gene NAD(P)H:quinone oxidoreductase 1 (NQO1) is a distinct biomarker of NRF2/KEAP1 mutant NSCLC tumors. NQO1 is a cytosolic flavoprotein that catalyzes the two-electron reduction of quinones into hydroquinones in an effort to hamper oxidative cycling of these compounds [13,14]. Although NQO1-dependent reduction of quinones has been historically defined as a major detoxification mechanism, a number of quinones induce toxicity following NQO1 reduction [15–19]. The mechanism behind this paradox relies on the chemical properties of the hydroquinone forms. Unstable hydroquinones can be reoxidized to the original quinone by molecular oxygen, which leads to the formation of superoxide radicals. As the parent quinone is regenerated, the cycle

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**Fig. 1.** Aberrant activation of NRF2 increases resistance to  $\beta$ -Lapachone treatment.

\*Please note that, for survival assays, cells were exposed to  $\beta$ -lapachone for 2 h, after which medium was replaced and cell viability was assessed 48 h after treatment using CellTiter-Glo (D) or crystal violet staining (F,G). Western blots included in Fig. 1C, S3B and S4E are a reprobing of the same blot and share the loading control (tubulin).

(A) Schematic representation of  $\beta$ -lapachone redox cycling. NQO1 catalyzes the two-electron reduction of  $\beta$ -lapachone to a hydroquinone form, which can spontaneously reoxidize, leading to the formation of superoxide radicals. (B) NQO1 mRNA expression in healthy lung tissue, lung adenocarcinomas (LuAD) and lung squamous cell carcinoma (LuSC). NQO1 mRNA expression in tumors was subdivided according to the KEAP1/NRF2 mutational status. One-way ANOVA statistical test was performed to compare groups. **LuAD:** P-value ANOVA summary < 0.0001; Tukey's multiple comparison test Normal Vs WT (0.004, \*\*) Normal vs MUT (< 0.0001, \*\*\*\*). **LuSC:** P-value ANOVA summary < 0.0001; Tukey's multiple comparison test Normal Vs WT (0.0212, \*) Normal vs MUT (< 0.0001, \*\*\*\*). (C) Western blot analyses of NRF2, NQO1 and Tubulin expression in a panel of wild-type (WT) and mutant (MUT) KEAP1 NSCLC cells. Note that Calu-3 cells harbor a polymorphic variant of NQO1 (NQO1\*3, 465C < T). (D) Survival assays of KEAP1 wild-type (WT) and KEAP1 mutant (MUT) NSCLC cell lines exposed to  $\beta$ -lapachone alone (left) or in combination with the NQO1 inhibitor dicoumarol (right). Cells were treated with vehicle (< 0.1% DMSO) or the indicated concentrations of  $\beta$ -lapachone alone or in combination with dicoumarol (50  $\mu$ M). KEAP1<sup>WT</sup> cells: H2009, H1299, H1581, H1975, H1993, H2087, H2347 and H441. KEAP1<sup>MUT</sup> cells: A549, H460, H1792, H2127, H1944, HCC15, H322. Data presented as mean  $\pm$  S.D. P-values KEAP1 WT vs MUT  $\beta$ -lap 2  $\mu$ M = 0.0081 (\*\*), 3  $\mu$ M = 0.0002 (\*\*\*), 4  $\mu$ M = 0.0014 (\*\*), 5  $\mu$ M = 0.0314 (\*) were calculated using unpaired t-tests. (E) Oxygen consumption rates of a panel of KEAP1 WT and MUT NSCLC cells exposed to 2 and 3  $\mu$ M of  $\beta$ -lapachone alone or in combination with 50  $\mu$ M of dicoumarol for 117 min. KEAP1<sup>WT</sup> cells: H1299, H1581, H1975, H441, H2347, H2087. KEAP1<sup>MUT</sup> cells: A549, H2172, H1944, H460, HCC15, H1792. Data presented as mean  $\pm$  S.D. P-values KEAP1<sup>WT</sup> basal vs  $\beta$ -lapachone 2  $\mu$ M (0.0007, \*\*\*) and 3  $\mu$ M (0.0006, \*\*\*) and KEAP1<sup>MUT</sup> basal vs  $\beta$ -lapachone 2  $\mu$ M (0.0179, \*) and 3  $\mu$ M (0.0029, \*\*) were calculated using a paired t-test statistical analysis. (F) H1299 cells (KEAP1 WT) were infected with an empty vector (Control) or a virus coding for the expression of NRF2 T80K, KEAP1 wild-type or KEAP1 C273S. Left, Western blot analyses of NRF2, Flag (for KEAP1 detection), NQO1 and actin (loading control). Right, survival assays of cells exposed to  $\beta$ -lapachone. (G) Western blot (left) and survival assays (right) of H460 (KEAP1 MUT) infected with virus coding for shRNAs against NRF2 (shNRF2) or an shRNA control.

continues, which amplifies the generation of superoxide radicals, initiating a cascade of reactive oxygen species (ROS).

The ability of NQO1 to generate cytotoxic hydroquinones has been utilized as a strategy to target cancer cells with high NQO1 levels. To date,  $\beta$ -lapachone and its derivatives are the most studied NQO1-bioactivatable quinones, and the molecular mechanisms by which they promote cytotoxicity have been thoroughly characterized [20–24] (Fig. 1A). NQO1 has been proposed as a target for NSCLC therapy, as it is overexpressed in lung tumors but not in adjacent normal tissues [25–27]. Thus, systemic delivery of  $\beta$ -lapachone would spare healthy lung tissue while inducing robust cytotoxicity in tumor cells. Although  $\beta$ -lapachone has been tested in phase 1 and 2 clinical trials for advanced solid tumors as the analogs ARQ 501 and ARQ 761, none of the clinical trials designed to date have been focused on lung cancer patients.

Remarkably, a large fraction of NSCLC with high NQO1 also harbor sustained NRF2 activation, which in turn could hinder the cytotoxic effects of  $\beta$ -lapachone through the active scavenging of ROS. Therefore, although high levels of NQO1 could be exploited with a therapeutic intent in NRF2/KEAP1 mutant cancer cells, it is unclear whether actions of NRF2 could limit  $\beta$ -lapachone efficacy. In this study, we aim to clarify whether NQO1 represents a druggable strategy for NRF2/KEAP1 mutant NSCLC or, conversely, these alterations promote resistance to  $\beta$ -lapachone.

## 2. Results

### 2.1. Aberrant activation of NRF2 in NSCLC promotes resistance to $\beta$ -lapachone

We compared the mRNA levels of NQO1 in healthy lung tissue, adenocarcinoma (LuAD) and squamous cell carcinoma (LuSC) patients using the TCGA dataset (Fig. 1B, Table 1 and Table 2). NQO1 expression in lung tumors was further subdivided according to the NRF2/KEAP1 mutational state. Both LuAD and LuSC tumors had significantly higher NQO1 levels compared to normal lung tissue. Further, tumors harboring NRF2/KEAP1 mutations displayed significantly higher expression of NQO1 than those lacking mutations in this pathway, consistent with the direct transcriptional regulation of NQO1 by NRF2 [28]. Remarkably, a number of KEAP1<sup>WT</sup> NSCLC tumors exhibited elevated NQO1 levels, suggesting that NQO1 overexpression in KEAP1/NRF2<sup>WT</sup> tumors can also result from alternative mechanisms of NRF2 activation (i.e. epigenetic silencing of KEAP1 [29,30], oncogenic activation of NRF2 [31]) or through NRF2-independent mechanisms.

