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# Expression and activation of nuclear hormone receptors result in neuronal differentiation and favorable prognosis in neuroblastoma

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## Abstract

**Background** Neuroblastoma (NB), a childhood tumor derived from the sympathetic nervous system, presents with heterogeneous clinical behavior. While some tumors regress spontaneously without medical intervention, others are resistant to therapy, associated with an aggressive phenotype. *MYCN*-amplification, frequently occurring in high-risk NB, is correlated with an undifferentiated phenotype and poor prognosis. Differentiation induction has been proposed as a therapeutic approach for high-risk NB. We have previously shown that *MYCN* maintains an undifferentiated state via regulation of the *miR-17~92* microRNA cluster, repressing the nuclear hormone receptors (NHRs) estrogen receptor alpha (ERα) and the glucocorticoid receptor (GR).

**Methods** Cell viability was determined by WST-1. Expression of differentiation markers was analyzed by Western blot, RT-qPCR, and immunofluorescence analysis. Metabolic phenotypes were studied using Agilent Extracellular Flux Analyzer, and accumulation of lipid droplets by Nile Red staining. Expression of angiogenesis, proliferation, and neuronal differentiation markers, and tumor sections were assessed by immunohistochemistry. Gene expression from NB patient as well as adrenal gland cohorts were analyzed using GraphPad Prism software (v.8) and GSEA (v4.0.3), while pseudo-time progression on post-natal adrenal gland cells from single-nuclei transcriptome data was computed using scVelo.

**Results** Here, we show that simultaneous activation of GR and ERα potentiated induction of neuronal differentiation, reduced NB cell viability in vitro, and decreased tumor burden in vivo. This was accompanied by a metabolic reprogramming manifested by changes in the glycolytic and mitochondrial functions and in lipid droplet accumulation. Activation of the retinoic acid receptor alpha (RARα) with all-*trans* retinoic acid (ATRA) further enhanced the differentiated phenotype as well as the metabolic switch. Single-cell nuclei transcriptome analysis of human adrenal glands indicated a sequential expression of *ERα*, *GR*, and *RARα* during development from progenitor to differentiated chromaffin cells. Further, in silico analysis revealed that patients with higher combined expression of *GR*, *ERα*, and *RARα* mRNA levels had elevated expression of neuronal differentiation markers and a favorable outcome.

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**Conclusion** Together, our findings suggest that combination therapy involving activation of several NHRs could be a promising pharmacological approach for differentiation treatment of NB patients.

**Keywords** Neuroblastoma, Nuclear hormone receptors, Neuronal differentiation, Metabolic reprogramming, Glucocorticoid receptor, Estrogen receptor  $\alpha$ , Retinoic acid receptor  $\alpha$

## Background

Neuroblastoma (NB), an embryonal tumor originating from neural crest derivatives of the sympathetic nervous system, is the most common extracranial solid malignancy diagnosed in children during the first year of life [1, 2]. It presents a diverse clinical pattern ranging from spontaneous regression to widespread incurable disease. According to the International Neuroblastoma Staging System (INSS), NB is divided in five stages based on the severity and age of onset [1–3]. Despite intense multimodal treatment, ~40% of high-risk patients are incurable [4, 5]. Considerable efforts have been devoted to identifying drugs that induce differentiation as therapeutic options [6–8]. Retinoic acid (RA), a vitamin A derivative, is used as a differentiation and anti-neoplastic agent in cancer, including leukemia and several solid tumors [9]. The effect of RA is mediated by binding to the RA receptors (RARs), members of the nuclear hormone receptor (NHR) family. Once activated, RARs bind to specific RA response elements, triggering a downstream signalling cascade that results in differentiation [10]. In NB, this process is preceded by downregulation of MYCN and upregulation of nerve growth factor (NGF) receptors [11]. Neuroblastoma cells showed increased RA receptor  $\alpha$  (RAR $\alpha$ ) levels in response to RA [12]. Importantly, 13-*cis*-RA is used as maintenance therapy in combination with immunotherapy in some European countries and in the United States for high-risk NB patients, however without stratification for RAR $\alpha$  expression levels [13–15].

MYCN-amplification occurs in approximately 20% of all cases, and in around 40% of the high-risk NB group, linked with an undifferentiated phenotype and poor outcome [1, 2]. We have previously shown that MYCN promotes upregulation of the *miR-17~92* microRNA cluster, which in turn represses a plethora of target genes including the NHRs *estrogen receptor  $\alpha$*  (ER $\alpha$ ) and the *glucocorticoid receptor* (GR) [16–18]. The NHRs are unique therapeutic targets because they can be modulated with small molecules that mimic their natural ligands, enabling finetuning of their biological activities [19].

Glucocorticoid receptor activation via glucocorticoids results in anti-inflammatory, anti-proliferative, pro-apoptotic, and anti-angiogenic stimuli and has been used to successfully treat many different diseases [20]. We previously found that MYCN inhibition in MYCN-amplified

NB cells resulted in upregulation of GR, and subsequent activation by dexamethasone (DEX) led to neuronal differentiation. Further, a significant decrease in tumor volume and weight was observed in all DEX- compared to vehicle-treated animals. With these data together with analysis of *TH-MYCN* mice, we demonstrated that MYCN-mediated downregulation of GR plays an important role in NB by impairing differentiation [18].

We formerly demonstrated that ER $\alpha$  is another down-regulated NHR in MYCN-amplified NB patients and a prognostic factor for favorable outcome [16, 17]. However, in many tumor types, including breast cancer, over-expression and activation of ER $\alpha$  signalling is associated with proliferation and poor survival [21]. In contrast, during brain development, estrogen is important for neurite formation and synaptogenesis, as well as neuronal differentiation [22–24]. We found that restoration of ER $\alpha$  by inhibiting *miR-18a*, one member of the *miR-17~92* microRNA cluster, or ectopic ER $\alpha$  expression led to upregulation of NGF receptors followed by neuronal differentiation. This revealed that MYCN-amplified NB cells maintain an undifferentiated phenotype due to MYCN-mediated upregulation of *miR-18a*, which resulted in decrease of ER $\alpha$  and impairment of estrogen-induced neuronal differentiation [16, 17].

In summary, GR or ER $\alpha$  expression correlates with favorable prognosis in NB patients, while MYCN is related to poor outcome as it maintains an undifferentiated state by decreasing the expression of these receptors [16–18]. Activation of either GR or ER $\alpha$  resulted in a partial differentiation, suggesting that they could induce a more robust differentiation phenotype when triggered together.

## Material and methods

### Cell culture, cell lines, and plasmids

Cells were cultured in 1:1 of F12 and minimal essential medium (MEM) supplemented with 10% fetal bovine serum (FBS) (Life Technologies, Waltham, MA, USA), 0.5% GlutaMax, 100 units/ml penicillin, 100  $\mu$ g/ml streptomycin (Sigma, St. Louis, MO, USA), and non-essential amino acids (Gibco, Life Technologies, Waltham, MA, USA) in a humidified environment at +37°C and 5% CO<sub>2</sub>.

SK-N-BE(2)-GR (from here on referred to as BE(2)-GR) cells with ectopic expression of the human GR (*NR3C1*)

gene were previously generated [18]. To obtain the *GR* (*NR3C1*) and *ERα* (*ESR1*) double expressing cells, BE(2)-GR cells were transduced with a lentivirus carrying the *CD511B-1* vector (System Biosciences, Palo Alto, CA, USA) containing the human *ERα* cDNA under the control of the CMV7 promoter or a lentivirus with the corresponding empty vector (EV) as control, generating BE(2)-GR+ERα and BE(2)-GR+EV cells, respectively. Similarly, SK-N-AS and SH-SY5Y GR-overexpressing cells carried pLV-Puro-CMV-*hNR3C1* and pLV-Hygro-CMV-*EV* while GR+EV and GR+ERα IMR32 and SMS-KCN69n (from here referred to KCN69n) were generated by transduction with lentiviruses carrying pLV-Puro-CMV-*hNR3C1* and pLV-Hygro-CMV-*hESR1* or the corresponding empty vector (EV) (VectorBuilder Inc.). We used 4 μg/ml of polybrene and MOI=10 for BE(2) cells, MOI=5 for KCN69n, MOI=3 for IMR32 and SK-N-AS, and MOI=1 for SH-SY5Y. Stable cell lines were generated by antibiotic selection with the following concentrations: KCN69n, 3 μg/ml puromycin, 500 μg/ml hygromycin; IMR32, 0.4 μg/ml puromycin, 400 μg/ml hygromycin; SK-N-AS, 2 μg/ml puromycin and 500 μg/ml hygromycin; SH-SY5Y, 0.8 μg/ml puromycin, 400 μg/ml hygromycin. These concentrations were applied for 48 h and thereafter cells were maintained in half of the initial concentrations of puromycin and/or hygromycin.

#### Treatment of cells

All treatments were performed in media with charcoal stripped FBS (Life Technologies, Waltham, MA, USA) to avoid activation of any of the NHRs due to the presence of their ligands in regular FBS. Throughout the study, 10 nM of E2 (17-β-estradiol), 100 nM DEX (dexamethasone), and 0.5 μM of ATRA (all-*trans* retinoic acid) were used if not indicated differently for BE(2) cells, 20 nM of E2, 200 nM DEX and 1 μM of ATRA for KCN69n and IMR-32 cells, and 100 nM DEX and 5 μM of ATRA for SK-N-AS and SH-SY5Y cells. In all experiments, ethanol was used as control for E2, DEX, and the combination of E2+DEX, dimethyl sulfoxide (DMSO) for ATRA treatment, and ethanol+DMSO as control for the E2+DEX+ATRA triple combination. All ligands were purchased from Sigma, St. Louis, MO, USA.

#### Colony formation assay

Cells were cultured in six-well plates at a density of 100 cells per well. Ligands and vehicles were added after 3 days in culture as indicated, replenished every 3 days, and incubated for 10 days. Colonies were stained using 0.5% crystal violet solution (SERVA Electrophoresis GmbH, Heidelberg, Germany). Images were captured and colonies were quantified using ImageJ software [25].

#### WST-1 viability assay for determination of IC<sub>50</sub> values

For calculating the IC<sub>50</sub> of the individual ligands  $1 \times 10^4$  cells were seeded in 96 well-plates and treated for 72 h with a range of concentrations of the different compounds: E2 (1 nM-100 nM), DEX (20 nM-1000 nM), and ATRA (0.5 μM-100 μM). For assessing the effect of combining these ligands, the following concentrations were applied: E2 (10 nM and 20 nM)+DEX (100 nM and 250 nM) and E2 (10 nM and 20 nM)+DEX (100 nM and 250 nM)+ATRA (0.5 μM and 2 μM). For measurement of cell viability, 10 μl of 2-(4-Iodophenyl)-3-(4-nitrophenyl)-5-(2,4-disulfophenyl)-2H-tetrazolium (WST-1) solution (Roche, Basel, Switzerland) was added per well. After 1 h incubation, absorbance was measured at 480 nm using a LUMIstar Omega plate reader (BMG Labtech, Ortenberg, Germany).

#### Western blot analysis

Whole-cell lysates were prepared using RIPA lysis buffer containing a protease and phosphatase inhibitor cocktail (both from Thermo Fisher Scientific, MA, USA). Samples were boiled in 1× Laemmli buffer at +95°C for 5 min and separated by sodium dodecyl sulfate-polyacrylamide gel electrophoresis (SDS-PAGE) (Bolt™ 4-12% Bis-tris Plus, Invitrogen, Waltham, MA, USA). Following electrophoresis, the separated proteins were transferred to nitrocellulose membranes (Trans-Blot Turbo Transfer Pack, Cat No. 1704159, Bio-Rad, CA, USA). Membranes were stained with Ponceau to verify equal transfer. After blocking in 5% non-fat milk, membranes were probed at +4°C overnight with the following primary antibodies: rabbit anti-GR (1:1000, D8H2), rabbit anti-ERα (1:1000, D8H8), rabbit anti-p75<sup>NTR</sup> (1:1000, D4B3), mouse anti-MYC (1:500, sc-53,993), mouse anti-RARα (1:500, sc-515,796), rabbit anti-SCG2 (1:1000, HPA011893), rabbit anti-p75<sup>NTR</sup> (1:1000, D4B3), mouse anti-βIII-tubulin (1:1000, ab7751), mouse anti-TH (1:300, 22,941), mouse anti-GFAP (1:2000, ab4648), mouse anti-c-MYC (1:500, sc-40), rabbit anti-c-MYC (1:2000, #9402), β-actin (1:10,000, SC-47775), and α-tubulin (1:10,000, SC-32293). Next day, membranes were incubated with horseradish peroxidase tagged goat anti-mouse or goat anti-rabbit secondary antibodies (P044801-2 and P044701-2 Agilent Technologies, North Billerica, MA, USA). Signals were developed using SuperSignal™ West Dura (Cat No. 34076, Thermo Fisher Scientific, MA, USA). All Western blots were carried out at least three times and were quantified using ImageJ software. The antibodies for MYC, c-MYC (sc-40), β-actin, α-tubulin, and RARα were purchased from Santa Cruz Biotechnology (Dallas, TX, USA), anti-GR, anti-ERα, anti-p75<sup>NTR</sup> and anti-c-MYC (#9402) from Cell Signaling Technology (Danvers,

MA, USA), anti- $\beta$ III-tubulin and anti-GFAP from Abcam (Cambridge, UK), anti-TH from Immunostar (Hudson, WI, USA), and anti-SCG2 from Atlas Antibodies (Bromma, Sweden).

#### Bright field microscopy and immunofluorescence of neurite outgrowth

BE(2)-GR + EV and BE(2)-GR + ER $\alpha$  cells were seeded overnight at a density of  $1.2 \times 10^5$  for control and ATRA, and  $2.0 \times 10^5$  for the E2 and DEX treatments in six-well plates containing glass coverslips. Next day, cells were exposed to the indicated ligands and incubated at +37°C for 7 days. Cells were fixed in 4% paraformaldehyde solution. For immunofluorescence, coverslips were incubated for 1 h at room temperature with blocking solution (5% goat serum, 0.25% Triton X-100, 1% BSA, and 0.05% sodium azide (Sigma, St. Louis, MO, USA), in PBS). For staining, coverslips were incubated overnight with mouse anti- $\beta$ III-tubulin (1:500, ab7751), rabbit anti-SCG2 (1:500, HPA011893), or mouse anti-vimentin (1:200, M0725) diluted in blocking solution at +4°C. Next day, samples were washed three times with PBS and incubated with AlexaFluor 594-conjugated goat anti-mouse, AlexaFluor 488-conjugated goat anti-rabbit (Invitrogen, Waltham, MA, USA) secondary antibodies, or with phalloidin Dylight TM 554 (1:500, 13054S) for 1 h at room temperature. DAPI (1:10,000) was added to stain the nuclei. After 10 min of incubation, cells were washed three times in PBS. Images were captured with a Zeiss Axiovert 200M microscope with the Zen 2 blue edition software. Phalloidin Dylight TM 554 was purchased from Cell Signaling (Danvers, MA, USA). Neurites from three separate images from three independent experiments were quantified using ImageJ. A similar procedure was applied for KCN69n, IMR32, SK-N-AS, and SH-SY5Y cells.

