



Published in final edited form as:

Nature. 2019 November ; 575(7782): 380–384. doi:10.1038/s41586-019-1715-0.

***In vivo* imaging of mitochondrial membrane potential in non-small cell lung cancer**

Milica Momcilovic¹, Anthony Jones³, Sean T. Bailey¹², Christopher M. Waldmann³, Rui Li¹, Jason T. Lee^{3,8,9}, Gihad Abdelhady¹, Adrian Gomez⁵, Travis Holloway³, Ernst Schmid⁴, David Stout¹¹, Michael C. Fishbein², Linsey Stiles⁶, Deepa V. Dabir¹⁰, Steven M. Dubinett^{1,2,3,9,13}, Heather Christofk^{3,4,7,9}, Orian Shirihai^{6,9}, Carla M. Koehler⁵, Saman Sadeghi³, David B. Shackelford^{1,9,§}

¹Division of Pulmonary and Critical Care Medicine, Department of Medicine, David Geffen School of Medicine at the University of California, Los Angeles, CA 90095

²Department of Pathology and Laboratory Medicine, David Geffen School of Medicine at the University of California, Los Angeles, CA 90095

³Department of Molecular and Medical Pharmacology, David Geffen School of Medicine at the University of California, Los Angeles, CA 90095

⁴Department of Biological Chemistry, David Geffen School of Medicine at the University of California, Los Angeles, CA 90095

⁵Department of Chemistry and Biochemistry, David Geffen School of Medicine at the University of California, Los Angeles, CA 90095

⁶Department of Endocrinology, David Geffen School of Medicine at the University of California, Los Angeles, CA 90095

⁷UCLA Metabolomics Center, David Geffen School of Medicine at the University of California, Los Angeles, CA 90095

Materials & Correspondence should be sent to David B. Shackelford dshackelford@mednet.ucla.edu.

[§]corresponding author

Author contributions

D.B.S. conceived the study and wrote the manuscript. D.B.S., M.M., S.T.B. and A.J. designed experiments. M.M., S.T.B., A.J. and J.T.L. performed and analyzed PET/CT imaging. S.T.B. and D.S. analyzed biodistribution data. M.M. and S.T.B. induced tumors in KL mice using AdenoCre and/or LentiCre. S.T.B. and M.M. created KPL cell lines. M.M. and S.T.B. treated mice. M.M., R.L., and A.J. performed transthoracic injections. G.A. performed a portion of the CT scans. M.M. and S.T.B. performed IHC staining and analyzed data. M.M. J.T.L. and A.J. performed *in vitro* ¹⁸FBNTP uptake assays. M.M. did TMRE staining and western blots. M.C.F. is a board-certified anatomic pathologist who performed the pathological analysis. L.S. and O.S. performed and guided respirometry experiments. S.S., C.M.W., A.G. and T.H. performed radio-tracer synthesis. D.D. and C.K. performed biochemical analysis of mitochondria. E.S. and H.C. performed metabolic analysis of lung tumors. S.M.D. contributed resources and critical feedback on the project.

Data availability

Source data for Western blots are provided with the paper as Supplementary Figure 1. Source data for Figures 1b–d; Figures 2d–g; Figures 3b, 3d, 3e; ED Figures 3c–e; ED Figures 4c, 4d; ED Figure 9a are provided with the paper.

The data that support the findings of this study are available from the corresponding author upon reasonable request.

Competing financial interests

Steven M. Dubinett is an advisory board member for EarlyDx Inc., T-Cure Bioscience Inc., Cynvenio Biosystems Inc. and the Johnson and Johnson Lung Cancer Initiative. D.B.S., M.M. and S.S. have filed a provisional patent U.S. 62/901,947 and are listed as inventors. The patent proposes the use of ¹⁸FBNTP PET to guide use of complex I inhibitors for the treatment of lung cancer.

⁸Crump Institute for Molecular Imaging, David Geffen School of Medicine at the University of California, Los Angeles, CA 90095

⁹Jonsson Comprehensive Cancer Center; David Geffen School of Medicine at the University of California, Los Angeles, CA 90095

¹⁰Department of Biology, Loyola Marymount University, Los Angeles, CA 90045.

¹¹Regis College, Weston, MA 02493

¹²University of North Carolina Chapel Hill, Chapel Hill, NC 27599

¹³VA Greater Los Angeles Healthcare System, Los Angeles CA 90073.

Abstract

The mitochondria are essential regulators of cellular energy and metabolism and they play a critical role in sustaining growth and survival of cancer cells. A central process of the mitochondria is the synthesis of ATP through oxidative phosphorylation (OXPHOS) known as bioenergetics. The mitochondria maintain OXPHOS by creating a membrane potential gradient (Ψ) that is generated by the electron transport chain (ETC) in order to drive ATP synthesis¹. Mitochondria are essential for tumor initiation and maintenance of tumor cell growth in cell culture and xenografts^{2,3}. However, our understanding of oxidative mitochondrial metabolism in cancer is limited because the majority of studies have been performed *in vitro* in cell culture models. This has left a large gap in our knowledge of how oxidative mitochondrial metabolism supports tumor growth and highlights a need for *in vivo* studies. Therefore we sought to measure mitochondrial Ψ *in vivo* in non-small cell lung cancer (NSCLC) using a voltage sensitive, positron emission tomography (PET) tracer known as 4-[¹⁸F]fluorobenzyl triphenylphosphonium (¹⁸FBnTP)⁴. We used ¹⁸FBnTP PET imaging to profile mitochondrial Ψ in autochthonous mouse models of lung cancer and discovered distinct functional mitochondrial heterogeneity within NSCLC tumor subtypes. The use of ¹⁸FBnTP PET imaging enabled us to functionally profile mitochondrial Ψ in live tumors.

Keywords

mitochondria; ¹⁸FBnTP; membrane potential; bioenergetics; OXPHOS; non-small cell lung cancer; Kras; Lkb1; tumor heterogeneity

Mitochondria are required for lung tumorigenesis as was shown in a *Kras*^{G12D} driven genetically engineered mouse models (GEMM) of lung cancer⁵. Therefore we used *Kras*^{G12D} mutant, *Lkb1* deficient (*KL*) GEMMs to perform ¹⁸FBnTP PET imaging on lung tumors *in vivo*^{6,7}. ¹⁸FBnTP is a positively charged lipophilic cation that localizes to the negatively charged mitochondrial inner membrane in a voltage-dependent manner^{8,9}. ¹⁸FBnTP has been studied in rodent and canine myocardium to detect myocardial infarction^{4,10} and in tumor xenografts as a surrogate marker of apoptosis following chemotherapy treatment¹¹. While mass spectroscopy based approaches have been used to study Ψ ¹², no study to date has used ¹⁸FBnTP PET to measure mitochondrial Ψ using autochthonous murine models of lung cancer. We first synthesized ¹⁸FBnTP as previously described¹³ and performed PET imaging on lung tumors in *KL* mice ten weeks post tumor

induction. We identified both ^{18}F BnTP positive lung tumors and heart (Figure 1a). We performed biodistribution analysis of tissues by either measuring gamma counts or percent injected dose per gram (%ID/g) and confirmed high uptake of the tracer in the heart, liver and intestine as well as low uptake in normal lung, skeletal muscle and brain (Figures 1b,c). Analysis of ^{18}F BnTP PET imaged *KL* mice identified two distinct populations of lung tumors distinguished by either high or low ^{18}F BnTP uptake (Figure 1d,e). Interestingly, we confirmed that tumors with high ^{18}F BnTP avidity segregated with lung adenocarcinomas (ADCs) while lung squamous cell carcinomas (SCC) tumors had uniformly lower avidity for ^{18}F BnTP (Figures 1d). We confirmed lung tumor histology by staining tumors for cytokeratin 5 (CK5) to mark SCC and thyroid transcription factor 1 (TTF1) or surfactant protein C (SP-C) to identify ADCs (Figure 1f; Extended Data Figure 1). We suspected low mitochondrial content in lung SCC may have explained the reduced Ψ and ^{18}F BnTP uptake. Therefore, we stained tumors for the pan mitochondrial marker Tom20 and confirmed similar staining intensities for both lung ADC and SCC (Figure 1f). We performed additional analysis of the mitochondrial membrane proteins Tom20, 40, 70 and Tim23 in lung ADC and SCC from *KL* mice and showed that ADCs (SP-C:actin ratio >0.5) had no discernable difference in expression of these proteins as compared to SCC (SP-C:actin ratio <0.5) (Extended Data Figure 1). These results demonstrate that both tumor subtypes have similar mitochondrial content but a two-fold difference in ^{18}F BnTP affinity (Figure 1d).

We next sought to validate ^{18}F BnTP as a voltage sensitive marker of both Ψ and OXPHOS by treating cells with mitochondrial complex I inhibitor phenformin, which dissipates Ψ and inhibits OXPHOS¹⁴ (Figure 2a). Short-term phenformin treatment of the human lung ADC cell line A549 or the mouse lung ADC line L3161C (derived from a *Kras*^{G12D};*p53*^{-/-};*Lkb1*^{-/-} mouse) significantly reduced Ψ in a dose dependent manner but did not affect cell viability (Extended Data Figures 2a–e). Likewise, acute treatment of A549 cells with phenformin significantly reduced ^{18}F BnTP uptake similar to results with TMRE staining (Extended Data Figure 2f). Phenformin also resulted in a significant reduction of cellular OXPHOS in both A549 and L3161C cells as measured by respirometry (Extended Data Figures 2g, h). Lastly, we treated L3161C cells with oligomycin, a complex V ATPase inhibitor, which induces increased Ψ . We detected a significant increase in TMRE and ^{18}F BnTP uptake following oligomycin treatment while Ψ was significantly reduced following the addition of the mitochondrial uncoupler FCCP (Extended Data Figures 2i, j) matching a response equal to the MitoClick probe¹². Oligomycin +/- FCCP did not significantly affect cell viability (Extended Data Figure 2k).

We next measured ^{18}F BnTP uptake in lung tumors of *KL* mice before and after phenformin or vehicle (saline) treatment (Figure 2b). Representative PET images show reduced ^{18}F BnTP uptake in phenformin treated lung tumors (Figure 2c). Treatment groups showed no significant difference in ^{18}F BnTP uptake values before start of the treatment (Figure 2d) but showed a significant reduction in ^{18}F BnTP uptake in the mice that received phenformin (Figure 2e). Three independent experiments were performed on *KL* mice that demonstrated a significant reduction in ^{18}F BnTP uptake in phenformin treated lung tumors as compared to vehicle (Figure 2f). We further quantified the percent change in ^{18}F BnTP uptake following treatment and showed that phenformin induced a significant drop in tracer uptake compared

to vehicle treated mice (Figure 2g). *KL* lung ADCs are sensitive to phenformin,⁷ therefore it was possible that reduced ¹⁸FBnTP uptake was due to phenformin induced cell death. Cleaved Caspase 3 (CC3) and Ki67 staining showed no evidence of phenformin induced apoptosis or reduced cell viability (Extended Data Figures 3a–d) agreeing with previously published studies that showed longer duration of phenformin treatment induced cellular apoptosis^{7,15}. Mass spectrometry analysis of phenformin treated *KL* lung tumors showed a significant increase in intra-tumoral phenformin as compared to vehicle treated tumors (Extended Data Figure 3e). Collectively, results in Figure 2 demonstrate that ¹⁸FBnTP is a voltage sensitive probe that detected changes in Ψ and OXPHOS *in vitro* and *in vivo* in lung tumor cells.

We then investigated whether ¹⁸FBnTP could selectively measure changes in Ψ and OXPHOS *in vivo* following treatment with a broader panel of ETC inhibitors. The complex I inhibitors included metformin, phenformin, or rotenone, which all reduce Ψ and suppress OXPHOS^{7,14,16} as well as the complex V inhibitor oligomycin, which induces an increase in Ψ . We utilized an orthotopic mouse model in which we transthoracically (TT) implanted L3161C lung tumor cells into the left lobe of syngeneic recipient mice (Figure 3a) to profile Ψ in lung tumors. Importantly, this enabled us to spatially localize a single lung tumor in the left lobe of the mouse and perform ¹⁸FBnTP PET imaging on mouse lung ADC tumors (Extended Data Figures 3f–h). We then measured ¹⁸FBnTP uptake in syngeneic mice TT implanted with L3161C cells following acute 4 hour treatment with either oligomycin or rotenone¹⁷ (Figure 3a). We used a safely tolerated dose of rotenone (0.5 mg/kg) or oligomycin (0.25 mg/kg) below the toxic dose range¹⁸. We show that ¹⁸FBnTP uptake in lung tumors was significantly increased after delivery of oligomycin whereas rotenone treatment significantly reduced ¹⁸FBnTP uptake (Figure 3b). Our results demonstrate that ¹⁸FBnTP PET detected acute changes in Ψ in lung tumors following inhibition of respiratory complexes I or V.

At a cellular level metformin, like phenformin, inhibits mitochondrial complex I resulting in reduced OXPHOS^{19–21}, and is broadly used world wide to clinically manage type 2 diabetes²². We therefore sought to determine if ¹⁸FBnTP PET could measure direct changes in the Ψ and complex I activity of lung tumors *in vivo* following systemic treatment of mice with metformin (Figure 3c). Our results show that ¹⁸FBnTP uptake in lung tumors was significantly reduced in the mice that received metformin compared to the vehicle treated mice (Figure 3d). As expected it had slightly less inhibition of ¹⁸FBnTP uptake than its more potent analog phenformin (Figures 3d and 3e). Similar to phenformin, metformin did not induce apoptosis, cell death or significantly alter tumor growth as measured by CC3 and Ki67, respectively (Extended Data Figure 3j). These results confirm that ¹⁸FBnTP imaging can accurately detect a loss of Ψ following delivery of metformin.

We next tested whether expression of the *Saccharomyces cerevisiae* NADH dehydrogenase (ND1), which oxidizes NADH similar to mammalian mitochondrial complex I, would render lung tumor cells insensitive to biguanides and prevent loss of ¹⁸FBnTP uptake following complex I inhibition^{21,23}. Expression of ND1 in L3161C lung tumor cells (L3161C-ND1) conferred resistance to phenformin as L3161C-ND1 cells maintained higher OXPHOS following phenformin treatment as compared to cells expressing the vector alone (Extended

Data Figures 4a, b). ^{18}F BnTP PET imaging identified that L3161C-ND1 tumors were resistant to phenformin and showed no loss of ^{18}F BnTP uptake as compared to vector expressing L3161C tumors (Extended Data Figure 4c) while vehicle treated L3161C-ND1 and vector tumors were both positive for ^{18}F BnTP uptake (Extended Data Figure 4d). Our results demonstrate that ^{18}F BnTP imaging is sensitive to functional changes in complex I activity.