To examine the influence of KEAP1/NRF2 mutations on NSCLC response to  $\beta$ -lapachone treatment, we assessed the cytotoxic efficacy of  $\beta$ -lapachone in a panel of sixteen NSCLC cell lines, seven of which harbor characterized inactivating mutations of KEAP1 (Fig. 1C, S1A). In line with the mRNA data of LuSC and LuAD patients, KEAP1<sup>MUT</sup> cell lines displayed uniformly high NQO1 protein levels, while protein levels of NQO1 in KEAP1<sup>WT</sup> cells were highly variable. To determine the range of doses of  $\beta$ -lapachone that promote cell death in a NQO1-dependent manner, cells were treated with increasing concentrations of  $\beta$ -lapachone alone or in combination with the NQO1 inhibitor dicoumarol [32,33] (Fig. 1D, Fig. S1B). Additionally, we included in the study Calu-3 cells, which harbor a polymorphic variant of NQO1 (NQO1\*3) that results in 95% lower enzyme levels [27,34,35] (Fig. S1C). To recapitulate  $\beta$ -lapachone *in vivo* half-life conditions [36], cells were treated with  $\beta$ -lapachone for 2 h and cell viability was analyzed 48 h after treatment. Our results showed that doses ranging from 1 to 6  $\mu$ M induced cell death in a dose-dependent and NQO1-specific manner. Remarkably, KEAP1 mutation conferred resistance to  $\beta$ -lapachone treatment (Fig. 1D).

To test the ability of KEAP1<sup>WT</sup> and KEAP1<sup>MUT</sup> cell lines to promote redox cycling of  $\beta$ -lapachone, we monitored the oxygen consumption rate (OCR) using the Seahorse bioanalyzer. Basal OCR was monitored prior injection of  $\beta$ -lapachone, and OCR was followed for 2 h after  $\beta$ -

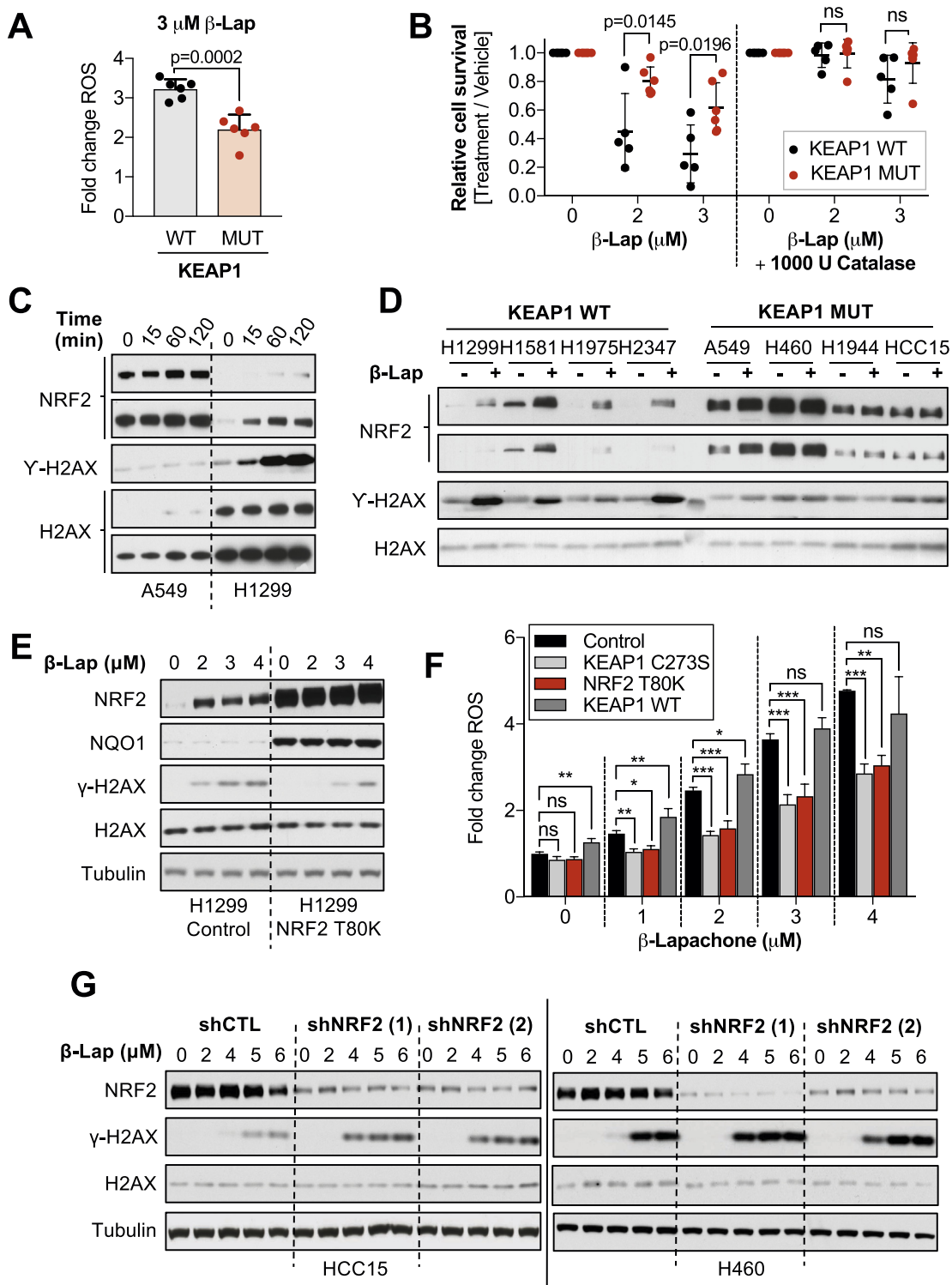
lapachone addition. To validate whether changes in the OCR were a consequence of NQO1-dependent redox cycling of  $\beta$ -lapachone, we also monitored the OCR of cells co-treated with  $\beta$ -lapachone and dicoumarol. Treatment with  $\beta$ -lapachone resulted in a significant increase of the OCR in both KEAP1<sup>WT</sup> and KEAP1<sup>MUT</sup> cells, which was precluded by the addition of dicoumarol (Fig. 1E). Further, there was no significant difference in the OCR between KEAP1<sup>WT</sup> and KEAP1<sup>MUT</sup> cells after  $\beta$ -lapachone treatment, indicating that protein levels of NQO1 in KEAP1<sup>WT</sup> NSCLC cells are not limiting for redox cycling of  $\beta$ -lapachone. Hence, both KEAP1<sup>WT</sup> and KEAP1<sup>MUT</sup> cancer cells are capable of NQO1-dependent redox cycling of  $\beta$ -lapachone at comparable rates.

To determine whether  $\beta$ -lapachone resistance was NRF2-dependent, H1299 cells (KEAP1<sup>WT</sup>) were infected with virus encoding for an inactivating mutation of KEAP1 (C273S) or a gain-of function NRF2 mutation (T80K), to promote the aberrant activation of NRF2 [7,37,38]. In agreement with our previous findings, overexpression of KEAP1<sup>C273S</sup> and NRF2<sup>T80K</sup> but not KEAP1<sup>WT</sup> led to the accumulation of NRF2, which promoted resistance to  $\beta$ -lapachone exposure (Fig. 1F). Consistently, NRF2 silencing by shRNAs markedly reduced resistance to  $\beta$ -lapachone in H460 cells (KEAP1<sup>MUT</sup>) (Fig. 1G). Additionally, we compared the  $\beta$ -lapachone sensitivity of NRF2-knockout A549 cells [39] infected with a control vector or with virus coding for NRF2 expression (Figs. S1D and S1E). In agreement with our previous data, NRF2-knockout cells exhibited increased sensitivity to  $\beta$ -lapachone compared to cells reconstituted for NRF2 expression. Collectively, these results indicate that aberrant activation of NRF2 in KEAP1 mutant lung cancer cells confers resistance to  $\beta$ -lapachone exposure.