#### Real-time qPCR

Total RNA was isolated using TRIzol reagent (Invitrogen, Waltham, MA, USA) and extracted with DirectZol RNA miniprep kit (Qiagen, Hilden, Germany). cDNA was synthesized using iScript cDNA synthesis kit (Bio-Rad, Hercules, CA, USA) according to manufacturer's instructions. *TRKA*, *NEFL*, *SOX2*, *NES*, *MYCN*, and *DLG2* mRNA expression was evaluated by Real-time qPCR using iTaq universal SYBR Green supermix (BioRad, Hercules, CA, USA) and performed on a StepOnePlus Real-Time PCR system (Applied Biosystems, Waltham, MA, USA) according to the manufacturer's instructions. Samples were run in triplicate and normalized to the mRNA levels of the internal controls,  $\beta$ -2-microglobulin (*B2M*) or  $\beta$ -actin. Relative mRNA expression was calculated

using the  $\Delta\Delta$ CT method. Primer sequences used are listed below. At least three independent experiments were performed.

*TRKA*: Forward: 5'CACTAACAGCACATCTGGAGACC3'  
Reverse: 5'TGAGACAAGGAGCAGCGTAG3'

*NEFL*: Forward: 5'CTGGAAATCGAAGCATGCCG3'  
Reverse: 5'GCGGGTGGACATCAGATAGG3'

*SOX2*: Forward: 5'ATGCACCGCTACGACGTGA3'  
Reverse: 5'CTTTTGCACCCCTCCCATT3'

*NES*: Forward: 5'CTGCTACCCTTGAGACACCTG3'  
Reverse: 5'GGGCTCTGATCTCTGCATCTAC3'

*MYCN*: Forward: 5'GCAGAGAGGTCCTGTTTCCC3'  
Reverse: 5'GCCAGAGAGTCCCTTTCACC3'

*DLG2*: Forward: 5'CCCAGGTCTCTGGAACCTCT3'  
Reverse: 5'TGCTCGATCATAGGTTTCTTG3'

*B2M*: Forward: 5'TGCTGCTCCATGTTTGATGTATC3'  
Reverse: 5'TCTCTGCTCCCCACCTCTAAGT3'

$\beta$ -actin: Forward: 5AACTCCATCATGAAGTGTGACG3'  
Reverse: 5'GATCCACATCTGCTGGAAGG3'

#### Nile red staining for lipid droplets

BE(2)-GR + EV and BE(2)-GR + ER $\alpha$  cells were cultured overnight at a density of  $1.0 \times 10^5$  cells in six-well plates containing glass coverslips. Next day, cells were exposed to the indicated ligands and incubated at +37°C for 72 h. Cells were fixed in 4% buffered paraformaldehyde solution. For lipid droplet staining, coverslips were incubated with Nile Red (Sigma, St. Louis, MO, USA) (1:1000) for 15 min at RT. After washing with PBS, DAPI was used (1:10,000) to stain nuclei followed by washes with PBS. Images were captured with a Zeiss Axiovert 200M microscope using the Zen 2 blue edition software.

#### Extracellular flux analysis

XFe 96 Analyzer (Seahorse Bioscience, Agilent Technologies, North Billerica, MA, USA) was employed to determine the glycolytic and mitochondrial functions in BE(2)-GR + EV and BE(2)-GR + ER $\alpha$  cells. To this end, extracellular acidification rates (ECAR) and oxygen consumption rates (OCR) were measured by performing Glycolysis and Cell Mito stress tests, respectively. Cells were plated at  $8 \times 10^3$  cells/well in 96-well plates (Seahorse cell culture micro plates) in standard cell culture medium. Next day, cells were treated with 10 nM E2, 100 nM DEX, E2 + DEX, or 0.5  $\mu$ M ATRA, as well as the combination of the three ligands in charcoal stripped FBS media for 72 h. One hour prior the assay, culture medium was replaced with XF assay medium (pH7.4; Agilent Technologies) supplemented with 2 mM glutamine (Glycolysis stress test) or 2 mM glutamine, 1 mM pyruvate and 10 mM glucose (Cell Mito stress test) and cells were incubated at +37°C in a CO<sub>2</sub>-free incubator. Oligomycin



and carbonyl cyanide 4-(trifluoromethoxy) phenylhydrazone (FCCP) were applied at final doses of 1  $\mu$ M. Glucose, 2-deoxyglucose (2-DG), rotenone, and antimycin A were used at the final doses recommended by the manufacturer's instructions. Extracellular acidification rate (ECAR) and oxygen consumption rate (OCR) values were expressed as mpH/min and pmol/min, respectively. Baseline levels were normalized to protein contents. For obtaining the energy profile and metabolic potential, the baseline levels of BE(2)-GR+EV and BE(2)-GR+ER $\alpha$  cells were compared before and after induction of metabolic stress using 1  $\mu$ M oligomycin (stressed ECAR) and 1  $\mu$ M FCCP (stressed OCR).

### In vivo animal experiments

Five-week-old female NMRI-*Foxn1*<sup>tm</sup> mice purchased from Taconic Biosciences were housed in specific pathogen free conditions where light, temperature (+21 °C), and relative humidity (50-60%) were controlled. Food and water were available ad libitum. For xenograft experiments, 8  $\times$  10<sup>6</sup> BE(2)-EV or BE(2)-GR cells, and 1.0  $\times$  10<sup>7</sup> BE(2)-GR+EV or BE(2)-GR+ER $\alpha$  cells were inoculated subcutaneously into the right flank of the mice. Tumor growth was followed daily, and tumor volume was calculated as width  $\times$  length  $\times$  height  $\times$  0.52. Animals were monitored every day for signs of weight loss and euthanized when tumors in the control group reached the maximum permitted volume of 1 cm<sup>3</sup>. At sacrifice, tumors were dissected and fixed in formaldehyde for further analysis. The procedures for all animal experiments were in accordance with the ethical principles and guidelines of Karolinska Institutet and the Swedish law. Ethical permit numbers N71/15 and 10579-2020 approved by the Ethical Committee at the Northern court of Stockholm.

### Immunohistochemistry analysis of tumor sections

For immunohistochemistry analysis, xenograft tumors were fixed in 4% paraformaldehyde and embedded in paraffin. Tumors were sectioned (5  $\mu$ m thick) and stained with the EnVision Gl2 Doublestain System (Agilent Technologies, North Billerica, MA, USA) according to the manufacturer's instructions. Tumor sections were deparaffinized and rehydrated using a gradient of xylol-alcohol solutions. Endogenous peroxidase activity was blocked by 30 min incubation in methanol-hydrogen peroxide solution and sections were boiled for antigen retrieval in sodium citrate buffer (pH 6.0), except for the staining with endomucin, for which Tris-EDTA buffer was used (pH 9.0). After blocking, samples were incubated overnight at +4 °C with primary antibodies; rabbit anti-Ki67 (1:250, ab16667), rabbit anti-GR (1:400, D6H2L), rabbit anti-ER $\alpha$  (1:100, ab32063), rabbit anti-SCG2 (1:250, HPA011893), mouse anti- $\beta$ III tubulin (1:250,

ab7751), mouse anti-p75<sup>NTR</sup> (1:500, D4B3), or mouse anti-endomucin (1:400, eBioV.7C7) diluted in blocking solution. Next day, samples were incubated with HRP-polymer for 20 min, followed by 30 seconds-2 min incubation with 3,3'-Diaminobenzidine (DAB) solution. For nuclear staining, samples were incubated with hematoxylin (Agilent Technologies, North Billerica, MA, USA), for 2 min, dehydrated by a gradient of alcohol-xylol solutions and mounted with Roti-histokitt mounting medium (Carl Roth, Karlsruhe, Germany). Section images were taken at 40x with inverted microscope Olympus IX73. The antibody against GR was purchased from Cell Signaling Technology (Danvers, MA, USA), anti-ER $\alpha$ , anti-Ki67 and anti- $\beta$ III tubulin from Abcam (Cambridge, UK), anti-SCG2 from Sigma (St. Louis, MO, USA), anti-p75<sup>NTR</sup> from Cell Signaling (Danvers, MA, USA), and anti-endomucin from eBioscience Affymetrix (Santa Clara, CA, USA).

### Receptor expression analysis in NB cell lines

RNA sequencing data from 39 commonly used neuroblastoma cell lines (GSE89413) [26] was analyzed to study the levels of *GR*, *ER $\alpha$* , and *RAR $\alpha$* . The average of the log (fold change) of the expression levels (measured as fragments per kilobase of exon per million mapped fragments, FPKMs) of all samples was used to determine high and low levels. Diverging bar charts were performed using package 'ggpubr' in R (version 4.1.3).

### Gene expression analyses

RNA sequencing data and clinical information from 498 patient samples were obtained from the SEQC (GSE62564) [27] and microarray and clinical data from 649 patient samples from the Kocak (GSE45547) [28] NB cohorts downloaded from GEO (<https://www.ncbi.nlm.nih.gov/geo/>). Patients were individually divided based on low and high expression of the three different NHR genes *GR* (*NR3C1*), *ER $\alpha$*  (*ESR1*), and *RAR $\alpha$*  (*RARA*) by quartile expression score. The first quartile was considered as "low", corresponding to the patients with the lowest *GR*, *ER $\alpha$* , or *RAR $\alpha$*  (Low<sup>GR</sup>, Low<sup>ER $\alpha$</sup> , or Low<sup>RAR $\alpha$</sup> ) mRNA expression levels, and the fourth quartile as "high", corresponding to patients with the highest *GR*, *ER $\alpha$* , or *RAR $\alpha$*  levels (High<sup>GR</sup>, High<sup>ER $\alpha$</sup> , or High<sup>RAR $\alpha$</sup> ). Transcription data and clinical information of 251 patients from the Oberthuer dataset [29] were obtained from Array-Express platform (<https://www.ebi.ac.uk/arrayexpress/>) under the accession number E-MTAB-38. Patients were divided based on low and high expression of *GR*, *ER $\alpha$* , and *RAR $\alpha$*  by quartile expression score. Analysis was carried out as described above.

In the intersection of the first quartiles of *GR* and *ER $\alpha$*  patients with low mRNA expression levels, Low<sup>GR+ER $\alpha$</sup> ,

we obtained 80 patients in the SEQC and 41 in the Kocak cohorts, respectively. In addition, for the overlap of the fourth quartiles of *GR* and *ERα* with high mRNA expression,  $\text{High}^{GR+ER\alpha}$ , 74 patients were identified in the SEQC dataset and 46 in the Kocak cohort. Two samples in the Kocak cohort lacked survival information thus we used 40  $\text{Low}^{GR+ER\alpha}$  and 45  $\text{High}^{GR+ER\alpha}$  patients. Using the SEQC dataset, patients with  $\text{High}^{GR+ER\alpha}$  and  $\text{Low}^{GR+ER\alpha}$  were also divided according to their *MYCN*-status, amplified (MNA) or non-amplified (NMNA), respectively. This resulted in 74  $\text{High}^{GR+ER\alpha}$  NMNA, 29  $\text{Low}^{GR+ER\alpha}$  NMNA, 50  $\text{Low}^{GR+ER\alpha}$  MNA while no single MNA patient with  $\text{High}^{GR+ER\alpha}$ . The *MYCN* status was unknown for one of the patients included in the  $\text{Low}^{GR+ER\alpha}$  group and thus 79 patients were used in the analysis. Additionally, the levels of *GR*, *ERα*, and *RARα* were compared between the total number of MNA versus NMNA group of patients.

To study all three NHRs, the intersection of the first and fourth quartiles of triple mRNA expression of *GR*, *ERα*, and *RARα* resulted in 24 patients with high expression,  $\text{High}^{GR+ER\alpha+RAR\alpha}$ , and 36 with low expression,  $\text{Low}^{GR+ER\alpha+RAR\alpha}$ , in the SEQC cohort, while ten  $\text{High}^{GR+ER\alpha+RAR\alpha}$  and eight  $\text{Low}^{GR+ER\alpha+RAR\alpha}$  patients were identified in the Kocak dataset.

Expression levels of the genes encoding the neuronal differentiation marker tyrosine hydroxylase (TH), secretogranin 2 (SCG2), and the neurotrophic receptor (p75<sup>NTR</sup>), also known as nerve growth factor receptor (NGFR) were analyzed in the  $\text{High}^{GR+ER\alpha}$  and  $\text{Low}^{GR+ER\alpha}$ , as well as in the  $\text{High}^{GR+ER\alpha+RAR\alpha}$  and  $\text{Low}^{GR+ER\alpha+RAR\alpha}$  mRNA expression groups both of the SEQC as well as Kocak cohorts. Analysis of the differential processes affected between the  $\text{High}^{GR+ER\alpha}$  and  $\text{Low}^{GR+ER\alpha}$  mRNA expression groups from the SEQC dataset was performed using GSEA software (v4.0.3). Gene sets used for enrichment were obtained from C2: curated sets collection (c2.all.v7.2.symbols.gmt) (Additional File 1), and C5: ontology gene sets collection (c5.all.v7.2.symbols.gmt) (Additional File 2).

To determine the expression profile of genes of interest in normal and embryonic adrenal tissue, the data matrix of the Suntsova dataset (GSE96631) [30] was downloaded from the GEO database (<https://www.ncbi.nlm.nih.gov/geo/>). Expression values of each gene were plotted into a heatmap. Among the 2227 probes in the platform GPL22167, *NR3C1*, *NGFR*, *TUBB3*, and *ERBB3* were presented as indicated.

### Single-nuclei transcriptome analyses

The lists of genes significantly up-regulated in ten cell clusters (*i.e.* Progenitor-hC1, Macrophages-hC2, Cortex-hC3, -hC5, -hC8, and -hC9, Chromaffin-hC4, Endothelial -hC6, Mesenchymal-hC7, and T-cells-hC10) from three post-natal

adrenal glands were obtained from Bedoya-Reina et al. 2021 [31]. These lists were generated by computing gene-expression differences on the PAGODA-standardized expression using Benjamini-Hochberg corrected one-tailed Welch's *t*-tests. This dataset analyzed whether the PAGODA-standardized expression of genes (including *NR3C1*, encoding for *GR*, *RARα* for *RARα*, and *ESR1* for *ERα*) were significantly up-regulated in cells of each post-natal adrenal gland cluster in comparison with cells of the other clusters.

Gene expression in developing human adrenal glands was studied with the single cell sequencing data reported by Dong et al. (2020) [32] on differentially expressed genes in sympathoadrenal cell types and states in human fetal adrenal gland (selecting genes with an adjusted  $p < 0.01$ ). Pseudo-time progression on post-natal adrenal gland cells was computed as previously conducted [31]. Briefly, velocities were estimated with scVelo [33, 34] with a minimum number of shared read counts of 40 using the top 600 genes, in the gene counts obtained by Bedoya-Reina et al. (2021) [31].

### Statistical analysis

All in vitro and in vivo experiments were analyzed by Student's *t*-test or Mann-Whitney test, as indicated in the figure legends. All data is presented as mean  $\pm$  standard deviation (SD) of at least three independent experiments. Significance is highlighted with \*, \*\*, \*\*\*, and \*\*\*\* indicating  $p < 0.05$ ,  $p < 0.01$ ,  $p < 0.001$ , and  $p < 0.0001$ , respectively.

Patient data from the SEQC, Kocak, Oberthuer, and Suntsova datasets were analyzed using GraphPad Prism software (v.8). *T*-test was used for statistical analysis of gene expression with \*, \*\*, \*\*\*, and \*\*\*\* indicating  $p < 0.05$ ,  $p < 0.01$ ,  $p < 0.001$ , and  $p < 0.0001$ . Significance of overall survival (OS) curves was analyzed by Log-rank test. *T*-test was used for statistical analysis of gene expression with \*, \*\*, \*\*\*, and \*\*\*\* indicating  $p < 0.05$ ,  $p < 0.01$ ,  $p < 0.001$ , and  $p < 0.0001$ . The significance threshold for gene enrichment analysis using GSEA (v4.0.3) was set to an FDR *q*-value of 0.05. Normalized enrichment score (NES) was defined as actual ES/mean (ES against all permutations of the dataset).