NSCLC is marked by genetic, metabolic and histological heterogeneity in tumors^{24–26}. We next sought to perform multi-tracer PET imaging on *KL* mice using both ^{18}F BnTP and [^{18}F]Fluoro-2-deoxyglucose (^{18}F -FDG) PET tracers as a means to non-invasively profile glucose metabolism with ^{18}F -FDG and mitochondrial Ψ with ^{18}F BnTP. Multi-tracer PET imaging of *KL* lung tumors revealed distinct metabolic heterogeneity between lung tumors in which we identified three distinct tumor populations – glycolytic ^{18}F -FDG^{POS}/ ^{18}F BnTP^{NEG} tumors, oxidative ^{18}F BnTP^{POS}/ ^{18}F -FDG^{NEG} tumors and those with increased uptake of both tracers (Extended Data Figure 5a). Histological analysis of PET imaged lung tumors revealed that ^{18}F -FDG^{POS}/ ^{18}F BnTP^{NEG} tumors were SCC marked by positive CK5-TTF1 staining and ^{18}F BnTP^{POS}/ ^{18}F -FDG^{NEG} tumors were positive for TTF1 and absent of CK5 staining confirming ADC histology (Extended Data Figures 5b,c).

Both lung ADC and SCC showed distinct ^{18}F BnTP and ^{18}F -FDG profiles suggesting these tumor subtypes may have distinct bioenergetic profiles. Previous studies have shown that lung SCC tumors from *KL* mice are refractory to phenformin, which suggested that lung SCC tumors may harbor intrinsic defects in complex I that modulate response to complex I inhibition^{15,27}. Supporting this, a study of mitochondrial proteins in human NSCLC identified that late stage lung carcinomas have reduced expression of NDUFS1 and NDUFV1²⁸, which are complex I subunits involved in the transfer of electrons from NADH (Extended Data Figure 6a). We performed a PET guided biochemical analysis of Ndufs1 and Ndufv1 in lung ADCs and SCCs in *KL* mice. We identified that ^{18}F BnTP^{NEG}/ ^{18}F -FDG^{POS} SCC tumors (shown in red) had a marked reduction in Ndfus1 and Ndufv1 proteins as compared to ^{18}F BnTP^{POS}/ ^{18}F -FDG^{NEG} ADCs (shown in blue) (Figures 4a,b; Extended Data Figures 6b–d). We analyzed Ndfus1 and Ndufv1 proteins in lung ADC and SCC tumors from *KL* mice across three independent experiments and discovered that SCCs (red boxes) had a consistent reduction in Ndfus1 as compared to ADCs (blue boxes) (Figure 4c; Extended Data Figures 6e and 7). Lung ADC and SCC were distinguished by the levels of SP-C protein. Additionally, immunoblots for Tom20, Tom40, Tom70 or Tim23 showed similar distribution of mitochondrial content between SCC and ADC tumors (Figures 4b,c; Extended Data Figure 1).

We then examined the NDUFS1 and NDUFV1 proteins in the human lung ADC cell line A549 and lung SCC line RH2. Identical to mouse lung tumors, we identified a decrease in both the NDUFS1 and NDUFV1 proteins in RH2 cells compared to A549 cells (Figure 4d). Functional analysis of mitochondrial Ψ in human and mouse ADC and SCC cell lines demonstrated that the SCC tumor cells had a significantly reduced Ψ to that of ADC cells (Figure 4e; Extended Data Figure 8a). RH2 cells had a reduced oxygen consumption rate and an increased extracellular acidification rate compared to A549 cells (Figures 4f,g). Analysis of complex I in coomassie stained blue native gels showed that RH2 cells had

lower complex I levels than A549 (Figure 4h). In addition, RH2 cells had reduced complex I activity as compared to A549 cells (Figure 4i). These results suggest that Ψ and complex I activity may be predictive of response to complex I inhibitors in which $^{18}\text{FBnTP}^{\text{POS}}$ lung ADCs are predicted to have increased sensitivity compared to $^{18}\text{FBnTP}^{\text{NEG}}$ lung SCCs.

We next demonstrated that both human and mouse lung ADC cell lines were more sensitive to complex I inhibitors phenformin and IACS-010759²⁹ at low doses compared to lung SCCs lines (Extended Data Figure 8b–d). We next tested IACS-010759 *in vivo* on *KL* mice and determined that $^{18}\text{FBnTP}^{\text{POS}}$ tumors were sensitive to the complex I inhibition. *KL* mice were imaged by $^{18}\text{FBnTP}$ and ^{18}F -FDG PET before treatment to confirm the presence of $^{18}\text{FBnTP}^{\text{POS}}$ tumors and binned into equal groups based on $^{18}\text{FBnTP}$ uptake in tumors (Figure 4j; Extended Data Figure 9a). Mice receiving IACS-010759 showed a significant reduction in tumor burden compared to those receiving vehicle (Figure 4k; Extended Data Figure 9b,c). Our data predicted that $^{18}\text{FBnTP}^{\text{POS}}$ ADCs would show increased sensitivity to IACS-010759 compared to $^{18}\text{FBnTP}^{\text{NEG}}$ SCCs. Analysis of tumor cell proliferation showed a significant reduction in Ki67 positive cells in TTF1+ ADCs treated with IACS-010759 while CK5+ SCCs were refractory to IACS-010759 (Figure 4l).

We next asked whether $^{18}\text{FBnTP}/^{18}\text{F}$ -FDG PET imaging could detect metabolic heterogeneity within individual lung tumors. We identified heterogeneous uptake of both $^{18}\text{FBnTP}$ and ^{18}F -FDG within single lung nodules from *KL* mice as represented in Figures 4m. Histological analysis revealed squamous cell differentiation in the ^{18}F -FDG^{POS}/ $^{18}\text{FBnTP}^{\text{NEG}}$ region marked by positive staining for CK5 and Glut1. In contrast, the $^{18}\text{FBnTP}^{\text{POS}}/^{18}\text{F}$ -FDG^{NEG} tumor region was ADC marked by positive TTF1 staining low expression of Glut1 (Figure 4m–o; Extended Data Figure 10). These results demonstrate that multi-tracer PET imaging with $^{18}\text{FBnTP}$ and ^{18}F -FDG was able to identify distinct mitochondrial and metabolic heterogeneity within individual lung tumors. Our study represents a novel and non-invasive approach to using $^{18}\text{FBnTP}$ PET imaging to profile mitochondrial Ψ and functional mitochondrial heterogeneity within NSCLC. We detected distinct mitochondrial Ψ and complex I activity profiles in lung SCC and ADCs tumors that were predictive of response to complex I inhibitors. Our results suggest $^{18}\text{FBnTP}$ may function as a noninvasive biomarker to guide the delivery of complex I inhibitors in cancer. $^{18}\text{FBnTP}$ PET imaging represents a valuable resource not only to the field of cancer metabolism but one that can be extended to other fields actively investigating mitochondrial activity in aging, physiology and disease.

Methods

Cell culture

Cells were maintained at 37°C in a humidified incubator with 5% CO₂. A549 cells were obtained from ATCC. The RH2 lung cancer cell line was previously established in our laboratories. All cell lines were routinely tested and confirmed to be free of Mycoplasma using the LookOut Mycoplasma PCR Detection Kit (Sigma). Cells were grown in Dulbecco's modified Eagle's medium (DMEM) plus 5% fetal bovine serum (Hyclone/Gemini) and 1% penicillin/streptomycin (Gibco).

Studies in GEMMs

We performed studies with the genetically engineered mouse model of lung cancer using *Kras*-Lox-Stop-Lox-G12D; *Lkb1* Lox/Lox; *Rosa26*-Lox-Stop-Lox-Luc mice (*KL*) as described previously²⁷. Briefly, lung tumors were induced by intranasal administration of 5×10^5 transduction units of Lenti-PGK-Cre (Cat. # FCT071, Kerafast,) and developed nearly 100% lung adenocarcinomas as previously described^{7,27}. *KL* mice that were inhaled with LentiCre were used in studies with Phenformin treatment. For studies where mice were imaged with both ¹⁸FBnTP and ¹⁸F-FDG probes, *KL* mice were inhaled with Adenoviral Cre which leads to development of both ADC and SCC tumors. For all treatments, *KL* mice were imaged with ¹⁸FBnTP and sorted into two groups based on tumor maximum percent injected dose per gram (%ID/g) values, so that two groups would have similar matched maximum %ID/g values. Treatment was initiated on the same day or on the following day after ¹⁸FBnTP imaging. Mice were treated with 125 mg/kg/day phenformin for 5 days or 15 mg/kg/day IACS-010759 for 12 days. The drugs were delivered by oral gavage. All experimental procedures that were performed on mice were approved by the UCLA Animal Research Committee (ARC). Mice were euthanized before the ARC approved endpoints were reached; none of the tumors exceeded maximum ARC defined volumes. Both male and female mice were used in all experiments and no preference in mouse gender was given for any of the studies.

Studies in syngeneic mice

We established the L3161C mouse cell line from a lung tumor dissected from a *Kras*;*Lkb1*;*p53* (KPL) mouse. Following resection, the tumor was minced and incubated in collagenase/dispase (Cat. # 10269638001, Sigma) for 3 hr. Cells were filtered using a 70 μ m strainer, centrifuged, resuspended in DMEM with 5% FBS and plated in a 6 cm dish. The following day media was changed and cells that attached were cultured. We confirmed that the L3161C cell line was adenocarcinoma by implanting cells in syngeneic mice, detecting lung tumors and staining tumor with H&E and CK5/TTF1. For imaging studies, 1×10^5 L3161C cells suspended in 20 μ l PBS were implanted into the left lung lobe via transthoracic injection. Two weeks after injections, mice were imaged by CT. Mice with similar sized tumors were used for ¹⁸FBnTP imaging. For treatment studies, syngeneic mice were imaged with ¹⁸FBnTP, and split into two groups (three groups for Fig 3b) based on tumor maximum %ID/g, such that maximum %ID/g of tumors in both groups would be similar. Treatment was then initiated for the specified time. Mice were treated with a single dose of 0.25 mg/kg Oligomycin or 0.5 mg/kg Rotenone; both drugs were delivered by i.p. injection. For other studies mice were treated with 125 mg/kg/day phenformin or 500 mg/kg/day metformin for 5 days; both drugs were delivered by oral gavage in the morning. Following imaging, mice were euthanized and tissue was harvested. For some experiments, lungs were fixed with 10% NBF overnight; for other experiments lung tumor nodules were rapidly dissected, snap frozen in liquid nitrogen and stored in -80°C freezer.

¹⁸FBnTP synthesis

We performed synthesis of the radio-tracer ¹⁸FBnTP as previously described¹³. The three-pot, four-step synthesis of [¹⁸F]FBnTP was performed using the automated radiochemical

synthesizer ELIXYS FLEX/CHEM (Sofie Biosciences). The no-carrier-added [^{18}F]fluoride was produced from the (p,n) reaction of [^{18}O]H $_2$ O with an RDS-112 11 MeV cyclotron (Siemens) in a 1-ml tantalum target with Havar foil. [^{18}F]Fluoride in water was pushed through a strong cation exchange (SCX) cartridge and trapped on a QMA cartridge. [^{18}F]Fluoride was then eluted with a solution of Kryptofix 222 (10 mg, 27 μmol) and K $_2$ CO $_3$ (1 mg, 7 μmol) in an acetonitrile/water (3:5, 0.8 ml) mixture. Azeotropic evaporation was performed at 110 °C under a stream of nitrogen (7 psi) to remove excess water using acetonitrile. The 4-trimethylammoniumbenzaldehyde trifluoromethanesulfonate (5 mg) precursor was solvated in DMSO (0.8 ml), added to the reactor vial containing the dried [^{18}F]fluoride and allowed to react at 90 °C for 5 min with stirring. The resulting 4-[^{18}F]fluorobenzaldehyde mixture was diluted with water containing 1% (w/v) Na-ascorbate solution (5 ml total) and passed through an Oasis WCX cartridge (6 psi) for 1.5 min. The WCX cartridge was dried with nitrogen (20 psi) for 1 min and eluted with DCM (3 ml). The mixture was passed through a glass column containing NaBH $_4$ · (Al $_2$ O $_3$) $_x$ (350 mg) on the top half portion and K $_2$ CO $_3$ (2 g) on the bottom half portion for a flow through reduction of 4-[^{18}F]fluorobenzaldehyde ([^{18}F]FBA) to 4-[^{18}F]fluorobenzyl alcohol ([^{18}F]FBnOH), which was directed to the second reactor vial (3 psi). A subsequent elution and rinsing of the column was performed using DCM (1 ml, containing 0.2% (v/v) of water) (3 psi). The mixture containing [^{18}F]FBnOH was reacted with Ph $_3$ PBr $_2$ (100 mg) in DCM (1.1 ml) at 35 °C for 10 min resulting in the formation of 4-[^{18}F]fluorobenzyl bromide ([^{18}F]FBnBr). The resulting mixture was passed through a silica cartridge and directed towards the third reactor vial (2 psi). A solution of PPh $_3$ (3 mg) in EtOH (0.6 ml) was added, followed by removal of most of the DCM under vacuum and a stream of nitrogen (3 psi) at 45 °C for 6.5 min while stirring. EtOH (1 ml) was added and the mixture was evaporated to approximately 0.5 ml under vacuum and a stream of nitrogen (7 psi) at 80 °C for 2.5 min while stirring. The mixture was reacted at 160 °C for 5 min in a sealed position, which converted the [^{18}F]FBnBr to the desired [^{18}F]FBnTP. The reaction vial was cooled to 35 °C and diluted with water (3 ml) while stirring. The mixture was passed through a Sep-Pak Plus Accell CM cartridge (8 psi) and the cartridge was washed with EtOH (20 ml). The product was released with 2% EtOH in saline + 0.5% (w/v) Na-ascorbate (10 ml) and passed through a sterile filter into a vented sterile vial. Under optimized conditions, the resulting [^{18}F]FBnTP PET tracer was obtained in AY of 1.4–2.2 GBq starting from 9.4 to 12.0 GBq [^{18}F]fluoride in 90–92 min (RCY = 28.6 \pm 5.1% with n = 3). Molar activities ranged from 80 to 99 GBq/ μmol (EOS) and radiochemical purity was >99%.