### 2.2. Activation of NRF2 promotes active scavenging of $\beta$ -lapachone-induced ROS and attenuates DNA damage

Given the established role of NRF2 in protection against ROS through the transcriptional regulation of antioxidant enzymes, we evaluated whether KEAP1<sup>MUT</sup> cells harbor an increased capacity to detoxify  $\beta$ -lapachone-induced ROS. We monitored ROS generation after  $\beta$ -lapachone exposure in our panel of NSCLC cell lines using the fluorogenic probe CellROX Green, as previously described [40] (Fig. 2A). We found that KEAP1<sup>WT</sup> cells displayed a significantly higher fold-change of ROS after 1-h of  $\beta$ -lapachone treatment compared to KEAP1<sup>MUT</sup>. To confirm whether  $\beta$ -lapachone promotes cell death via induction of ROS, we supplemented the media with exogenous catalase to increase the antioxidant capacity of the cells (Fig. 2B). Consistent with prior studies [22,41], addition of exogenous catalase abrogated  $\beta$ -lapachone-induced cell death. Next, we assessed whether KEAP1<sup>MUT</sup> cells were protected against  $\beta$ -lapachone-induced DNA damage [27,40]. We monitored levels of phosphorylated H2A.X ( $\gamma$ -H2AX), a sensitive molecular marker of DNA damage. We observed a time-dependent accumulation of DNA damage in H1299 cells (KEAP1<sup>WT</sup>), while A549 cells (KEAP1<sup>MUT</sup>) did not exhibit increased  $\gamma$ -H2AX following 2-h treatment with 3  $\mu$ M  $\beta$ -lapachone (Fig. 2C). We extended these analyses to a larger panel of cell lines, and we found that KEAP1<sup>WT</sup> cells, but not KEAP1<sup>MUT</sup> cells, accumulated  $\gamma$ -H2AX following  $\beta$ -lapachone exposure (Fig. 2D). Accordingly, ectopic expression of KEAP1<sup>C273S</sup> or NRF2<sup>T80K</sup> in H1299 cells also promoted resistance to  $\beta$ -lapachone-induced DNA damage and decreased accumulation of ROS (Fig. 2E, F and S2A).

We next assessed whether depletion of NRF2 could exacerbate  $\beta$ -lapachone-induced DNA damage in KEAP1<sup>MUT</sup> cells (Fig. 2G). Indeed, shRNA-mediated silencing of NRF2 in H460 and HCC15 cells increased  $\gamma$ -H2AX levels following  $\beta$ -lapachone exposure. Lastly, we interrogated ROS and DNA damage levels in NRF2-KO A549s infected with NRF2<sup>WT</sup> or an empty control vector after  $\beta$ -lapachone treatment (Figs. S2B and S2C). Consistently, A549 NRF2-knockout cells exhibited greater production of ROS and accumulation of DNA damage markers compared to cells expressing NRF2. Together, these results demonstrate that constitutive activation of NRF2 in NSCLC protects cells from  $\beta$ -lapachone



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exposure by decreasing ROS-mediated DNA damage.

**2.3. Inhibition of thioredoxin-dependent systems but not catalase and glutathione overcome NRF2-mediated resistance to β-lapachone**

To sensitize KEAP1<sup>MUT</sup> lung cancer cells to β-lapachone treatment, we sought to identify and inhibit key NRF2-regulated antioxidant pathways. Given the major role of hydrogen peroxide in mediating β-

lapachone toxicity, we tested whether inhibition of individual peroxide detoxification systems could overcome β-lapachone resistance (Fig. S3A). First, we tested the relevance of catalase in the sensitivity to β-lapachone by using shRNAs (Fig. 3A and B). We observed that depletion of catalase did not affect the β-lapachone sensitivity of NSCLC cells, regardless of KEAP1 mutational status. Of note, we found that H460 cells did not express detectable catalase protein (Fig. 3B, S3B).

NRF2 is a major upstream transcriptional regulator of enzymes



## Fig. 2. Activation of NRF2 promotes active scavenging of $\beta$ -lapachone-induced ROS and attenuates DNA damage.

(A) A panel of KEAP1 mutant and KEAP1 wild-type NSCLC cell lines were exposed to 3  $\mu$ M of  $\beta$ -lapachone for 1 h. Relative increase of ROS was measured using the green fluorescent probe CellROX green by flow cytometry. KEAP1<sup>WT</sup> cells: H1299, H1581, H1975, H2087, H2347, H441. KEAP1<sup>MUT</sup> cells: A549, H1792, H1944, H2172, H460, HCC15. Data presented as mean  $\pm$  S.D. (B) Cell survival analyses of NSCLC cell lines exposed to vehicle control,  $\beta$ -lapachone alone or co-treated with 1000 U catalase/well (96-well plate) for 2 h. Surviving cells were stained with crystal violet 48 h after treatment. KEAP1<sup>WT</sup> cells: H1299, H1581, H441, H2347, H2087. KEAP1<sup>MUT</sup> cells: A549, H1944, H460, HCC15, H1792, H322. Data presented as mean  $\pm$  S.D. (C) A549 and H1299 cells, KEAP1 mutant and wild-type respectively, were exposed to 3  $\mu$ M of  $\beta$ -lapachone for 0, 15, 60 and 120 min, after which cells were collected and protein levels of NRF2, total H2AX (loading control), and the DNA damage marker  $\gamma$ -H2AX (pS139) were assessed by western blotting. (D) Western blot analyses of nuclear extracts of a panel of KEAP1 wild-type (WT) or mutant (MUT) NSCLC cell lines. Cells were treated with 3  $\mu$ M of  $\beta$ -Lapachone for 2 h. Protein levels of NRF2, total H2AX (loading control), and the DNA damage marker  $\gamma$ -H2AX (pS139) were assessed by western blotting. KEAP1<sup>WT</sup> cells: H1299, H1581, H1975, H2347. KEAP1<sup>MUT</sup> cells: A549, H1944, H460, HCC15. (E) DNA damage assessment of H1299 cells (KEAP1 WT) infected with an empty vector (Control) or a virus coding for the expression of NRF2 T80K. Left, cells were exposed to 2, 3 or 4  $\mu$ M of  $\beta$ -lapachone. Protein levels of NRF2, NQO1, total H2AX (loading control), Tubulin (loading control) and the DNA damage marker  $\gamma$ -H2AX (pS139) were assessed by western blotting. See Supplementary Fig. 2A. (F) H1299 cells (KEAP1 WT) were infected with an empty vector (Control) or a virus coding for the expression of NRF2 T80K, KEAP1 wild-type or KEAP1 C273S. Cells were exposed to 1–4  $\mu$ M of  $\beta$ -lapachone for 1 h and resulting fluorescent signal of the probe CellROX green was measured by flow cytometry. P-values were calculated using one-way ANOVA statistical test followed by the multiple comparison Dunnett's test to compare between treatment groups. \*P < 0.05, \*\*P < 0.01, \*\*\*P < 0.001, \*\*\*\*P < 0.0001. Data presented as mean  $\pm$  S.D. (G) H460 and HCC15 cells (KEAP1 MUT) infected with virus coding for shRNAs against NRF2 (shNRF2) or an shRNA control were treated with the indicated concentration of  $\beta$ -lapachone for 2 h, after which protein levels of NRF2, total H2AX (loading control), Tubulin (loading control) and the DNA damage marker  $\gamma$ -H2AX (pS139) were assessed by western blotting. (For interpretation of the references to colour in this figure legend, the reader is referred to the Web version of this article.)

involved in the thioredoxin (TXN)- and glutathione (GSH)-dependent antioxidant systems, which share certain redundancy in detoxifying hydrogen peroxide. We tested whether individual inhibition of the thioredoxin - or glutathione-dependent systems could overcome NRF2-mediated resistance to  $\beta$ -lapachone. To inhibit glutathione synthesis, we used buthionine sulfoximine (BSO), a well-characterized inhibitor of glutamate-cysteine ligase (GCL) [42]. Twenty-four-hour treatment with 100 or 200  $\mu$ M of BSO depleted > 95% of the total pool of glutathione (Fig. S3C). To inhibit the TXN-dependent system, cells were treated with 1–5  $\mu$ M auranofin, a pan-thioredoxin reductase (TXNRD) inhibitor for 2 h [43]. We observed a dose-dependent inhibition of both the cytosolic and mitochondrial TXN-dependent systems in KEAP1<sup>WT</sup> cells, as seen by oxidation of peroxiredoxin 1 and 3 (Fig. S3D). Interestingly, KEAP1<sup>MUT</sup> cell peroxiredoxins were resistant to oxidation, and KEAP1<sup>WT</sup> NSCLC cells are more sensitive to auranofin-induced cell death in the absence of exogenous oxidants (Fig. S3E). We next examined the effect of these inhibitors on  $\beta$ -lapachone sensitivity. Depletion of glutathione did not increase the sensitivity to  $\beta$ -lapachone treatment, while auranofin significantly increased  $\beta$ -lapachone-induced cell death and DNA damage in KEAP1<sup>MUT</sup> cells (Fig. 3C and D). Similarly, auranofin but not BSO increased sensitivity of KEAP1<sup>WT</sup> cells to  $\beta$ -lapachone exposure (Fig. 3E).