The lists of genes from the single-nuclei analysis were generated by computing gene-expression differences on the PAGODA-standardized expression using Benjamini-Hochberg corrected one-tailed Welch's *t*-tests. For the gene expression in developing human adrenal glands, we selected genes with an adjusted  $p < 0.01$ .

## Results

### Ectopic GR expression induced differentiation and reduced tumorigenesis

We first analyzed the effect of a synthetic ligand of *GR*, dexamethasone (DEX), and the *RARα* ligand all-*trans*

retinoic acid (ATRA) on the viability of BE(2) cells stably expressing GR, named BE(2)-GR, and the empty vector carrying control BE(2)-EV, previously generated [18]. Following treatment with ATRA in BE(2)-GR cells, viability increased but no significant changes were found after treatment with either DEX or DEX + ATRA (Supplementary Fig. 1A).

Well-differentiated tumor cells are usually linked to a less aggressive phenotype [35]. We therefore asked whether DEX stimulated differentiation of BE(2)-GR cells. Retinoic acid (RA) is known for its differentiation mediating ability in NB [36] and was thus used as positive control. As expected, ATRA triggered neurite-like outgrowth, a morphological sign of neuronal differentiation. Activation of GR with DEX showed a similar phenotype and the DEX + ATRA combination slightly increased neurite formation compared to the single treatments in BE(2)-GR cells (Fig. 1A, Supplementary Fig. 1B and Supplementary Fig. 1C). In contrast, only ATRA provoked differentiation in BE(2)-EV cells. The levels of GR and RAR $\alpha$  were analyzed by Western blot to determine expression changes upon treatment. We found that GR levels declined in BE(2)-GR cells incubated with DEX (Supplementary Fig. 1D), consistent with a well described negative feedback loop [18, 37]. The abundance of RAR $\alpha$  was similar in both cell lines, and ATRA slightly increased the levels in BE(2)-GR cells while ATRA, DEX, or the combination led to a decrease in control cells (Supplementary Fig. 1D). Reduction of MYCN levels is a well-known effect during neuronal differentiation [38, 39]. Hence, MYCN protein was downregulated in BE(2)-EV cells treated with either ATRA or DEX + ATRA and mRNA levels were slightly reduced (Supplementary Fig. 1D, E). In BE(2)-GR cells, single treatment with ATRA reduced MYCN mRNA expression (Supplementary Fig. 1F). The neuronal differentiation marker tyrosine hydroxylase (TH) was elevated in BE(2)-GR cells upon DEX exposure, with a slight increase in the p75 neurotrophin receptor (p75<sup>NTR</sup>), while no changes were observed in secretogranin 2 (SCG2) or  $\beta$ III-tubulin (Fig. 1B and Supplementary Fig. 1E). ATRA treatment

alone or in combination with DEX resulted in an upregulation of differentiation markers, particularly in SCG2 in both cell lines. Expression analysis of mRNA levels of additional differentiation markers including *Neurofilament L (NEFL)* and *Tropomyosin receptor Kinase A (TRKA)*, as well as the progenitor markers *Nestin (NES)* and *Sex determining region Y-box 2 (SOX2)*, were performed by RT-qPCR to validate the induction of neuronal differentiation upon GR and RAR $\alpha$  activation (Fig. 1C and Supplementary Fig. 1F). Treatment with DEX resulted in upregulated expression of *NEFL* and *TRKA* only in BE(2)-GR cells, while ATRA increased their levels in both cell lines. Both *NES* and *SOX2* were significantly downregulated in BE(2)-GR cells in all conditions compared to control while in BE(2)-EV cells only *SOX2* was significantly reduced when ATRA was added.

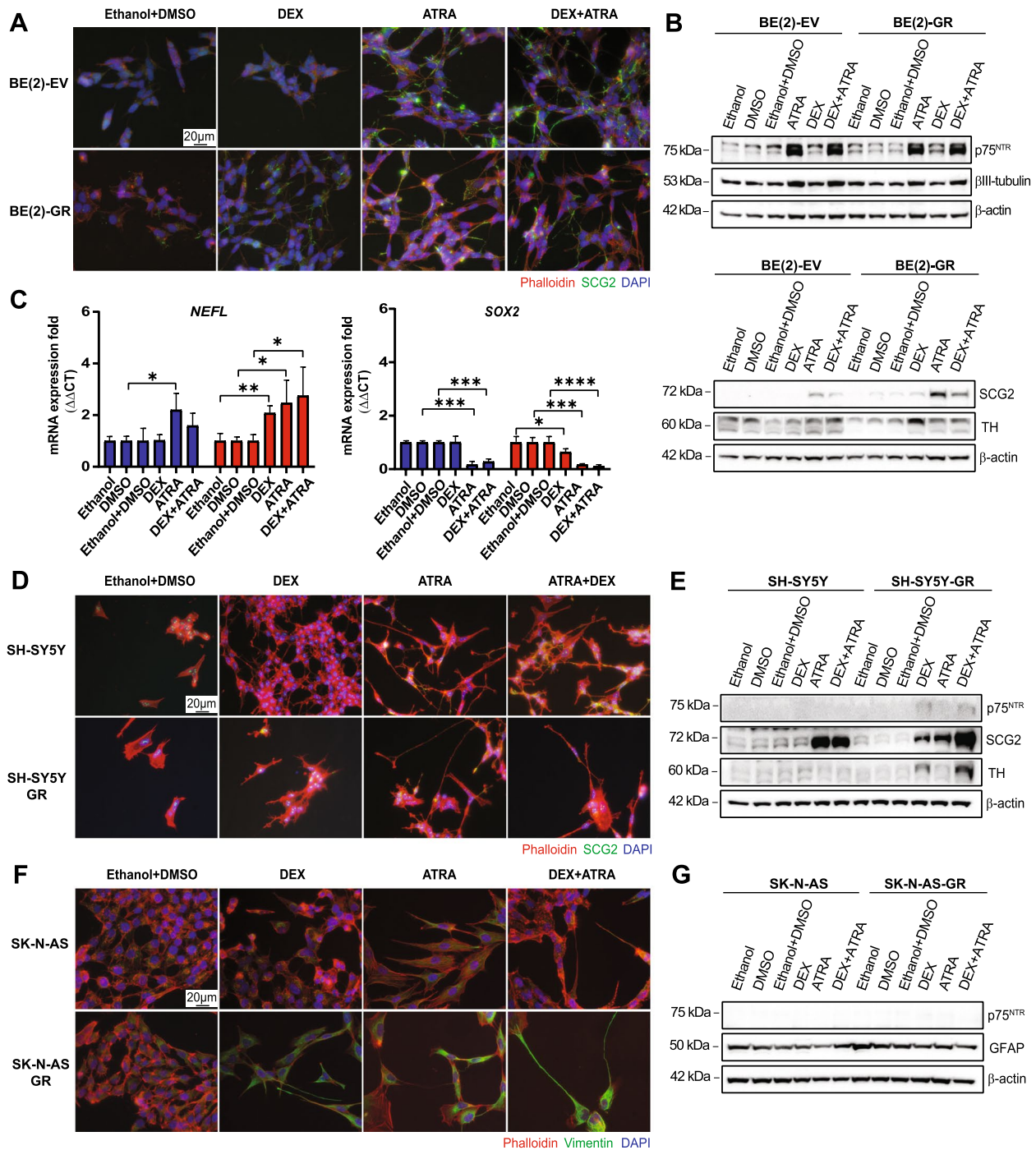
Moreover, we extended the differentiation studies by overexpressing GR in two additional cell lines, SH-SY5Y and SK-N-AS, both non-MYCN-amplified but expressing c-MYC. First, we assessed the protein levels of GR, RAR $\alpha$ , and c-MYC after treatment with DEX, ATRA, or their combination (Supplementary Fig. 2A). In SH-SY5Y parental cells, GR protein levels were barely detected by Western blot analysis, while they were highly expressed in SH-SY5Y-GR cells, with all treatments. Furthermore, c-MYC levels decreased upon ATRA or DEX + ATRA in both cell lines while RAR $\alpha$  was barely detectable in any condition in SH-SY5Y-GR cells (Supplementary Fig. 2A, B). We observed low GR expression in parental SK-N-AS. Exposure to DEX or DEX + ATRA reduced GR levels in both SK-N-AS parental and GR-overexpressing cells. Moreover, all treatments reduced RAR $\alpha$  expression in both cell lines. c-MYC was downregulated in parental cells upon DEX + ATRA, and with DEX in SK-N-AS-GR cells (Supplementary Fig. 2A, B).

In SH-SY5Y parental and SH-SY5Y-GR cells, ATRA exposure resulted in neurite outgrowth, while DEX alone induced mild differentiation observed as a moderate neurite outgrowth in GR-overexpressing cells (Fig. 1D and Supplementary Fig. 2C). Moreover, SCG2 was increased in all ATRA conditions, while the other

(See figure on next page.)

**Fig. 1** Expression of GR reduced proliferation, induced neuronal and glial differentiation, and decreased tumor growth. **A** Immunofluorescence staining of BE(2)-EV and BE(2)-GR cells after ligand treatment. Green = SCG2; red = Phalloidin; blue = DAPI. **B** Western blot of indicated markers in BE(2)-EV and BE(2)-GR cells following incubation with ligands. Please note the different loading order on the two membranes. **C** RT-qPCR of *NEFL* and *SOX2* in BE(2)-EV and BE(2)-GR cells following ligand treatment. *B2M* was used as housekeeping gene. Statistical analysis: *t*-test with \*, \*\*, \*\*\*, and \*\*\*\* indicating  $p < 0.05$ ,  $p < 0.01$ ,  $p < 0.001$ , and  $p < 0.0001$ , respectively. Data of the fold mRNA expression is presented as mean  $\pm$  SD. **D** Immunofluorescence staining of SH-SY5Y parental and GR expressing cells after incubation with ligands. Green = SCG2; red = Phalloidin; and blue = DAPI. **E** Western blot of neural differentiation markers in SH-SY5Y parental and GR expressing cells following ligand treatment. **F** Immunofluorescence staining of SK-N-AS parental and GR expressing cells after incubation with ligands. Green = Vimentin; red = Phalloidin; blue = DAPI. **G** Western blot of neural and glial differentiation markers in SK-N-AS parental and GR expressing cells following ligand treatment. All experiments were carried out during seven days. Ethanol was used as control for DEX, DMSO for ATRA, and ethanol + DMSO for the combination. Scale bars represent 20  $\mu$ m.  $\beta$ -actin was used as loading control and molecular weight markers are shown to the left. All results are representative of at least three independent experiments



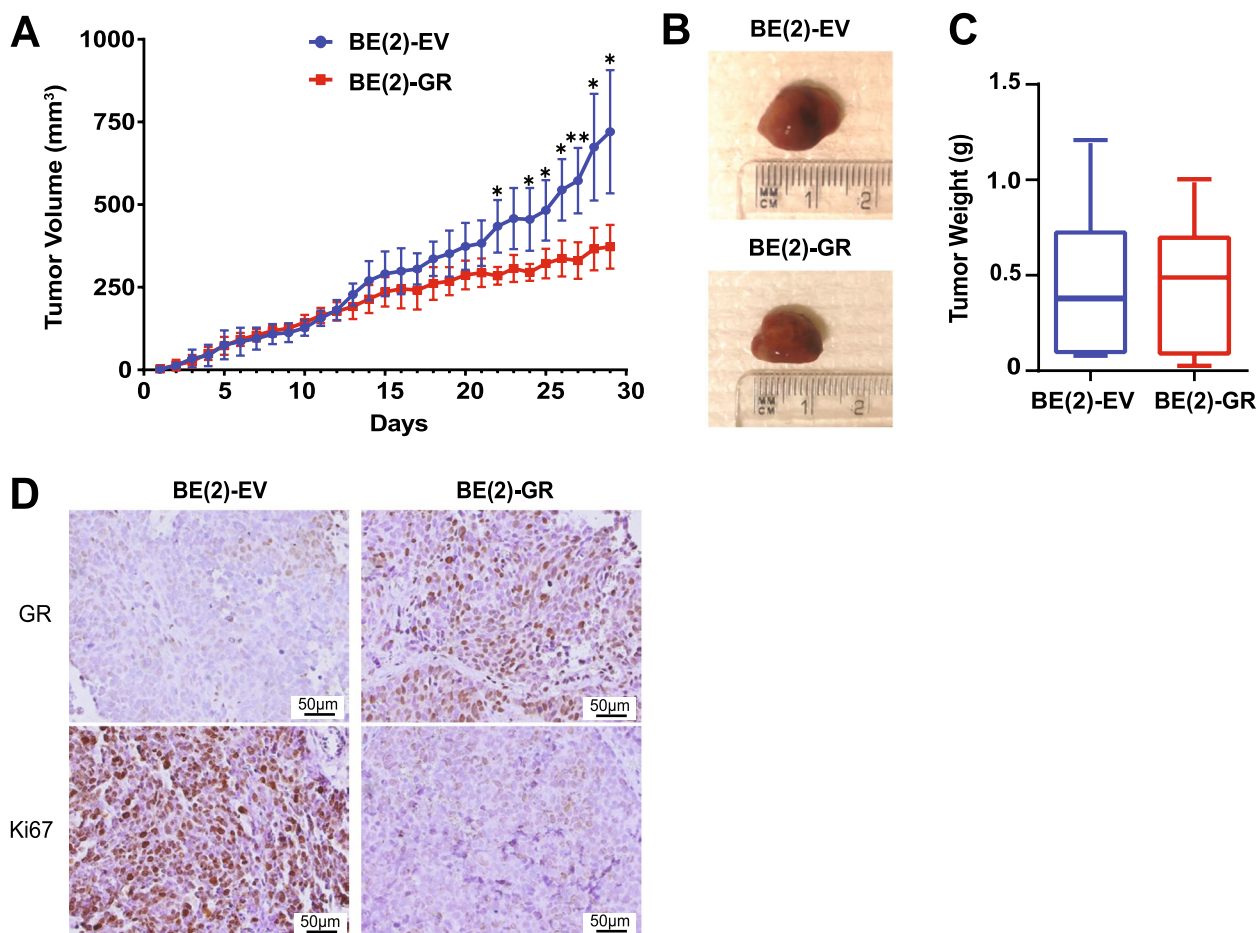


**Fig. 1** (See legend on previous page.)

markers analyzed were barely detectable in parental cells (Fig. 1D, E and Supplementary Fig. 2D). In the SY5Y-GR cells, SCG2 was enhanced upon treatments, while TH increased only with DEX or DEX + ATRA, and p75<sup>NTR</sup> only slightly with all conditions (Fig. 1D, E and Supplementary Fig. 2D).