PET/CT imaging studies

All PET/CT imaging was performed on *KL* mice or syngeneic mice TT implanted with L3161C using either single tracer imaging with [^{18}F]FBnTP or dual radio-tracer imaging with [^{18}F]FBnTP and [^{18}F]FDG as previously described^{26,27}. In order to reduce variability between mice imaged with [^{18}F]FBnTP, maximum percent injected dose per gram (%ID/g) for each tumor was normalized to maximum %ID/g of heart as indicated in the figures. For waterfall plots in Figure 2g, 3b, 3d, 3e and extended data figures 4c–4d, we calculated % change in the uptake of the [^{18}F]FBnTP probe post-treatment relative to pre-treatment using maximum %ID/g of the tumor that was normalized to maximum %ID/g of the heart for each mouse.

Respirometry Analysis

Experiments were conducted on a Seahorse XF96 Extracellular Flux Analyzer (Agilent Technologies) in order to measure oxygen consumption rate (OCR) and extracellular acidification rate (ECAR). L3161C, A549 or RH2 cells were seeded into an XF96 microplate at density of 12,000–15,000 cells per well. Cells were plated in growth medium and maintained overnight in a tissue culture incubator (37°C; 5% CO₂). On the day of the experiment, assay medium (Seahorse XF Base Medium supplemented with 2 mM L-glutamine, 1mM Pyruvate and 10 mM glucose) was freshly prepared. The cells were washed twice with assay medium and brought to a final volume of 175 µL per well. The XF96 plate was placed in a 37°C incubator without CO₂ for 30 minutes prior to loading the plate into the instrument. Injection of compounds during the assay included: the mitochondrial ATP Synthase inhibitor oligomycin (final concentration of 2 µM); the chemical uncoupler, FCCP (final concentration of 1 µM); and the Complex I inhibitors rotenone (final concentrations 2 µM) and phenformin (final concentration 1 mM) and Complex III inhibitor antimycin A (final concentrations of 2 µM). At the conclusion of the assay, the cells were fixed with 4% paraformaldehyde, stained with Hoechst, and cell number per well was determined based on nuclei number using an Operetta High-Content Imaging System (PerkinElmer). Oxygen consumption rates were normalized to cell number per well. Activity of complex I was measured in permeabilized cells using XF PMP assay where complex I dependent OCR was measured by determining OCR in the presence of pyruvate and malate (as substrates for complex I) before and after addition of rotenone (complex I inhibitor).

Measurement of mitochondrial membrane potential (Ψ)

Experiments were conducted by analyzing TMRE fluorescence using flow cytometry. A549 and L3161C cells were harvested on the day of the assay and 500,000 cells were aliquoted into a microfuge tube. Cells were resuspended in 0.5 ml DMEM with 5% FBS containing different concentrations of phenformin or oligomycin or FCCP as indicated in figure legends. Cells were incubated in a tissue culture incubator (37°C, 5% CO₂) for 2 hr. After 2 hr incubation, media with TMRE was added to tubes, such that final concentration of TMRE was 7 nM and concentrations of phenformin, oligomycin and FCCP were constant. Cells were incubated for an additional 1 hr in a tissue culture incubator (37°C, 5% CO₂). Cells were washed twice in phenol red free DMEM and cellular fluorescence was acquired with a BD LSRII analyzer at UCLA Flow Cytometry Core. Data was analyzed with Flowing Software.

In vitro ¹⁸FBnTP uptake assay

On the day of the assay, cells were trypsinized, collected in DMEM with 5% FBS and counted. 1,000,000 cells were aliquoted into a microfuge tube, resuspended in 0.5 ml media containing DMEM with 5% FBS and either Vehicle, 1 mM phenformin, 8 µM Oligomycin or 8 µM Oligomycin with 4 µM FCCP. Cells were incubated in a tissue culture incubator (37°C, 5% CO₂) for 2 hr. After 2 hr incubation, 0.5 ml of media with ¹⁸FBnTP was added to tubes, such that final concentration of ¹⁸FBnTP was 10 µCi/ml and concentrations of phenformin, oligomycin and FCCP were constant. Cells were incubated for an additional 1 hr in a tissue culture incubator (37°C, 5% CO₂). The uptake was terminated by

centrifugation at 4°C (1200 rpm, 5 min). Cells were washed twice with cold media. After the final wash, cell pellet was resuspended in 500 µl of media, and 300 µl was used in a gamma counter, while 100 µl was used to count viable cells using ViCell counter (Beckman). Counts per minute were normalized to viable cells.

Immunohistochemistry

After the fixation step in 10% neutral buffered formalin overnight, lungs were transferred to 70% ethanol and further processing and embedding was done by the TPCL at UCLA. The following antibodies were used: anti-CK5 (EP1601Y) (abcam, ab52635 1:100), anti-TTF1 (8G7G3/1) (Dako, 1:1000), anti-Ki67 (SP6) (Thermo-Scientific, RM-9106-S1 1:200), anti-Glut1 (alpha-diagnostic, GT11-A, 1:400), anti-Cleaved Caspase 3 (CST, #9664, 1:1000). Slides were scanned onto a ScanScope AT (Aperio Technologies Inc.). Digital slides were analyzed with Definiens and QuPath software.

Western blot analysis

Whole cell lysates from lung tumors isolated from mice were prepared as previously described⁷. Briefly, tumors were homogenized in buffer containing phosphatase and protease inhibitors (20 mM Tris pH 7.5, 150 mM NaCl, 1% Triton X-100, 50 mM sodium fluoride, 1 mM EDTA, 1 mM EGTA, 2.5 mM pyrophosphate, 1 mM sodium orthovanadate, protease inhibitor tablet), centrifuged and supernatant was normalized, aliquoted and stored in -80°C freezer. Lysates were separated on 4–12% Bis-Tris protein gels (Thermo), transferred to PVDF membrane and probed with the following antibodies: SP-C (1:5000, AB3786 Milipore); Glut1 (1:2000, GT11-A, Alpha Diagnostic); Ndufs1 (1:2000, ab169540, abcam); Ndufs1 (1:2000, sc-271510, Santa Cruz); Ndufv1 (1:500, 11283-1-AP, Proteintech), Ndufv2 (1:2000, sc-271620, Santa Cruz), Tom20 (1:10000, FL-145, Santa Cruz), Tom40 (1:2000, 18409-1-AP, Proteintech); Tom70 (1:2000, 14528-1-AP, Proteintech); Tim23 (1:2000, 11123-1-AP, Proteintech); actin (1:8000, #4970 and #3700, Cell Signaling Technology). Intensity of bands was quantified using Image J.

Blue Native Gel

Blue Native (BN)-PAGE was performed based on the method of Schagger and colleagues³⁰ with minor modifications. Briefly, mitochondria (100 µg protein) were solubilized for 15 min with digitonin using a 6g/g digitonin/protein ratio. Insoluble material was removed by centrifugation at 21,000 *g* for 30 min at 4 °C, the soluble component was combined with BN-PAGE loading dye and separated on a 3–13% acrylamide-bisacrylamide precast BN-PAGE gel. For separation, cathode buffer (15 mM bis-Tris [pH 7.0] and 50 mM tricine) containing 0.02% (w/v) Coomassie Blue G was used until the dye front had reached approximately one-third of the way through the gel before exchange with cathode buffer lacking Coomassie Blue G. Anode buffer contained 50 mM bis-Tris (pH 7.0). Native complexes were separated at 4 °C at 110V for 1 hour, followed by 12mA constant current. Thyroglobulin (669 kDa), ferritin (440 kDa), Catalase (232 kDa), Lactate dehydrogenase (140 kDa), and bovine serum albumin (BSA 67 kDa) were used as markers (GE Healthcare).

Liquid chromatography/Mass spectroscopy

Tumors were homogenized with a Tissue Master (Omni international) in 1 ml chilled 80% Methanol. Tumor suspensions were spun down at 4°C for 5 min at 17,000g, and the top layer taken as extracted metabolites. The volume equivalent of 1 mg of tumor was transferred into glass vials and the samples were dried with a EZ2-Elite lyophilizer (Genevac). Dried metabolites were re-suspended in 100 µl of 50%:50% acetonitrile (ACN):dH2O solution; 10 µl of these suspensions were injected per analysis. Samples were run on a Vanquish (Thermo Scientific) UHPLC system with mobile phase A (5 mM NH₄AcO, pH 9.9) and mobile phase B (ACN). Separation was achieved at a 200 µl/min flow rate on a Luna 3mm NH₂ 100A (150 × 2.0 mm) at 40°C with a gradient going from 15% A to 95% A in 18 min followed by an 11 minute isocratic step. The UHPLC was coupled to a Q-Exactive (Thermo Scientific) mass analyzer running in positive mode at 3.5kV with an MS1 resolution of 70,000. Metabolites were identified using exact mass (MS1), retention time, and fragmentation patterns (MS2) at normalized collision energy (NCE) 35. Quantification was performed via area under the curve (AUC) integration of MS1 ion chromatograms with the MZmine 2 software package. For the quantification of absolute moles of phenformin, one tumor from the vehicle group was selected to provide a representative tumor small molecular matrix. The volume equivalent of 1 mg of this tumor was distributed into several glass vials and 10 µl of pure aqueous phenformin standards (0.1mM – 0.5mM) was added to these samples to span the possible range of phenformin concentrations. From this point on these samples were treated as described above. AUC values from the phenformin standards were used to fit a linear regression model that related MS1 AUC to the moles of phenformin present. The linear regression equation was used to convert MS1 AUC to moles of phenformin in all tumor samples and expressed relative to the tissue mass of each tumor.

Statistical Analysis

The *in vivo* experiments were analyzed utilizing analysis of variance (ANOVA) models to evaluate the main effects of the two treatment types on the various quantitative outcome measures. Categorical outcomes were compared between groups with Fisher's exact test. The sample size of 7–10 KL mice per group provided a 99% power to detect differences in the outcomes of % cleaved caspase 3, Ki67 and ¹⁸FBnTP %ID/g positivity based on the observed results previously described ⁷, assuming a two-sample t-test (a simplification of the ANOVA analysis plan) with a two-sided 0.05 significance level.

Mouse experiments involving imaging of KL mice with ¹⁸FBnTP were repeated with 3 separate cohorts several months apart. For imaging studies with both GEMMs and syngeneic mice, after basal ¹⁸FBnTP imaging, mice were split into two groups (3 cohorts for Fig. 3b) based on maximum %ID/g values, such that maximum %ID/g values of tumors in both groups would be similar after normalization to the maximum probe uptake in the heart. Variation is indicated using standard deviation or standard error of the mean as described in the figure legends. Differences between groups were determined using unpaired two-tailed t-test or one-way ANOVA if more than two groups were compared. Western blot analysis of mitochondrial markers was completed on lung nodules isolated from three separate cohorts of mice.