These data suggest that although inhibition of the TXN-dependent system increases sensitivity of KEAP1<sup>MUT</sup> cells to  $\beta$ -lapachone, the inherent reinforcement of this antioxidant pathway in KEAP1<sup>MUT</sup> cells might represent a challenge *in vivo*. Further, single inhibition of the glutathione or catalase it is not sufficient to increase sensitivity to  $\beta$ -lapachone treatment, suggesting that inhibition of these pathways is compensated by other antioxidant mechanisms.

### 2.4. Inhibition of SOD1 potentiates $\beta$ -lapachone anti-tumor efficacy in KEAP1/NRF2<sup>MUT</sup> NSCLC

The inherent redundancy in the hydrogen peroxide detoxification systems represents a major challenge to sensitize KEAP1<sup>MUT</sup> cells to ROS generators, as inhibition of one of these pathways may be compensated by other antioxidant enzymes. In contrast, SOD1 has a unique role in catalyzing the dismutation of cytosolic superoxide radicals generated by  $\beta$ -lapachone (Fig. 4A). Given this unique role of SOD1, we interrogated the effects of SOD1 inhibition on  $\beta$ -lapachone efficacy. We infected KEAP1<sup>MUT</sup> cells with virus coding for shRNAs against SOD1 or a non-targeting shRNA (Fig. S4A). Depletion of SOD1 markedly increased  $\beta$ -lapachone-mediated cell death in KEAP1<sup>MUT</sup> cell lines and increased DNA damage (Fig. 4B and C, S4B). Importantly,  $\beta$ -lapachone treatment did not change SOD1 activity (Fig. S4C).

To validate these findings, we sought to test the effect of

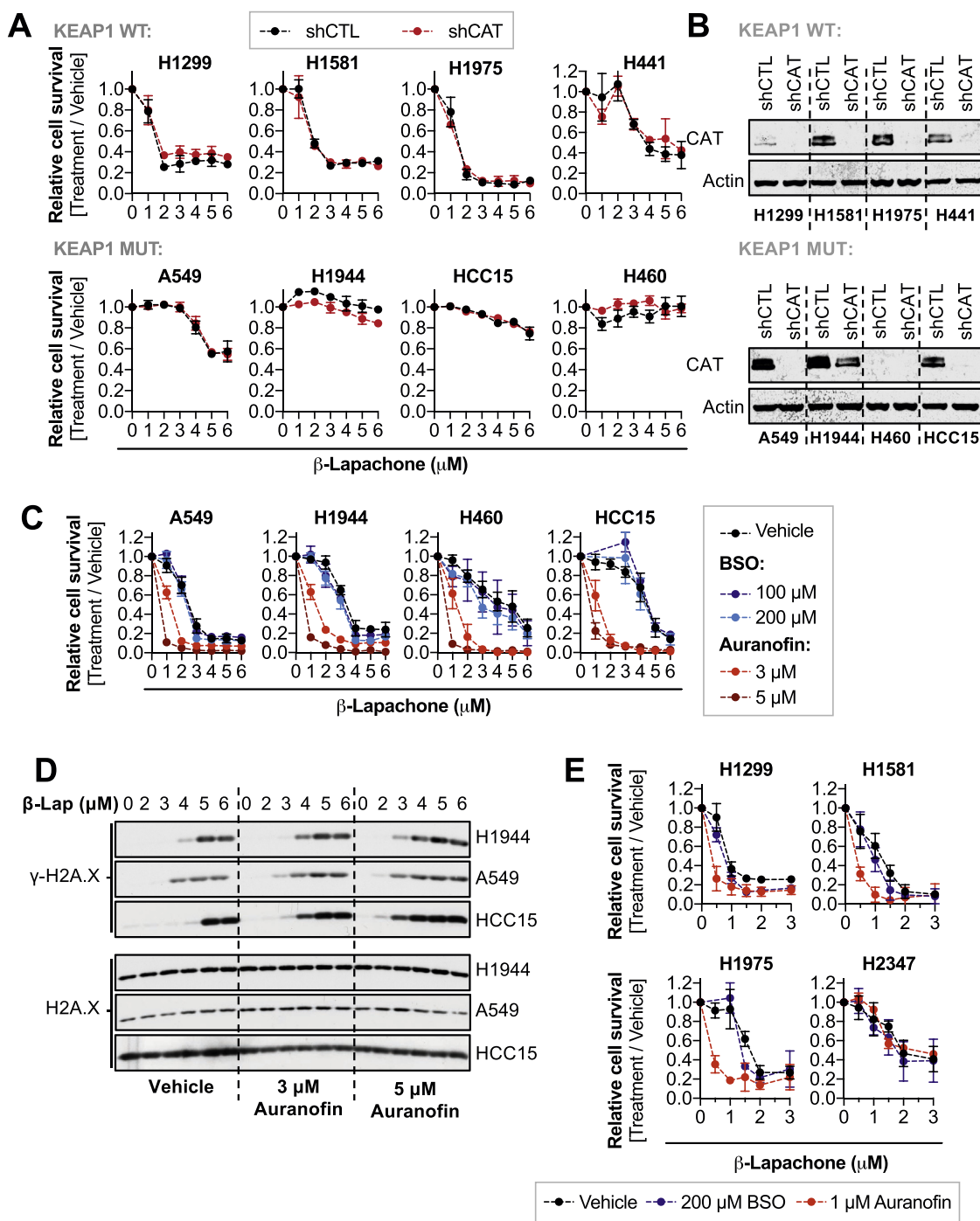
pharmacological inhibition of SOD1 on  $\beta$ -lapachone efficacy. However, direct inhibitors of SOD1 that have been shown efficacy in cell-based assays or *in vivo* are lacking. The cytosolic (SOD1) and the extracellular (SOD3) superoxide dismutases require copper and zinc to function, while the mitochondrial isoform (SOD2) relies on manganese. Thus, indirect inhibition of SOD1 can be achieved through copper chelation [44,45], while the mitochondrial SOD activity should remain intact.

First, we validated whether we could achieve SOD1 inhibition in cell culture using the copper chelator ATN-224 (Fig. S4D). We observed that most of SOD1 activity was inhibited after 24-h treatment using 2.5–5  $\mu$ M. As expected, copper chelation did not affect SOD2 activity. Inhibition of SOD1 resulted in increased sensitivity of KEAP1<sup>MUT</sup> cells to  $\beta$ -lapachone-mediated cell death and DNA damage (Fig. 4D and E). Of note, SOD1 inhibition had little to no effect in KEAP1<sup>WT</sup> cells (Fig. 4D). We also examined the protein levels and activity of SOD1 across our panel of NSCLC cells to evaluate whether KEAP1<sup>MUT</sup> cells have higher capacity to detoxify cytosolic superoxide (Fig. S4E). KEAP1 mutant cells did not exhibit significantly higher levels of SOD1, suggesting that inactivation of KEAP1 does not confer a reinforced capacity to detoxify cytosolic superoxide radicals through SOD1 upregulation. To directly interrogate whether NRF2 regulates SOD1 levels/activity, we infected KEAP1<sup>MUT</sup> cells with shRNAs against NRF2 and monitored SOD1 protein levels and its enzymatic activity (Figs. S4F and S4G). Depletion of NRF2 was accompanied by reduced protein levels of the well-characterized NRF2 targets NQO1, TXN and TXNRD1 (Fig. S4F), while SOD1 protein levels were unchanged. Similarly, we did not observe any changes in SOD1 activity following NRF2 depletion (Fig. S4G). These results suggest that hyperactivation of NRF2 does not alter SOD1 protein levels or activity.