SK-N-AS cells are well known to differentiate into the glial lineage. Therefore, two glial differentiation markers, vimentin (VIM) and glial fibrillary acidic protein (GFAP), were analyzed. Treatment with DEX slightly increased vimentin abundance in parental SK-N-AS, and this effect was stronger in SK-N-AS-GR cells (Fig. 1F). All-trans





**Fig. 2** Expression of GR decreased tumor growth. **A** Tumor volume in mice inoculated with BE(2)-EV ( $n=6$ ) and BE(2)-GR ( $n=7$ ) cells. Growth was followed until the control group reached the ethical endpoint volume of 1 cm<sup>3</sup>. Statistical analysis: *t*-test with \* and \*\* indicating  $p < 0.05$  and  $p < 0.01$ , respectively. Data is presented as mean  $\pm$  SD. **B** Representative photos of xenograft tumors at experimental endpoint with ruler. **C** Tumor weight at experimental endpoint. Statistical analysis: *t*-test. Data is presented as mean  $\pm$  SD. **D** Images of immunohistochemistry analysis of BE(2)-EV and BE(2)-GR derived tumors stained with anti-GR and anti-Ki67 antibodies. Representative pictures from at least five independent stainings per condition. Scale bars indicate 50  $\mu$ m

retinoic acid (ATRA) and the combination with DEX induced vimentin expression in both cell lines, notably more pronounced in the GR-overexpressing cells, also evidenced by morphological changes (Fig. 1F), while GFAP protein levels were not changed (Fig. 1G and Supplementary Fig. 2E). As expected, the neural differentiation marker p75<sup>NTR</sup> was not expressed either in the parental or the GR-overexpressing cells, verifying the differentiation towards the glial lineage instead of neuronal of SK-N-AS cells.

To evaluate possible differences in tumor growth *in vivo*, we performed a xenograft experiment comparing BE(2)-EV and BE(2)-GR cells. Tumor volume was significantly decreased in mice injected with cells

overexpressing GR compared to those generated by control cells (Fig. 2A, B, and Supplementary Fig. 3A). However, there was no significant difference in weight at experimental endpoint, since tumors from BE(2)-EV were filled with fluid with signs of necrosis, while BE(2)-GR derived tumors exhibited a solid texture (Fig. 2C). Analysis of tumor sections confirmed the presence of GR protein and low expression of Ki67, a proliferation marker associated with aggressiveness, in BE(2)-GR-derived tumors in contrast to in control tumors (Fig. 2D).

Together, our results showed that activation of GR-expressing cells resulted in increased expression of neuronal differentiation markers and neurite outgrowth, and in reduced tumor burden *in vivo*.

### Triple activation of ER $\alpha$ , GR, and RAR $\alpha$ induced differentiation

Combination treatments, *i.e.*, therapeutic interventions with a cocktail of two or more drugs, is a cornerstone of cancer therapy. The amalgamation of anti-cancer medicines improves effectiveness compared to monotherapy since it targets key pathways in a characteristically additive or synergistic manner [40].

We found that treatment with 17- $\beta$ -estradiol (E2) impaired the tumorigenic potential of NB cells overexpressing ER $\alpha$  [17] and that GR overexpression led to reduced tumorigenesis both in vitro and in vivo (Figs. 1 and 2, Supplementary Figs. 1-3) [18]. Although both effects were robust, they did not result in complete differentiation. To assess whether concomitant overexpression of GR and ER $\alpha$  would promote a stronger differentiation phenotype, we generated BE(2)-GR+EV and BE(2)-GR+ER $\alpha$  cells using lentiviral transduction (Supplementary Fig. 4A) and performed in vitro and in vivo assays. All-*trans* retinoic acid (ATRA) was used as positive control for neuronal differentiation and the impact of RAR $\alpha$  activation on differentiation triggered by GR and ER $\alpha$  was analyzed.

GR and ER $\alpha$  expression were validated in BE(2)-GR+EV and BE(2)-GR+ER $\alpha$  cells by Western blot analysis (Supplementary Fig. 4A) and the IC<sub>50</sub> value for each ligand was calculated. While DEX showed similar IC<sub>50</sub> values in both cell lines, E2, as expected, barely affected viability of BE(2)-GR+EV cells (Supplementary Fig. 4B). The IC<sub>50</sub> values for ATRA were similar in GR+ER $\alpha$  overexpressing and control cells. To evaluate possible cumulative effects upon activation of two or three ligands, we performed assays of single and combination treatments. All concentrations employed were below the IC<sub>50</sub> values and ATRA was used in a significantly lower concentration (0.5  $\mu$ M) than in many other studies (10  $\mu$ M) [41, 42]. Single treatments using any of the concentrations analyzed did not affect cell viability (Supplementary Fig. 4C). Interestingly, 0.5  $\mu$ M ATRA significantly increased viability of BE(2)-GR+ER $\alpha$  cells, while only slightly in BE(2)-GR+EV, similar as observed in BE(2)-GR cells (Supplementary Fig. 1A). While the triple combination of 10 nM E2+100 nM DEX+0.5  $\mu$ M ATRA did not affect cell viability in BE(2)-GR+EV cells, a reduction to 52% occurred when increasing the concentrations to 20 nM E2+250 nM DEX+2  $\mu$ M ATRA (Supplementary Fig. 4C). In BE(2)-GR+ER $\alpha$  cells, the incubation with E2+DEX resulted in mild reduction of cell viability, which decreased to 63% upon triple combination using low concentrations of ligands, and it was strikingly reduced to 26% with higher concentrations (20 nM E2+250 nM DEX+2  $\mu$ M ATRA) (Supplementary Fig. 4C). This demonstrated that ATRA decreased

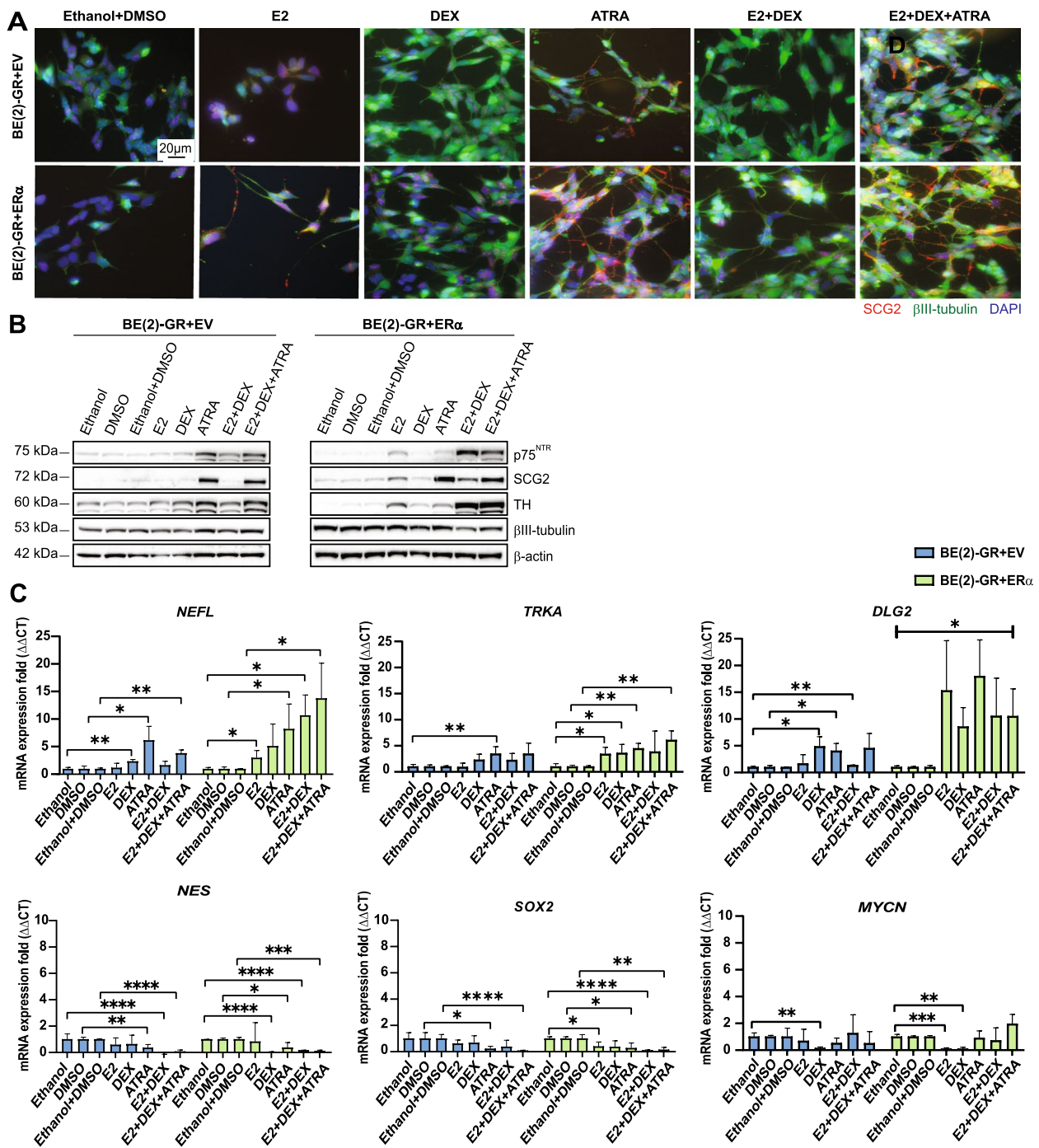
viability when combined with E2+DEX in an additive and dose-dependent manner, even though ATRA alone at low concentration increased the percentage of viable cells.

Next, we examined the colony formation potential of BE(2)-GR+EV and BE(2)-GR+ER $\alpha$  cells and found that the latter formed significantly fewer colonies compared to control cells (Supplementary Fig. 4D). Treatment with ATRA or the triple combination led to formation of small, highly differentiated colonies that easily detached from the plate. Neither E2, DEX, nor E2+DEX addition led to significant differences in colony number in control cells, while in BE(2)-GR+ER $\alpha$  cells numbers were reduced with either E2 or E2+DEX.

Given the decrease in colonies between BE(2)-GR+ER $\alpha$  and control cells, we enquired whether activation of the three receptors together would trigger a stronger differentiation. To this end, we analyzed neurite outgrowth after single, double, or triple treatments. As expected, neurite-like protrusions appeared in BE(2)-GR+EV cells upon DEX and ATRA addition, whereas the morphology did not change with E2 alone (Supplementary Fig. 5A). The combined E2+DEX cocktail also resulted in neurite outgrowth while the triple combination further enhanced neuronal differentiation. In contrast, all treatments promoted neurite outgrowth in BE(2)-GR+ER $\alpha$  cells, an effect that was most robust upon the triple condition (Supplementary Fig. 5A, B).

Neuronal differentiation was validated by immunofluorescence staining of the differentiation markers  $\beta$ III-tubulin and SCG2. In control cells,  $\beta$ III-tubulin increased upon exposure to DEX, ATRA, E2+DEX, or E2+DEX+ATRA, while SCG2 protein abundance was mainly induced with ATRA or the triple cocktail (Fig. 3A). Notably, in BE(2)-GR+ER $\alpha$  cells, single activation by any of the ligands resulted in elevation of both markers compared to control treatments. As observed, incubation with E2, ATRA, E2+DEX, or E2+DEX+ATRA, led to pronounced elongated neurite protrusions. Morphological changes also occurred in BE(2)-GR-EV cells albeit at a more modest level (Fig. 3A).

We confirmed that GR levels decreased following DEX treatment in both cell types (Supplementary Fig. 5C). In addition, BE(2)-GR+ER $\alpha$  cells showed higher RAR $\alpha$  levels, which remained unchanged upon any treatment compared to control cells, where expression was decreased after incubation with E2, DEX, E2+DEX, or the triple combination. None of the treatments affected MYCN protein expression in BE(2)-GR+EV cells, but RT-qPCR analysis revealed a significant downregulation of the MYCN gene upon DEX exposure (Supplementary Fig. 5C, D and Fig. 3C). Similarly, in BE(2)-GR+ER $\alpha$  cells, a considerable



**Fig. 3** Triple activation of GR, ER $\alpha$ , and RAR $\alpha$  enhanced neuronal differentiation in BE(2) cells. **A** Immunofluorescence staining after ligand treatment. Green =  $\beta$ III-tubulin; red = SCG2; blue = DAPI. Scale bars represent 20  $\mu$ m. **B** Western blot analysis of neural differentiation markers in BE(2)-GR + EV and BE(2)-GR + ER $\alpha$  cells following incubation with ligands.  $\beta$ -actin was used as loading control. Molecular weight markers shown to the left. **C** RT-qPCR of *NEFL*, *TRKA*, *DLG2*, *NES*, *SOX2*, and *MYCN* in BE(2)-GR+EV and BE(2)-GR-ER $\alpha$  cells following ligand treatment. *B2M* was used as housekeeping gene. Statistical analysis: *t*-test with \*, \*\*, \*\*\*, and \*\*\*\* indicating  $p < 0.05$ ,  $p < 0.01$ ,  $p < 0.001$ , and  $p < 0.0001$ , respectively. The brackets in the *DLG2* graph represent significance of all the experimental conditions versus their controls. Data of the mRNA expression fold is presented as mean  $\pm$  SD of a minimum of three independent replicates. In all experiments, 10 nM E2, 100 nM DEX, or 0.5  $\mu$ M ATRA were used with ethanol as control for E2, DEX, and E2 + DEX, DMSO for ATRA, and ethanol + DMSO for the triple combination. All experiments were carried out during seven days and performed at least three times



reduction in *MYCN* mRNA was observed after E2 or DEX exposure, although we did not detect any changes in protein levels. Note that the previous results included analysis on protein and mRNA abundance. A caveat of this approach is that mRNA and protein levels might not necessarily be correlated [43].

Moreover, we analyzed protein expression of the neuronal differentiation markers TH, SCG2, p75<sup>NTR</sup>, and  $\beta$ III-tubulin by Western blot. Treatment with E2+DEX slightly increased TH levels in control cells. In addition, ATRA alone or in combination with E2+DEX upregulated all four markers. In BE(2)-GR+ER $\alpha$  cells, activation of ER $\alpha$  increased p75<sup>NTR</sup>, SCG2, and TH, and levels were robustly potentiated with triple treatment (Fig. 3B and Supplementary Fig. 5D).

Additionally, we confirmed neuronal differentiation by analyzing mRNA expression of other known neuronal differentiation and progenitor markers. Increased *NEFL* and *TRKA* were observed in all conditions with DEX or ATRA in BE(2)-GR+EV cells, whereas a downregulation in *SOX2* and *NES* occurred upon ATRA and the double (E2+DEX) and triple combinations. Likewise, all treatments increased the abundance of neuronal differentiation markers and diminished the levels of the progenitor markers in BE(2)-GR+ER $\alpha$  cells (Fig. 3C). The *Discs Large MAGUK Scaffold Protein 2 (DLG2)* gene was recently reported to regulate the differentiation phenotype induced by ATRA, and proposed as a tumor suppressor candidate in NB [44]. Our RT-qPCR analysis showed that all treatments, except E2 in BE(2)-GR+EV cells, elevated *DLG2* levels in accordance with our differentiation results (Fig. 3C).

