## ORIGINAL ARTICLE



## 3-Nitrobenzanthrone promotes malignant transformation in human lung epithelial cells through the epiregulin-signaling pathway

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Abstract Exposure to environmental and occupational contaminants leads to lung cancer. 3-Nitrobenzanthrone (3-nitro-7H-benz[de]anthracen-7-one, 3-NBA) is a potential carcinogen in ambient air or diesel particulate matter. Studies have revealed that short-term exposure to 3-NBA induces cell death, reactive oxygen species activation, and DNA adduct formation and damage. However, details of the mechanism by which chronic exposure to 3-NBA influences lung carcinogenesis remain largely unknown. In this study, human lung epithelial BEAS-2B cells were continuously exposed to 0–10- $\mu$ M 3-NBA for 6 months. NanoString analysis was conducted to evaluate gene expression in the cells, revealing that 3-NBA-mediated transformation results in

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C.-H. Tseng  $\cdot$  P.-H. Feng  $\cdot$  W.-L. Sun  $\cdot$  Y.-H. Tseng  $\cdot$ T.-T. Chen  $\cdot$  W.-T. Liu  $\cdot$  K.-Y. Lee ( $\boxtimes$ )  $\cdot$  S.-M. Wu ( $\boxtimes$ ) Division of Pulmonary Medicine, Department of Internal Medicine, School of Medicine, College of Medicine, Taipei Medical University, Taipei, Taiwan a distinct gene expression signature including carbon cancer metabolism, metastasis, and angiogenesis. Alterations in tumor-promoting genes such as *EREG* (*epiregulin*), *SOX9*, *E-cadherin*, *TWIST*, and *IL-6* were involved in epithelial cell aggressiveness. Kaplan– Meier plotter analyses indicated that increased *EREG* and *IL-6* expressions in early-stage lung cancer cells are correlated with poor survival. In vivo xenografts on 3-NBA–transformed cells exhibited prominent tumor formation and metastasis. *EREG* knockout cells exposed to 3-NBA for a short period exhibited high apoptosis and low colony formation. By contrast, overexpression of *EREG* in 3-NBA–transformed cells markedly activated the PI3K/AKT and MEK/ERK signaling pathways,

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N. Van Hiep International PhD Program in Medicine, College of Medicine, Taipei Medical University, Taipei, Taiwan resulting in tumorigenicity. Furthermore, elevated IL-6 and EREG expressions synergistically led to STAT3 signaling activation, resulting in clonogenic cell survival and migration. Taken together, chronic exposure of human lung epithelial cells to 3-NBA leads to malignant transformation, in which the EREG signaling pathway plays a pivotal mediating role.

**Keywords** 3-Nitrobenzanthrone · Carcinogen · Transformation · Epiregulin · Lung cancer

## Introduction

Lung cancer has been commonly associated with exposure to environmental and occupational pollutants (Field and Withers 2012). The high number of lung cancer deaths among individuals who have never smoked indicates that risk factors other than tobacco smoking substantially contribute to lung cancer mortality (Casal-Mourino et al. 2019). Diesel engine exhaust (DEE) is a major source of urban pollution, and its composition is complex owing to its gas and particulate phases (Steiner et al. 2016). Toxic chemicals adsorbed onto diesel exhaust particles (DEPs) include polycyclic aromatic hydrocarbons (PAHs) and nitro-PAHs, which exert carcinogenic properties through intracellular metabolic activation by binding to DNA and inducing mutations (Long et al. 2016; White et al. 2017). Casecontrol studies of 11 populations with smokingadjusted analysis have revealed an increased risk of lung cancer after exposure to DEE (Olsson et al. 2011). Moreover, animal studies have revealed that long-term (3 months) exposure to low (100  $\mu$ g/m<sup>3</sup>) or high (3 mg/ m<sup>3</sup>) concentrations of DEP for 1 h/day 5 days/week increased airway inflammation, pulmonary fibrosis, and goblet cell hyperplasia (Kim et al. 2016). These results indicate that chronic exposure to DEPs may promote airway remodeling and angiogenesis. Additionally, DEP extracts instilled intratracheal lung carcinomas and sarcomas in animals (Kunitake et al. 1986; Grimmer et al. 1987).

The nitro-PAH 3-nitrobenzanthrone (3-nitro-7Hbenz[de]anthracen-7-one, 3-NBA) is a potential carcinogen typically present in diesel emissions, gasoline exhaust particles, and atmospheric particles (Arlt 2005; Santos et al. 2019) and has been reported to possess high genotoxic and mutagenic potential (Nagy et al. 2006, 2007; Bieler et al. 2007). Notably, 3aminobenzanthrone was identified as the predominant metabolite of 3-NBA in the urine of DEE-exposed workers (Seidel et al. 2002). In addition, after 3-NBA is metabolically activated, the final electrophilic metabolite can bind to nucleophilic sites in biomolecules such as DNA (Arlt et al. 2005; Stiborova et al. 2010). Thus, nucleophilic attacks may occur at the nitrogen and carbon rings of DNA (Takamura-Enya et al. 2007). Intratracheal instillation of 3-NBA (total dose = 2.5mg) for 18 months caused tumor formation in rats: specifically, 3-NBA induced squamous cell carcinoma in 11 of 16 rats (68.7%) and lung adenocarcinoma in one rat (Nagy et al. 2005). Evidently, 3-NBA causes premutagenic lesions in DNA and may initiate tumor progression in target tissues. In the MutaMouse model, 3-NBA also causes DNA adducts in lung tissue when administered through gavage (Arlt et al. 2008). In addition, 3-NBA induces cell death, the production of reactive oxygen species (ROS), and DNA adduct formation and lesion damage in several types of cells and tissues (Arlt et al. 2008; Arlt et al. 2001; Hansen et al. 2007; Stiborova et al. 2012). These data suggest that 3-NBA is a potential lung carcinogen.

Increasing evidence suggests that the 3-NBA present in ambient air and diesel particulate matter (PM) is a critical carcinogenic compound. In fact, DEPs contain a heterogeneous mixture of transition metals, PAHs, and nitro-PAHs, including 3-NBA. An individual's daily breath intake of 3-NBA contained in DEPs may be as high as 90 pg/day (Arlt 2005). However, the qualitative and quantitative compositions of DEE vary according to fuel, engine, and emission system. Moreover, 3-NBA exposure concentrations may vary between the general population and specific high-risk groups exposed to engine exhaust, domestic coal-burning stoves, rainwater, and ambient air PM. Accordingly, the detailed mechanism of carcinogenicity mediated by consistent, long-term exposure to single-compound 3-NBA remains unclear.

To determine the cellular and molecular processes involved in carcinogenesis, lung epithelial BEAS-2B cells were continuously exposed to 3-NBA in a culture over an extended period. Analysis of NanoString PanCancer gene expression profiling revealed that 3-NBA-mediated cell transformation significantly altered several tumor-promoting genes such as *EREG*. EREG is an agonist of EGFR that homodimerizes EGFR, thereby activating EGFR downstream signaling cascades such as the MEK/ERK pathway and subsequently promoting cancer cell survival and proliferation (Shelly et al. 1998). Signaling of the EREG/EGFR pathway regulates tumor development processes, including apoptosis resistance, cell proliferation, metastasis, and angiogenesis (Sunaga and Kaira 2015). Notably, EREG expression is typically low in nontumor cells but is elevated in several human tumors such as lung cancer (Sunaga et al. 2013). We hypothesized that EREG may play a key role in cell survival, and we further prepared BEAS-2B EREGdepleted cells by using CRISPR/Cas9 technology. EREG knockout can markedly increase more apoptosis and reduce clonogenic cell survival upon stimulation with 3-NBA. In the current study, chronic 3-NBA exposure induced malignant transformation through the altered expression of tumor-promoting genes that mediated clonogenic cell survival, anchorage-independent cell growth, migration, and in vitro angiogenesis. In addition, EREG-mediated downstream signaling paths including PI3K/AKT, MEK/ERK, and STAT3 may contribute to tumorigenicity in 3-NBA-transformed cells.

## Materials and methods

## Cell culture

Human lung epithelial cells (BEAS-2B cells) were purchased from American Type Culture Collection (ATCC, Manassas, VA, USA). The cells were cultured in Dulbecco's modified Eagle's medium (DMEM) supplemented with 10% fetal bovine serum (FBS; Invitrogen, Thermo Fisher Scientific, Carlsbad, CA, USA) in a 5% CO<sub>2</sub> humidified incubator at 37°C. 3-NBA (Carbosynth, Berkshire, UK) was suspended and diluted to appropriate concentrations in the culture medium. In total,  $1 \times 10^6$  BEAS-2B cells were seeded onto a 10-cm dish and treated with 0-10-µM 3-NBA per passage. This process was sustained for 6 months (2 passages/week, BEAS-2B 3-NBA-6M). Continuous culture-matched BEAS-2B cells were treated with dimethyl sulfoxide (DMSO) as controls (BEAS-2B control-6M).

#### Cell proliferation assay

In total,  $1 \times 10^5$  BEAS-2B parental and transformed 3-NBA-6M or control-6M cells were seeded on 6-cm

dishes. Growth rates were then examined with trypan blue exclusion, and cells were quantitated on days 1–4 by using the Counters cell counter (Invitrogen). The results are presented as total cell numbers.