To confirm whether copper chelation sensitizes KEAP1<sup>MUT</sup> cells through SOD1 inhibition, A549 cells were engineered to express an *Escherichia coli* manganese-dependent superoxide dismutase enzyme (SodA) to rescue SOD activity. Importantly, SodA expression significantly rescued the effects of copper chelation on  $\beta$ -lapachone treatment (Fig. 4F and G). Altogether, these data demonstrate that inhibition of SOD1 selectively increases  $\beta$ -lapachone efficacy in KEAP1<sup>MUT</sup> NSCLC cells.

## 3. Discussion

Aberrant NRF2 activation promotes resistance to therapeutics that rely on the production of ROS, including multiple chemotherapeutics and radiation therapy. In this study, we find that NRF2 activation also promotes resistance to the NQO1-activatable prodrug  $\beta$ -lapachone, which relies on the generation of superoxide for its efficacy. While direct NRF2 inhibition could potentially reverse this resistance, NRF2



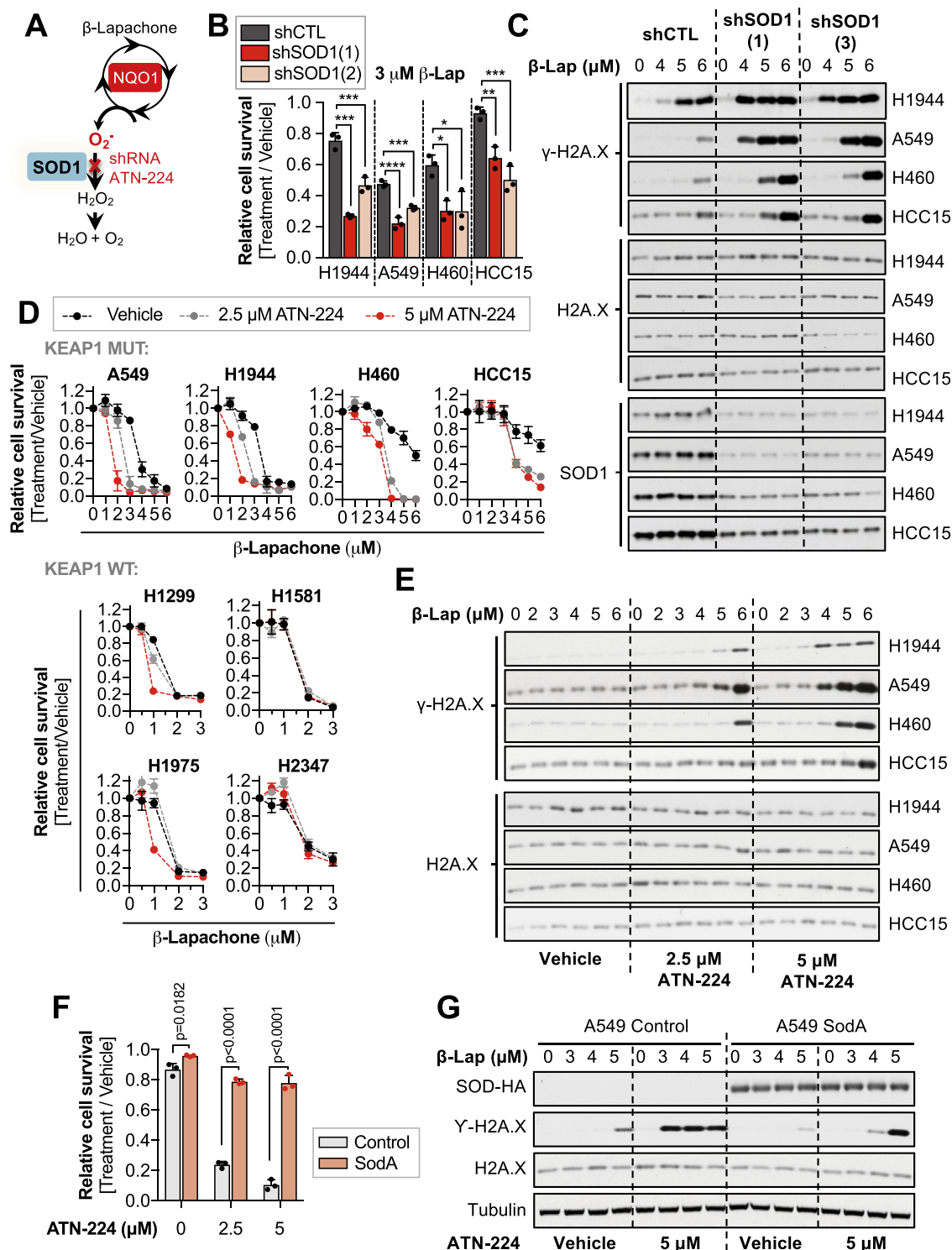
**Fig. 3.** Inhibition of the TXN-dependent system but not GSH and catalase enhances sensitivity to  $\beta$ -lapachone treatment.

(A) Assessment of  $\beta$ -lapachone sensitivity of NSCLC cell lines infected with shRNA against catalase (shCAT) or non-targeting control shRNA (shCTL). (B) Western blotting analysis of CAT and Actin (loading control) to validate the efficacy of the shRNAs against catalase. (C) Survival assays of a panel of KEAP1<sup>MUT</sup> cells exposed to  $\beta$ -lapachone alone or in combination with BSO (24 h pre-treatment) or auranofin (2 h co-treatment) to specifically inhibit the glutathione, and thioredoxin-dependent systems, respectively. Cells were fixed and stained with crystal violet 48 h after treatment. (D) DNA damage assessment of a panel of KEAP1 mutant cells exposed to  $\beta$ -lapachone alone or in combination with 3 or 5  $\mu$ M of auranofin for 2 h. Protein levels of total H2AX (loading control) and the DNA damage marker  $\gamma$ -H2AX (pS139) were assessed by western blotting. (E) Survival assays of KEAP1<sup>WT</sup> cells exposed to  $\beta$ -lapachone alone or in combination with BSO (24 h pre-treatment) or auranofin (2 h co-treatment). Surviving cells were fixed and stained 48 h after treatment. For A, C, and E, data are presented as mean  $\pm$  S.D. (For interpretation of the references to colour in this figure legend, the reader is referred to the Web version of this article.)

inhibitors identified to date either lack specificity or potency. Further, the effects of NRF2 whole-body inhibition as anti-tumor strategy remain unclear, as NRF2 activity is necessary for normal functioning of immune cells [46,47].

Consequently, we have evaluated whether inhibition of the cellular

antioxidant systems can reverse the resistance of NRF2 active cells to ROS. We find that inhibitors of the TXN-dependent peroxide detoxification system and SOD1, but not glutathione or catalase depletion, can reverse the resistance of KEAP1<sup>MUT</sup> cells to  $\beta$ -lapachone. Surprisingly, we find that KEAP1<sup>MUT</sup> cells were highly resistant to



(caption on next page)

auranofin compared to KEAP1<sup>WT</sup> cells, which raises a concern about the toxicity of the required auranofin doses to healthy tissues. The resistance of KEAP1<sup>MUT</sup> cells is likely explained by the redundancy of the thioredoxin- and glutathione-dependent antioxidant systems, which can both detoxify H<sub>2</sub>O<sub>2</sub> and protect from excessive oxidation. Indeed, even at the highest doses of auranofin, KEAP1<sup>MUT</sup> cells exhibited no peroxiredoxin oxidation in the absence of exogenous oxidants. This redundancy of the antioxidant program, particularly in cancer cells, represents a major challenge [48]. Although concomitant inhibition of

the GSH and the TXN-dependent systems has been shown to abolish such redundancy *in vitro*, this strategy appears to be highly toxic and potentially lethal *in vivo*. Elias Arnér's laboratory previously reported that combination of auranofin and BSO in mice, at concentrations that are tolerable as single agents, was lethal after the first round of administration [49].