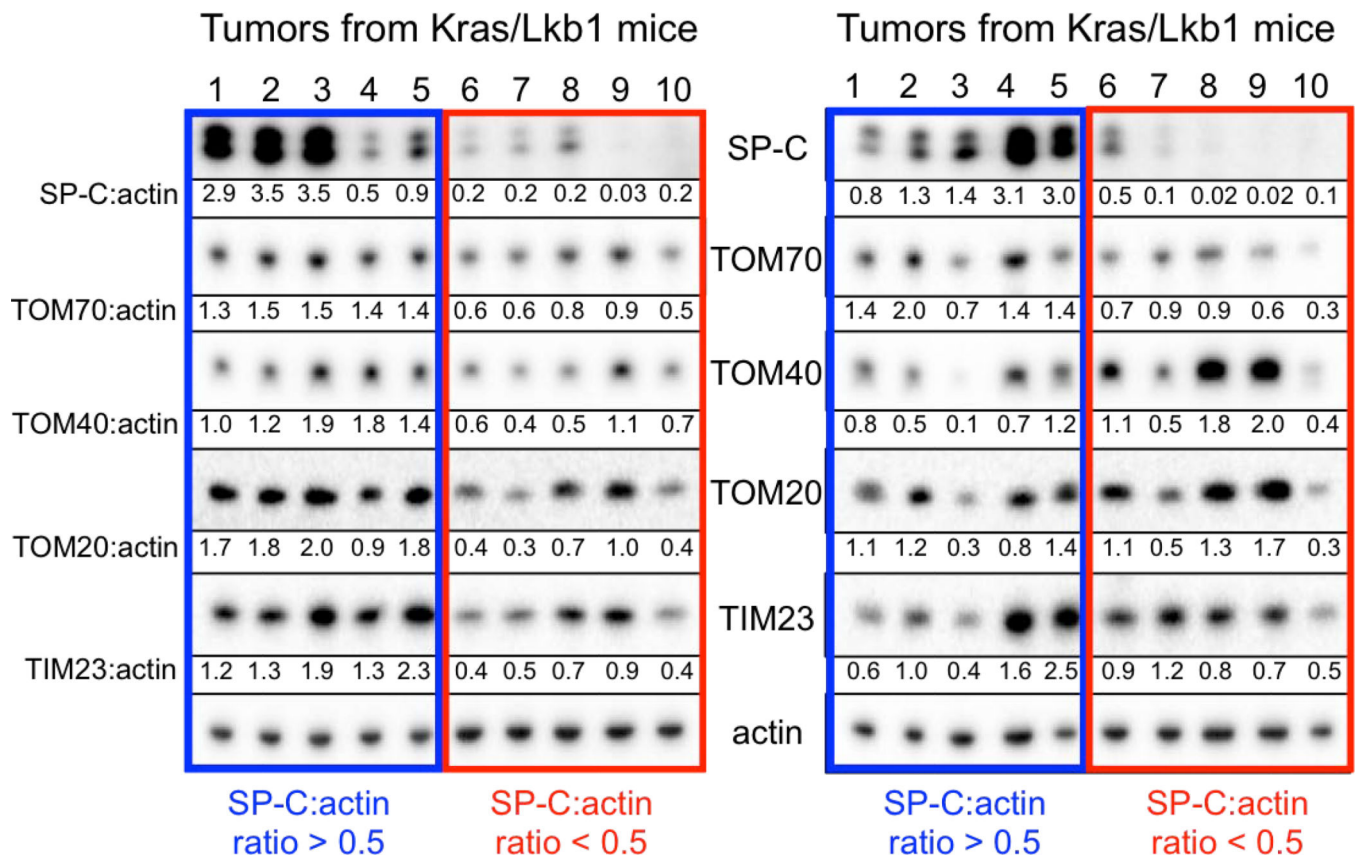
Extended Data

Author Manuscript

Author Manuscript

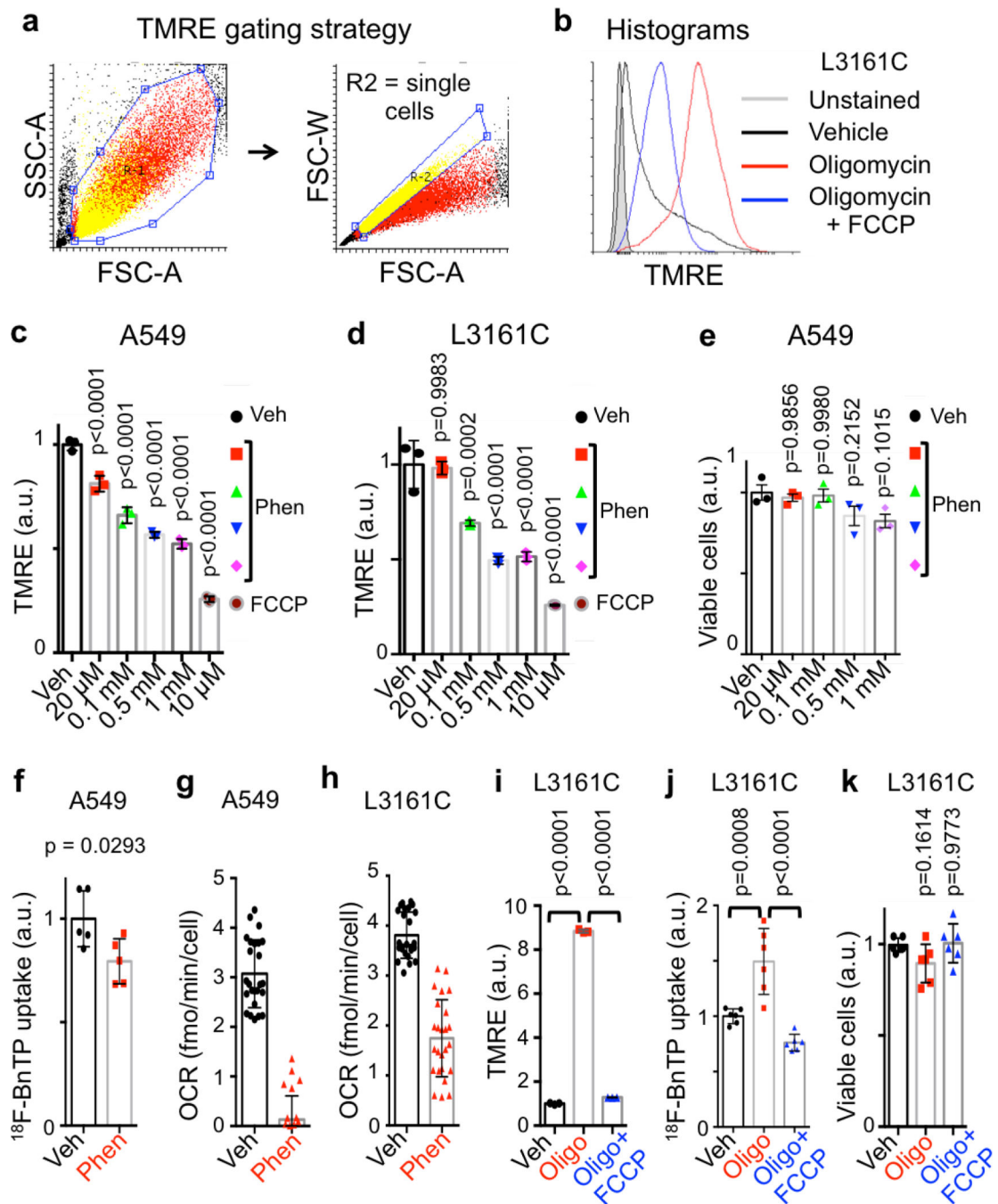
Author Manuscript

Author Manuscript



Extended data Figure 1. Mitochondrial markers in *KL* mouse lung tumors.

Whole cell lysates from lung tumors isolated from *KL* mice were immunoblotted with indicated antibodies. Tumors with high levels of surfactant protein C (SP-C:actin ratio > 0.5) were defined as adenocarcinomas (blue box), while tumors with low SP-C (SP-C:actin ratio < 0.5) were defined as squamous cell carcinomas (red box). Each lane represents individual tumor isolated from *KL* mice. This Western blot was done on 20 individual tumors isolated from *KL* mice from three independent experiments.



Extended data Figure 2. Measuring mitochondrial membrane potential *in vitro* in A549 and L3161C cells.

a, Gating strategy used for quantification of TMRE signal. R2 – region representing single cells was used for quantification of the TMRE signal. **b**, Overlay histogram showing shifts in TMRE staining in L3161C cells strained with Vehicle, 8 μ M Oligomycin, and 8 μ M Oligomycin + 4 μ M FCCP. **c**, TMRE measurements in A549 cells treated with indicated concentrations of Phenformin or FCCP for 3 hr (n = 3 biological replicates). **d**, TMRE measurements in mouse cell line L3161C treated with indicated concentrations of

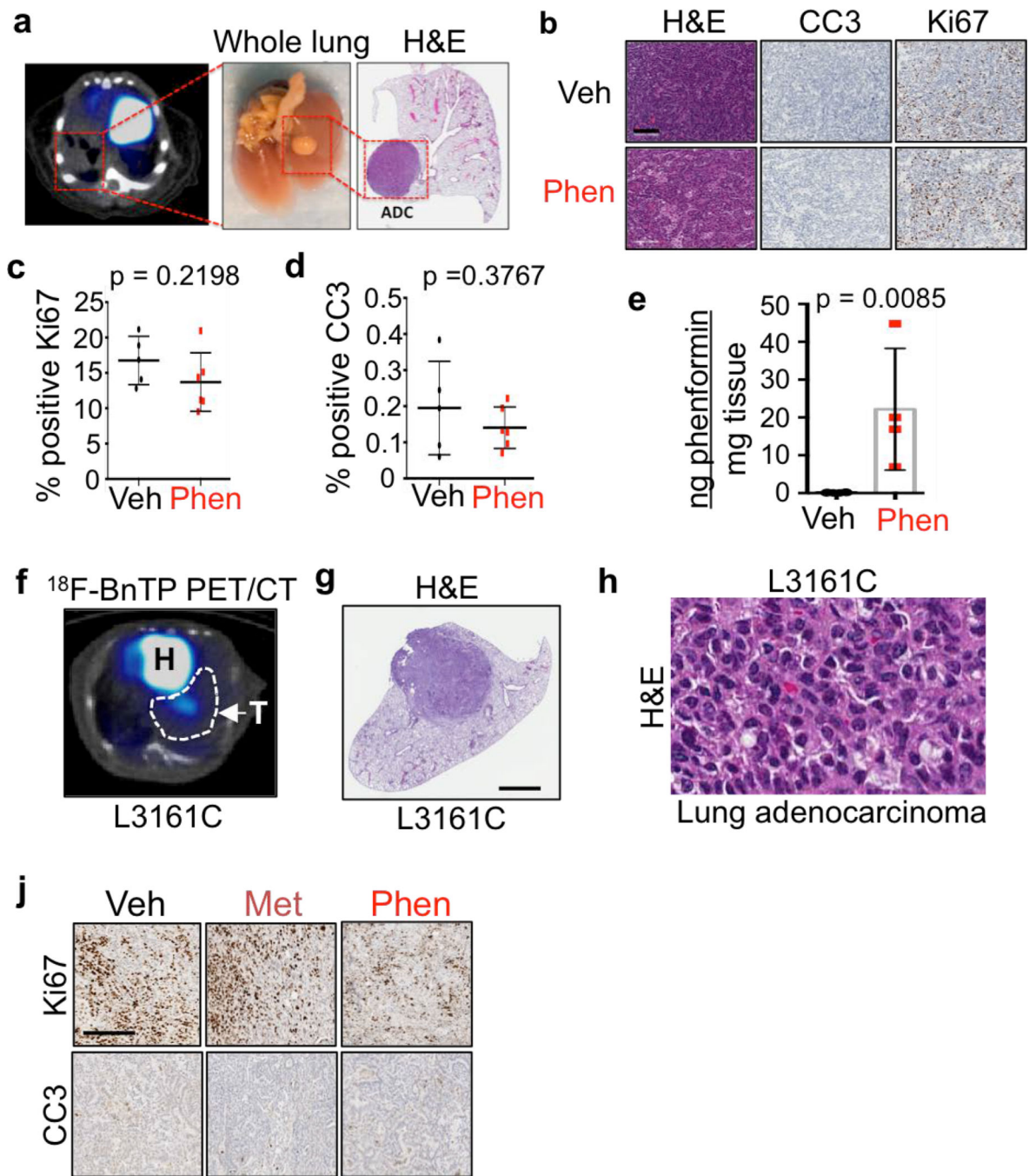
Phenformin or FCCP for 3 hr (n = 3 biological replicates). **e**, Viability of A549 cells treated with indicated concentrations of Phenformin for 3 hr (n = 3 biological replicates). **f**, Uptake of ^{18}F BnTP probe measured by gamma counter in A549 cells treated with 1 mM Phenformin for 3 hr (n = 5 biological replicates). **g**, Oxygen consumption rate (OCR) per cell measured in A549 cells treated acutely with 1 mM Phenformin (n = 25 technical replicates). **h**, OCR per cell measured in mouse cell line L3161C treated acutely with 1 mM Phenformin (n = 25 technical replicates). **i**, TMRE measurements in mouse cell line L3161C treated with Vehicle, 8 μM Oligomycin, or 8 μM Oligomycin with 4 μM FCCP for 3 hr (n = 3 biological replicates). **j**, Uptake of ^{18}F BnTP probe measured by gamma counter in mouse cell line L3161C treated with Vehicle, 8 μM Oligomycin, or 8 μM Oligomycin with 4 μM FCCP for 3 hr (n = 6 biological replicates). **k**, Viability of L3161C cells treated as in **j** (n = 6 biological replicates). Data are shown as mean \pm SD. Experiments in **c-i**, were repeated twice with similar results. Experiments in **j** and **k** were done once.

Author Manuscript

Author Manuscript

Author Manuscript

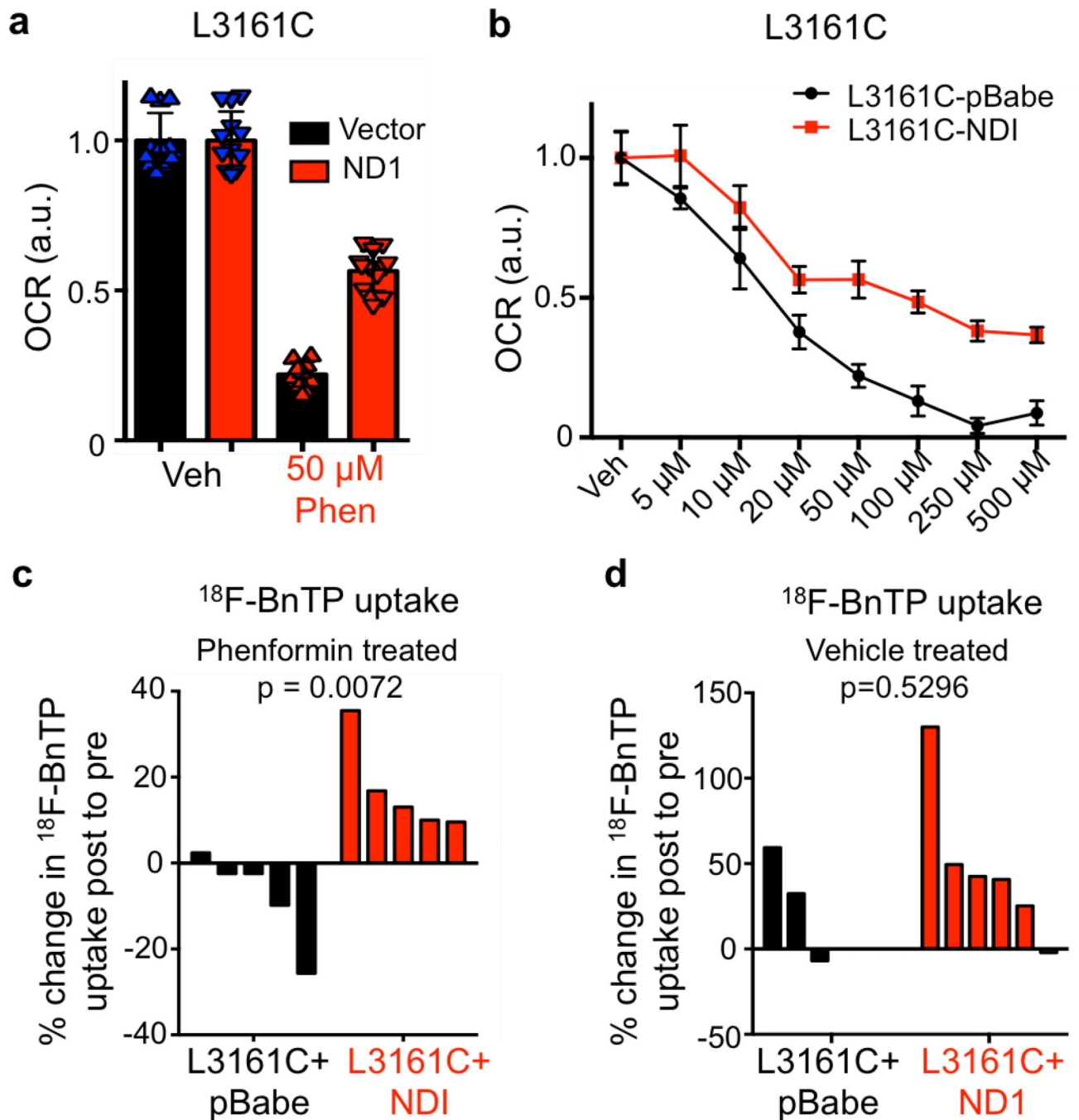
Author Manuscript



Extended Data Figure 3. Short-term treatment with phenformin does not lead to changes in proliferation or apoptosis.

a, Transverse ^{18}F BnTP/CT overlay (left panel) of mouse lung (middle panel) after treatment with phenformin. H&E of a lung lobe with associated adenocarcinoma (ADC) tumor (right panel). **b**, Representative slides stained with H&E (left panel), Cleaved Caspase 3 (middle panel), and Ki67 (right panel) from tumors from *KL* mice treated with Vehicle (top panel) or Phenformin (bottom panel). This experiment was done once on slides from $n = 5$ mouse lungs (Vehicle) and $n = 6$ mouse lungs (Phenformin). **c**, Quantification of staining for Ki67

and **d**, Cleaved Caspase 3 for tumors from *KL* mice treated with Vehicle (n = 5 mice) or Phenformin (n = 6 mice). This experiment was done once. **e**, Phenformin in lung tumors isolated from *KL* mice was quantified using liquid chromatography/mass spectroscopy. Tumors were isolated from mice treated with Vehicle (n = 6) or 100 mg/kg (n = 2) or 200 mg/kg Phenformin (n = 2) for 5 days. This experiment was done once. **f**, Representative ¹⁸FBNTP PET/CT overlay of a tumor formed by transthoracically implanted L3161C cell line. H – heart, T – tumor. This image is representative of at least 20 PET/CT images. **g**, H&E slide of a tumor formed by transthoracically implanted L3161C cell line imaged in **f**. **h**, H&E staining of tumor formed by L3161C mouse cell line. **j**, Representative slides stained with Ki67 (top panel), and Cleaved Caspase 3 (bottom panel) from tumors formed by transthoracically transplanted L3161C cells that were treated with Vehicle, Metformin, Phenformin. This experiment was done once on slides from n = 8 tumors (Vehicle), n = 5 tumors (Metformin), n = 6 tumors (Phenformin). The data are represented as the mean +/- SD. Statistical significance was calculated using unpaired two-tailed t-test.