Transfection and RNA interference

In total,  $5 \times 10^6$  BEAS-2B 3-NBA-6M or control-6M cells were transiently transfected with 500-nM small interfering RNAs targeting *EREG* and *IL-6* (Dharmacon, Lafayette, CO, USA) or a scramble control according to the manufacturer's instructions. The samples were then transferred into an electroporation cuvette by using a Nucleofector system; the transfections were performed according to the manufacturer's instructions. After transfection, the cells were immediately transferred into prewarmed complete DMEM medium and cultured in a regular culture condition.

### Cell apoptosis assay

Apoptosis analysis was performed through Annexin V-FITC/propidium iodide (PI) staining (BD Biosciences, San Jose, California, USA) with a detection kit according to the manufacturer's instructions. In brief, 3-NBA– treated cells were harvested, washed twice with cold phosphate-buffered saline (PBS), and then resuspended in binding buffer. The cell suspension ( $10^5$  cells) was mixed with equal volumes (5 µL) of Annexin V-FITC and PI at room temperature without exposure to light for 15 min. Subsequently, the percentage of apoptotic cells was measured using a BD LSRFortessa cell analyzer.

NanoString gene expression analysis

Gene expression assay was performed with the NanoString PanCancer Pathway Panel by using 50 ng of total RNA according to the manufacturer's instructions. The data were then processed and analyzed using nSolver analysis software 4.0 (NanoString Technologies, WA, USA). The geometric mean of housekeeping genes was calculated to normalize all samples. The fold change (FC) of differentially expressed gene expression between 3-NBA-6M and control-6M cells was obtained. Deregulated KEGG pathways were identified using STRING (http://string-db.org).

## Immunoblot analysis

Total cell lysates (40 μg/lane) were added to each lane of 10% SDS-PAGE gel and analyzed by blotting with antibodies specific to p53 (Santa Cruz, Dallas, TX, USA, sc-126), SOX9 ([SRY (sex determining region Y)-box 9]; ABclonal, Woburn, MA, USA, A2479), TWIST1 (Santa Cruz, sc-81417), TWIST2 (ABclonal, A5599), SANI2 (Proteintech, Rosemont, IL, USA, 12129-1-AP), GREM1 (ABclonal, A11595), THBS (ABclonal, A2125), E-cadherin (Thermo, 13-1700), STAT3 (Cell Signaling, Danvers, MA, USA, 9131), p-STAT3 (Cell Signaling, 9139), ERK (Thermo, MA5-15605), p-ERK (Cell Signaling, 5683), AKT (Proteintech, 10176-2-AP), p-AKT (Cell Signaling, 9271), MET (Cell Signaling, 3127), and EREG (R&D, Minneapolis, MN, USA, AF1195).

## Soft agar colony formation assays

In total, 10,000 cells per well were seeded in 12-well plates for 3 weeks to achieve layer agar cultures according to the method described in our previous publication (Wu et al. 2017). Thereafter, the cells were resuspended in 10% FBS in DMEM with 0.33% agar; the complete medium in the upper layer was replaced once per week. The colonies were stained with crystal violet (0.01%, w/v) after 3 weeks.

## Clonogenic assays

*EREG* knockout or control cells (250 cells/well) were seeded in 6-well plates, and 10- $\mu$ M 3-NBA was replenished every 3 days for 2 weeks. Induction of colony formation was also measured in 3-NBA-6M or control-6M cells with recombinant human IL-6 (rIL-6) treatment in the presence or absence of indicated inhibitors. Monolayers were then fixed and stained with 0.5% crystal violet, washed, and dried. After the plates were photographed, the crystal violet was solubilized with 20% acetic acid, and the intensity was spectrophotometrically quantified at 490 nm.

## Migration and invasion assay

The BEAS-2B–transformed and control cells  $(2 \times 10^5)$  were resuspended in 100 µL of serum-free DMEM before being placed in the upper chamber of 24-well transwell plates (Costar, St Lowell, MA, USA); 1 mL of

20% FBS medium was used as a chemoattractant in the lower chamber. For invasion assays, the upper chambers were coated with 100  $\mu$ L of diluted Matrigel and were left to gel at 37°C for 4 h. BEAS-2B–transformed and control cells were preincubated in serum-free medium overnight. Subsequently, the cells were suspended in 100  $\mu$ L of serum-free medium before being placed in the upper Matrigel-coated chamber; the lower well was placed in a 20% FBS medium. After 24 h of incubation, the migration or invasion ability of the cells was measured as described previously (Wu et al. 2017).

Endothelial cell tube formation assay

The Matrigel matrix was placed on ice overnight before tube formation analysis. Next, 100  $\mu$ L of Matrigel was transferred to one well in a 48-well plate, which was placed in regular culture condition overnight. Primary human umbilical vein endothelial cells (HUVECs) derived from PromoCell (Heidelberg, Germany) were cultured in EGM-2 medium, and 3 × 10<sup>4</sup> cells/100  $\mu$ L were mixed with 80  $\mu$ g of conditioned medium from BEAS-2B 3NBA-6M or control-6M cells from each well. After 16 h of incubation, the absolute number of tube formations in five randomly selected fields per well was measured using light microscopy.

## Enzyme-linked immunosorbent assay

The IL-6 protein levels in the supernatants were determined using commercial enzyme-linked immunosorbent assay (ELISA) kits (eBioscience, San Diego, CA, USA) according to the manufacturer's instructions. ELISA kits were also used to confirm secretory EREG protein levels (Abnova, Taipei, Taiwan, KA5094).

Generation of *EREG* knockout BEAS-2B cells through CRISPR/Cas9-mediated genome editing

Human *EREG* knockout BEAS-2B cells were generated using CRISPR/Cas9 technology. Two sgRNAs targeting the third or seventh coding exon were separately cloned into pAll-Cas9. We purchased pPpuro plasmid from the National RNAi Core Facility (Academia Sinica, Taipei, Taiwan). The sgRNA targeting sites 5'-ATGGAATCACAGTTGTACTGAGG-3' and 5'-GACAGAAGACAATCCACGTGTGGG-3' were used for sgRNA#1 and sgRNA#2, respectively. Human BEAS-2B cells were transfected with two sgRNA plasmids by using the 4D-Nucleofector system according to the manufacturer's instructions (Lonza, Morristown, NJ, USA). After 2 days, the transfected cells were treated with puromycin (2  $\mu$ g/mL) for 1 week. The live cells were then diluted in a 96-well plate to isolate single-cell clones. The depletion of *EREG* in the *EREG* knockout cells was confirmed through immunoblot analysis and genomic DNA sequencing.

## Xenograft assays of tumorigenicity in vivo

A total of 20 female BALB/cAnN.Cg-Foxn1nu/CrlNarl nude mice aged 6 weeks were obtained from the National Laboratory Animal Center (Taipei, Taiwan) and housed in a pathogen-free facility. To evaluate solid tumors generated in the nude mice,  $2 \times 10^5$  BEAS-2B 3-NBA-6M (10 µM)-transformed (3-NBA-T) or control cells in 100-µL PBS were subcutaneously inoculated (n = 5 nude mice/group), and tumor size was determined as described previously (Wu et al. 2017). The animals were sacrificed after the 6-week tumor growth experiment. The invasive ability of the 3-NBA-T cells was further determined by intravenously injecting transformed or control cells  $(1 \times 10^6)$  into five nude mice/group. After 7 weeks, all animals involved in invasion experiments were sacrificed. We examined the tumor foci in the lung tissues of the nude mice and determined EREG and IL-6 expressions by using immunohistochemistry with EREG (Abcam, ab175118) and IL-6 (Bioss, Woburn, MA, USA, bs-0781R) antibodies. Animal care and experiment protocols were approved by the Institutional Animal Care and Use Committee of Taipei Medical University (Approval No. LAC-2020-0061).

### Kaplan-Meier plotter database

The Kaplan–Meier (KM) survival plotter database (http://kmplot.com/analysis/), which includes data on 1925 patients with lung cancer, was used to evaluate the prognostic values of the 3-NBA–mediated genes. KM plots were obtained for each gene symbol in the database. The high- and low-expression groups of patients with lung cancer were classified according to optimal gene expression cutoff values, and 10-year overall survival analyses were conducted. The number of patients, upper quartile or median survival months, and hazard ratios with 95% confidence intervals and log rank *p* values were extracted from the database.

#### Statistical analysis

Data were presented as means with standard deviations and statistically analyzed using GraphPad Prism 8.0 (GraphPad Software, San Diego, CA, USA). Betweengroup differences were analyzed using the Student's *t* test. To compare the results obtained from multiple treatments, one-way analysis of variance and Tukey's honestly significant difference post hoc test were conducted.

## Results

Differential gene expression in human lung epithelial cells after long-term exposure to 3-NBA

The chemical structure of 3-NBA is presented in Supplementary Material 1. BEAS-2B cells exposed to 1–160- $\mu$ M 3-NBA for 24 h revealed a dose-dependent 10.43–65.42% reduction in cell viability and a 15.10–110.28% increase in intracellular ROS when compared with DMSO-exposed control cells (Supplementary Material 1). Moreover, 1- or 10- $\mu$ M 3-NBA treatment resulted in a 1.89–5.12% increase in cell apoptosis for 24 h and repressed cell proliferation by 20.28–30.38% for 4 days. These results indicate that treatment with 1- or 10- $\mu$ M 3-NBA can induce cellular ROS formation and apoptotic cell death within a short period.