While previous studies demonstrated an important role for H<sub>2</sub>O<sub>2</sub> in mediating β-lapachone cytotoxicity, we uncovered a surprising role for SOD1 in the protection against cell death in KEAP1<sup>MUT</sup> cells. The

#### Fig. 4. Inhibition of the copper-zinc superoxide dismutase (SOD1) potentiates $\beta$ -lapachone anti-tumor efficacy in NSCLC *in vitro*.

(A) Schematic representation of the potential role of SOD1 in the detoxification of  $\beta$ -lapachone-induced ROS. (B) Survival assays of a panel of KEAP1 mutant NSCLC cells infected with virus encoding for shRNAs against SOD1 (1, 2) or with a control shRNA (shCTL). NSCLC cells were treated with vehicle (0.012% DMSO) or with 3  $\mu$ M  $\beta$ -lapachone for 2 h. Cell viability was assessed 48 h after treatment. One-way ANOVA statistical test was performed, followed by the multiple comparison Dunnett's test. H1944 shCTL vs shSOD1(1) = 0.0001 (\*\*\*\*), shCTL vs shSOD1 (2) = 0.0003 (\*\*\*). A549 shCTL vs shSOD1(1) = 0.0001 (\*\*\*\*), shCTL vs shSOD1 (2) = 0.0007 (\*\*\*). H460 shCTL vs shSOD1(1) = 0.0133 (\*), shCTL vs shSOD1 (2) = 0.0128 (\*). HCC15 shCTL vs shSOD1(1) = 0.0039 (\*\*), shCTL vs shSOD1 (2) = 0.0005 (\*\*\*). (C) KEAP1 mutant cells were infected with virus encoding for shRNAs against SOD1 (1, 3) or with an shRNA control (shCTL). Cells were treated with 3  $\mu$ M  $\beta$ -lapachone and protein levels of total H2AX (loading control), SOD1 and the DNA damage marker  $\gamma$ -H2AX (pS139) were assessed by western blotting 2 h after treatment. (D) A panel of KEAP1 mutant (top) and KEAP1 WT (bottom) NSCLC cells were treated for 24 h with vehicle (0.05% DMSO) or with 2.5 or 5  $\mu$ M of ATN-224, after which cells were treated with  $\beta$ -lapachone for 2 h in ATN-224 or vehicle containing medium. Fresh media was added after treatment to allow for SOD1 reactivation. Cell viability was assessed 48 h after treatment using crystal violet. (E) NSCLC cells were treated for 24 h with vehicle (0.05% DMSO) or with 2.5 or 5  $\mu$ M of ATN-224, after which cells were treated with  $\beta$ -lapachone for 2 h in ATN-224 or vehicle containing medium. Protein levels of total H2AX (loading control) and the DNA damage marker  $\gamma$ -H2AX (pS139) were assessed by western blotting. (F) A549 cells were infected with virus coding for the expression of *E. coli* MnSOD (SodA) or an empty vector (control). Cells were pre-treated for 24 h with ATN-224 (2.5 or 5  $\mu$ M) or vehicle (0.05% DMSO), after which cells were exposed to 2  $\mu$ M of  $\beta$ -lapachone (alone or in combination with the indicated concentrations of ATN-224) for 2 h. Surviving cells were stained with crystal violet 48 h after treatment. (G) A549 SodA or control were pre-treated for 24 h with ATN-224 (5  $\mu$ M) or vehicle, after which cells were exposed to the indicated concentrations of  $\beta$ -lapachone (alone or in combination of ATN-224) for 2 h. Protein levels of SodA (HA-tag), Tubulin (loading control), total H2AX (loading control), and the DNA damage marker  $\gamma$ -H2AX (pS139) were assessed by western blotting. For B, D, and F, data are presented as mean  $\pm$  S.D. (For interpretation of the references to colour in this figure legend, the reader is referred to the Web version of this article.)

selectivity of SOD1 inhibition for KEAP1<sup>MUT</sup> cells may be a consequence of the enhanced peroxide detoxification capacity of these cells, while KEAP1<sup>WT</sup> cells may be equally sensitive to both peroxide and superoxide. Importantly, our results suggest that antioxidant inhibition may sensitize NRF2/KEAP1 mutant cells to other ROS-generating therapeutics to which these cells are generally resistant. In agreement with our findings, a recent study found that SOD1 deletion or modulation of copper availability sensitized Jurkat cells to the superoxide generating compound paraquat [50]. Interestingly, SOD1 inhibition alone could target NSCLC cells in a study using A549 and H460 cells, which are KEAP1 mutant [51]. Authors also found that SOD1 inhibition was synergistic with glutathione depletion, suggesting that alternative combinations to inhibit the antioxidant capacity of KEAP1 mutant cells may be possible.

Auranofin and ATN-224 join the growing list of agents that can sensitize cells to  $\beta$ -lapachone. These agents converge on DNA damage and repair (PARP and XRCC1) [27,40], NAD<sup>+</sup> availability (NAMPT) [52], and ROS (GLS1 inhibition) [53]. However, cautions should be taken when considering combination of  $\beta$ -lapachone and inhibition of antioxidant systems for *in vivo* studies, as it might increase toxicity. Indeed,  $\beta$ -lapachone has been shown to induce toxicity in red blood cells due to the production of methemoglobin [54,55], which might represent a major limitation when combined with SOD1 or TXNRD inhibitors. Recently, more potent NQO1-activatable compounds, including the deoxyxyboquinones (DNQs) have shown equivalent efficacy to  $\beta$ -lapachone at 6-fold lower dose [22]. Isobutyl-deoxyxyboquinone (IB-DNQ) is being developed for clinical use [56], and lacks the issues with stability, solubility and red blood cell toxicity that  $\beta$ -lapachone demonstrates. Further, Napabucasin, a well-characterized STAT3 inhibitor currently in clinical trials [57,58], has also been shown recently to induce cytotoxicity via NQO1-dependent redox cycling and, to a lesser extent, through cytochrome P450 oxidoreductase one-electron reduction [59]. In agreement with our data, authors also observed that depletion of TXNRD1 also conferred sensitivity to Napabucasin in pancreatic cancer cells. Our results suggest KEAP1<sup>MUT</sup> cells would be resistant to IB-DNQ and Napabucasin as well, and KEAP1/NRF2 mutation status should be considered in addition to NQO1 levels when predicting *in vivo* response to these agents.

#### 4. Materials and methods

**Reagents and chemicals.**  $\beta$ -Lapachone and dicoumarol were a gift from Professor David Boothman. Nitrotetrazolium Blue chloride powder (N6639), riboflavin (R7649), Auranofin (A6733-10MG) and Catalase from bovine liver (C1345) were all obtained from Sigma Aldrich. L-Buthionine-(S,R)-Sulfoximine (BSO) was obtained from

Cayman Chemical (14484) or from Sigma Aldrich (B2515-500MG). ATN-224 was purchased from Cayman Chemical (23553). N-Ethylmaleimide was purchased from Chemimpex.

**Cell culture and reagents.** Parental NSCLC cell lines were previously described (DeNicola et al., 2015). NRF2-KO A549 cells were obtained from Dr. Laureano de la Vega (Torrente et al., 2017). Cell lines were routinely tested and verified to be free of mycoplasma (MycoAlert Assay, Lonza). All lines were maintained in RPMI 1640 media (Hyclone or Gibco) supplemented with 5–10% FBS without antibiotics at 37 °C in a humidified atmosphere containing 5% CO<sub>2</sub> and 95% air. Lenti-X 293T cells were obtained from Clontech, and maintained in DMEM media (Hyclone or Gibco) supplemented with 10% FBS.