Furthermore, to validate the phenotype achieved by activation of the three NHRs, we expanded our analysis to two additional *MYCN*-amplified NB cell lines, IMR32 and KCN69n, both overexpressing GR+EV and GR+ER $\alpha$ . Equally to in BE(2) cells, neurite outgrowth was observed upon DEX, ATRA, double, and triple combination in GR+EV cells, as well as with all treatments in GR+ER $\alpha$  cells, in particular with E2+DEX+ATRA in both IMR32-GR-ER $\alpha$  and KCN-GR+ER $\alpha$  (Supplementary Fig. 6A). These results were supported by phalloidin and SCG2 staining (Fig. 4A). Moreover, *MYCN* levels were significantly reduced with the double and triple combination in KCN-GR+ER $\alpha$  cells (Supplementary Fig. 6B, C). Notably, GR protein levels were downregulated upon all conditions containing DEX in GR+EV cells, and RAR $\alpha$  expression diminished in all treatments. In contrast, all ligands increased ER $\alpha$  levels in KCN-GR+ER $\alpha$  cells (Supplementary Fig. 6B). Evaluation of the neuronal differentiation markers showed that TH was enhanced with DEX or ATRA in KCN-GR+EV and in all conditions in the double overexpressing cells. The levels

of p75<sup>NTR</sup> were robustly increased after the triple combination in both cell lines while the change in SCG2 was only minor (Fig. 4B and Supplementary Fig. 6C).

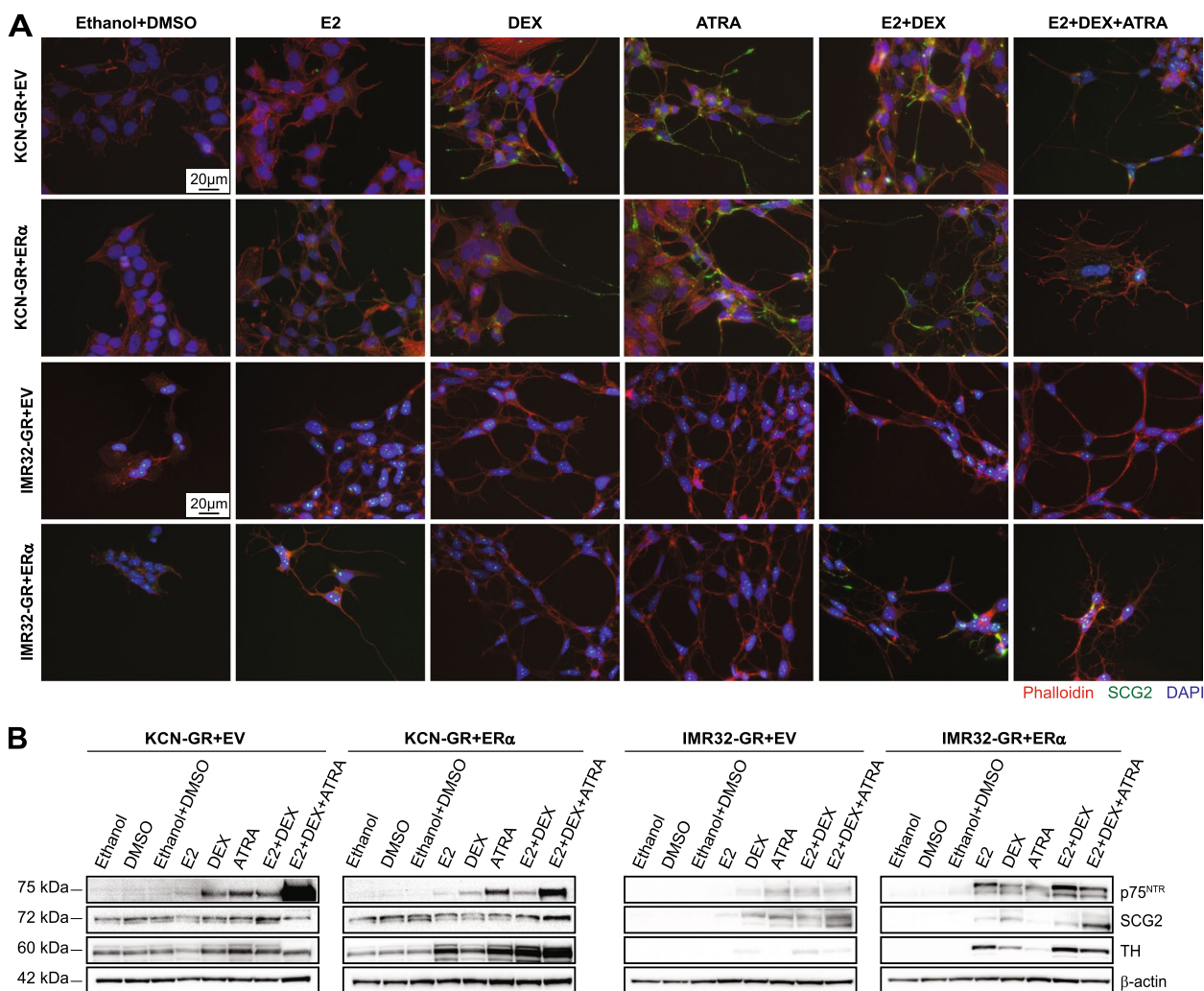
IMR-32-GR+ER $\alpha$  cells showed the most robust differentiation phenotype of all cells analyzed, with a stronger increase in all neuronal differentiation markers after E2 + DEX or E2 + DEX + ATRA treatment (Fig. 4A, Supplementary Fig. 6A and 7B). In IMR32-GR+EV, SCG2 levels were elevated when treated with E2+DEX+ATRA while TH was increased with both the double and triple combination. Furthermore, while no changes were observed in *MYCN* protein (Supplementary Fig. 7A, B), GR levels increased in both cell lines and ER $\alpha$  abundance was elevated in GR+ER $\alpha$  cells upon treatment. The endogenous protein levels of the receptors used in this study, GR, ER $\alpha$ , and RAR $\alpha$  are shown in Supplementary Fig. 7C. Moreover, using RNAseq data from 39 common NB cell lines, we analyzed the expression of the three receptors and presented data as higher or lower than the average level in all samples. All cells used in our study were present except KCN69n. The levels of *GR (NR3C1)* were higher than the average in SH-SY5Y cells followed by SK-N-AS, while they were under the average in SK-N-BE(2) and IMR32, with the lowest levels in the latter. In comparison, we only detected GR protein in SK-N-AS cells by Western blot (Supplementary Fig. 2A and Supplementary Fig. 7D). All cells showed lower expression of ER $\alpha$  (*ESR1*) than average (Supplementary Fig. 7D). In accordance, we did not detect ER $\alpha$  levels in any of the cells (Supplementary Fig. 4A, 5C, 6B, 7A and 7C). For RAR $\alpha$  (*RARA*), mRNA levels were high in SK-N-AS, similar to average in SH-SY5Y, and lower than average in SK-N-BE(2) and IMR32 (Supplementary Fig. 7D). However, we detected higher levels of RAR $\alpha$  protein in the *MYCN*-amplified cells BE(2), IMR32, and KCN69n, compared to the non-*MYCN*-amplified cells (Supplementary Fig. 7C).

In summary, simultaneous activation of GR and ER $\alpha$  lead to reduced viability and colony forming ability, accompanied by a stronger induction of neurite outgrowth and neuronal differentiation markers. Expression data revealed that cells with *MYCN*-amplification have lower levels of NHRs receptors than non-*MYCN* amplified cells, supporting the notion that *MYCN* inhibits their expression.

#### **NHR activation increased glycolytic capacity and induced lipid droplet accumulation**

Cancer cells reprogram their metabolism to maintain proliferation [45, 46]. We have previously shown that the glycolytic and oxidative functions were impaired in *MYCN*-amplified NB cells overexpressing ER $\alpha$  [17]. To examine a putative cumulative effect of GR and ER $\alpha$  activation on the metabolic phenotype, we employed the Agilent





**Fig. 4** Triple activation of GR, ER $\alpha$ , and RAR $\alpha$  enhanced neuronal differentiation in KCN69n and IMR32 cells. **A** Immunofluorescence staining after ligand treatment. The upper two panels show KCN69n and the lower two panels IMR32 cells. Green = SCG2; red = Phalloidin; blue = DAPI. Scale bars represent 20  $\mu$ m. **B** Western blot analysis of neural differentiation markers in KCN-GR + EV, KCN-GR + ER $\alpha$ , IMR32-GR + EV, and IMR32-GR + ER $\alpha$  cells following incubation with ligands. Molecular weight markers shown to the left and  $\beta$ -actin was used as a loading control. Cells were treated with 20 nM E2, 200 nM DEX, 1  $\mu$ M ATRA, or the combination of either 20 nM E2 + 200 nM DEX, or 20 nM E2 + 200 nM DEX + 1  $\mu$ M ATRA for seven days. Experiments were performed at least three times

Extracellular Flux Analyzer (Supplementary Fig. 8A, B) [47, 48]. We found that cells expressing GR were more glycolytic and, in addition, had a higher oxidative phosphorylation (OXPHOS) capacity than those co-expressing GR and ER $\alpha$  (Fig. 5A, B). Incubation with DEX increased the glycolytic parameters in control cells. As expected, both E2 and DEX single treatments raised glycolysis in BE(2)-GR + ER $\alpha$  cells, and it was further increased upon their combination (Fig. 5A). Similarly, treating with ATRA or the triple combination resulted in a stronger induction of glycolytic function, especially in control cells (Fig. 5B).

Conversely, analysis of oxygen consumption rate (OCR) revealed that mitochondrial respiration was significantly reduced in BE(2)-GR + ER $\alpha$  compared to control cells. Furthermore, activation of both receptors downregulated OXPHOS in BE(2)-GR + ER $\alpha$ . In contrast, neither E2, DEX, nor their combination affected mitochondrial activity in control cells (Fig. 5C). Notably, ATRA increased OXPHOS in both cell types whereas the mitochondrial parameters mildly decreased when combining E2 + DEX + ATRA, most likely due to a counter effect of E2 and DEX (Fig. 5B, D).

To investigate the metabolic potential in response to induced stress, we used oligomycin, inhibiting ATP synthase, and FCCP, an uncoupler of the electron transport chain. Upon stress induction, control cells shifted to a more energetic phenotype. BE(2)-GR + ER $\alpha$  cells moved towards an aerobic phenotype after ATRA treatment, with enhanced ECAR upon activation with ATRA or the triple cocktail (Fig. 5G and Supplementary Fig. 8C-F). In BE(2)-GR + EV cells, ATRA alone or in combination with E2 + DEX increased glycolysis, whereas only a minor change was observed in OXPHOS (Fig. 5E, F). In contrast, in BE(2)-GR + ER $\alpha$  cells, E2 enhanced glycolysis and decreased respiration, an effect further potentiated when combining with DEX + ATRA for glycolysis while OXPHOS was unaffected compared to control. Notably, glycolysis was mildly enhanced with DEX but strikingly increased with ATRA but neither DEX nor ATRA influenced OXPHOS (Fig. 5G, H).

Lipids are stored in several cancer types as a consequence of metabolic reprogramming [49, 50]. We have previously demonstrated lipid droplet accumulation in ER $\alpha$  expressing NB cells upon E2-activation [17]. Hence, we explored lipid droplet formation upon simultaneous activation of GR, ER $\alpha$ , and RAR $\alpha$ . Treatment with DEX, ATRA, their combination, or a mix of all three ligands resulted in lipid droplet accumulation in control cells. All treatments including E2 alone triggered lipid droplet deposition in BE(2)-GR + ER $\alpha$  cells while none of the vehicle conditions showed any sign of lipids (Fig. 5I).

Collectively, co-activation of GR, ER $\alpha$ , and RAR $\alpha$  increased glycolysis and lipid droplet accumulation with minimal influence on mitochondrial respiration.

#### Concurrent overexpression of GR and ER $\alpha$ reduced angiogenesis and tumor burden

To evaluate the tumorigenic potential of combined expression of GR and ER $\alpha$  in vivo, cells were inoculated in nude mice, and tumor growth was followed until the control group reached the ethical endpoint volume. Overexpression of combined GR and ER $\alpha$  significantly reduced tumor burden and weight compared to tumors

derived from GR expressing cells (Fig. 6A, B, and Supplementary Fig. 9A). We verified the presence of ER $\alpha$  and/or GR by analysis of tumor sections derived from control or BE(2)-GR + ER $\alpha$  cells. Ki67 staining showed that BE(2)-GR + ER $\alpha$  tumors had a less proliferative phenotype compared to controls (Fig. 6C). Staining of tumor sections showed higher levels of the differentiation markers, p75<sup>NTR</sup>, SCG2, and  $\beta$ III-tubulin in tumors derived from BE(2)-GR + ER $\alpha$  cells compared to control tumors (Fig. 6D). Notably, tumors generated from BE(2)-GR + EV cells were more vascularized in appearance than those from BE(2)-GR + ER $\alpha$  cells. We confirmed extensive angiogenesis, with multiple and wide blood vessels, in BE(2)-GR + EV-derived tumors by staining for the endothelial marker endomucin in comparison with BE(2)-GR + ER $\alpha$  generated tumors (Fig. 6E and Supplementary Fig. 9B).

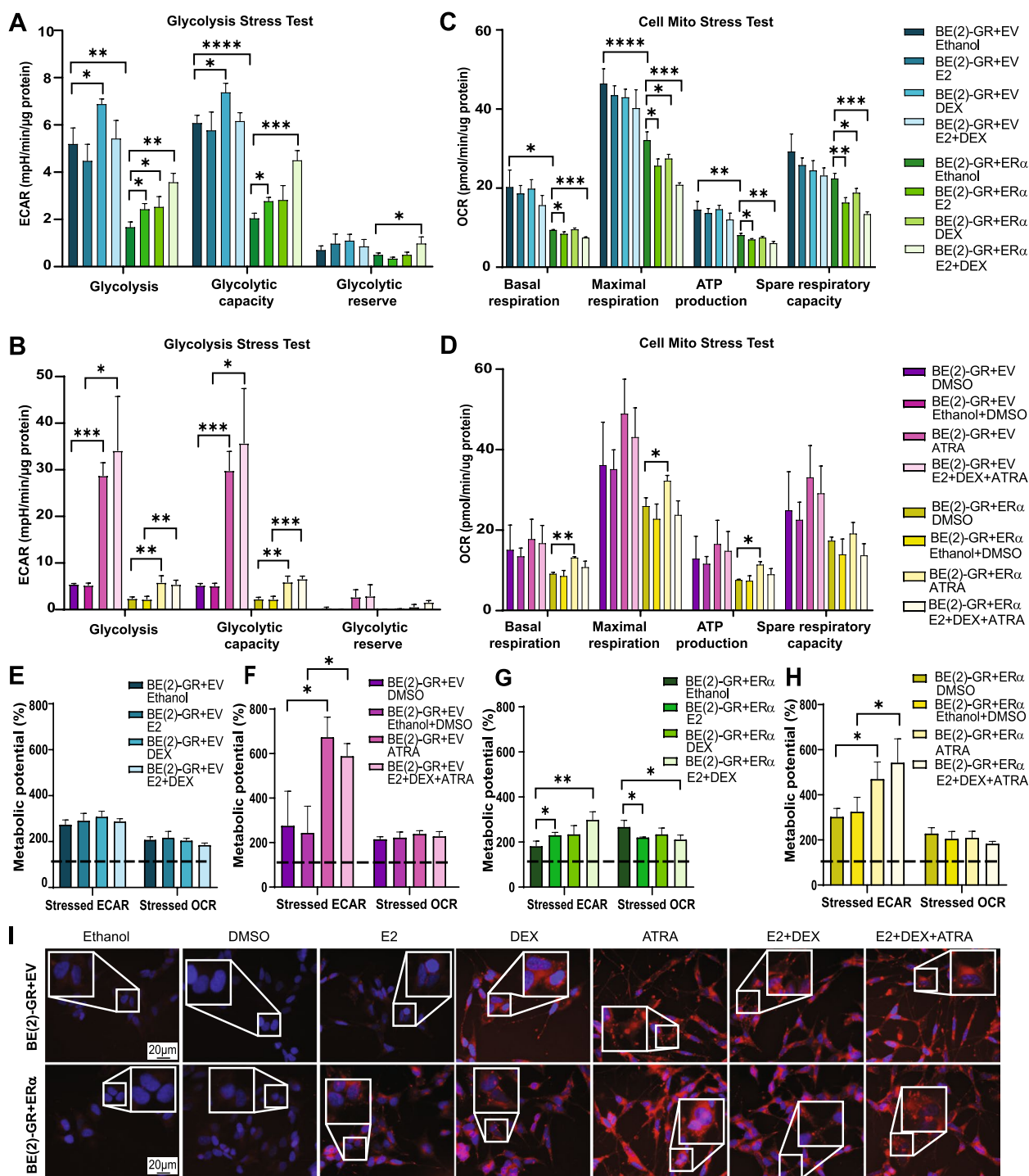
Together, these results demonstrated that co-activation of GR and ER $\alpha$  induced robust differentiation in combination with decreased angiogenesis and tumor burden in vivo, highlighting the potential of triggering both receptors as a putative therapeutic approach.