Extended Data Figure 4. Expressing ND1 in mouse L3161C lung adenocarcinoma cell line reduces sensitivity of mitochondrial membrane potential to Phenformin *in vitro* and *in vivo*.

a, Basal OCR rate per cell for L3161C-pBabe (black) (n = 12 technical replicates) and L3161C-ND1 cells (red) (n = 12 technical replicates) treated with 50 μ M Phenformin for 24 hr. **b**, Basal OCR rate per cell for L3161C-pBabe (black) (n = 12 technical replicates for all conditions, except n = 6 for 250 μ M Phen and n = 9 for 500 μ M Phen) and L3161C-ND1 cells (red) (n = 12 technical replicates) treated with indicated concentrations of Phenformin for 24 hr. This experiment was repeated once. The data are represented as the mean \pm SD.

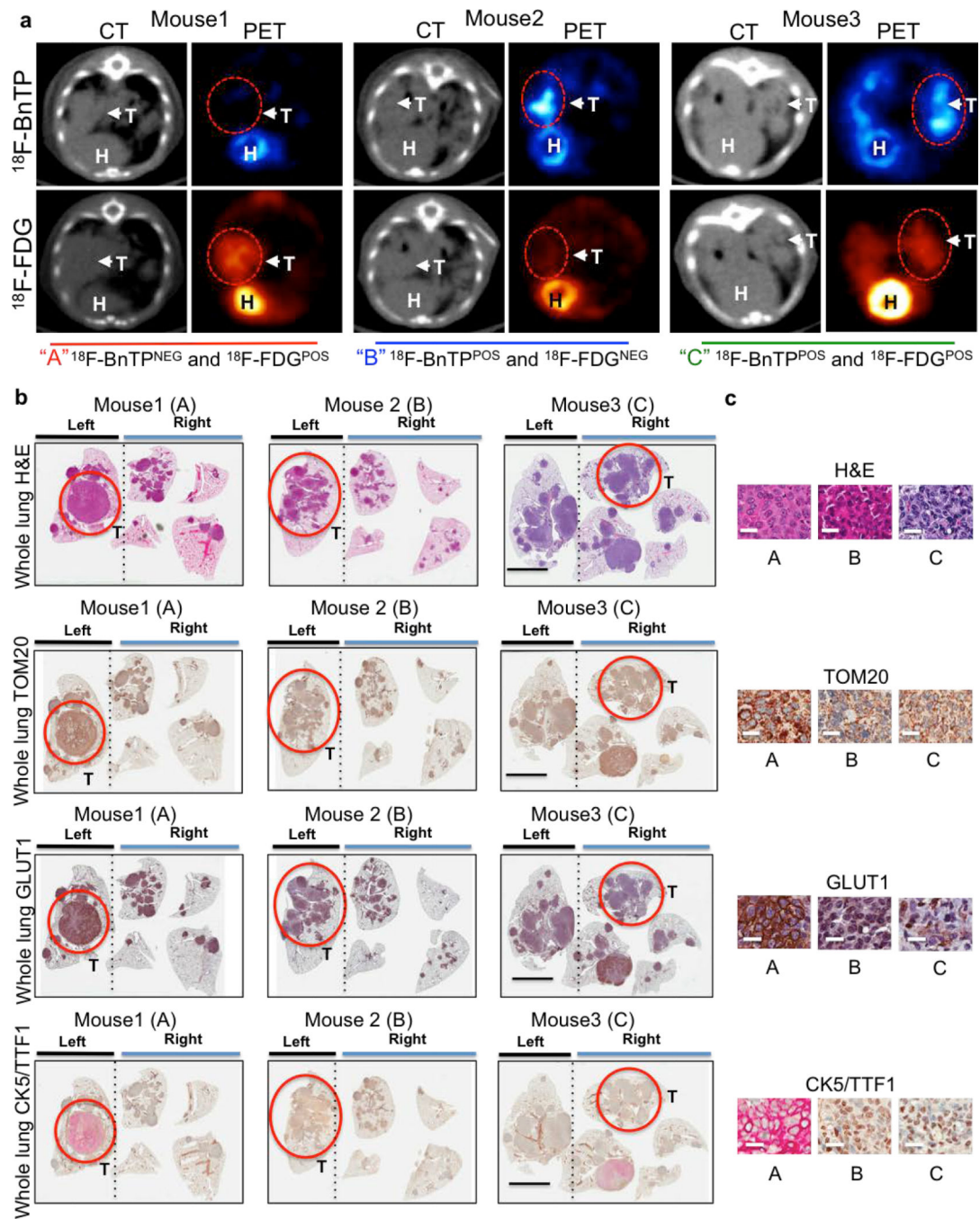
c, Waterfall plot for % change in maximum uptake of ^{18}F BnTP post-treatment to pre-treatment for mice transthoracically implanted with L3161C cells expressing empty vector (L3161C+pBabe) (n = 5 mice) or expressing ND1 (L3161C+ND1) (n = 5 mice) and treated with 125 mg/kg Phenformin for 5 days. **e**, Waterfall plot of % change in maximum uptake of ^{18}F BnTP in tumors formed by transthoracically implanted L3161C-pBabe (n = 3 mice) or L3161C-ND1 cells (n = 5 mice) that were treated with Vehicle for 5 days. Experiments in **a-d** were performed once. Statistical significance was calculated using unpaired two-tailed t-test.

Author Manuscript

Author Manuscript

Author Manuscript

Author Manuscript



Extended Data Figure 5. Multi-tracer imaging and IHC markers in lung tumors from *KL* mice.
a, Representative PET images of *KL* mice imaged with ^{18}F BnTP and ^{18}F -FDG on sequential days. Top panel shows CT and ^{18}F BnTP image and bottom panel shows CT and ^{18}F -FDG image. H - heart, T - tumor; tumors are indicated by arrows and circled. **b**, Whole lung slides stained with H&E, Tom20, Glut1, and CK5/TTF1 from Mouse 1, Mouse 2 and Mouse 3. Scale bar = 5 mm. **c**, Higher magnification of representative images from tumor circled in **b** from mouse 1, mouse 2, mouse 3 and that were stained with H&E, Tom20,

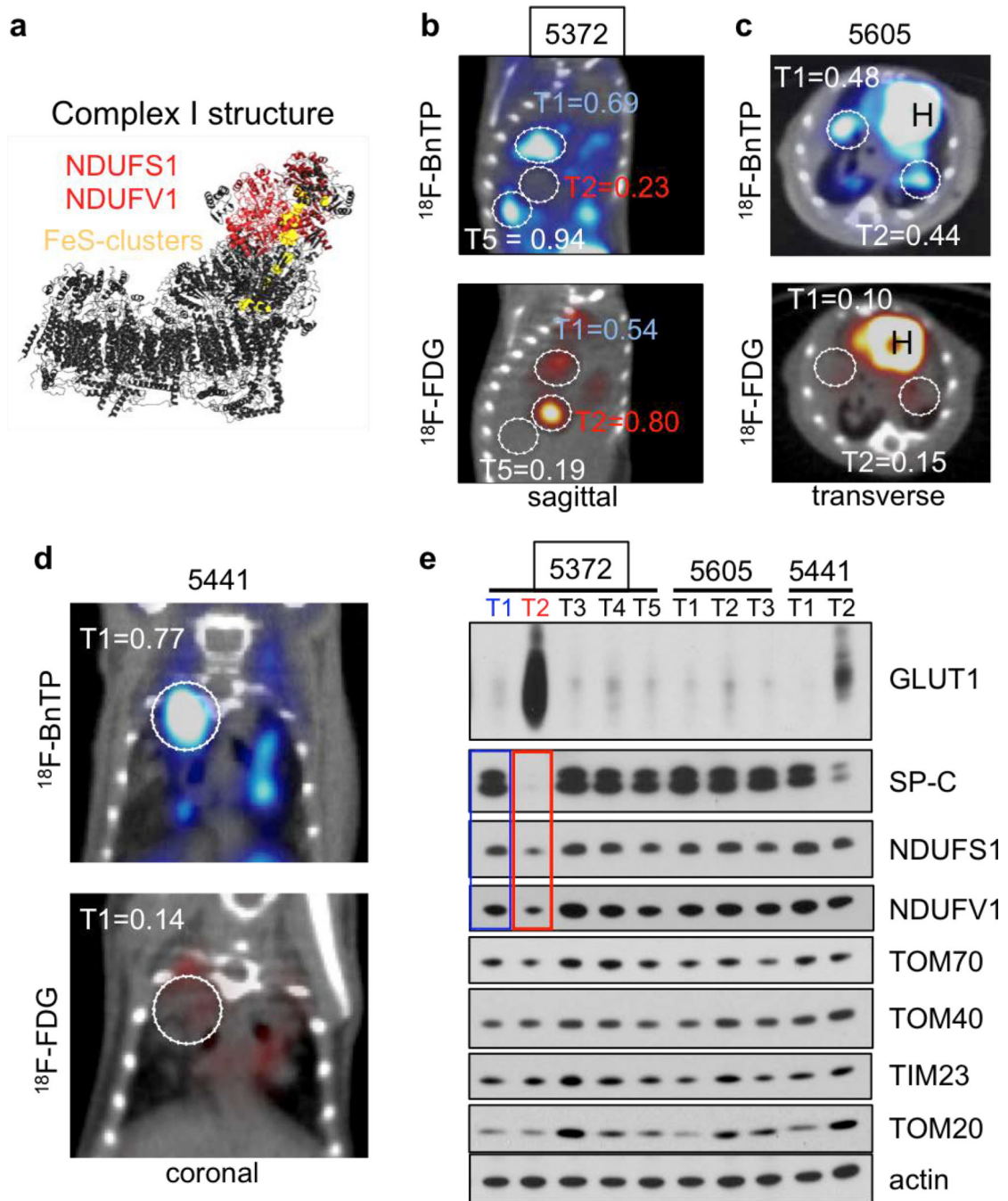
Glut1, CK5 and TTF1. Scale bar = 25 μ m. This data is representative of three independent mouse experiments.

Author Manuscript

Author Manuscript

Author Manuscript

Author Manuscript



Extended Data Figure 6. PET/CT and biochemical analysis of *KL* tumors.

a, Crystal structure of complex I (PDB: 5lc5) is shown with NDUFS1 and NDUFV1 subunits in red and FeS clusters in yellow. **b-c**, PET/CT images from three *KL* mice that were imaged on sequential days with ^{18}F BnTP (top panel) and ^{18}F -FDG (bottom panel). Tumors are circled, H – heart. Maximum uptake value for each tumor after normalization to maximum uptake of the heart is indicated. **e**, Western blot analysis from lung nodules that were isolated from mice imaged in **b-d**. Two lung tumors from mouse 5372 (imaged in **b**) are shown – T1 in blue (low ^{18}F -FDG and Glut1 levels; high ^{18}F BnTP and high Ndufs1 and

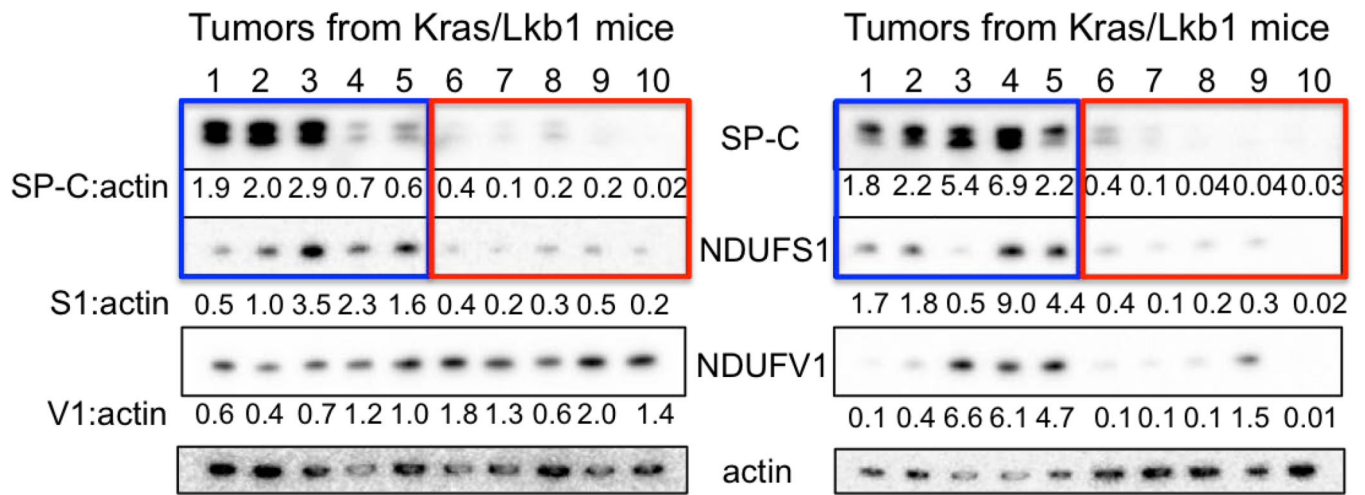
Ndufv1 levels); and T2 in red (high ^{18}F -FDG and Glut1 levels; low ^{18}F BnTP and low Ndufs1 and Ndufv1 levels). Experiments in **b-d** are representative of three independent mouse experiments. Experiment in **e** was done once.