**Antibodies.** The following antibodies were used: NRF2 (Cell Signaling Technologies, D1Z9C, Cat #12721), NQO1 (Sigma Aldrich, Cat# HPA007308),  $\beta$ -actin (Thermo Fisher, clone AC-15, Cat # A5441),  $\alpha$ -tubulin (Santa Cruz, TU-02, Cat #sc-8035), Total Histone H2A.X (Cell Signaling Technologies, D17A3, Cat #9718), Gamma Histone H2A.X (Cell Signaling Technologies, 20E3, Cat #7631S), KEAP1 (Millipore Sigma, Cat# MABS514), SOD1 (Cell Signaling Technologies, 71G8, Cat #4266), Catalase (Cell Signaling Technologies, D4P7B, Cat #12980S), Flag Tag (Cell Signaling Technologies, M2, Cat# 14793S), HA-Tag (Cell Signaling Technologies, C29F4, Cat #3724), Prdx3 (Abcam, Cat #ab73349), Prdx1 (Cell Signalling, D5G12, Cat# 50-191-580)

**Plasmids.** shRNAs against SOD1, NRF2 and catalase in the pLKO.1 backbone were purchased from Dharmacon. shSOD1(1) TRCN0000039809, shSOD1 (2) TRCN0000039812, shSOD1 (3) TRCN0000039808. shNRF2(1) TRCN000007555 and shNRF2 (2) TRCN0000281950 were previously described [60]. shCAT TRCN0000061756. The shRNA control was purchased from Sigma-Aldrich (#SHC002). pLX317-NRF2 and pLX317-NRF2<sup>T80K</sup> were obtained from Dr. Alice Berger [61] and the pLX317 empty control vector was generated by site-directed mutagenesis as previously described [62]. SodA: The cDNA encoding for the MnSOD (Gene name: sodA) of *Escherichia coli* (strain K12) containing a c-terminal Influenza Hemagglutinin (HA) reporter tag was cloned into the backbone pLX317-empty using the In-Fusion cloning kit (Clontech). The backbone was cut with BamHI and EcoRI. KEAP1 WT and KEAP1 C273S vectors were obtained from Dr. Christian Metallo [63] (Fig. 1F) and KEAP1 proteins were subcloned into the pLX317-empty backbone (Fig. 2F and S2A) between the NheI and EcoRV sites.

**Stable cell line generation.** Stable cell lines were generated via lentiviral transduction. For lentivirus production, Lenti-X 293T cells (Clontech) were transfected at 90% confluence with JetPRIME (Polyplus) or Polyethylenimine (PEI). Packaging plasmids pCMV-dR8.2 dvpr (addgene # 8455) and pCMV-VSV-G (addgene #8454) were used. Cells were transduced for 6 h by recombinant lentiviruses in growth



media using polybrene (8 µg/ml). Twenty-four hours after transduction, puromycin (1 µg/ml) was added to the growth medium for 72 h to select for infected cells.

**Cell viability assays.** NSCLC cells were seeded in 96-well plates at a density of 2,500–5,000 cells/well in a 200 µl final volume. The following day, the media was replaced with 150 µl of fresh media containing the indicated concentrations of β-lapachone or vehicle (≤0.1% DMSO) for 2 h, after which media was replaced. Two hours after treatment, medium was replaced by 200 µl fresh medium. Cell viability was assessed 48 h after treatment with CellTiter-Glo (Promega) or crystal violet staining. To stain surviving cells with crystal violet, cells were washed in ice-cold PBS, fixed with 4% paraformaldehyde, stained with crystal violet solution (0.1% Crystal Violet, 20% methanol), washed with H<sub>2</sub>O and dried overnight. Crystal violet was solubilized in 10% acetic acid for 30 min and the OD600 was measured. Relative cell number was normalized to vehicle treated cells.

For experiments using the copper chelator ATN-224, cells were pre-treated with 1–5 µM of ATN-224 for 24 h prior β-lapachone treatment. To ensure that no copper was added back with the media when cells were treated with β-lapachone, additional ATN-224 containing medium was prepared the day before β-lapachone treatment and stored at 4°C. After 24 h, β-lapachone was prepared in ATN-224 containing medium and 150 µl were dispensed in each well. Similarly, cells were pre-treated for 24 h with 100–200 µM of BSO prior β-lapachone exposure, which was prepared in BSO containing media to prevent the recovery of glutathione. Auranofin was added to the media in combination with β-lapachone for 2 h.

**Protein extraction and Immunoblotting.** Lysates were prepared in RIPA lysis buffer (20 mM Tris-HCl [pH 7.5], 150 mM NaCl, 1 mM EDTA, 1 mM EGTA, 1% NP-40, 1% sodium deoxycholate) containing protease and phosphatase inhibitors. To assess total/gamma-H2A.X levels in whole cell lysates, cells were lysed in boiling 1% w/v SDS RIPA lysis buffer supplemented with phosphatase and protease inhibitors. Cells were seeded in 6-well plates at 70–90% confluence. After drug treatment (β-lapachone ± ATN-224 or auranofin) cells were washed in PBS and 300 µl of pre-warmed lysis buffer (90°C) was directly added to the wells. Cell lysates were transferred to a microcentrifuge tubes, incubated at 90°C for 5 min, followed by sonication to shred the DNA in a water bath sonicator (Diagenode). Samples were centrifuged at 13,000 x rpm for 15 min at 4°C to precipitate the insoluble fraction. The supernatant was transferred to a clean Eppendorf tube. Alternatively, total/gamma-H2A.X levels were monitored in nuclear extracts (see protocol below). Cell lysates were mixed with 6X sample buffer containing β-ME and separated by SDS-PAGE using NuPAGE 4–12% Bis-Tris gels (Invitrogen), followed by transfer to 0.45µm Nitrocellulose membranes (GE Healthcare). The membranes were blocked in 5% non-fat milk in TBS-T, followed by immunoblotting.

**Nuclear isolation.** Cells were plated in 6-cm dishes at 70–90% confluence (5 × 10<sup>5</sup> cells/well). The following day, cells were washed with ice-cold PBS, collected in 1 ml of ice-cold PBS, transferred to microcentrifuge tubes, and subjected to centrifugation at 13,000 × rpm for 1 min at 4°C. The cell pellet was resuspended in 400 µl of ice-cold of the low-salt buffer A (10 mM HEPES/KOH pH 7.9, 10 mM KCl, 0.1 mM EDTA, 0.1 mM EGTA and protease/phosphatase inhibitors). After incubation for 10 min on ice, 10 µl of 10% NP-40 was added and cells were lysed by gently vortexing. The homogenate was centrifuged for 10 s at 13,200 rpm. The supernatant was collected as the cytoplasmic fraction while the pellet containing the cell nuclei was washed 4 times in 400 µl buffer A. Cell nuclei was lysed in 100µl high-salt buffer B (20mM HEPES/KOH pH7.9, 400mM NaCl, 1mM EDTA, 1mM EGTA and protease/phosphatase inhibitors). The lysates were sonicated and centrifuged at 4 °C for 15 min at 13,200 rpm. The supernatant representing the nuclear fraction was collected and protein concentration of both fractions was determined using the DC protein assay (Biorad). Cytosolic and nuclear fractions were further diluted to the desired protein concentration using the corresponding lysis buffers. One volume of 5X

sample SDS loading buffer (250 mM Tris-Cl [pH 6.8], 10% [v/v] SDS, 40% [v/v] glycerol, and 0.1% [w/v] bromophenol blue, 15% [v/v] β-mercaptoethanol) was added to 4 volumes of the lysate and subjected to SDS-PAGE.