The malignant transformation potential of BEAS-2B cells in vitro was assessed after long-term exposure to 3-NBA. As presented in Fig. 1a, subconfluent cell cultures continuously exposed to 3-NBA (0.1–10  $\mu$ M) and DMSO control for 6 months were designated as BEAS-2B 3-NBA-6M and control-6M, respectively. To identify a specific gene alteration pattern caused by 1- or 10-µM 3-NBA, gene expression profiling was performed using the NanoString PanCancer Panel. The gene expression profile of BEAS-2B 3-NBA-6M (1 or  $10 \mu$ M) cells differed from that of the control-6M cells (Fig. 1b). The most differentially expressed genes in each gene set were identified; the global significance score indicates the extent of differential expression. The heatmap represents the scores of the different gene sets between BEAS-2B cells treated with 1- or 10-µM 3-NBA and the control cells treated with DMSO (Fig. 1c). The pathway scores condense the gene expression profile of each sample assessed in later experiments. The scores were plotted to compare pathway differences



ABIJBE		2.02	1.236-04	0.007	10 10
IL6		2.27	6.83E-04	0.022	9 11 18 26 28
INHBA		2.26	2.74E-02	0.299	7 9 11 31 32
CYP1B1		2.25	8.13E-05	0.006	1 6 27 34
SRGN		1.85	1.02E-04	0.006	4 13 17
SOX9		1.76	9.83E-05	0.006	9 10 16 17 31 33
THBS1		1.74	5.20E-06	0.002	4 6 7 9 14 19 25
CD24		1.66	2.33E-04	0.011	6 9 11 17 15 19 26
COL5A2		1.62	1.04E-04	0.006	10 13 14 15 17
LAD1		1.57	2.23E-02	0.259	3 17
FBLN5		1.46	5.84E-03	0.086	4 6 10 15
KIAA1462		1.42	5.67E-03	0.084	17
SNAI2		1.35	1.15E-03	0.027	6 10 16 17 31 33
HOXB3		1.33	6.42E-04	0.021	1 33
AREG		1.21	9.31E-03	0.129	9 11 17 20
SFRP1		1.18	8.85E-04	0.025	9 15 17 26 28 34
FST		1.17	1.50E-04	0.008	32
FGFR2		1.14	8.37E-04	0.025	1 5 9 11 20 31
CHRDL1		-4.24	3.96E-05	0.005	17
SPOCK3		-4.26	1.57E-02	0.196	15
CDH1		-4.42	4.85E-03	0.076	6 17 20 23 24 26 31
CXCR4		-4.47	2.10E-04	0.010	17 19 20 26 31
NDRG1		-4.81	1.73E-03	0.036	19 23 26
SULF1		-4.90	1.17E-03	0.027	9 11 25 26
THBS2		-5.06	7.16E-04	0.022	3 6 14 25 32
HLA-DPB1		-5.07	2.12E-02	0.250	20 22
FBLN1		-5.14	1.08E-03	0.027	3 15 17
BICC1		-5.16	2.60E-05	0.005	17
SYNE1		-5.34	1.44E-02	0.185	17 20
DSC2		-5.70	4.54E-04	0.016	6 17 20 26
LUM		-5.70	6.31E-03	0.092	11 13 15
IRF6		-5.86	1.75E-03	0.036	7 9 17 31 33
OAS1		-6.04	2.72E-04	0.011	17
GDF6		-6.34	8.06E-05	0.006	11 32
ADM2		-6.59	8.83E-06	0.002	1 27
ITGA1		-6.66	9.52E-05	0.006	6 13 14 20 26 31
TCF4		-7.28	9.38E-06	0.002	16 17 33
PDPN		-7.96	4.45E-07	0.001	6 7 9 10 26

ECM Receptor Interaction ECM Structure EMT to Metastasis Epithelial to Mesenchymal Transition HIF1A Signaling Hypoxia Response 20 Integral to Membrane 21 LOX Remodeling 22 23 Metastasis Response Metastasis Suppressors MMP Remodeling 24 Negative Regulation of Angiogenesis Plasma Membrane Positive Regulation of Angiogenesis 25 26 27 Regulation of Angiogenesis Regulation of Metabolism Sprouting Angiogenesis Stem Cell Associated 28 29 30 31 32 33 TGFB Signaling Transcription Factor Transcription Fa Vasculogenesis

Fig. 1 Differential gene expression after long-term exposure of BEAS-2B cells to 3-NBA. a Schematic representation of BEAS-2B cells continuously exposed to 0-10-µM 3-NBA for 6 months (BEAS-2B 3-NBA-6M cells). b mRNA quantified using the PanCancer Progression Panel through NanoString analysis with BEAS-2B samples exposed to 3-NBA and DMSO control for an extended period. Results are depicted as a volcano plot indicating the differential gene expression of BEAS-2B cells treated with 1or 10-M 3-NBA for 6 months compared with the BEAS-2B DMSO control. c Heatmap displaying differential gene expression between BEAS-2B cells treated with DMSO control and those treated with 1- or 10-µM 3-NBA. The most differentially expressed genes in each gene set were identified, and the extent of differential expression in each gene set was summarized using a global significance score. The heatmap displays each sample's global significance score. Orange denotes gene sets whose genes exhibited higher differential expression with the covariate, and blue denotes gene sets with lower differential expression. d Pathway scores plotted to compare variation between 0-, 1-, and 10µM 3-NBA-6M. The lines denote each pathway's average score among the group conditions. e Top 20 upregulated and downregulated genes in the 10 µM 3-NBA-6M group; p values and log2 FC on the left panel correspond to the cancer progression pathway gene sets. False discovery rate was controlled using the Benjamini-Yekutieli procedure, and adjusted p values were generated

between 1- and 10- $\mu$ M 3-NBA (Fig. 1d). The average scores for pathways related to carbon cancer metabolism, epithelial-to-mesenchymal transition (EMT) to metastasis, angiogenesis regulation, and sprouting angiogenesis increased in a 3-NBA dose-dependent manner. The top 20 up- and downregulated genes in BEAS-2B 3-NBA-6M (10  $\mu$ M) cells and the relative gene sets of the cancer progression pathways are presented in Fig. 1e.

## 3-NBA-mediated cell transformation promotes proliferation

To determine whether 3-NBA can transform lung epithelial cells into the cancer progression phenotype, NanoString gene expression analysis was performed by applying the nCounter PanCancer Progression Pathways Panel to RNA from 3-NBA–transformed cells. The panel contains 770 genes involved in several key cancer progression steps such as cell proliferation, extracellular matrix remodeling, EMT, and metastasis. Carbon cancer metabolism gene sets such as *FGFR2* and *MET* were upregulated, but key tumor suppressor genes such as *p53* were downregulated. The p53 protein was downregulated in BEAS-2B 3-NBA-6M cells compared with the control-6M cells (Supplementary Material 2).

To examine the proliferation alteration in BEAS-2B 3-NBA-6M cells, we analyzed the proliferation gene set signature (Fig. 2). Figure 2a indicates that the genes in 3-NBA-transformed cells were significantly altered. The analysis of the proliferation pathway gene set revealed differentially expressed genes with  $\log 2 \text{ FC} > 1.5$ , including EREG, IL-6, SOX9, THBS1, and CD24, in BEAS-2B cells transformed through exposure to 10-µM 3-NBA. Notably, the most differentially expressed gene, EREG, was significantly upregulated by log2 FCs of 3.00 and 6.88 in 1- and 10- $\mu$ M 3-NBAtransformed cells, respectively. To evaluate the potential functional interrelationships within the proliferation gene set, the STRING database (Szklarczyk et al. 2017) was used to determine protein-protein interactions after 3-NBA transformation. The results revealed that the upregulated genes affected after 3-NBA transformation were mainly in the EREG/AKT, IL-6/SOX9, and MET protein networks. As expected, 1- or 10-µM 3-NBA-transformed BEAS-2B cell proliferation was enhanced by 33.76-48.47% compared with control cells after treatment for 4 days (Fig. 2b).

Anchorage-independent growth in soft agar in vitro is an indication of cellular transformation and is closely associated with tumorigenesis in vivo (Cox and Der 1994). Data from the clonogenic soft agar assay revealed 2.43- to 2.77-fold increases in colony numbers in the BEAS-2B 3-NBA-transformed group compared with the controls, indicating malignancy (Fig. 2c). To determine whether the changes in the gene expression patterns were consistent with those in protein levels, we investigated several principal components involved in cell proliferation. The levels of EREG, AKT, SOX9, and MET were increased in the BEAS-2B 3-NBA group treated with 10-µM 3-NBA (Fig. 2d). Notably, an evident dose-dependent increase (1.83- and 2.69-fold) in EREG proteins was observed in cells transformed with 1-10-µM 3-NBA.