#### The levels of GR, ER $\alpha$ , and RAR $\alpha$ correlated with high expression of differentiation markers and favorable prognosis in NB patients

Next, we interrogated the impact of the three receptors for survival of NB patients. Using the SEQC ( $n = 498$ ) [27] and Kocak ( $n = 649$ ) [28] NB cohorts, we analyzed the outcome of expression of GR, ER $\alpha$ , and RAR $\alpha$ , either individually or in combination, for NB patient survival (Fig. 7). To this end, patients were divided in high or low GR, ER $\alpha$ , or RAR $\alpha$ , according to their mRNA levels and separated in quartiles of expression: from quartile 1, patients with the highest levels, to quartile 4, patients with the lowest expression. We selected all patients in quartile 1 (High<sup>GR</sup>, High<sup>ER $\alpha$</sup> , or High<sup>RAR $\alpha$</sup> ) and in quartile 4 (Low<sup>GR</sup>, Low<sup>ER $\alpha$</sup> , or Low<sup>RAR $\alpha$</sup> ), separating them from patients with intermediate expression levels (quartiles 2 and

(See figure on next page.)

**Fig. 5** Activation of GR, ER $\alpha$ , and RAR $\alpha$  resulted in metabolic reprogramming. **A-B** Quantification of extracellular acidification rate (ECAR) in BE(2)-GR + EV and BE(2)-GR + ER $\alpha$  cells treated with **A**) ethanol, E2, DEX or E2 + DEX, or **B**) DMSO, ethanol + DMSO, ATRA or E2 + DEX + ATRA. **C-D** Quantification of oxygen consumption rate (OCR) in BE(2)-GR + EV and BE(2)-GR + ER $\alpha$  cells treated with **C**) DMSO, ethanol + DMSO, ATRA or E2 + DEX + ATRA, or **D**) DMSO, ethanol + DMSO, ATRA or E2 + DEX + ATRA. **E-F** Increase in metabolic potential compared to baseline (100%, black dotted lines) in control cells exposed to oligomycin (stressed ECAR) or FCCP (stressed OCR) after incubation with **E**) ethanol, E2, DEX, E2 + DEX, or **F**) DMSO, ethanol + DMSO, ATRA, or E2 + DEX + ATRA. **G-H** Increase in metabolic potential compared to baseline (100%, black dotted lines) in BE(2)-GR + ER $\alpha$  cells exposed to oligomycin (stressed ECAR) or FCCP (stressed OCR) after treatment with **G**) DMSO, ethanol + DMSO, ATRA, E2 + DEX + ATRA, or **H**) DMSO, ethanol + DMSO, ATRA, or E2 + DEX + ATRA. **I**) Lipid droplets stained by Nile Red in control or BE(2)-GR + ER $\alpha$  cells treated with E2, DEX, ATRA, the combination of E2 + DEX, or E2 + DEX + ATRA. Representative images from three independent experiments. Scale bars indicate 20  $\mu$ m. All experiments in **A-I** were performed at 72 h with 0.5  $\mu$ M ATRA, 10 nM E2, and 100 nM DEX. Data is presented as mean  $\pm$  SD of three independent experiments; statistical analysis: *t*-test with \*, \*\*, \*\*\*, and \*\*\*\* indicating  $p < 0.05$ ,  $p < 0.01$ ,  $p < 0.001$ , and  $p < 0.0001$

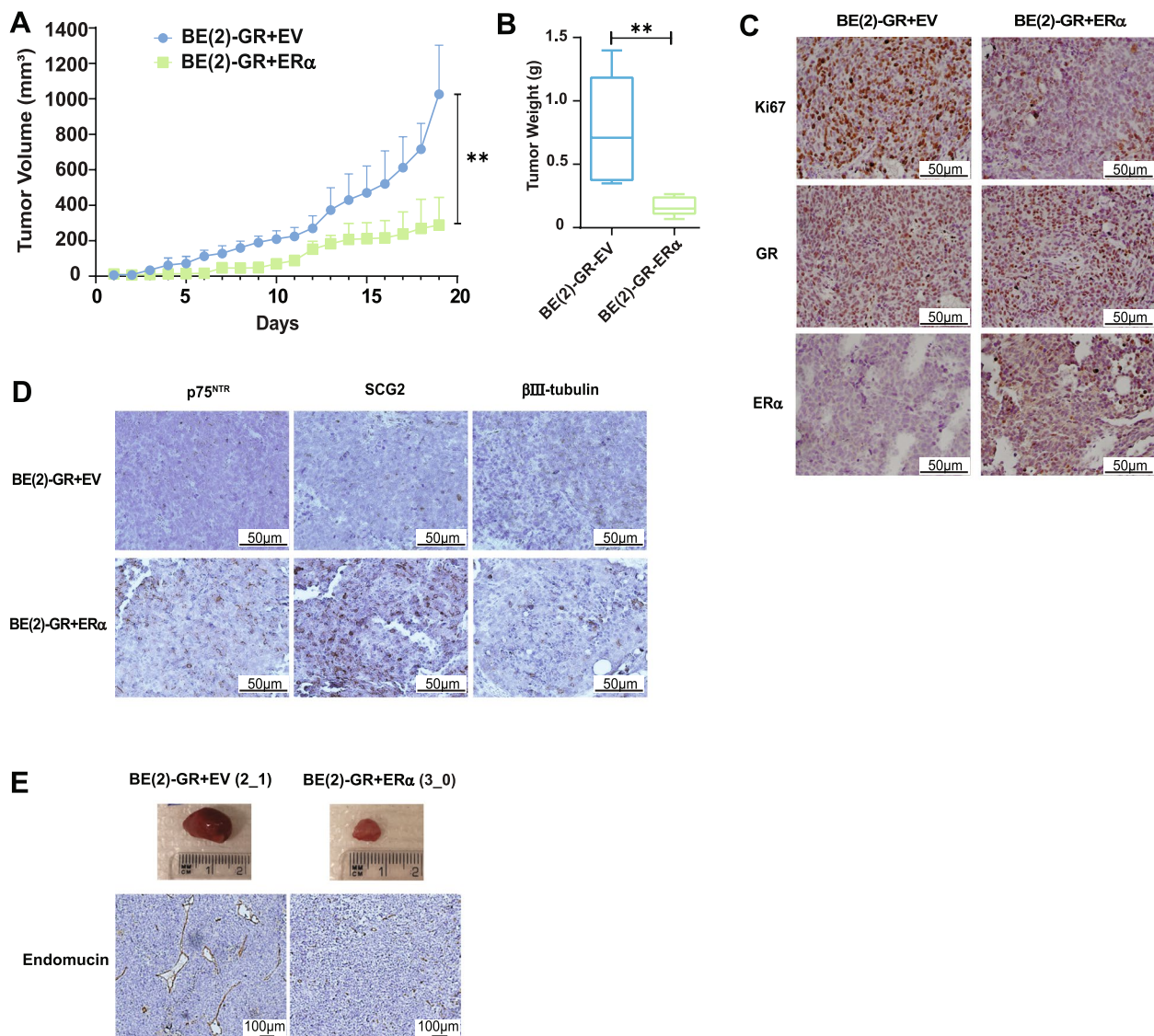


**Fig. 5** (See legend on previous page.)

3). Patients with higher *GR*, *ERα*, or *RARα* mRNA levels had a better event free and overall survival than patients with lower levels in the SEQC cohort (Supplementary Fig. 10A-C). However, only patients with High<sup>GR</sup> mRNA expression correlated with a

better overall survival in the Kocak dataset (Supplementary Fig. 10D-F). We therefore also analyzed the Oberthuer cohort ( $n = 251$ ) [29], where patients with high levels of all the individual receptors presented with better prognosis (Supplementary Fig. 10G-I),





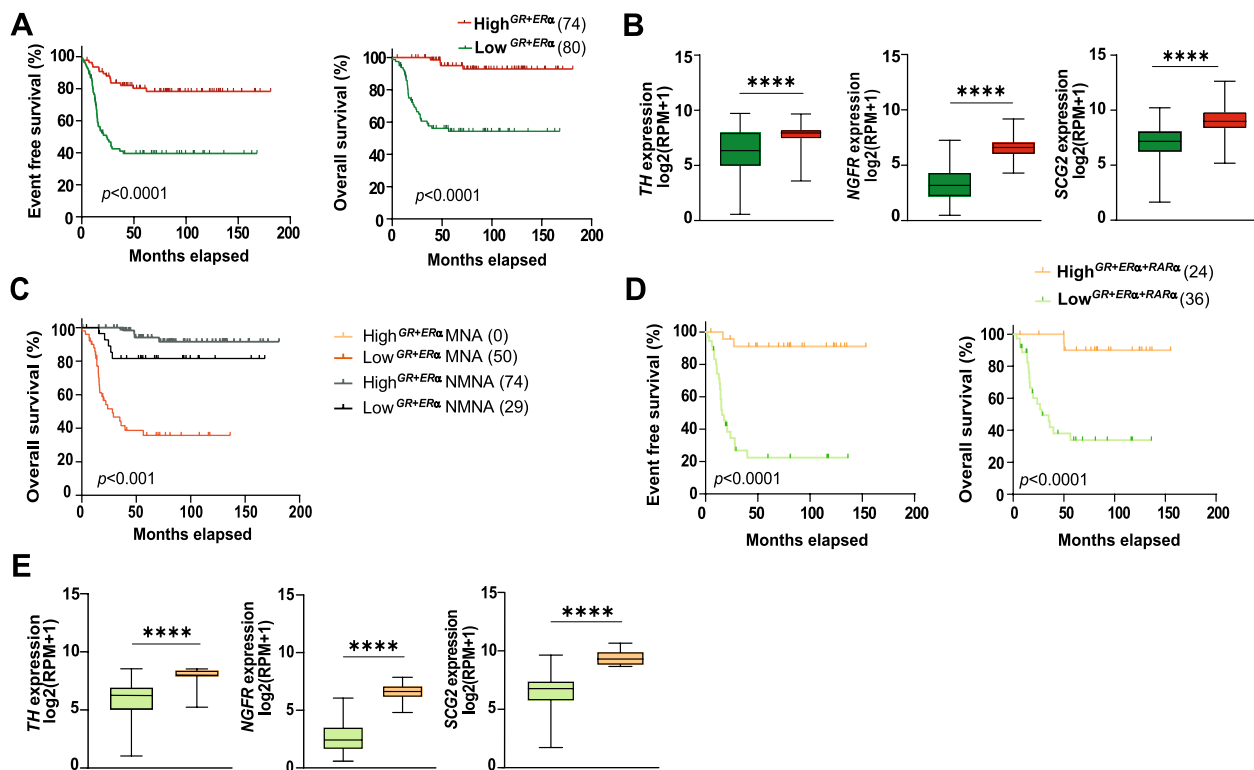
**Fig. 6** Combined GR and ER $\alpha$ -expression resulted in reduced angiogenesis and tumor burden. **A** Tumor volume in mice with tumors derived from BE(2)-GR + EV ( $n = 5$ ) and BE(2)-GR + ER $\alpha$  ( $n = 6$ ) cells. Growth was followed until the control group reached the ethical endpoint volume of 1 cm<sup>3</sup>. Data is presented as mean  $\pm$  SD. Statistical analysis: Mann-Whitney  $t$ -test with \* and \*\* indicating  $p < 0.05$  and  $p < 0.01$ , respectively. **B** Tumor weight at experimental endpoint. Data is presented as mean  $\pm$  SD. Statistical analysis:  $t$ -test with \* and \*\* indicating  $p < 0.05$  and  $p < 0.01$ , respectively. **C** Immunohistochemistry analysis of BE(2)-GR + EV and BE(2)-GR + ER $\alpha$  xenograft tumors stained with anti-Ki67, anti-GR, or anti-ER $\alpha$  antibodies. Scale bars indicate 50  $\mu$ m. **D** Immunohistochemistry analysis of BE(2)-GR + EV and BE(2)-GR + ER $\alpha$  xenograft tumors stained with anti-p75<sup>NTR</sup>, anti-SCG2, or anti- $\beta$ III-tubulin antibodies. Scale bars indicate 50  $\mu$ m. **E** Photos of tumors derived from BE(2)-GR + EV or BE(2)-GR + ER $\alpha$  cells with ruler. Images of immunohistochemistry analysis of the respective xenograft tumors stained with anti-endomucin for visualization of blood vessels. Scale bars indicate 100  $\mu$ m. Representative images from at least five independent stainings per condition (**C-E**)

in agreement with our previous data [16–18]. Additionally, since we already had demonstrated a negative correlation between MYCN and the three NHRs, we further studied the levels of GR, ER $\alpha$ , and RAR $\alpha$  in the SEQC dataset separating the patients according to their MYCN status, either MYCN-amplified (MNA) or non-MYCN-amplified (NMNA). As expected, patients with MYCN-amplification showed

lower levels of all three receptors than those lacking amplification (Supplementary Fig. 10J).

Given these results, we investigated the clinical relevance of concurrent overexpression of GR and ER $\alpha$ . The SEQC and Kocak datasets were divided into patients with High<sup>GR+ER $\alpha$</sup>  and Low<sup>GR+ER $\alpha$</sup>  mRNA levels. As expected, the high co-expression patient group was related to favorable prognosis with better event





**Fig. 7** High *GR*, *ERα*, and *RARα* levels correlated with favorable prognosis and neuronal differentiation status in NB patients. **A** Kaplan-Meier overall and event free survival curves for patients divided into High<sup>GR+ERα</sup> (74 patients) versus Low<sup>GR+ERα</sup> (80 patients) mRNA expression levels. **B** mRNA expression of the neuronal differentiation markers *TH*, *NGFR*, and *SCG2* in the High<sup>GR+ERα</sup> versus Low<sup>GR+ERα</sup> patient groups. **C** Kaplan-Meier overall survival curves for patients divided into four patient groups according to *MYCN* status. MNA High<sup>GR+ERα</sup> (0 patients) versus Low<sup>GR+ERα+RARα</sup> (50 patients) and NMNA with High<sup>GR+ERα</sup> (74 patients) versus Low<sup>GR+ERα+RARα</sup> (29 patients) mRNA expression levels. **D** Kaplan-Meier overall and event free survival curves for patients divided into two groups according to High<sup>GR+ERα+RARα</sup> (24 patients) versus Low<sup>GR+ERα+RARα</sup> (36 patients) mRNA expression levels. **E** mRNA expression of the neuronal differentiation markers *TH*, *NGFR*, and *SCG2* between the High<sup>GR+ERα+RARα</sup> versus Low<sup>GR+ERα+RARα</sup> patient groups. Statistical analysis: *t*-test with \*, \*\*\*, and \*\*\*\* indicating  $p < 0.05$ ,  $p < 0.001$ , and  $p < 0.0001$ . Log-rank test was used for analysis of all Kaplan-Meier curves. *p*-values are shown in each plot. All data are from the SEQC cohort

free and overall survival compared to the low expression group in both cohorts (Fig. 7A and Supplementary Fig. 11A).