**In-gel SOD activity assay.** Cells were plated in 35 mm diameter cell culture dishes at a density of 5 × 10<sup>5</sup> if assayed the following day or 3.5 × 10<sup>5</sup> cells/well if 24 h of ATN-224 pre-treatment was required. Cells were collected by scraping with ice-cold PBS and lysed on ice for 30 min in 100 µl of SOD lysis buffer (8.96 mM Na<sub>2</sub>HPO<sub>4</sub>, 0.96 mM NaH<sub>2</sub>PO<sub>4</sub>, 0.1% Triton X-100, 5 mM EDTA, 5 mM EGTA, 50 mM NaCl, 10% Glycerol). Samples were centrifuged for 15 min at 13,000 x rpm at 4 °C, and supernatant transferred to a microcentrifuge tube. Protein concentration was determined using the DC protein Assay (Biorad). Protein samples were diluted to 0.7–1 µg/µl using the SOD lysis buffer and 1/5th volume of 5x native loading dye [0.31 M Tris pH 6.8, 0.05% bromophenol blue (w/v), 50% glycerol (v/v)]. Samples were subjected to native polyacrylamide gel electrophoresis (7.5%) at 90V for 2 h at 4 °C in a buffer containing 25 mM Tris, 192 mM glycine. The gel was stained in SOD staining solution (0.22 M K<sub>2</sub>HPO<sub>4</sub>, 0.02 M KH<sub>2</sub>PO<sub>4</sub>, 1% [w/v] Riboflavin, 1.3% [w/v] Nitro blue tetrazolium and 0.1% TEMED) in the dark for 1 h, after which the gel was washed in dH<sub>2</sub>O and exposed to light until developed to dark blue/black (1 h approximately). Achromatic bands correspond to SOD1 and SOD2.

**Reactive oxygen species measurement.** Reactive oxygen species were measured using the CellROX green reagent (ThermoFisher) according to the manufacturer's instructions. In short, cells were plated in 24-well plates at 70% confluence. The following day, cells were treated with the indicated concentrations of β-lapachone in a 400 µl/well final volume for 30 min at 37 °C. CellROX green reagent was added to a final concentration of 5 µM to the cells without replacing the media, and incubated for additional 30 min at 37 °C. Cells were washed in PBS, trypsinized and transferred to microcentrifuge tubes. The cell suspension was centrifuged for 20 s at 13,000 x rpm, and resuspended in 300 µl of ice-cold PBS. The Green fluorescence of dye-loaded cells was determined by flow cytometry using the FACSCalibur flow cytometer (BD Biosciences) and the acquisition software CellQuest Pro. The mean fluorescence intensity of 10,000 discrete events was calculated for each sample.

**Glutathione measurement.** H1944 and HCC15 cells were seeded on flat, round bottomed 96-well plates at a density of 1 × 10<sup>4</sup> cells/well. The following day, media was replaced with media containing 100–200 µM of BSO or fresh media (negative control). The following day, the GSH-Glo™ Glutathione Assay (Promega, Cat# V6911) was used to measure the intracellular reduced glutathione pool (GSH). Data were normalized by percentage relative to the control non-treated sample.

**Redox western blotting.** The protocol for determining the ratio of reduced and oxidized peroxiredoxin 1 and 3 was adapted from Prof. Mark Hampton's lab [64]. One-day prior to the assay, cells were seeded in 6-well plates at 70–90% confluence (~5 × 10<sup>5</sup> cells/well). The following day, cell culture media was replaced with 1ml of media containing 1, 3 or 5 µM of auranofin or fresh medium. Final DMSO concentration was 0.013% (V/V). Two hours after treatment, media was aspirated and cells were gently washed with 1 ml of ice-cold PBS. 1 mg/ml of bovine catalase was added to the alkylation buffer (40mM HEPES, 50mM NaCl, 1mM EGTA, complete protease inhibitors, pH 7.4) 30 min prior collection. Immediately prior sample collection, 200 mM of N-Ethylmaleimide (NEM) were added to the alkylation buffer and the lysis buffer was warmed to 42 °C for 1–2 min to dissolve the NEM. To lyse the cells, 200 µl of alkylation buffer were dispensed in each well, followed by 10 min incubation at room temperature. A solution of 10% CHAPS was added to the lysates to a final concentration of 1% CHAPS (20 µl/sample). Cell lysates were transferred to a 1.5 ml microcentrifuge tube, samples were vortex and incubated on ice for further 30 min, followed by 15 min centrifugation at 13,000 x rpm, 4°C. The supernatant was transferred to a clean 1.5 ml microcentrifuge tube. These redox western samples were mixed with a 4X non-reducing buffer

prior to separation by SDS-Page.

**Analysis of NQO1 mRNA expression in patient samples.** Patient normal lung, LuAD and LuSC data mRNA data was obtained by combining the data available in cBioportal and the MethHC databases. Patient LuAD and LuAD data from The Cancer Genome Atlas (TCGA), with associated KEAP1 mutation status (Illumina HM450 Beadchip), was obtained from cBioPortal [65,66]. Patient IDs were matched with the data from The Cancer Genome Atlas (TCGA) via the MethHC database [67], and expression of NQO1 in normal lung tissue data was included in the study.

**Seahorse assay (Oxygen consumption).** Seahorse assays were performed using the Seahorse XFe96 analyzer (Agilent) according to the manufacturer's instructions.  $4 \times 10^4$  cells/well were seeded in the seahorse XF96 cell culture microplates at a final volume of 80  $\mu$ l. Sensor cartridge was hydrated overnight in a non-CO<sub>2</sub> 37 °C incubator with Seahorse the XF calibrant (200  $\mu$ l). The following day, cell media was changed to bicarbonate-free supplemented with 4.5 g/L glucose, 2mM glutamine and antibiotics (penicillin/streptomycin) at a final volume of 175  $\mu$ l/well. Cells were incubated for 40 min-1 hour in a non-CO<sub>2</sub> 37 °C incubator.  $\beta$ -Lapachone and dicoumarol were prepared as concentrated stocks (8X). Three baseline measurements were obtained prior to injection of  $\beta$ -lapachone alone or in combination with dicoumarol. All the experimental conditions contained equal amounts of  $\beta$ -lapachone vehicle (0.016% DMSO) and dicoumarol vehicle (150  $\mu$ M NaOH). After  $\beta$ -lapachone/dicoumarol injections, the Oxygen Consumption Rate was followed for 2 h (20 measurements). OCR values displayed in Fig. 1E depict the OCR 117 min after  $\beta$ -lapachone  $\pm$  dicoumarol injections.

**Cytotoxicity assay (CellTox™ green cytotoxicity assay).** H1581 cells were seeded on flat, black-walled, clear bottom 96-well plates at a density of  $1 \times 10^4$  cells/well. The following day, cells were exposed to  $\beta$ -lapachone for 2 h, after which the medium was replaced by phenol-free RPMI medium supplemented with 5% FBS and antibiotics (penicillin/streptomycin) and 1X of CellTox green dye (Promega, Cat# G8741) to a final volume of 100  $\mu$ l. Fluorescent signal was monitored by microscopy and the images shown in S1B were taken 48-h post  $\beta$ -lapachone treatment.

**Statistical analyses.** Data were analyzed using a two-sided unpaired/paired Student's *t*-test or One-way ANOVA followed by Tukey's or Dunnett's multiple comparison tests as appropriate. GraphPad Prism 7 software was used for all statistical analyses, and values of  $P < 0.05$  were considered statistically significant (\* $P < 0.05$ ; \*\* $P < 0.01$ ; \*\*\* $P < 0.001$ , \*\*\*\* $P < 0.0001$ ).

#### Author contributions

Conceptualization, L.T. and G.M.D.; Methodology, L.T., and G.M.D.; Investigation, L.T., N.P.F., and A.F.; Resources – D.A.B.; Writing – Original Draft, L.T. and G.M.D.; Writing – Review & Editing, L.T. N.P.F. and G.M.D.; Funding Acquisition, G.M.D. and E.B.H.; Supervision, G.M.D., E.B.H. and D.A.B.

#### Declaration of competing interestCOI

The authors declare no competing interests.

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#### Appendix A. Supplementary data

Supplementary data to this article can be found online at <https://doi.org/10.1016/j.redox.2020.101440>.

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