Long-term exposure to 3-NBA induces human lung epithelial cell aggressiveness

Active tumor cell migration is a crucial prerequisite for tumor cell invasion and metastasis. To determine whether 3-NBA-mediated transformation can affect EMT phenotype, we conducted a NanoString gene expression



Fig. 2 Cell proliferation increased in lung epithelial cells exposed to 3-NBA for an extended period. a Differentially expressed genes with  $p \le 0.01$  and  $\log 2 \text{ FC} > 1$  or  $\log 2 \text{ FC} < -1$  in BEAS-2B cells treated with 10-µM 3-NBA for 6 months when compared with the BEAS-2B DMSO control (0-µM 3-NBA). The analysis of proliferation-related genes in BEAS-2B 3-NBA-6M cells treated with 1- or 10-µM 3-NBA is depicted as a volcano plot. The inter protein-protein interaction of the genes upregulated (log2 FC > 0.5) under long-term 10-µM 3-NBA treatment during cell proliferation was obtained through STRING network analysis. The network yielded up to three clusters by using k-means clustering and had a high confidence of interaction score (0.700). b BEAS-2B 3-NBA-6M (1-10 µM)-transformed cells exhibited increased cell proliferation when compared with control cells after treatment for 4 days. c 3-NBA-transformed cells grown in plates with soft agar cultures. Representative images of colonies (scale bar, 400 µm) are displayed. The 3-NBA-mediated transformation significantly increased colony numbers in BEAS-2B 3-NBA-6M cells when compared with the DMSO control. d Expression levels of EREG, SOX9, and MET proteins examined through immunoblotting. Actin served as a loading control, and protein expression was normalized to actin. The relative values of proteins are expressed as the FC over control. Data are presented as the mean  $\pm$  standard deviation of three independent experiments. (\*p < 0.05 and \*\*p < 0.050.01)

analysis, revealing that 10-µM 3-NBA-mediated transformation upregulated EMT and EMT to metastasis gene sets such as SOX9 (log2 FC = 1.76) and SANI2  $(\log 2 \text{ FC} = 1.35)$  but downregulated *CDH1* (*Ecadherin*) (log2 FC = -4.42) during EMT (Fig. 3a and b). To examine the functional role of 3-NBA-mediated transformation in cell migration, we performed a transwell migration assay, which indicated that migration ability increased 2.12- to 2.34-fold in cells transformed with 1- or 10-µM 3-NBA (Fig. 3c). Furthermore, compared with control cells, 1- or 10-µM 3-NBA-transformed BEAS-2B cells exhibited 2.59- to 3.56-fold enhancements in invasion ability (Fig. 3d). We further examined several key regulators of EMT in 3-NBA-transformed cells. Western blot assays revealed markedly reduced protein levels of E-cadherin (0.32fold) and increased levels of TWIST1 and TWIST2 (1.91- and 2.56-fold, respectively) in BEAS-2B cells transformed with 10-µM 3-NBA (Fig. 3e).

Angiogenesis is critical to cancer development and is characterized by abnormal tumor vascularization. Therefore, we conducted NanoString gene expression analysis to examine angiogenesis regulation in 3-NBA– transformed cells. Differentially expressed genes from the angiogenesis or sprouting angiogenesis processes were observed (Fig. 4a and b). To determine whether 3-NBA-transformed cells induced angiogenesis in vitro, we performed tube formation assays, revealing that 3-NBA-mediated transformation markedly enhanced tube formation (1.77- to 2.04-fold), particularly at concentrations of 1 and 10  $\mu$ M (Fig. 4c). The IL-6/ STAT3 axis may facilitate angiogenesis in several cancers. High levels of systemic IL-6 expression are correlated with poor prognosis in patients with non-small-cell lung cancer (NSCLC) (Silva et al. 2017). The gene expression levels of IL-6 increased 3.09- to 4.62-fold in 3-NBA-transformed cells (1 or 10 µM; Fig. 4d). Moreover, secretory IL-6 protein levels were markedly elevated (1.58- to 2.15-fold; Fig. 4e). However, NanoString analysis indicated that the upregulation of THBS1 and GREM1 in 3-NBA-transformed cells did not significantly alter protein levels (Fig. 4f).

Collectively, these data suggest that chronic exposure to 3-NBA may mediate tumor-promoting gene alteration, including cell proliferation, independent cell growth, migration, invasion, and tube formation, thereby inducing epithelial cell aggressiveness.

# 3-NBA-mediated gene expression is correlated with poorer overall lung cancer survival

We used KM plotter with the transcriptomic data of 1925 NSCLC specimens from the lung cancer gene expression dataset (Gyorffy et al. 2013) to evaluate the prognostic significance of the biomarkers in the genes that were markedly mediated by 3-NBA. The 10-year overall survival analysis suggested that most upregulated genes in the 3-NBA transformation network, including IL-6, SOX9, and SANI2, were highly expressed in patients with poor lung cancer prognosis (Fig. 5a). By contrast, the levels of several downregulated genes such as CDH1, SYNE1, and TCF4 were lower, with significant differences in patients with poor lung cancer poor prognosis (Fig. 5b). Furthermore, survival analyses were performed according to subtypes of clinical lung cancer characteristics, revealing that 3-NBA markedly induced EREG gene correlation with lung cancer. Notably, in an analysis of patients with lung cancer, female patients, those who never smoked, and those with adenocarcinoma exhibited a high correlation of EREG expression with poor overall survival (Fig. 5c). Moreover, poor survival was observed in patients with lung cancer and high EREG expression in the following subtypes: small tumor size (stage T1,  $\leq$ 3 cm), no regional lymph node or ipsilateral mediastinal lymph node spreading





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✓ Fig. 3 3-NBA-transformed lung epithelial cells exhibited increased cell migration and invasion. a The EMT-related differentially expressed genes with  $p \le 0.01$  and  $\log 2 \text{ FC} > 1$  or  $\log 2 \text{ FC}$ < -1 in BEAS-2B cells treated with 10-µM 3-NBA for 6 months when compared with the DMSO control cells (0-µM 3-NBA). The analysis of proliferation-related genes in BEAS-2B 3-NBA-6M cells treated with 1- or 10-µM 3-NBA is depicted as a volcano plot. The protein network of the EMT-related genes upregulated after long-term 10-µM 3-NBA treatment during cell proliferation was obtained through STRING network analysis. b The differentially expressed genes in EMT and metastasis-related genes with p  $\leq$  0.01 are listed and depicted as a volcano plot. The protein network displays upregulated genes after 10-µM 3-NBA treatment. c BEAS-2B 3-NBA-6M (1-10 µM)-transformed cells exhibited increased cell migration compared with DMSO control cells. d BEAS-2B 3-NBA-6M (1-10 µM)-transformed cells exhibited increased cell invasion compared with control cells. e Expression levels of TWIST1, TWIST2, p-AKT, and AKT proteins examined through immunoblotting and normalized to actin. The relative expressions of proteins are indicated as the FC over control. Data are presented as the mean  $\pm$  standard deviation of three independent experiments. (\*p < 0.05 and \*\*p < 0.01)

(N0 or N2 status), and well-differentiated lung cancer cells (grade I). Patients with stage 1A (T1N0M0) lung cancer and high EREG expression had poor survival (low expression, 48.0 months; high expression, 25.0 months; p = 0.023; Fig. 5d). The survival analysis demonstrated that high IL-6 expression was associated with unfavorable prognosis in most subtypes of clinical characteristics (except stages T2-T4; Fig. 5e). Similarly, in patients with stage 1A lung cancer, survival was lower in patients with high IL-6 expression (30.0 months) than in those with low IL-6 expression (91.0 months; p < 0.001; Fig. 5f). Collectively, 3-NBA-transformed cells demonstrated alterations in several tumorpromoting genes such as EREG and IL-6, and their expression in early-stage lung cancer was correlated with shorter survival.

3-NBA-transformed cells mediate malignant properties in vivo

On the basis of the malignant phenotypes caused by 3-NBA in vitro, we inoculated xenograft mice with BEAS2B 3-NBA-6M (10  $\mu$ M)–transformed (3-NBA–T) cells to examine tumorigenicity in vivo. Nude mice were inoculated with 3-NBA–T and control cells through subcutaneous injection. No tumor formation was observed in the mice inoculated with BEAS-2B

control cells after 6 weeks, but all five mice in the subcutaneous xenograft mouse model injected with 3-NBA–T cells exhibited tumor formation (average volume > 500 mm<sup>3</sup>; Fig. 6a and b). To determine the potential metastasis ability in vivo, nude mice received tail-vein injections of 3-NBA–T or control cells. Inoculation of 3-NBA–T cells resulted in higher metastasis capability compared with the control cells (5.68-fold; Fig. 6c). Immunostaining revealed that the lungs of mice receiving 3-NBA–T contained *EREG* and *IL-6* overexpressing micrometastases (Fig. 6c). These findings indicate that 3-NBA–T cells induce tumor formation and metastasis in vivo.

3-NBA induces lung epithelial cell malignancy through the EREG signaling pathway

The present results indicate that 3-NBA-mediated cell malignancy transformation increases clonogenic cell survival, in vitro angiogenesis, and migration. Moreover, 3-NBA-T cells contributed to tumorigenesis in the mouse xenograft model. These results suggest that EREG and IL-6 are crucial for inducing the tumorigenic properties of 3-NBA-transformed cells. To determine whether EREG plays a critical role in cell transformation, EREG expression was stably knocked out in the parental (BEAS-2B) cells. After 10-µM 3-NBA treatment, the *EREG* knockout cells exhibited higher apoptosis (1.71-fold) and formed substantially fewer (0.46fold) and smaller colonies when compared with knockout control cells (Fig. 7a and b). To determine the signaling pathway involved in colony formation, BEAS-2B 3-NBA-6M (10 µM)-transformed cells were treated with kinase or STAT3 inhibitors. Treatments with PI3K and MEK inhibitors caused reduced colony formation in the 3-NBA-transformed cells (reduction from 2.33-fold to 0.51- and 0.29-fold, respectively; Fig. 7c). However, treatment with STAT3 inhibitors partially reduced clonogenic cell survival (30.0%, reduction from 2.33-fold to 1.63-fold). Moreover, recombinant IL-6 stimulation enhanced colony formation ability by 28.8%, and this was attenuated to 10.4% through the suppression of STAT3 activation. These results imply that 3-NBA-transformed cells may markedly promote cell survival through the PI3K/AKT and MEK/ERK signaling pathways. To clarify the signaling pathway involved in migration, we treated 3-NBA-transformed cells with PI3K and MEK inhibitors, which significantly disrupted migration in the 3-NBA-transformed cells



(reduction from 2.50-fold to 0.59- and 0.41-fold, respectively; Fig. 7d). Similarly, treatment with STAT3 inhibitors partially blocked cell migration (35.6%, reduction from 2.50-fold to 1.61-fold). IL-6 stimulation increased migration by 26.4%, and this was attenuated to 8.8% by the STAT3 inhibitors.