Author Manuscript

Author Manuscript

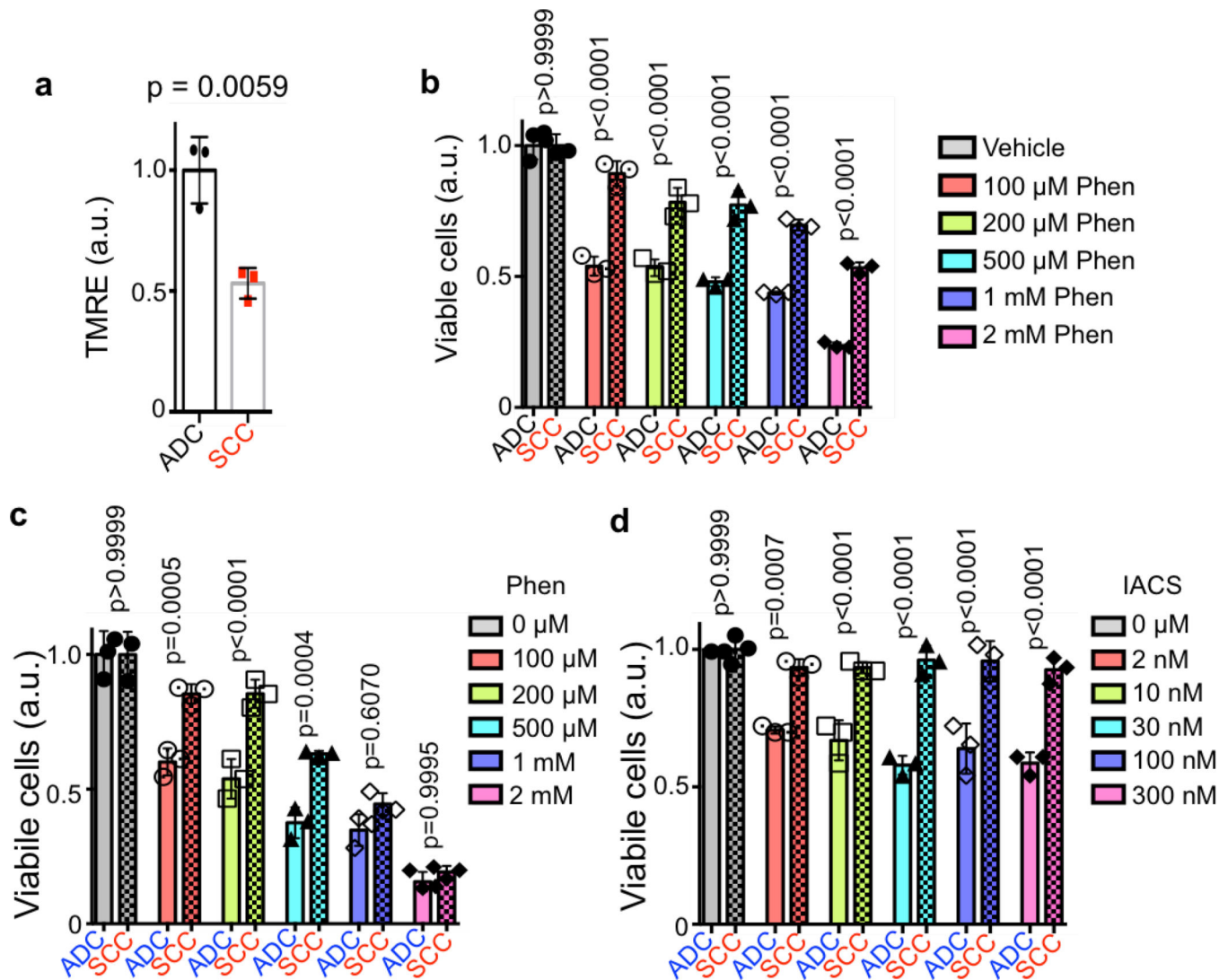
Author Manuscript

Author Manuscript



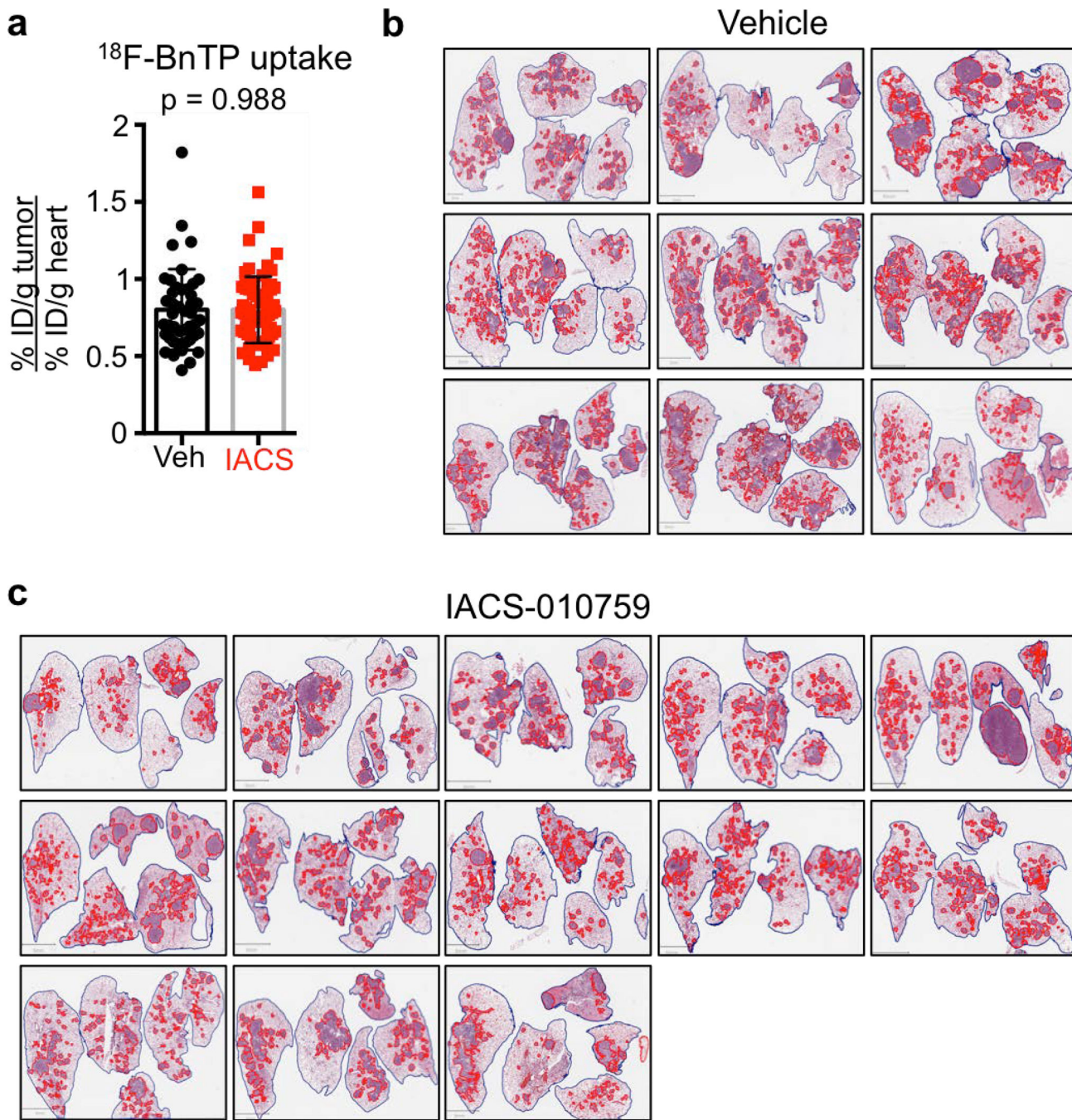
Extended Data Figure 7. Levels of Ndufs1 and Ndufv1 in *KL* tumors.

Whole cell lysates from lung tumors isolated from *KL* mice were immunoblotted with indicated antibodies. This Western blot was done on 20 individual tumors isolated from *KL* mice from three independent experiments.



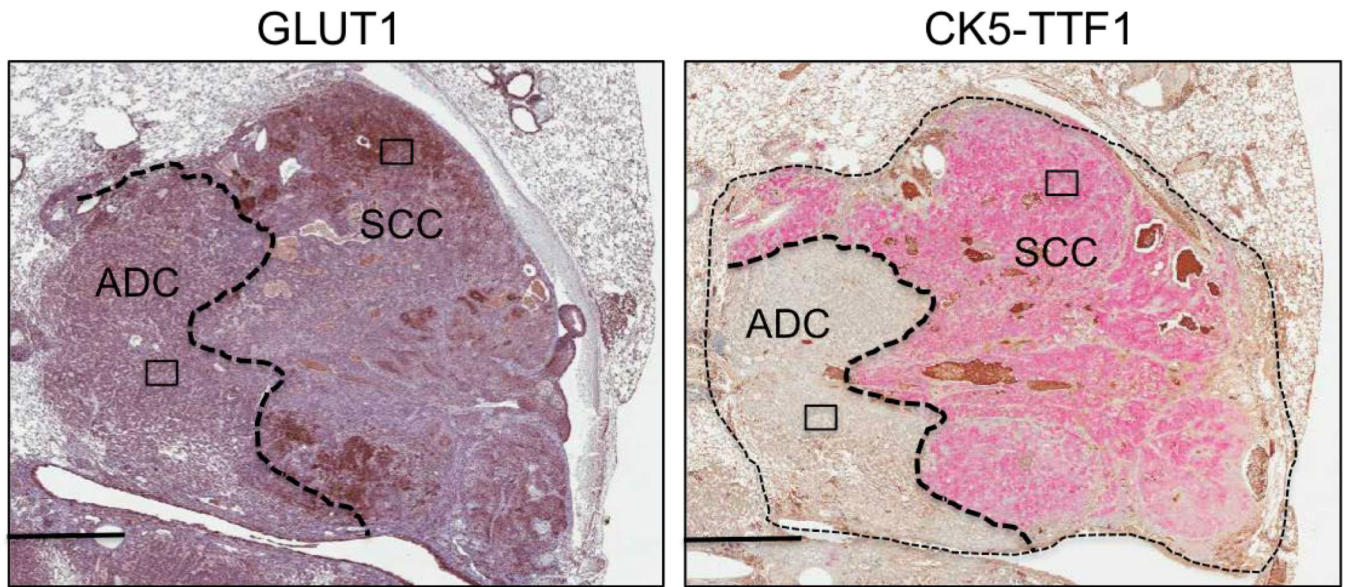
Extended Data Figure 8. Sensitivity of mouse and human lung cancer cell lines to complex I inhibitors phenformin and IACS-010759.

a, TMRE measurement comparing mouse adenocarcinoma cell line ($n = 3$ biological replicates) and mouse squamous cell carcinoma ($n = 3$ biological replicates) cell lines. **b**, Cell viability of mouse adenocarcinoma cell line ($n = 3$ biological replicates) and mouse squamous cell carcinoma cell line ($n = 3$ biological replicates) cells was measured in the presence of indicated concentrations of Phenformin for 48 hr. **c**, Cell viability of human ADC cell line (A549) ($n = 3$ biological replicates) and human SCC cell line (RH2) ($n = 3$ biological replicates) cells was measured in the presence of indicated concentrations of Phenformin for 48 hr. **d**, Cell viability of human ADC cell line (A549) ($n = 3$ biological replicates) and human SCC cell line (RH2) ($n = 3$ biological replicates) cells was measured in the presence of indicated concentrations of IACS-010759 for 48 hr. The data are represented as the mean \pm SD. Statistical significance was calculated using unpaired two-tailed t-test or one-way ANOVA (for **b-d**). Experiments were repeated twice with similar results.



Extended Data Figure 9. Characteristics of tumors from *KL* mice treated with Vehicle or IACS-010759.

a, ^{18}F BnTP uptake in tumors in *KL* mice before the start of the treatment with Vehicle or 15 mg/kg IACS-010759. Each dot represents a tumor; n = 44 (Vehicle), n = 66 (IACS). **b** and **c**, Images from H&E stained lung sections from *KL* mice treated with Vehicle (**b**) or 15 mg/kg IACS-010759 (**c**) for 12 days with tumors delineated with red lines. Quantification of this data is shown in Figure 4I. This experiment was done once.



Extended Data Figure 10. Intra-tumoral heterogeneity in *KL* mice.

Higher magnification of tumor shown in Figure 4n, and Figure 4o with Glut1 staining (left panel) and CK5/TTF1 staining (right panel). Areas corresponding to ADC and SCC are indicated, with rectangular boxes corresponding to zoomed in images shown in Figure 4n. This data is representative of three independent mouse experiments.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

Acknowledgements

We would like to thank Charles Zamilpa, Dishan Abeydeera, Waldemar Ladno, Olga Sergeeva, Darin Williams, Tove Olafsen, at UCLA's Crump Imaging Technology Center for assistance with PET/CT imaging of the mice. We thank Marianne Cilluffo, Robert McMickle, Vishaka Muhunthan, Mingqi Han and Essam Assali for laboratory assistance. We thank the Translational Pathology Core Laboratory at UCLA's DGSOM for assistance with tumor sample preparation and processing. This research was supported by the NIH National Center for Advancing Translational Science (NCATS) UCLA CTSI Grant number UL1TR001881. D.B.S. was supported by the UCLA CTSI KL2 Translational Science Award grant numbers KL2TR001882 at the UCLA David Geffen School of Medicine, the UCLA Jonsson Comprehensive Cancer Center grant P30 CA016042, the Department of Defense LCRP grant number W81XWH-13-1-0459 and the NIH/NCI R01 CA208642-01. S.T.B. was supported by an NIH T32 training grant HL072752. A.J. was supported by a USHHS Ruth L. Kirschstein Institutional National Research Service Award # T32 CA009056. G.A. and A.G. were supported by an NIH/NCI R01 CA208642-01 diversity supplement. J.T.L. was supported by NIH/NCI P30 CA016042. This research was supported by the Joyce and Saul Brandman Fund for Medical Research. We thank the Scott Family and the Carrie Strong Foundation as well as Barry and Donna Goldfarb for their generous support.