As our *in vitro* and *in vivo* experiments showed strong induction of neuronal differentiation by *GR* and *ERα* co-expression, we compared levels of differentiation markers between the High<sup>GR+ERα</sup> versus Low<sup>GR+ERα</sup> patient groups. Notably, expression of *NGFR* (*p75<sup>NTR</sup>*), *TH*, and *SCG2*, were significantly higher in High<sup>GR+ERα</sup> patients in contrast to those with lower *GR* and *ERα* levels (Fig. 7B and Supplementary Fig. 11B). We next divided patients with High<sup>GR+ERα</sup> and Low<sup>GR+ERα</sup> levels according to *MYCN* status using the SEQC dataset. Strikingly, no single patient with *MYCN*-amplification and High<sup>GR+ERα</sup> was identified, further validating the role of *MYCN* in regulating NHRs expression. As expected, High<sup>GR+ERα</sup> NMNA patients had a better survival than the Low<sup>GR+ERα</sup> NMNA patients (Fig. 7C).

Using Gene Set Enrichment Analysis (GSEA), we identified processes with significant differences between the High<sup>GR+ERα</sup> versus Low<sup>GR+ERα</sup> patient groups (see Additional Files 1 and 2 containing the gene sets used for the analysis), including neuronal crest differentiation, regulation of actin cytoskeleton, early differentiation genes, and axon guidance. Moreover, we also found metabolism-related processes including fatty acid biosynthesis, and fatty acid  $\beta$ -oxidation although they did not reach the significant threshold (Supplementary Fig. 11C).

We anticipated that patients with high expression of the three receptors were associated with elevated levels of differentiation markers and a better prognosis than patients with high levels of two NHRs. Despite the relatively low number of patients in the High<sup>GR+ERα+RARα</sup> ( $n = 24$  in SEQC and  $n = nine$  in Kocak) versus Low<sup>GR+ERα+RARα</sup> ( $n = 36$  in SEQC and  $n = eight$  in Kocak) mRNA expression groups, we observed very large

differences in survival between these quartiles in both cohorts (Fig. 7D and Supplementary Fig. 11D), although for Kocak patients, differences were not statistically significant. Accordingly, neuronal differentiation markers showed higher expression in High<sup>GR+ERα+RARα</sup> patients versus the Low<sup>GR+ERα+RARα</sup> patient group in both datasets (Fig. 7E and Supplementary Fig. 11E).

Collectively, in silico analyses demonstrated that combined high levels of *GR*, *ERα*, and *RARα* correlated with increased expression of neuronal markers and a more favorable outcome linked to a more differentiated state in tumors of NB patients.

#### Single-nuclei transcriptome analysis suggested subsequent *GR*, *ERα*, and *RARα* expression for signaling a transition from undifferentiated to adrenergic cells

To explore the physiological significance of *GR*, *ERα*, and *RARα* during development of the human sympathetic nervous system, we studied their expression in four embryonic and seven adult adrenal glands, using the Suntsova dataset [30]. Expression of some of the genes of interest were available, namely the genes encoding *GR* (*NR3C1*), p75<sup>NTR</sup> (*NGFR*), βIII-tubulin (*TUBB3*), and the Erb-B2 Receptor Tyrosine Kinase 3 (*ERBB3*). Of these, only *GR* showed differences, with higher expression in embryonic adrenal glands compared to adult (Supplementary Fig. 12A).

As a proxy to study neural differentiation in vitro and to overcome its limitations, we interrogated the role of *GR*, *ERα*, and *RARα* during chromaffin cell differentiation in single-cell-nuclei of embryonic and post-natal human adrenal glands [28, 29]. Expression was compared with reference genes including *ERBB3* for progenitor cells, *Dopamine Beta-Hydroxylase* (*DBH*) as well as *TH* for nor-adrenergic population, and phenylethanolamine N-methyltransferase (*PNMT*) for adrenergic cells. We identified a significant expression of *ERα* (*ESR1*) in the progenitor population of chromaffin cells in post-natal adrenal gland (hC1, FDR=0.008, one-tailed Welch's *t*-test) (Fig. 8A). We found that *GR* (*NR3C1*) was significantly upregulated in chromaffin cells (hC4, FDR=5.18 × 10<sup>-4</sup>, one-tailed Welch's *t*-test) and their progenitor cluster (hC1, FDR=2.82 × 10<sup>-3</sup>, one-tailed Welch's *t*-test) in post-natal adrenal gland in accordance with the Suntsova dataset analysis (Supplementary Fig. 12A). In contrast, *RARα* was not significantly expressed in any post-natal human adrenal gland cell cluster (FDR>0.01 for all clusters, one-tailed Welch's *t*-test) (Fig. 8A).

We then examined the expression of *GR*, *ERα*, and *RARα* in the developing human adrenal gland using previously published data [32]. Following the corrected annotation [31, 51], a significant up-regulation of *GR* in

chromaffin cells and of *RARα* in non-cycling chromaffin cells was reported (Fig. 8B).

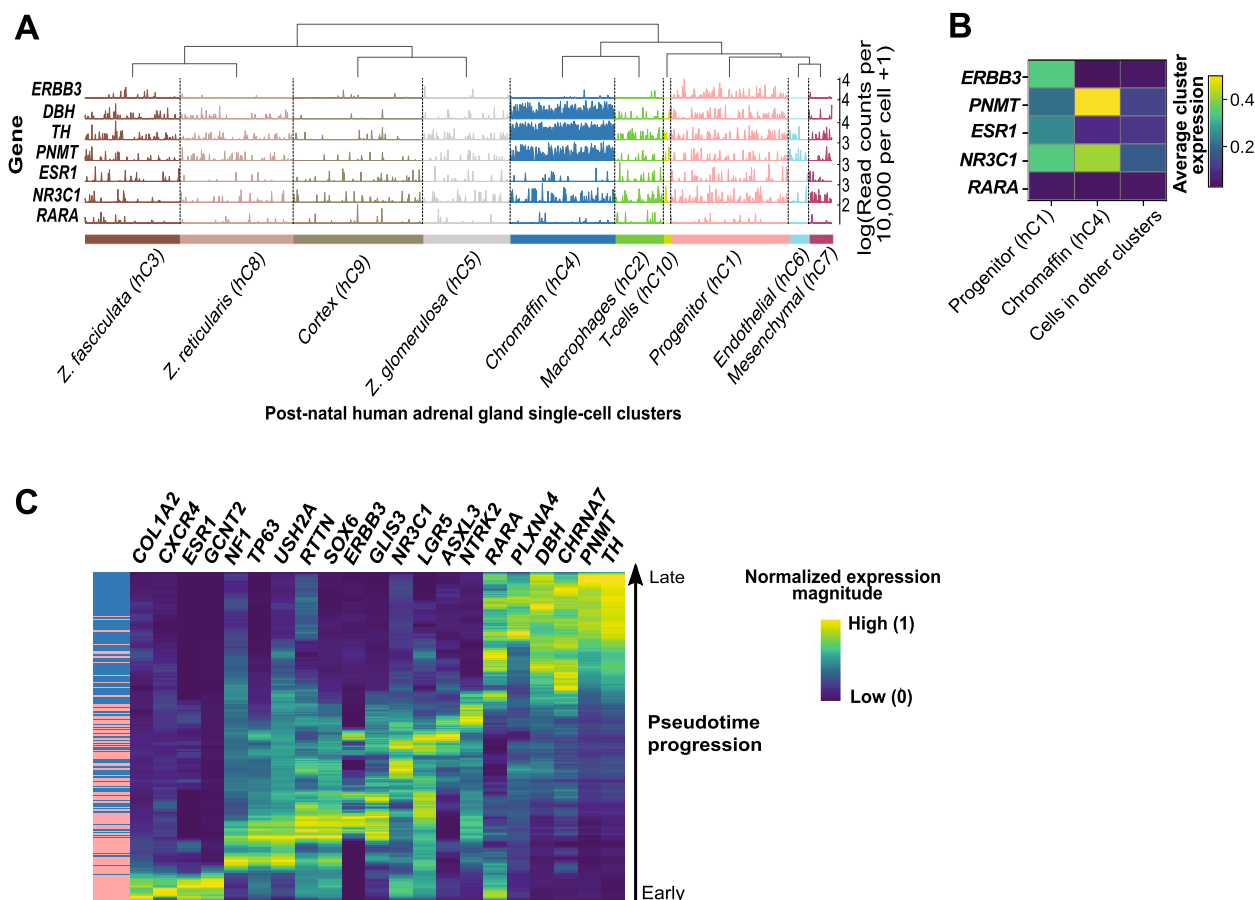
Next, we generated a pseudotime reconstruction of differentiating chromaffin cells in post-natal human adrenal glands to identify the order of expression of the three *NHR* genes during neuronal development. Progenitor cells were separated from early to late cells, the former with expression of progenitor markers and a high differentiation potential, and the latter sourcing from chromaffin cells, characterized by nor- and adrenergic markers and a lower differentiation capacity. This trajectory showed that *ESR1*, *NR3C1*, and *RARA* were sequentially expressed during chromaffin development (Fig. 8C).

In conclusion, our data suggest that the three *NHR* genes, *GR*, *ERα*, and *RARα*, are sequentially expressed from progenitor to chromaffin cells during human adrenal gland differentiation, indicating important roles during maturation of the sympathetic nervous system.

#### Discussion

The current standard treatment for high-risk NB includes surgery, chemotherapy, myeloablative therapy followed by autologous hematopoietic stem cell transplantation. In addition, maintenance therapy with 13-*cis*-RA (isotretinoin) with or without anti-disialoganglioside 2 (GD2)-antibodies is used in some European countries and in the United States [15, 36]. Retinoids are important factors for cellular homeostasis of many normal adult and embryonic tissues, with potent antiproliferative activity against several tumors [52]. Combination therapies may enhance the anticancer efficacy of retinoids [53]. For instance, a cocktail of retinoids and histone deacetylase inhibitors showed a synergistic effect in NB [54] and treatment with ceramide modulators increased the anti-tumor potential of RA in NB models [6]. Isotretinoin has undergone several clinical trials for NB treatment, both alone or in combination with chemotherapy, transplantation, or immunotherapy. Whereas RA alone did not improve event-free survival, it provided a benefit when used in combination with other approaches [55, 56]. It is important to highlight that none of the studies with RA used patients stratified according to *RARα* levels. Despite advancements, half of all patients treated with 13-*cis*-RA still relapse, showing the need for a potent combination therapy approach for high-risk NB.

In this study, our aim was to analyze the combined activation of *GR*, *ERα*, and *RARα*, with dexamethasone (DEX), 17-β estradiol (E2), and all-*trans* retinoic acid (ATRA), on the differentiation phenotype of NB cells. Importantly, the concentration of all ligands used was much lower than their respective IC<sub>50</sub>. Using in vitro, in vivo, and in silico approaches we concluded that the robust effects achieved upon triple treatment support the



**Fig. 8** The three NHRs *Era*, *Gr*, and *RARα* were sequentially expressed during human adrenal gland development. **A** Tracksplot illustrating expression of the genes encoding ERα (*ESR1*), GR (*NR3C1*), and RARα (*RARA*) in ten different cell populations from three normal human post-natal adrenal glands (31). These include cortex cells *i.e.*, Zona fasciculata (hC3), Zona reticularis (hC8), Zona glomerulosa (hC5), and cortex (hC9), immune cells [macrophages (hC2), and T-cells (hC10)], endothelial (hC6), mesenchymal (hC7), and progenitor cells (hC1). Reference genes were *ERBB3* for progenitors, *DBH* and *TH* for noradrenergic, and *PNMT* for adrenergic cells. Gene expression was computed as log (read counts per 10,000 per cell + 1). One-tailed Welch’s *t*-test was used with FDR < 0.01. **B** Matrix plot illustrating the average expression of *ESR1*, *NR3C1*, and *RARA*, and reference genes for progenitor (*ERBB3*) and chromaffin (*PNMT*) cells. Significance was tested with one-tailed Welch’s *t*-tests and a FDR threshold of 0.01. Gene expression was computed as log (read counts per 10,000 per cell + 1). The top average expression displayed was limited to 0.45 (for *PNMT* with an average value of 1.34 in chromaffin cells). **C** Pseudotime reconstruction of differentiating chromaffin cells in human adrenal glands. The population of progenitor cells in post-natal adrenal gland (pink) sourcing from chromaffin cells (blue), were separated from early to late (left panel). The reconstruction of this process indicated that gene expression elapses from an undifferentiated stem-like (*i.e.*, *RTTN*+) to an adrenergic signature (*TH*+, *PNMT*+). **B-C** Normalized expression magnitude from Low (0; dark blue) to High (1; yellow) as indicated to the right

potential of translating this strategy into clinical practice. A combination of DEX, E2, and ATRA may provide a benefit for NB patients with high levels of the three receptors.

Dexamethasone (DEX) is commonly used together with chemotherapy against certain types of cancer [57–59] as well as for treating edema in children [60]. Previously, we showed that GR activation by glucocorticoids drives sympathetic neuronal differentiation in mice. Upon *MYCN*-overexpression, neuroblasts/neurons that would otherwise express GR, failed to initiate or maintain their differentiation status and instead developed

proliferative behavior. In support, hyperplastic lesions in ganglia of *TH-MYCN* mice expressing *MYCN* were deficient in GR and had low levels of neuronal differentiation markers [18].

Our previous studies further showed that *MYCN* induced *miR-18a*, one member of the 17~92 miRNA cluster, which in turn downregulated ERα, thereby interfering with E2-stimulated neuronal differentiation. Thus, the consequence of E2 signaling in NB is the opposite to the well-known oncogenic effect in breast cancer [61, 62]. In NB, ERα overexpression is partly sufficient to overcome the malignant phenotype associated

with MYCN overexpression supported by increased levels of differentiation markers [17].

Here, we further explored the differentiation phenotype induced by DEX treatment in BE(2) cells overexpressing GR, as well as validated our findings in two non-MYCN-amplified cell lines overexpressing GR, SK-N-AS and SH-SY5Y. Exposure of SK-N-AS-GR cells with DEX, ATRA and the combination resulted in glial differentiation while as expected SH-SY5Y-GR cells displayed a stronger neural differentiation upon ATRA or DEX + ATRA than to DEX alone.