Next, we investigated the effects of IL-6/STAT3 signaling on EREG expression. The levels of cytosolic or secreted EREG proteins were not significantly altered in BEAS-2B 3-NBA-6M (10  $\mu$ M) or control-6M cells after *IL*-6 knockdown (Fig. 7e). In addition, the signaling pathways involved in STAT3, AKT, and ERK

Fig. 4 3-NBA-transformed lung epithelial cells exhibited increased in vitro angiogenesis. a Angiogenesis-related differentially expressed genes with  $p \le 0.01$  and  $\log 2 \text{ FC} > 0.5$  or  $\log 2 \text{ FC}$ <-0.5 in BEAS-2B cells treated with 10-µM 3-NBA for 6 months compared with the DMSO control cells. The analysis of angiogenesis-related genes in BEAS 3-NBA-6M cells treated with 1- or 10-µM 3-NBA is depicted as a volcano plot. The protein network of the EMT-related genes upregulated after long-term 10µM 3-NBA treatment during cell proliferation was obtained through STRING network analysis. b Differentially expressed genes in sprouting angiogenesis with  $p \le 0.01$  and log2 FC > 0.5 or log2 FC < -0.5. All differentially expressed genes are depicted as a volcano plot. The protein network indicates the upregulated genes in cells transformed after 10-µM 3-NBA treatment. c BEAS-2B 3-NBA-6M (1-10 µM)-transformed cells exhibited increased tube formation compared with DMSO control cells. In vitro angiogenesis assays were conducted. HUVECs were grown in 3-NBA-transformed cell-derived conditioned medium (CM). The number of closed tubes was counted in five random fields from each well, and relative tube formation was then calculated. d IL-6 expression measured using quantitative real-time polymerase chain reaction. e Secretory IL-6 protein was elevated in BEAS-2B 3-NBA-6M (1-10 µM) cells according to ELISA assays. f GREM1 and THBS1 protein expression levels measured through immunoblotting. No significant difference was observed between the treated and control cells. The relative expressions of proteins are indicated as the FC over control. Data are presented as the mean  $\pm$  standard deviation of three independent experiments. (\**p* < 0.05 and \*\**p* < 0.01)

activation were only partially diminished in the BEAS-2B-6M IL-6 knockdown cells, suggesting that elevated EREG expression mediated these signaling pathways in 3-NBA-transformed cells. To elucidate whether EREG plays a crucial role in tumorigenic properties, EREG knockdown assays were conducted with BEAS-2B 3-NBA-6M (10 µM) cells. Western blot and ELISA assays indicated efficient reduction of EREG expression through knockdown (Fig. 7f). Moreover, secretory IL-6 protein levels were reduced in *EREG* knockdown cells. The STAT3, AKT, and ERK signaling pathways were markedly repressed in the 3-NBA-6M EREG knockdown cells. Similarly, EREG knockdown in 3-NBAtransformed cells abrogated colony formation and migration. Notably, the expression levels of proliferationand migration-related proteins such as SOX9 and TWIST2 were suppressed in 3-NBA-transformed cells after EREG knockdown.

Collectively, these findings indicate that 3-NBAtransformed cells induce EREG overexpression, thereby activating the PI3K/AKT and MEK/ERK signaling pathways and resulting in tumorigenicity (Fig. 8). Furthermore, elevated IL-6 and EREG expressions can synergistically lead to STAT3 signaling activation, promoting clonogenic cell survival and migration.

## Discussion

As indicated, 3-NBA is a potent inducer of BEAS-2B cell apoptosis through the DNA damage response (Oya et al. 2011). The metabolic activation of nitro-PAHs often increases ROS production. In human lung cancer A549 cells, short-term exposure of 3-NBA significantly induced superoxide levels and reduced total antioxidant capacity as well as HMOX1 and TXNRD1 expressions (Libalova et al. 2018). Our results reveal that chronic exposure to 3-NBA can cause malignant transformation in human lung epithelial cells because of increased cellular proliferation, colony formation, and cell migration. Moreover, 3-NBA-T cells induced tumor formation and metastasis in the xenograft mouse model. Lung tumors exhibited high mutation rates in oncogenes such as KRAS and in emerging tumor suppressors such as p53 (Gibbons et al. 2014). Findings in both primary tumors and cell lines, including NSCLCs and SCLCs, revealed that p53 genome locations are frequently deleted or mutated (Gibbons et al. 2014). Evidence has revealed that the p53 protein confers epigenetic fidelity and that the depletion of p53 gene functions increases epigenetic status alterations in cancer cells (Levine et al. 2016). The translesion DNA synthesis of dGC8-N-ABA catalyzed by hPol $\kappa$  is error-prone, which may be the mechanism by which 3-NBA promotes tumorigenesis (Phi et al. 2019). The present results also reveal a reduction of p53 protein levels in 3-NBA-transformed cells. The genetic and signaling mechanisms in the malignant cell transformation process induced by long-term 3-NBA exposure were further investigated.

In the current study, NanoString analysis was conducted using the PanCancer Progression Pathways Panel to analyze RNA expression in the 3-NBA–transformed cells and to subsequently identify the novel EREG-mediated network. The gene signature scores in the cancer progression pathways involved with carbon cancer metabolism, EMT to metastasis, regulation of angiogenesis, and sprouting angiogenesis were increased in 3-NBA–transformed cells. Notably, the critical tumor suppressor gene p53 was also downregulated in the transformed cells, potentially promoting cell proliferation and clonogenic survival. Advanced data 878

60 80 100 120

90 28 52 17 35 10 24 7

Upregulated	Low Expression	High Expression	LID (02	NCD	C	verall Survival						
Gene	N (Months)	N (Months)	HK (95	‰CI) <i>p</i> -var	le	(10 year)	Downregulated	Low Expression	High Expression	HR (95%CI)	<i>p</i> -value	Overall Survival
EREG	1443 (72.0)	482 (61.2)	1.14 (0.98	- 1.31) 0.08		-8	Gene	N (Months)	N (Months)			(10 year)
РТХ3	1152 (63.0)	773 ( <mark>76.0</mark> )	0.84 (0.73	- 0.95) 0.00		-	CHRDL1	1400 (52.0)	525 (119.5)	0.47 (0.40 - 0.55)	< 0.001	+
ABI3BP	1410 (59.5)	515 ( <mark>95.0</mark> )	0.65 (0.56	- 0.77) <0.00	1	+	SPOCK3	327 (67.0)	817 ( <mark>80.0</mark> )	0.85 (0.71 - 1.02)	0.077	
IL6	594 (95.0)	1331 ( <mark>62.0</mark> )	1.49 (1.28	- 1.72) <0.00	1		CDH1	600 (48.0)	1325 (78.9)	0.69 (0.60 - 0.79)	< 0.001	+
INHBA	1435 (68.6)	490 ( <mark>81.0</mark> )	0.91 (0.78	- 1.06) 0.23		-8-	CXCR4	763 (87.7)	1162 (59.0)	1.38 (1.21 - 1.58)	< 0.001	
CYP1B1	746 (89.0)	1179 (62.0)	1.34 (1.17	- 1.53) <0.00	1		NDRG1	1089 (88.7)	836 (49.0)	1.52 (1.34 - 1.73)	< 0.001	
SRGN	848 (80.9)	1077 (62.3)	1.24 (1.09	- 1.41) 0.00			SULF1	495 (40.3)	1430 (18.0)	1.82 (1.54 - 2.15)	< 0.001	
SOX9	1225 (74.0)	700 (56.8)	1.22 (1.07	- 1.39) 0.00			THBS2	480 (74.0)	1445 (68.0)	1.07 (0.92 - 1.24)	0.400	_
THBS1	1306 (77.8)	619 (55.0)	1.31 (1.14	- 1.50) <0.00	1	-	HLA-DPB1	921 (46.2)	1004 (87.7)	0.63 (0.55 - 0.71)	<0.001	
CD24	920 (79.3)	1005 (59.0)	1.33 (1.17	- 1.51) <0.00	1	-8	FBLN1	1031 (54.0)	894 (81.0)	0.73 (0.64 - 0.83)	<0.001	
COL5A2	551 (75.7)	1374 (67.0)	1.16 (1.00	- 1.34) 0.04			BICC1	528 (57.0)	1397 (72.0)	0.85 (0.74 - 0.97)	0.016	-
LAD1	1128 (85.0)	797 (51.0)	1.57 (1.38	- 1.78) <0.00	1	-8	SYNE1	1401 (15.8)	524 (51.0)	0.43 (0.37 - 0.52)	<0.001	
FBLN5	1284 (53.0)	641 (106.0)	0.60 (0.52	- 0.70) <0.00	1	+	DSC2	925 (91.2)	1010 (56 5)	1.33 (1.17 - 1.52)	<0.001	
KIAA1462	866 (44.0)	1059 (93.0)	0.60 (0.53	- 0.69) <0.00	1	-	D3C2	920 (01.2)	086 (81.0)	0.75 (0.66 0.05)	<0.001	_
SNAI2	1362 (73.7)	563 (60.7)	1.24 (1.08	-1.42) <0.00		- -	LUM	939 (57.0)	900 (81.0)	0.75 (0.86 - 0.85)	-0.001	-
IOXB3	360 (51.5)	784 (88.0)	0.71 (0.59	-0.84) <0.00		- <sup>1</sup>	IKF6	449 (41.4)	095 (17.4)	1.86 (1.54 - 2.24)	<0.001	
REG	877 (59.0)	1098 (75.4)	0.82 (0.72	-0.93) 0.00		-	UASI	1068 (84.0)	857 (50.7)	1.39 (1.22 - 1.58)	<0.001	
FRP1	8650 (79.3)	1060 (63.0)	1 23 (1 08	- 1.40) 0.00		· _	ADM2	886 (85.0)	1039 (57.0)	1.35 (1.18 - 1.53)	<0.001	
ST	779 (103.0)	1146 (59.0)	1.51 (1.32	-1.73) <0.00			TCF4	1379 (62.5)	546 (88.7)	0.74 (0.64 - 0.86)	<0.001	
FGFR2	539 (95.0)	1386 (61.3)	1.49 (1.27	(-1.74) <0.00	1		PDPN	1443 (77.6)	482 (45.5)	1.40 (1.21 - 1.61)	<0.001	
	and the state			,		-	N = number of	patients			(	0.5 1 1.5 2
N = number of patients					0 0	.5 1 1.5 2	GDF6 and ITGA1 genes are n		not available	in the lung		Hazard Ratio (95%CI
					Haz	ard Ratio (95%CI)	cancer dataset o	conort.				
									_ d			
Characteristic -		ow EREG H	ligh EREG	HR (95%CI)	nevalue	Overall	Survival (10 year)					
		N (Months) N (Mor			,	o venum	surrivur (10 yeur)			Stage	1A (I1	NOMO)
A11	1	443 (72.0)	482 ( <mark>61.2</mark> )	1.14 (0.98 - 1.31)	0.084						ER	EG (205767_at)
Gender										o		
Male	4	24 (66.5)	676 ( <mark>52.0</mark> )	1.14 (0.96 - 1.34)	0.130	- <b>-</b> -						HR = 1.62 (1.07 – 2
Female	5	534 (114.0)	180 ( <b>75.4</b> )	1.51 (1.17 - 1.94)	0.001					<sup>#</sup> `\`\	h	logrank P = 0.
	ory								_	<u>~</u>	· <sup>·/+</sup> ***	*
Smoking histo	-		F770 ((0 77)	1.32(1.05 - 1.67)	0.019				a a	<u> </u>	*_1	**************************************
Smoking histo Smoked	2	248 (92.6)	572 (08.7)	1.52 (1.05 - 1.07)	I							The state of the s
Smoking histo Smoked Never smoked	2	248 (92.6) 51 (76.0)	572 ( <mark>68.7</mark> ) 54 ( <mark>48.0</mark> )	1.98 (1.12 - 3.51)	0.017		-		ζi,		*	**************************************
Smoking histo Smoked Never smoked Histology sub	2 1 types	248 (92.6) 51 (76.0)	572 ( <b>68.7</b> ) 54 ( <mark>48.0</mark> )	1.98 (1.12 - 3.51)	0.017		-		urviv	0.6	A.	
Smoking histo Smoked Never smoked Histology sub Adenocarcinos	2 1 types na 5	248 (92.6) 5 151 (76.0) 5 506 (38.1) 2	572 (88.7) 54 (48.0) 213 (22.0)	1.98 (1.12 - 3.51) 1.51 (1.18 - 1.92)	0.017		_		Surviv	0.6	*. ~~	