References

1. Mitchell P & Moyle J Evidence discriminating between the chemical and the chemiosmotic mechanisms of electron transport phosphorylation. *Nature* 208, 1205–1206 (1965). [PubMed: 5870319]
2. Morais R et al. Tumor-forming ability in athymic nude mice of human cell lines devoid of mitochondrial DNA. *Cancer Res* 54, 3889–3896 (1994). [PubMed: 8033112]
3. Cavalli LR, Varella-Garcia M & Liang BC Diminished tumorigenic phenotype after depletion of mitochondrial DNA. *Cell Growth Differ* 8, 1189–1198 (1997). [PubMed: 9372242]

4. Madar I et al. Characterization of uptake of the new PET imaging compound 18F-fluorobenzyl triphenyl phosphonium in dog myocardium. *J Nucl Med* 47, 1359–1366 (2006). [PubMed: 16883017]
5. Weinberg F et al. Mitochondrial metabolism and ROS generation are essential for Kras-mediated tumorigenicity. *Proc Natl Acad Sci U S A* 107, 8788–8793, doi:1003428107 [pii] 10.1073/pnas.1003428107 (2010). [PubMed: 20421486]
6. Ji H et al. LKB1 modulates lung cancer differentiation and metastasis. *Nature* 448, 807–810 (2007). [PubMed: 17676035]
7. Shackelford DB et al. LKB1 inactivation dictates therapeutic response of non-small cell lung cancer to the metabolism drug phenformin. *Cancer Cell* 23, 143–158, doi:10.1016/j.ccr.2012.12.008 (2013). [PubMed: 23352126]
8. Madar I et al. Characterization of membrane potential-dependent uptake of the novel PET tracer 18F-fluorobenzyl triphenylphosphonium cation. *Eur J Nucl Med Mol Imaging* 34, 2057–2065, doi:10.1007/s00259-007-0500-8 (2007). [PubMed: 17786439]
9. Smith RA, Hartley RC & Murphy MP Mitochondria-targeted small molecule therapeutics and probes. *Antioxidants & redox signaling* 15, 3021–3038, doi:10.1089/ars.2011.3969 (2011). [PubMed: 21395490]
10. Kim DY et al. Evaluation of a mitochondrial voltage sensor, (18F-fluoropentyl)triphenylphosphonium cation, in a rat myocardial infarction model. *J Nucl Med* 53, 1779–1785, doi:10.2967/jnumed.111.102657 (2012). [PubMed: 23038748]
11. Madar I et al. Detection and quantification of the evolution dynamics of apoptosis using the PET voltage sensor 18F-fluorobenzyl triphenyl phosphonium. *J Nucl Med* 50, 774–780, doi:10.2967/jnumed.108.061283 (2009). [PubMed: 19372481]
12. Logan A et al. Assessing the Mitochondrial Membrane Potential in Cells and In Vivo using Targeted Click Chemistry and Mass Spectrometry. *Cell Metab* 23, 379–385, doi:10.1016/j.cmet.2015.11.014 (2016). [PubMed: 26712463]
13. Waldmann CM et al. An Automated Multidose Synthesis of the Potentiometric PET Probe 4-[(18F)Fluorobenzyl-Triphenylphosphonium ((18F)FBnTP). *Mol Imaging Biol*, doi:10.1007/s11307-017-1119-1 (2017).
14. Dykens JA et al. Biguanide-induced mitochondrial dysfunction yields increased lactate production and cytotoxicity of aerobically-poised HepG2 cells and human hepatocytes in vitro. *Toxicol Appl Pharmacol* 233, 203–210, doi:S0041-008X(08)00361-X [pii] 10.1016/j.taap.2008.08.013 (2008). [PubMed: 18817800]
15. Li F et al. LKB1 Inactivation Elicits a Redox Imbalance to Modulate Non-small Cell Lung Cancer Plasticity and Therapeutic Response. *Cancer Cell* 27, 698–711, doi:10.1016/j.ccell.2015.04.001 (2015). [PubMed: 25936644]
16. Giordano S, Lee J, Darley-Usmar VM & Zhang J Distinct effects of rotenone, 1-methyl-4-phenylpyridinium and 6-hydroxydopamine on cellular bioenergetics and cell death. *PLoS One* 7, e44610, doi:10.1371/journal.pone.0044610 (2012). [PubMed: 22970265]
17. Singer TP & Ramsay RR The reaction sites of rotenone and ubiquinone with mitochondrial NADH dehydrogenase. *Biochim Biophys Acta* 1187, 198–202 (1994). [PubMed: 8075112]
18. Caboni P et al. Rotenone, deguelin, their metabolites, and the rat model of Parkinson's disease. *Chem Res Toxicol* 17, 1540–1548, doi:10.1021/tx049867r (2004). [PubMed: 15540952]
19. Bridges HR, Jones AJ, Pollak MN & Hirst J Effects of metformin and other biguanides on oxidative phosphorylation in mitochondria. *Biochem J* 462, 475–487, doi:10.1042/BJ20140620 (2014). [PubMed: 25017630]
20. Owen MR, Doran E & Halestrap AP Evidence that metformin exerts its anti-diabetic effects through inhibition of complex 1 of the mitochondrial respiratory chain. *Biochem J* 348 Pt 3, 607–614 (2000). [PubMed: 10839993]
21. Wheaton WW et al. Metformin inhibits mitochondrial complex I of cancer cells to reduce tumorigenesis. *Elife* 3, e02242, doi:10.7554/eLife.02242 (2014). [PubMed: 24843020]
22. Sanchez-Rangel E & Inzucchi SE Metformin: clinical use in type 2 diabetes. *Diabetologia* 60, 1586–1593, doi:10.1007/s00125-017-4336-x (2017). [PubMed: 28770321]

23. Birsoy K et al. Metabolic determinants of cancer cell sensitivity to glucose limitation and biguanides. *Nature* 508, 108–112, doi:10.1038/nature13110 (2014). [PubMed: 24670634]
24. Hensley CT et al. Metabolic Heterogeneity in Human Lung Tumors. *Cell* 164, 681–694, doi:10.1016/j.cell.2015.12.034 (2016). [PubMed: 26853473]
25. de Bruin EC et al. Spatial and temporal diversity in genomic instability processes defines lung cancer evolution. *Science* 346, 251–256, doi:10.1126/science.1253462 (2014). [PubMed: 25301630]
26. Momcilovic M et al. The GSK3 Signaling Axis Regulates Adaptive Glutamine Metabolism in Lung Squamous Cell Carcinoma. *Cancer Cell* 33, 905–921 e905, doi:10.1016/j.ccell.2018.04.002 (2018). [PubMed: 29763624]
27. Momcilovic M et al. Heightening Energetic Stress Selectively Targets LKB1-Deficient Non-Small Cell Lung Cancers. *Cancer Res* 75, 4910–4922, doi:10.1158/0008-5472.CAN-15-0797 (2015). [PubMed: 26574479]
28. Su CY, Chang YC, Yang CJ, Huang MS & Hsiao M The opposite prognostic effect of NDUFS1 and NDUFS8 in lung cancer reflects the oncojanus role of mitochondrial complex I. *Sci Rep* 6, 31357, doi:10.1038/srep31357 (2016). [PubMed: 27516145]
29. Molina JR et al. An inhibitor of oxidative phosphorylation exploits cancer vulnerability. *Nat Med* 24, 1036–1046, doi:10.1038/s41591-018-0052-4 (2018). [PubMed: 29892070]
30. Wittig I, Braun HP & Schagger H Blue native PAGE. *Nat Protoc* 1, 418–428, doi:10.1038/nprot.2006.62 (2006). [PubMed: 17406264]

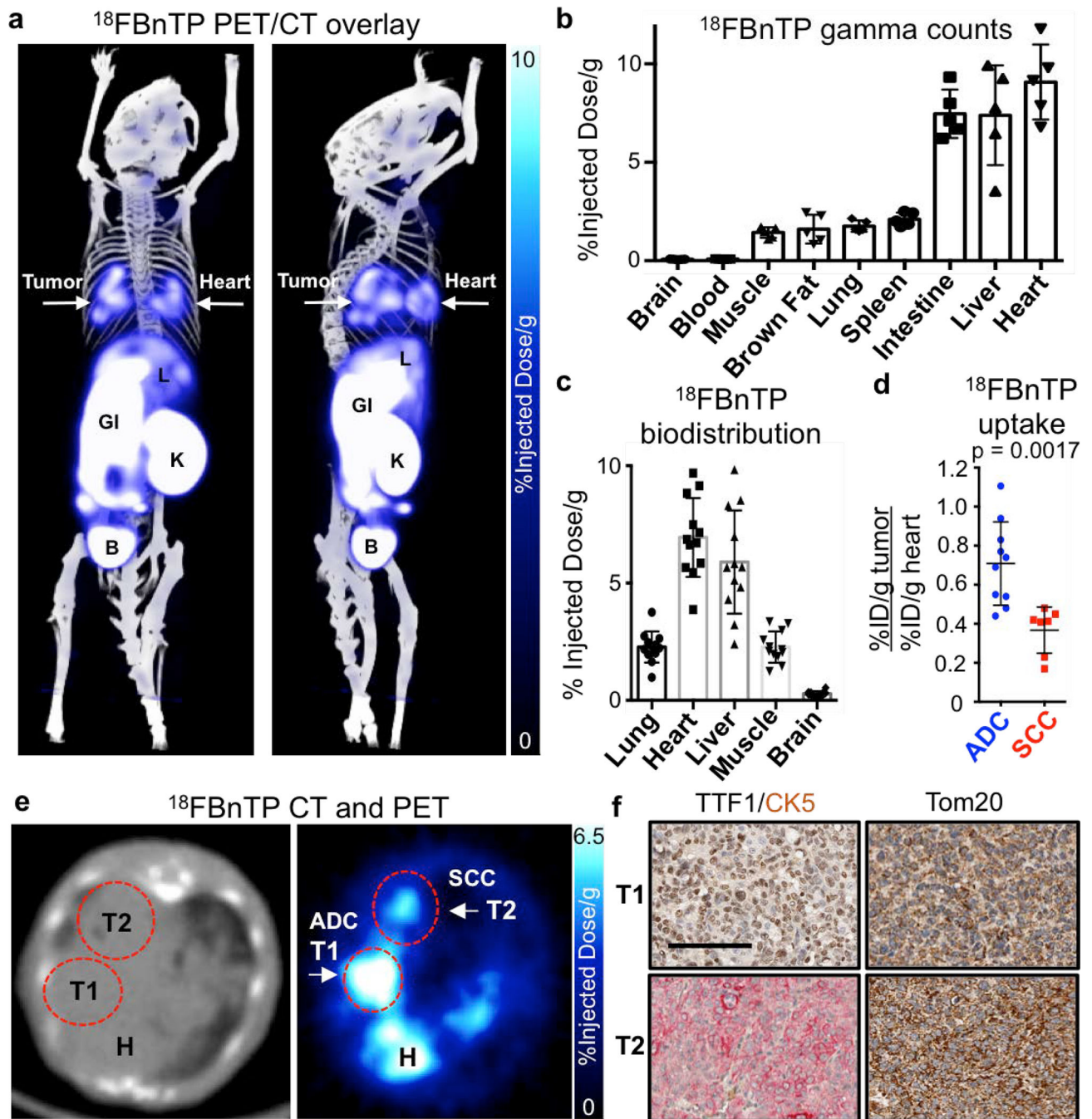


Figure 1. ^{18}F BnTP PET imaging and biodistribution analysis of *KL* lung tumors identified differential uptake between lung adenocarcinomas (ADC) and squamous cell carcinomas (SCC). **a**, PET/CT overlay of a *KL* mouse with lung tumors, imaged with ^{18}F BnTP. Right panel is rotated 90° compared to left panel. Heart (H) and tumor (T) are indicated by arrows. L – liver; GI – gastrointestinal tract; K – Kidney; B – Bladder. **b**, Biodistribution of ^{18}F BnTP probe in tissue from wild type FVB mice measured by gamma counter *ex vivo* after 1 hr uptake (n = 5 mice). **c**, Biodistribution of the ^{18}F BnTP probe in normal tissue of *KL* mice measured by % injected dose/gram after 1 hr uptake (n = 12 mice). **d**, ^{18}F BnTP uptake in

lung ADC and SCC from *KL* mice (n = 5 mice, n = 10 ADC tumors, n = 7 SCC tumors). **e**, Representative transverse image of the heart and lungs of a *KL* mouse imaged with CT (left panel) and ¹⁸FBNTP (right panel). H – heart, T1 – adenocarcinoma (ADC), T2 – squamous cell carcinoma (SCC). **f**, IHC staining of T1 and T2 tumors from panel **e**. TTF1 – thyroid transcription factor 1; CK5 – keratin 5; Tom20 – translocase of outer membrane 20. Scale bar = 100 μm. The data are represented as the mean +/- SD. Statistical significance was calculated using unpaired two-tailed t-test. Experiments in **b**, **c** were done once. Data in **a**, **d**, **e**, **f** are representative of experiments repeated thrice, with similar results obtained.

Author Manuscript

Author Manuscript

Author Manuscript

Author Manuscript

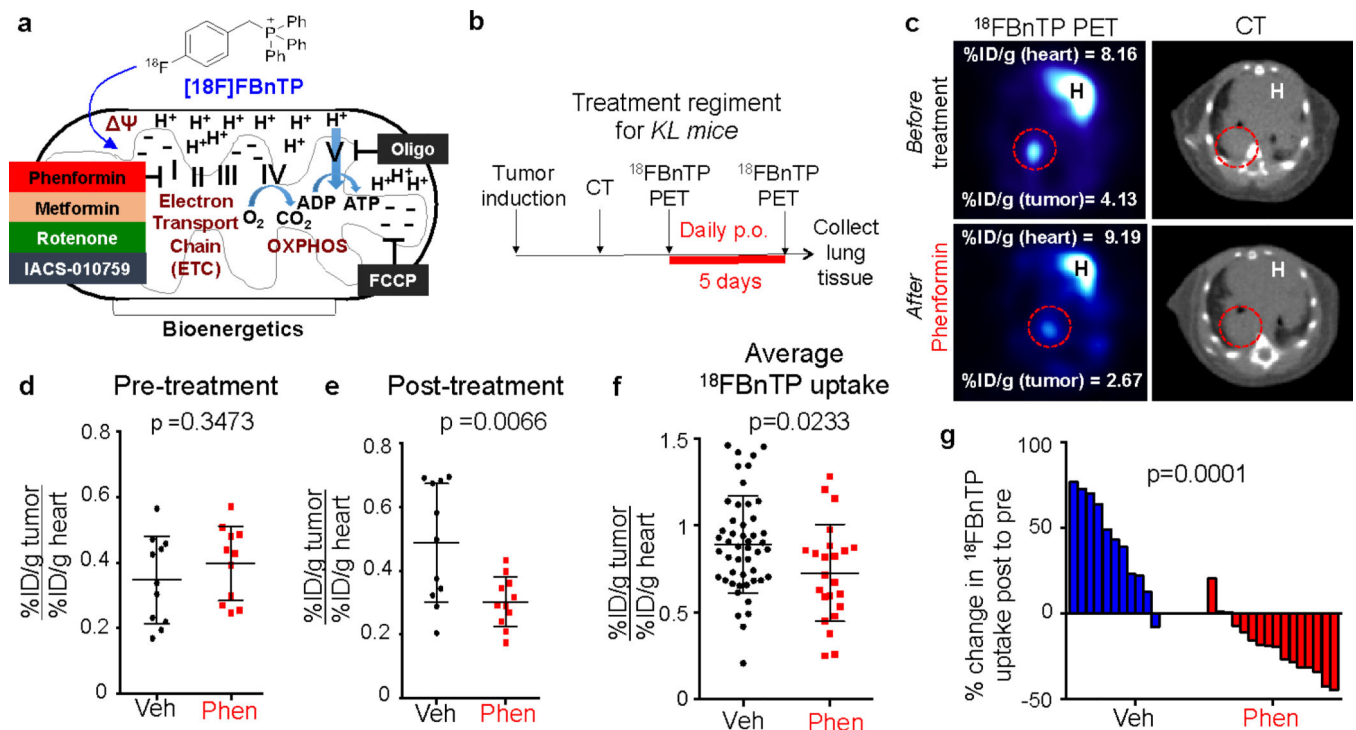


Figure 2. Treatment of *KL* mice with the complex I inhibitor phenformin suppresses ^{18}F BnTP uptake in lung tumors.