Characteristic	Low EREG IN (Months)	High EREG										
Characteristic		N (Months)	- HK (95%CI)	<i>p</i> -value	Overall Survival (10 year)			Stage	91A	1A (T1N0M0)		
All	1443 (72.0)	482 (61.2)	1.14 (0.98 - 1.31)	0.084						EREG	(2057	67_
Gender							0				-	
Male	424 (66.5)	676 ( <mark>52.0</mark> )	1.14 (0.96 - 1.34)	0.130			÷	***			HF	} =
Female	534 (114.0)	180 ( <b>75.4</b> )	1.51 (1.17 - 1.94)	0.001	<b></b>			<del>"</del> {}	<b>ч</b> .			
Smoking history							ø	`ì				
Smoked	248 (92.6)	572 ( <mark>68.7</mark> )	1.32 (1.05 - 1.67)	0.019	<b></b>	a	0				Silver	
Never smoked	151 (76.0)	54 ( <b>48.0</b> )	1.98 (1.12 - 3.51)	0.017	<b>_</b>	.<			<u> </u>	ŧ.		h.,
Histology subtypes						5	0.6	-		° <b>⊶</b> ++	<b>L</b> ##	144
Adenocarcinoma	506 (38.1)	213 ( <mark>22.0</mark> )	1.51 (1.18 - 1.92)	< 0.001	<b></b>	ທັ						ı.
Squamous cell carcinoma	169 (68.0)	355 ( <mark>43.1</mark> )	1.25 (0.97 - 1.63)	0.087		=	-+					44
AJCC stage						La	õ	1				
T1	318 (48.0)	119 ( <mark>21.9</mark> )	1.74 (1.28 - 2.36)	< 0.001	<b>_</b>	e N						
T2	203 (67.9)	386 ( <mark>62.2</mark> )	1.09 (0.83 - 1.39)	0.450	<b>_</b>	0	N					
T3	22 (21.0)	59 (20.0)	1.38 (0.77 - 2.47)	0.270			0	Expres	ssion			
Γ4	27 (12.0)	19 (28.0)	0.66 (0.34 - 1.28)	0.210	<b>B</b>			—	low			
M0	189 (76.0)	492 (67.0)	1.20 (0.95 - 1.52)	0.130	- <b></b>		0.0		high			
N0	583 (96.0)	198 ( <mark>69.0</mark> )	1.34 (1.06 - 1.70)	0.015	_ <b></b>		0	<u> </u>	-	10		_
N1	66 (67.0)	186 ( <mark>36.0</mark> )	1.43 (0.98 - 2.10)	0.064				0	20	40	60	
N2	76 (24.0)	35 (15.0)	1.65 (1.06 - 2.56)	0.025	<b>_</b>			No.	-let-	Tim	e (mon	iths
Grade							low	179	146	127	90	
I	137 (78.5)	34 ( <mark>42.2</mark> )	1.71 (1.17 - 2.49)	< 0.001	<b>_</b>		high	65	50	33	28	
п	79 (92.6)	231 ( <mark>62.3</mark> )	1.41 (0.96 - 2.07)	0.074	<b>⊢</b>							
ш	39 (48.0)	38 ( <b>75.7</b> )	0.45 (0.23 - 0.89)	0.019								
N = number of patient	s with availa	ble clinical d	ata		0 1 2 3	- 4						
					Hazard Ratio (95%CI)							



f Stage 1A (T1N0M0) Low IL6 High IL6 Characteristi HR (95%CI) p-value Overall Survival (10 year) N (Months) N (Months) IL6 (205207\_at) All 594 (95.0) 1331 (62.0) 1.49 (1.28 - 1.72) < 0.001 1.0 HR = 2.37 (1.42 – 3.96) logrank P = 0.00071 Gender €\_H Male 287 (80.9) 813 (<mark>48.6</mark>) 1.52 (1.25 - 1.84) < 0.001 Female 330 (112.7) 384 (81.1) 1.54 (1.21 - 1.96) < 0.001 0.8 Smoking history **Overall Survival** Smoked 215 (37.6) 1.41 (1.09 - 1.82) 605 (<mark>26.0</mark>) 0.008 0.6 Never smoked 124 (79.5) 81 (<mark>40.2</mark>) 2.14 (1.24 - 3.74) 0.006 Histology subtypes Adenocarcinoma 282 (47.0) 437 (<mark>23.4</mark>) 1.87 (1.45 - 2.42) < 0.001 0.4 Squamous cell carci 366 (65.1) 158 (33.0) 1.39 (1.08 - 1.79) < 0.001 AJCC stage T1 1.90 (1.39 - 2.58) 196 (56.7) 241 (<mark>27.6</mark>) < 0.001 0.2 T2 308 (62.2) 281 (**71.0**) 0.88 (0.70 - 1.10) 0.270 Expression Т3 30 (13.0) 51 (25.0) 0.72 (0.43 - 1.21) 0.210 low high T4 32 (14.0) 14 (26.9) 0.77 (0.38 - 1.56) 0.0 0.470 M0 189 (95.0) 492 (<mark>63.0</mark>) 1.42 (1.11 - 1.82) 0.005 Ó 20 40 60 80 100 120 N0 481 (75.7) 65 (28.4) 1.51 (1.20 - 1.90) 1.33 (0.94 - 1.89) 300 (111.0) < 0.001 N1 Time (months) 187 (50.0) 0.110 Numi 72 172 isk 64 132 N2 29 (19.0) 82 (17.6) 1.32 (0.81 - 2.14) 0.270 low high 55 105 47 71 28 41 21 24 12 19 Grade 149 (62.2) 52 (32.6) 1.36 (0.92 - 2.03) 0.120 I П 84 (96.1) 226 (64.0) 1.72 (1.17 - 2.52) 0.005 1.41 (0.58 - 3.42) Ш 19 (44.0) 58 (<mark>30.7</mark>) 0.450 N = number of patients with available clinical data 0 1 2 3 4 Hazard Ratio (95%CI)

**Fig. 5** Analysis of association between 3-NBA-mediated gene expression and survival in patients with lung cancer. **a**, **b** Prognostic hazard ratios of the top 20 genes that were upregulated or downregulated genes through 3-NBA mediation obtained using KM plotter with published lung cancer microarray datasets. **c** Overall survival for *EREG* (Affymetrix ID: 205767\_at) evaluated using KM analysis with transcriptomic data of 1925 patients with lung cancer. Clinical characteristics of the datasets were included in the survival analysis. **d** Overall survival for *EREG* according to data of patients with stage 1A lung cancer. **e** Survival analysis for *IL-6* (Affymetrix ID: 205207\_at) according to clinical characteristics of patients with lung cancer. Forest plots indicate hazard ratios and 95% confidence intervals. **f** Overall survival for *IL-6* according to data of patients with stage 1A lung cancer

mining and STRING network analysis revealed that the identified gene products IL-6, SOX9, AKT1, TWIST2, and MET interacted with EREG, a potential therapeutic target associated with lung cancer malignancy (Sunaga and Kaira 2015). Moreover, reduced E-cadherin expression was observed as a key event during EMT in the 3-NBA-transformed cells. Studies have revealed that upregulated EREG expression is crucial to cell growth in hTERT-mediated fibroblast immortalization and transformation (Lindvall et al. 2003). Moreover, EREG expression levels were inversely correlated with EREG methylation in lung cancer (Qu et al. 2016). EREG overexpression in lung cancer may activate the EGFR pathway to promote malignant progression (Sunaga and Kaira 2015). The present results reveal that EREG expression was significantly upregulated in 3-NBA-



**Fig. 6** Tumorigenicity of 3-NBA–T human lung epithelial cells in nude mice. **a** Tumor formation in nude mice and tumor xenografts 6 weeks after subcutaneous inoculation with  $2 \times 10^5$  BEAS-2B 3-NBA–T cells (10-µM 3-NBA-6M transformed) or control cells. **b** Tumor growth after injection with BEAS-2B control or 3-NBA–T cells. Tumor volume was measured every 7 days until the end of the experiment. Images display tumors from nude mice inoculated

with 3-NBA–T cells. None of the nude mice injected with BEAS-2B control cells formed tumors. **c** Immunohistochemical staining of lung sections for BEAS-2B control or 3-NBA–T cells with metastasis (n = 5/group). All analyses were conducted 7 weeks after tail-vein injection of  $1 \times 10^6$  3-NBA–T or control cells. The metastasis index (fold, tumor density in control or 3-NBA–T cells per cm<sup>2</sup>) in the lung is presented on the right panel



TWIST2 Actin Fig. 7 *EREG*-mediated clonogenic cell survival and migration in 3-NBA-transformed cells. a Knockout of EREG in parental BEAS-2B cells significantly increased cell apoptosis after treatment with 3-NBA for 24 h. b The 3-NBA-mediated colony formation was diminished by EREG knockout, suggesting involvement of EREG in colony formation. c) Treatment with rIL-6 (10 ng/mL) increased colony formation capabilities of 3-NBA-6M (10-µM 3-NBA-transformed) and control-6M cells. Induction of colony formation in 3-NBA-6M cells with IL-6 stimulation was mostly abrogated after treatment with Ly294002 (PI3K inhibitor, 10 µM) or U0126 (ERK1/2 inhibitor, 10 µM) when compared with control cells. However, 3-NBA-transformed cells with or without IL-6 stimulation still exhibited partly increased colony formation after S3I-201 (STAT3 activity inhibitor, 100 µM) treatment when compared with control cells. d Transwell migration assay of 3-NBA-6M cells after treatment with inhibitors and rIL-6 for 16 h. The 3-NBA transformation increased the migration ability that was abrogated by Ly294002, U0126, or S3I-201 treatment when compared with the control cells. e Cytosolic and secreted EREG protein levels examined using immunoblot and ELISA assays, respectively. Cytosolic or secreted EREG protein levels were not significantly altered in BEAS-2B 3-NBA-6M or control cells after IL-6 knockdown. The levels of p-STAT3, pAKT, and pERK were measured through immunoblotting. f EREG knockdown in BEAS-2B 3-NBA-6M cells determined through immunoblotting and ELISA analysis. The levels of p-STAT3, pAKT, pERK, SOX9, and TWIST2 were reduced in EREG knockdown cells. EREG knockdown in BEAS-2B 3-NBA-6M cells abrogated transformation-mediated clonogenic cell survival and migration. Data are presented as the mean  $\pm$  standard deviation of three independent experiments. (\*p < 0.05; \*\*p <0.01; ns, not significant)

transformed lung epithelial cells, promoting clonogenic colony formation and migration. Similarly, EREG overexpression may predominantly contribute to tumorigenesis in 3-NBA-transformed cells through the EGFR downstream PI3K/AKT and MEK/ERK signaling pathways.

*EREG* overexpression may be a predictive functional marker triggering head and neck squamous cell carcinoma oncogenic transformation through activation of the EREG–EGFR–C–Myc axis signaling pathway (Liu et al. 2020). Moreover, *EREG* deficiency reduced lung tumor formation in a primary two-stage mouse model; tumor promotion was initiated upon exposure to 3-methylcholanthrene, and tumor progression was subsequently promoted after multiple exposures to butylated hydroxytoluene (Bauer et al. 2017). EGFR was constitutively activated in metastatic lung subtypes of salivary adenoid cystic carcinoma (SACC) cells and may have been induced by EREG autocrine expression (Liu et al.

2016). EREG-activated EGFR stabilizes Snail and Slug, thus promoting SACC cell metastatic capability. NADPH oxidase 4/AKT and IL-6/STAT3 signaling pathways positively regulate each other, thereby enhancing the proliferation and survival of NSCLC cells (Li et al. 2015). In the present study, *EREG* knockout in parental epithelial cells exhibited more apoptosis and reduced colony formation after short-term 3-NBA treatment. *EREG* expression knockdown abrogated colony formation and migration, and the levels of SOX9, TWIST2, p-STAT3, p-AKT, and p-ERK were reduced in 3-NBA-transformed cells.

Studies have associated ambient air pollutants with lung cancer incidence and mortality (Hamra et al. 2014; Fischer et al. 2015). Several risk factors, such as female sex, environmental factors, hormones, genetic factors, and viruses, may cause lung cancer development in never-smokers (Sun et al. 2007). Notably, 3-NBA is a crucial carcinogen present in atmospheric and diesel exhaust PM (Arlt et al. 2005; Santos et al. 2019). Patients with lung cancer (particularly early-stage adenocarcinomas) presented short survival because of exposure to high ambient air pollutants such as NO<sub>2</sub>, PM<sub>2.5</sub>, and  $PM_{10}$  (Eckel et al. 2016). The present study revealed that EREG was highly expressed in 3-NBA-transformed cells and associated with cancer progression. Regarding the prognostic significance of EREG expression in lung cancer, an NSCLC biopsy specimen immunohistochemical staining analysis indicated that EREGpositive tumors were correlated with poor clinical outcomes (Zhang et al. 2008). In addition, the expression level of EREG is significantly higher in lung adenocarcinoma than in squamous cell carcinoma (Sunaga et al. 2013). Moreover, EREG contributes to aggressive tumor phenotypes in KRAS-mutant lung adenocarcinoma and may serve as a prognostic marker in NSCLC (Sunaga et al. 2013). In the present study, survival analyses based on the subtypes of female sex, neversmoker status, and adenocarcinoma in patients with lung cancer revealed a negative correlation between EREG and outcomes. Furthermore, high EREG and IL-6 expressions in early-stage lung cancer are correlated with poor survival. However, in most nonsmokers, lung cancer is more common in women and is often diagnosed at more advanced stages, the predominant histologic type of which is adenocarcinoma (Casal-Mourino et al. 2019). Whether specific *EREG* overexpression is correlated with driver mutations such as those in EGFR, ALK, and ROS1 in nonsmokers remains undetermined.



Fig. 8 Schematic of increased EREG expression in 3-NBAtransformed cells, leading to tumorigenicity. The short-term exposure of lung epithelial cells to 3-NBA can lead to ROS production and cell apoptosis. However, long-term exposure to 3-NBA resulted in distinct alterations in the expressions of genes such as *Ecadherin, SOX9, TWIST, IL-6*, and *EREG*, which are involved in carbon cancer metabolism, metastasis, and angiogenesis. The EREG ligand can bind to the EGFR and ErbB4 receptors, thereby activating the downstream signaling pathways. The 3-NBA-transformed cells exhibited marked EREG and IL-6 overexpressions, which activated the STAT3, PI3K/AKT, and MEK/ERK signaling

Additionally, IL-6 is a pleotropic and complex cytokine that might play an anti-inflammatory or proinflammatory role in response to tissue damage through classical and trans-signaling pathways, respectively (Scheller et al. 2011). IL-6 may play an antioxidant role in pulmonary homeostasis, particularly in protecting alveolar epithelial cells from ROS-mediated cell death (Kida et al. 2005). Chronic signaling of IL-6 is correlated with tumor development, possibly acting intrinsically on cancer cells through various mediators to increase cell survival, proliferation, and metastatic dissemination (Fisher et al. 2014). Furthermore, IL-6/STAT3 signaling was revealed to play a critical role in lung premetastatic niche formation and immunosuppression (Jing et al. 2020). The present study revealed that elevated EREG signaling can activate IL-6 expression, thereby synergistically contributing to cell survival capabilities and migration through the STAT3 pathway.