a, Schematic drawing representing voltage dependent uptake of ^{18}F BnTP into the mitochondria. Bioenergetics driven by electron transport chain (ETC), and oxidative phosphorylation (OXPHOS) are shown. **b**, Schematic drawing of imaging and treatment regimens for *KL* mice treated with 125 mg/kg/day Phenformin. **c**, Representative images from a *KL* mouse before (top panel) and after (bottom panel) treatment for 5 days with 125 mg/kg/day Phenformin. Values for maximum percent injected dose (%ID/g) for the heart and tumor are indicated. H – heart. **c**, Quantification of maximum percent injected dose (%ID/g) for tumors in Vehicle (Veh) and Phenformin (Phen) groups before treatment (Pre-treatment). Each dot represents an individual tumor; n = 11 tumors for Vehicle and Phenformin groups. **d**, Quantification of maximum ^{18}F BnTP uptake for tumors in Vehicle and Phenformin groups after treatment (Post-treatment) with 125 mg/kg/day Phenformin for 5 days. Each dot represents an individual tumor; n = 11 tumors for Vehicle and Phenformin groups. **e**, Average ^{18}F BnTP uptake in *KL* mice after 5 day treatment with Vehicle (n = 48 tumors; 10 mice) or Phenformin (n = 23 tumors; 10 mice). Each dot represents an individual tumor. **f**, Waterfall plot for % change in probe uptake post-treatment to pre-treatment for mice treated with Vehicle or Phenformin for 5 days. Each bar represents an individual tumor. The data are represented as the mean \pm SD. Statistical significance was calculated using unpaired two-tailed t-test. Data in **d**, **e**, **f** are from two separate mouse experiments. Data in **g** are from three individual mouse experiments.

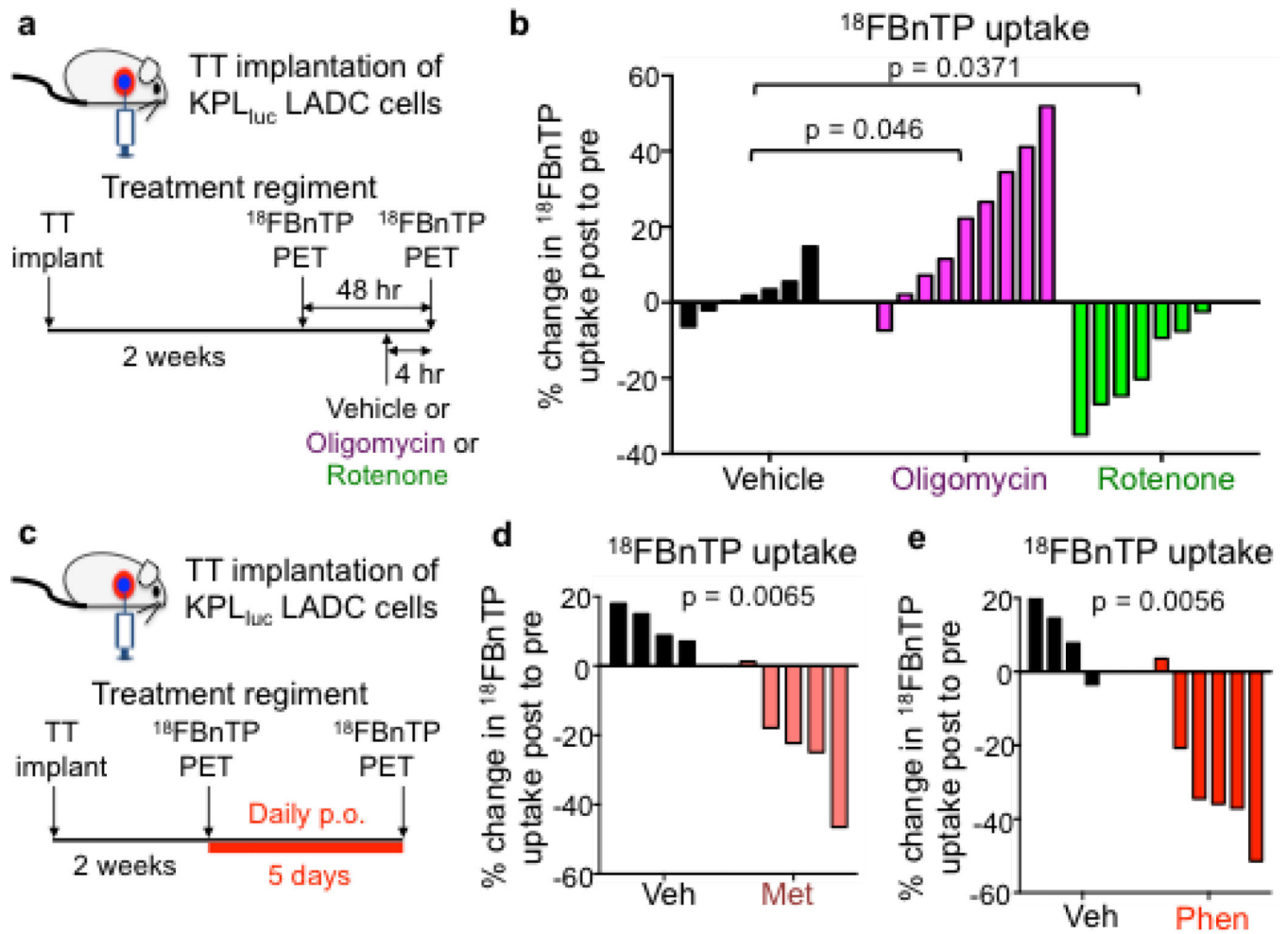


Figure 3. ^{18}F BnTP detects mitochondrial complex I inhibition *in vivo*.

a, Schematic drawing of the transthoracic (TT) implantation of *KPL* lung adenocarcinoma (ADC) cells into syngeneic recipient mouse, imaging and treatment regimens. **b**, Waterfall plot for % change in ^{18}F BnTP uptake post-treatment to pre-treatment for mice treated with a single dose of Vehicle ($n = 7$ mice) or 0.25 mg/kg Oligomycin ($n = 9$ mice) or 0.5 mg/kg Rotenone ($n = 7$ mice). Statistical significance was calculated using one way ANOVA. **c**, Schematic drawing of the treatment and imaging regiment for syngeneic mice implanted transthoracically with *KPL* lung ADC cells and treated with Vehicle or Complex I inhibitor for the indicated time. **d**, Waterfall plot for % change in ^{18}F BnTP uptake post-treatment to pre-treatment for mice treated with Vehicle ($n = 4$ mice) or 500 mg/kg Metformin ($n = 5$ mice) for 5 days. **e**, Waterfall plot for % change in ^{18}F BnTP uptake post-treatment to pre-treatment for mice treated with Vehicle ($n = 4$ mice) or 125 mg/kg Phenformin ($n = 6$ mice) for 5 days. Experiments in **b**, **d**, and **e** were performed once. Statistical significance for **d** and **e** was calculated using unpaired two-tailed t-test.

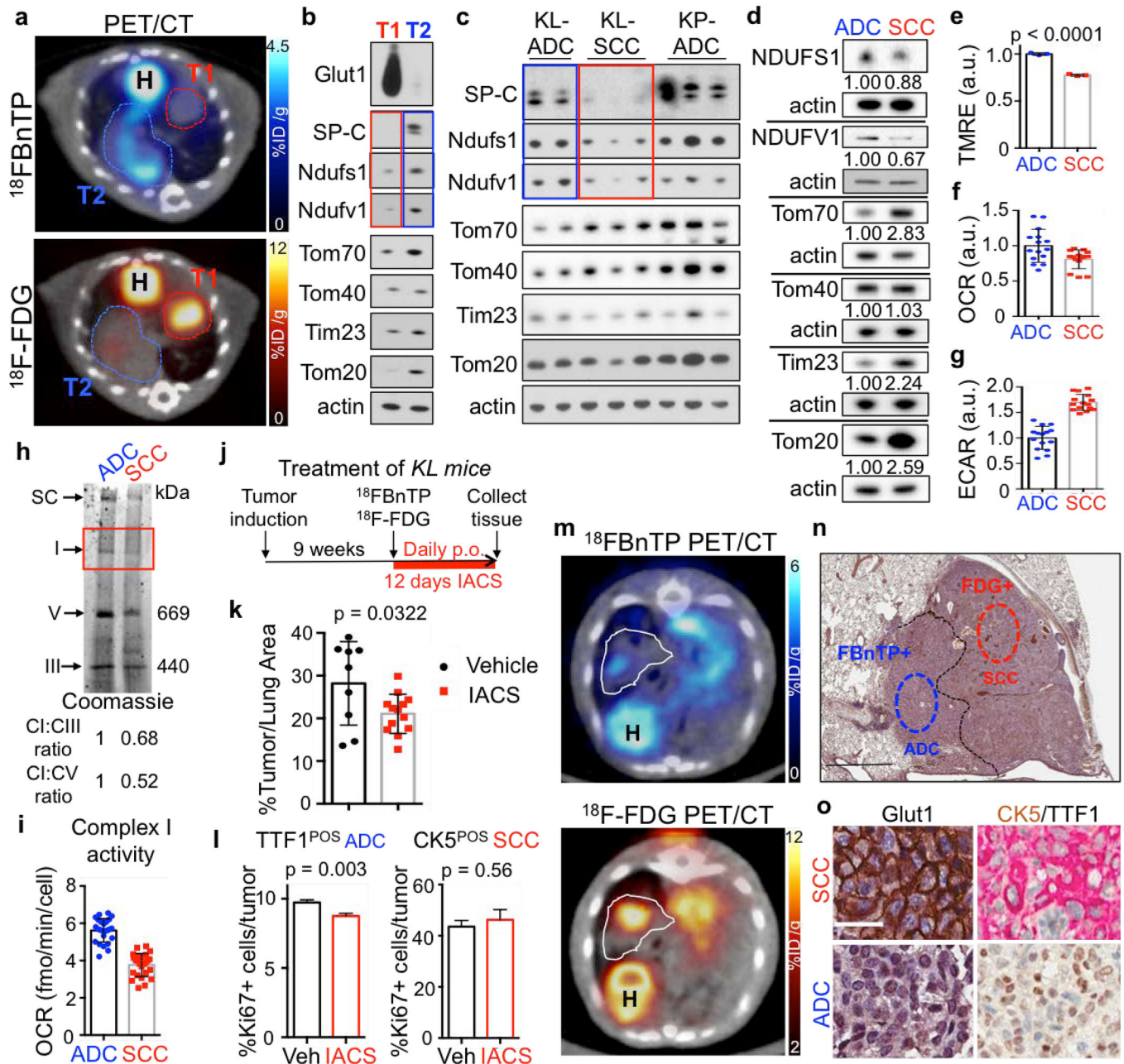


Figure 4. Multi-tracer PET imaging of *KL* lung tumors with $^{18}\text{FBnTP}$ and $^{18}\text{F-FDG}$.
a, PET/CT images of a *KL* mouse with two tumors, T1 and T2. Top panel – $^{18}\text{FBnTP}/\text{CT}$ overlay, bottom panel – $^{18}\text{F-FDG}/\text{CT}$ overlay. H – heart. **b**, Western blot of T1 and T2 isolated from mouse imaged in **a** and probed with indicated antibodies. **c**, Western blot of tumors isolated from *KL* or *KP* mice and probed with indicated antibodies. **d-i**, Experiments performed on A549 (ADC) and RH2 (SCC) cell lines. **d**, Western blot probed with indicated antibodies. Loading control (β -actin) is shown for each blot; intensity of bands relative to actin is indicated. **e**, TMRE measurement ($n = 3$ biological replicates). **f**, Basal oxygen consumption rate (OCR) ($n =$ technical 15 replicates). **g**, Extracellular acidification rate (ECAR) ($n =$ technical 15 replicates). **h**, Coomassie staining of mitochondria isolated from

A549 and RH2 cells separated on blue native gel. SC – supercomplex, I – complex I, V – complex V, III – complex III. Densitometry of the CI band corresponding to CV and CIII is indicated. **i**, Complex I activity in A549 and RH2 cells (n = technical 25 replicates). **j**, Schematic of the treatment regiment for *KL* mice. **k**, Percent of lung area occupied by tumors in *KL* mice treated with Vehicle or 15 mg/kg IACS-010759. N = 9 mice (Vehicle), n = 13 mice (IACS). **l**, Percent of Ki67 positive cells per tumor area quantified for TTF1 positive tumors (TTF1^{POS}) for *KL* mice treated as indicated in **j** (left panel; n=861 [Vehicle]; n=1068 [IACS]) and CK5 positive tumors (CK5^{POS}) tumors (right panel; n=31 [Vehicle]; n=26 [IACS]). The data are shown as the mean \pm SEM. **m**, Transverse view of a *KL* mouse imaged with ¹⁸FBNTP PET/CT (top panel) and ¹⁸F-FDG PET/CT (bottom panel). H – heart; tumor is outlined. **n**, H&E stain of the PET imaged tumor. Tumor histology is indicated. Scale bar = 1.0 mm. **o**, Representative images of Glut1 (left panel) and CK5/TTF1 (right panel) stained tumor. Scale bar = 25 μ m. The data are represented as the mean \pm SD. Statistical significance was calculated using unpaired two-tailed t-test. Experiments in **a**, **b**, **c**, **d-h** were done twice with similar results. Experiments in **i**, **k**, **l** were done once. Data in **m-o** are representative of three independent mouse experiments.