In vitro cell transformation assays can be used as alternative tools to evaluate human tumorigenesis

pathways and contributed to tumorigenicity. Depletion of *EREG* in 3-NBA-T cells abrogated IL-6 expression and reduced colony formation and migration. Furthermore, IL-6 stimulated the down-stream STAT3 signaling pathway, enhancing clonogenic cell survival and migration. However, STAT3 signaling blockade partially suppressed colony formation and migration capabilities. Taken together, increased EREG expression in 3-NBA-transformed cells markedly contributed to tumorigenesis through PI3K/AKT and MEK/ERK activation and synergistically enhanced IL-6 signaling pathways, thus promoting tumorigenicity.

induced by potent environmental carcinogens (Steinberg 2017). The air-liquid interface (ALI) culture of these assays may cause morphological and functional differentiation in epithelial cells, thereby creating a more realistic environment for exposure (Chen and Schoen 2019). ALI culture experiments (He et al. 2021) have revealed that only the human cancer cell line Calu-3, and not BEAS-2B, can sustain a monolayer structure and a strong tight junction for 2 weeks. Additionally, three-dimensional (3D) cell culture (MucilAir) experiments revealed the effects of short-term (24-h) and longterm (7- and 28-day) exposure to 0.1- or 1-µM 3-NBA (Cervena et al. 2019). Exposure to 0.1-µM 3-NBA for 11 days caused a marked reduction in junction tightness (i.e., transepithelial electrical resistance, TEER), whereas 1-µM 3-NBA exposure for 9 days caused only a slight reduction in TEER. Furthermore, CYP1A1 and *HMOX1* expression levels were upregulated after 7 days of 1-µM 3-NBA exposure. However, the mRNA levels of several genes did not significantly change after 28

days of 3-NBA exposure at any concentration, possibly because functioning cells and tight junctions affected 3-NBA entry into the lower cell layers. Therefore, further examination is required to determine environmentally relevant doses or higher concentrations of 3-NBA for long-term exposure (>1 month). Nevertheless, MucilAir is a useful 3D culture including ciliated, goblet, and basal human cells mimicking the heterogeneity of the lung environment for in vitro study of disease progression. However, commercially available systems are often limited in terms of flexibility (cell or genetic manipulation) and customization. In the present study, the effects of malignant cell transformation were mainly determined using BEAS-2B cells with long-term exposure to  $0.1-10-\mu M$  3-NBA, which may be higher than typical exposure concentrations. Oxidative stress and metabolomic profiles were investigated in human urothelial cancer cells exposed to a 0.0003-µM 3-NBA, which is a relevant environmental dose, and reaching 80 µM after 24 h of exposure (Pink et al. 2017). These results showed elevated levels of various antioxidants at low doses of 3-NBA (0.0003 and 0.01 µM). However, additional metabolic pathways were increased to maintain cellular homeostasis at 0.04-10-µM 3-NBA, and prominent toxic effects were observed at 80 µM. Treatments with higher doses of 3-NBA (10 and 80  $\mu$ M) may change energy metabolism through the pentose phosphate pathway. The present data indicated that short-term (24-h) exposure to 3-NBA (1–160  $\mu$ M) reduced cell viability and increased ROS production in a dose-dependent manner. Moreover, several tumor-promoting functions were dosedependently altered in 1- and 10-µM 3-NBA-transformed cells, possibly because long-term exposure to higher doses of 3-NBA markedly increased cell survival and caused malignant transformation through critical expression alterations of genes such as EREG.

The current results clearly indicate that chronic exposure to 3-NBA mediated lung epithelial cell transformation. Cancer aggressiveness, measured in terms of EMT, is regulated by various signaling cascades, which the PI3K/AKT and STAT3 pathways significantly activate during lung cancer progression (Liu et al. 2017; Wang et al. 2016). Our results identified the EREG regulatory cascade as a novel pathway associated with 3-NBA–mediated lung epithelial cell transformation through the activation signaling cascade involving the PI3K/AKT, MEK/ERK, and STAT3 pathways. We also revealed that E-cadherin reduction and the induction of

SNAI2 and TWIST1/2 expression may confer migration and invasion capabilities in 3-NBA-transformed cells. Our findings are consistent with those of relevant studies, strongly supporting the critical role of the EREG regulatory cascade in the molecular mechanism underlying cancer development. Additionally, studies revealed that numerous stem cell regulatory proteins and intracellular signaling pathways can regulate the cancer stem cells (CSCs) that contribute to tumor malignancies (Yang et al. 2020). Notably, EREG blockade through anti-EREG antibodies efficiently represses cancer development, whereas colon cancer enriches CSCs (Kobayashi et al. 2012). SOX9 is a transcription factor of the SOX family that acts a key regulator in lung cancer progression and patient survival (Zhou et al. 2012; Matheu et al. 2012). Studies have indicated that long-term exposure to the single-walled carbon nanotubes (SWCNTs) of BEASE-2B cells results in a highly invasive and stem cell-like subpopulation (Luanpitpong et al. 2014). Moreover, SOX9 increases CSC-like and metastatic properties in SWCNT-exposed cells (Voronkova et al. 2017). In the current study, SOX9 was also highly expressed in 3-NBA-transformed cells. However, whether 3-NBA mediates stemness properties in tumorigenesis remains undetermined.

Recently, BEAS-2B and human mesenchymal stem cell lines (hMSC1) were revealed to share the same expression profiles as human umbilical cord-derived MSC (hMSC) surface markers and exhibited similar osteogenic and adipogenic differentiation potentials (Han et al. 2020). However, BEAS-2B cells did not display expression of mesenchymal proteins such as  $\alpha$ -SMA, collagen I, and fibronectin, which are abundantly expressed in hMSCs. Additionally, BEAS-2B did not promote type-2 macrophage (M2) polarization, whereas hMSC1 induced a dramatic increase in the proportion of M2 macrophages. Furthermore, BEAS-2B cells exhibited a gene expression pattern similar to that of primary human bronchial epithelial cells (Courcot et al. 2012). In addition, the EMT process of BEAS-2B cells mediated by TGF-β1 caused morphological changes and reduced E-cadherin (Kamitani et al. 2011). The CSC-like and metastatic properties were also observed in transformed BEAS-2B cells (Voronkova et al. 2017). In addition, BEAS-2B exposed to FBS induced sustained but reversible EMT (Malm et al. 2018). Notably, EREG is required for fibroblast transformation, which induces EMT in a manner dependent on JAK2, STAT3, and IL-6 in oral squamous cell

carcinoma (OSCC) cells (Wang et al. 2019). In addition, overexpression of EREG in patients with OSCC was correlated with tumor invasion and shorter overall survival. Similarly, increased EREG expression in 3-NBA-transformed cells enhanced migration and the synergistically activated IL-6/STAT3 signaling pathway. Moreover, we observed that 3-NBA-transformed cells, which cause high levels of EREG and IL-6 expressions, induced tumor metastasis in vivo. Patients with lung cancer and high levels of EREG and IL-6 expressions had poor survival. Notably, primary human airway epithelia cocultured with lung fibroblasts may secrete ErbB ligands including EREG, thus stimulating airway epithelial differentiation (Vermeer et al. 2006). On the basis of these findings, EREG overexpression confers downstream signaling pathway activation, possibly promoting tumor development malignant cell transformation. However, this study could not sufficiently replicate the in vivo phenotype. The EREG signaling pathways and other mediated signaling pathways must be further analyzed in a more appropriate human microenvironment by using 3D primary cell or lung tissue cultures correlated with exposure to 3-NBA at various concentrations.

On the basis of the tumor-promoting potential of 3-NBA, we focused on predefined PanCancer genes in 3-NBA-transformed cells, revealing that significant changes in cancer progression analysis have not been realized. However, the results of NanoString gene expression analysis did not rule out other potential targets or pathways in 3-NBA-transformed cells that could be analyzed through a transcriptome microarray or RNA sequencing. Even so, the NanoString platform possesses several advantages, including high sensitivity and reproducibility, low possibility of cDNA introduction bias, and suitability for detecting low-expression RNA in clinical applications (Veldman-Jones et al. 2015). The intake of 3-NBA may be variable in individuals exposed to environmental contaminants. By characterizing the chemical composition of environmental pollutants, the direct effects of cancer progression in certain patient groups exposed to specific compounds (e.g., 3-NBA) can be further verified and correlated. Notably, low-quantity or poor-quality RNA derived from lung biopsy and formalin-fixed paraffin-embedded tissue can be examined through NanoString analysis. In future longitudinal studies, comprehensive analyses of genomic, transcriptomic, and proteomic profiling in these human tissue specimens could clarify the detailed characteristics of tumor microenvironments.

In conclusion, we demonstrated the 3-NBA-mediated transformation of normal lung epithelial cells preceding cancer cell progression through increased proliferation, anchorage-independent cell growth, migration, and in vitro angiogenesis. Long-term exposure to 3-NBA may promote lung cancer progression through EREG signaling activation.

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**Availability of data and material** The datasets used or analyzed are available from the corresponding author upon reasonable request.

**Code availability** Deregulated KEGG pathways were identified using STRING software (http://string-db.org). Differential genes were analyzed (www.kmplot.com) using Kaplan–Meier plotter with published lung cancer microarray datasets.

Author contribution KYC and CHT designed the study and wrote the manuscript. PHF and WLS drafted the manuscript and interpreted the data. SCH, CWL, NVH, CSL, and WTL collected the primary data and prepared the figures. TTC and YHT contributed to the literature review and performed statistical analysis. KYL and SMW supervised and reviewed the entire project and manuscript preparation. All authors have read and approved the manuscript.

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#### Declarations

**Ethics approval** All protocols for animal experiments were approved by the Taipei Medical University Institutional Animal Care and Use Committee.

Consent to participate Not applicable.

Consent for publication Not applicable.

**Conflicts of interest** The authors declare no competing interests.

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