To investigate whether the observed effects on viability, differentiation, and tumorigenesis could be potentiated by two NHRs, we transduced the BE(2)-GR overexpressing cells with *ERα*, and extended our study to two additional MYCN-amplified NB cell lines, IMR32 and KCN69n. Upon E2 + DEX treatment, the differentiated phenotype was more robust in cells expressing both GR and *ERα* in comparison with cells with single receptors. The triple ligand cocktail further enhanced the levels of neural differentiation markers and generated a more interconnected network of neurites compared to individual or double treatments in the BE(2)-, IMR32-, and KCN-GR + *ERα* cells. As expected, we also observed changes in MYCN levels. Generally, a decrease in MYCN is observed upon differentiation-inducing treatments in the cell lines used in the study. However, we observed a slight increase in MYCN upon treatment in some of replicates of BE(2) cells. This upregulation could be due to the requirement of MYCN expression for the proliferative burst at the onset of the differentiation program [63]. Moreover, we observed an increase in viability upon low concentrations of ATRA treatment in the GR-overexpressing and GR + *ERα*-overexpressing cells. When combining ATRA with E2 and DEX, the viability was significantly decreased, relative to the control levels. Further analysis of these differences in viability are needed in future studies.

Recently, Siaw et al., described *DLG2* as a possible tumor suppressor gene in NB since tumors with 11q deletion present genetic lesions in the *DLG2* gene, and its downregulation is associated with a reduction in the neural differentiation induced by ATRA [44]. Interestingly, we observed enhanced *DLG2* expression levels in all differentiation inducing conditions both in BE(2)-GR + EV and BE(2)-GR + *ERα* cells, indicating that *DLG2* is important also for the neuronal phenotype provoked by the activation of GR and *ERα*.

Importantly, our in vitro data was validated in vivo, showing a robust augmentation in the levels of neural differentiation markers with a decrease in volume and weight, and with a less angiogenic phenotype in tumors simultaneously overexpressing GR and *ERα* compared to

those generated from control cells. This is in line with the report that *ERα* overexpression inhibited angiogenesis in a model of human endometrial cancer [64]. Our data suggest that *ERα* activation is causing reduced tumor vascularization, as we did not see a similar phenotype in tumors from GR-overexpressing cells.

During recent years, it has been shown that many tumors can oxidize glucose via OXPHOS, contributing to cancer progression and aggressiveness [65, 66]. Here, we demonstrate that activation of GR and *ERα* shifted metabolism to glycolysis, which substantially increased upon treatment with ATRA or the triple combination. Although the three ligands induced robust neuronal differentiation, E2 and DEX affected mitochondrial function in an opposite manner compared to ATRA, indicating that a specific shift in OXPHOS is not a general characteristic of neuronal differentiation. Another interpretation yet unexplored, is that activation of *RARα* induces differentiation faster than stimulation of GR and *ERα*, and that OXPHOS might decrease after a longer incubation. We uncovered that BE(2)-GR + EV cells have a more energetic phenotype compared to BE(2)-GR + *ERα* cells after inducing metabolic stress. When activating BE(2)-GR + *ERα* with E2 + DEX, cells shifted towards glycolysis. Most likely, this could be an adaptation to the reduced mitochondrial activity, as ATP production is diminished after coactivation of both NHRs.

Alterations in energy production, as those reflected by the reprogramming observed, could impact the complex regulation of lipid metabolism and the formation of lipid droplets. These are neutral lipid storage organelles that regulate lipid homeostasis in the cells according to their nutrient requirements. They promote cancer survival by controlling the levels of polyunsaturated fatty acids (PUFAs) and lipotoxicity, which otherwise would result in increased oxidative stress and cell death [67, 68], as well as by providing resistance to common chemotherapeutic drugs [69]. We have previously demonstrated that MYCN-amplified NB cells depend on lipid metabolism, since targeting both fatty acid  $\beta$ -oxidation as well as de novo fatty acid synthesis resulted in reduction of tumor burden and the latter also induced neuronal differentiation [70, 71]. Upon ATRA treatment, OXPHOS parameters were slightly elevated, together with a robust increase in the glycolytic function. This indicated a shift towards a glycolytic phenotype with less mitochondrial usage, which could explain the reduction in  $\beta$ -oxidation and in turn, lipid accumulation. This is in line with our previous results showing lipid deposits after MYCN inhibition as a consequence of a diminished fatty acid  $\beta$ -oxidation [72]. In addition, when we treated *ERα*-overexpressing NB cells with E2 and NGF, lipid droplet accumulation occurred due to impairment of fatty acid utilization [17].



Thus, exploring the role of lipid droplets in the metabolic reprogramming taking place during differentiation could provide new insights about their potential as targets in NB.

The GSEA analysis revealed differences in processes related to neural differentiation as well as metabolic processes including fatty acid metabolism in agreement with lipid droplet accumulation. When examining patients in the High<sup>GR+ER $\alpha$ +RAR $\alpha$</sup>  versus Low<sup>GR+ER $\alpha$ +RAR $\alpha$</sup>  mRNA expression groups, a strikingly stronger difference in survival curves and a more robust upregulation of neuronal differentiation markers compared with patients with double receptor expression was observed. Importantly, expression of the *NHR* genes negatively correlated with *MYCN*-amplification, as non-*MYCN*-amplified cell lines showed higher levels of the genes encoding these three receptors compared to *MYCN*-amplified tumors. Remarkably, no patients with *MYCN*-amplification and High<sup>GR+ER $\alpha$</sup>  levels were identified supporting our hypothesis.

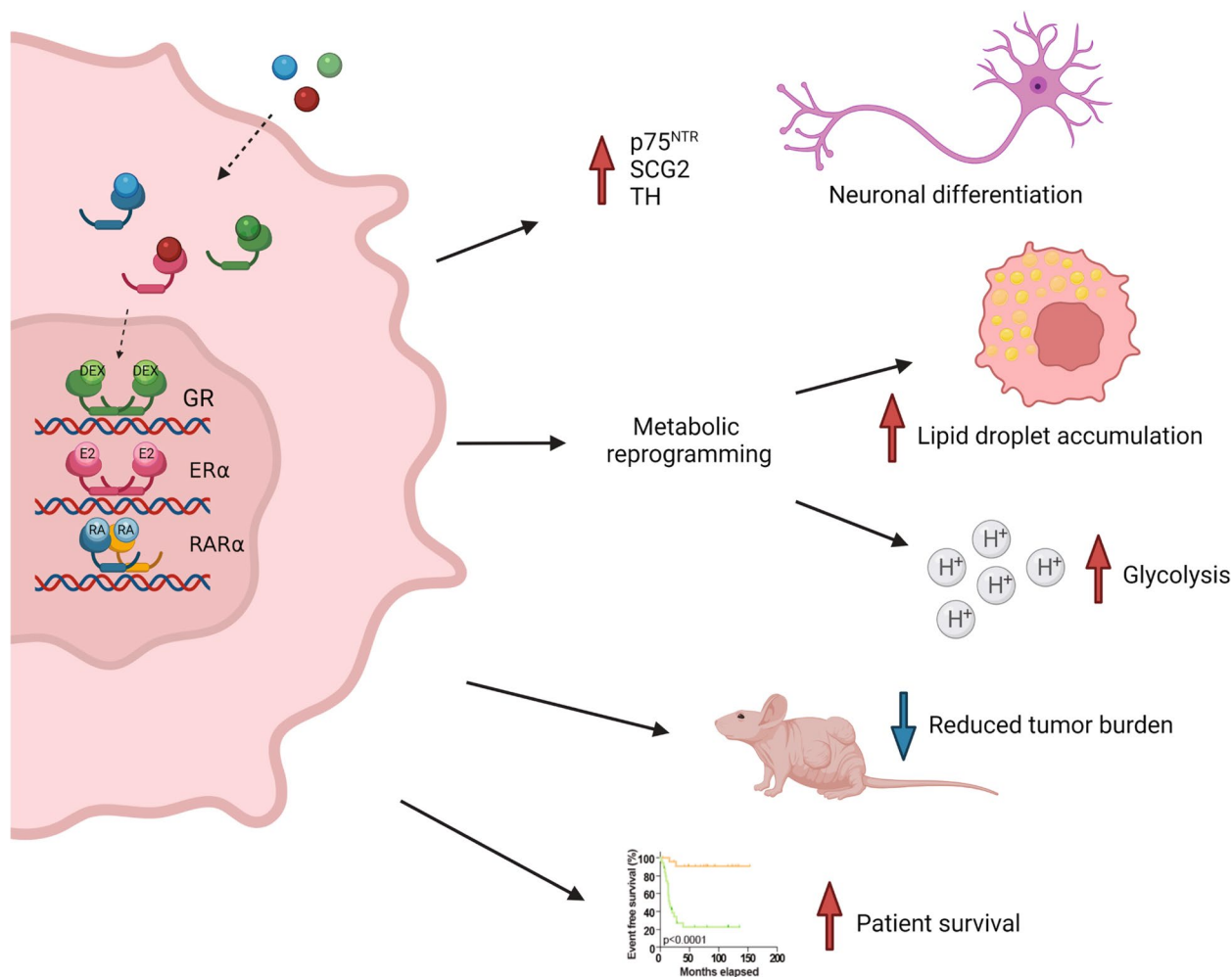
The glucocorticoid receptor (GR) is implicated in cell growth, proliferation, and neuronal plasticity during development of the nervous system [73, 74]. In the sympathetic nervous system, this NHR is mainly elevated in ganglia and specifically in chromaffin cells, inducing differentiation of catecholaminergic cells [75]. We have previously shown that nuclear GR was present in postnatal sympathetic ganglia in wild-type mice while absent in *MYCN*-positive hyperplastic areas or tumors from *TH-MYCN* mice [18]. Our present data showed that *GR* (*NR3C1*) was present both in human progenitor and chromaffin cells and was highly expressed in fetal adrenal glands, in concert with a recent report showing *GR* expression in human chromaffin cells [76]. This indicates that GR is important both at early stages and for terminal differentiation of sympathetic neurons. The mRNA levels of *ER $\alpha$*  (*ESR1*) were significantly elevated in progenitor cells, in agreement with our previous data demonstrating *ER $\alpha$*  expression in human fetal sympathetic ganglia [16]. Another study reported significant *ESR1* expression in human fetal adrenal cortex and in mesenchymal NB cells. These authors also observed significant *NR3C1* and *RAR $\alpha$*  expression in several neural populations and vascular cells of human fetal adrenal gland as well as in mesenchymal cells of NB [51]. Together, these data postulate an essential role of *ER $\alpha$*  during sympathetic nervous system maturation. ATRA together with bone morphogenic proteins (BMPs) was shown to regulate expression of the *trkA* and *trkC* neurotrophin receptor genes in developing sympathetic neurons [77]. Additionally, retinoids coordinated polarity and cell shape in sympathetic ganglia during development [78]. Our analysis of ten different cell populations from postnatal human adrenal glands

demonstrated that although *RAR $\alpha$*  expression was not significantly upregulated in chromaffin cells, levels were high in non-cycling chromaffin cells in a statistically significant manner [32]. One possibility is that *RAR $\alpha$*  is only expressed during development of the nervous system although we cannot exclude that the restricted sample size of postnatal glands ( $n=3$ ), limits the significance of *RAR $\alpha$*  expression.

Notably, *GR* has been characterized as part of the Group 2 neural crest cell (NCC)/core regulatory circuitries (CRCs)/mesenchymal signature in NB cells [79, 80]. One possibility is that *GR*, *ER $\alpha$* , and *RAR $\alpha$*  act in concert to promote differentiation from undifferentiated to noradrenergic cells. Expression of *ER $\alpha$*  in progenitor and undifferentiated cells could initiate differentiation, continued by *GR* expression in transitioning cells, and ending with *RAR $\alpha$*  in more differentiated cells. In agreement with this scenario, a pseudotime reconstruction from progenitor to chromaffin cells in the adrenal gland indeed suggested sequential expression of *ER $\alpha$* , *GR*, and *RAR $\alpha$* , following differentiation of progenitor cells. Particularly, cells initiated expressing some mesenchymal and progenitor genes (*e.g.*, *COL1A2*, *NF1*, *RTTN*, *ERBB3*) to transition into the expression of noradrenergic and adrenergic markers (*e.g.*, *DBH*, *TH*, *PNMT*). The expression of *ESR1* was found within the first, and *RAR $\alpha$*  within the latter groups of genes, while *NR3C1* was placed at the interface. The dynamics of the individual gene expression pattern indicate that in some cases, cells placed at different positions in the pseudotime can express the same gene, possibly as a consequence of stochastic expression or misplacement in the trajectory. This is for instance the case for *RAR $\alpha$* , which is expressed both in early and late stages. Although this can suggest a role of *RAR $\alpha$*  in the early stages of the pseudotime, most of the progenitor cells with *RAR $\alpha$*  expression are located later in proximity of *RAR $\alpha$* -expressing chromaffin cells. Nevertheless, we cannot discard the option that the sequential gene expression could signal a transdifferentiation cue for other types of cells, including neuroblast/sympathoblast cells, especially while they retain plasticity during development [32, 76].

## Conclusions

Collectively, our findings show that concurrent stimulation of GR, *ER $\alpha$* , and *RAR $\alpha$*  strongly potentiates neuronal differentiation, triggers metabolic reprogramming, and reduces tumor burden (Fig. 9). Single-nuclei RNA sequencing analysis revealed that these receptors are sequentially expressed during the differentiation of chromaffin cells in the post-natal human adrenal gland. Importantly, combined high expression of the genes encoding the three receptors correlates with a favorable prognosis.



**Fig. 9** Graphical abstract. Activation of the three NHRs via E2, DEX, and ATRA results in profound changes in NB cells with combined ERα and GR overexpression. Cells respond by morphological changes and neurite outgrowth with upregulation of the p75<sup>NTR</sup>, SCG2, and TH neuronal differentiation markers. The three ligands also induce metabolic reprogramming manifested by increased glycolysis and accumulation of lipid droplets. Mice with xenografts from GR- and ERα-overexpressing neuroblastoma cells, where NHR signaling is activated by endogenous mouse ligands, show reduced tumor growth compared to control. Importantly, neuroblastoma patients with high levels of *Era*, *GR*, and *RARA* show favorable prognosis and survival while patients with low levels of these three receptors show a poor outcome. The figure was created with [Biorender.com](https://biorender.com)

Together, these data set the basis for investigation of the therapeutic potential of NHR activation as a strategy to induce differentiation for high-risk NB therapy.

**Abbreviations**

ATRA	All- <i>Trans</i> -Retinoic Acid
B2M	β-2-Microglobulin
BMP	Bone morphogenetic Protein
CRCs	Core Regulatory Circuits
DBH	Dopamine Beta-Hydroxylase
DEX	Dexamethasone
DLG2	Discs Large MAGUK Scaffold Protein 2
E2	17-β-Estradiol
ECAR	Extracellular Acidification Rate
ERBB3	Erb-B2 Receptor Tyrosine Kinase 3
ERα	Estrogen Receptor α

FCCP	Carbonyl Cyanide 4-(trifluoromethoxy) Phenylhydrazone
GD2	disialoganglioside 2
GFAP	Glial Fibrillary Acidic Protein
GR	Glucocorticoid Receptor
GSEA	Gene Set Enrichment Analysis
INSS	International Neuroblastoma Staging System
NB	Neuroblastoma
NCC	Neural Crest Cells
NEFL	Neurofilament light chain
NGF	Nerve Growth Factor
NGFR	Nerve Growth Factor Receptor
NHR	Nuclear Hormone Receptor
OCR	Oxygen Consumption Rate
OXPPOS	Oxidative Phosphorylation
p75 <sup>NTR</sup>	Neurotrophin Receptor p75
PNMT	Phenylethanolamine N-methyltransferase
PUFA	Polyunsaturated fatty acid
RA	Retinoic Acid

RARs	Retinoic Acid Receptors
RARα	Retinoic Acid Receptor α
SCG2	Secretogranin-2
SOX2	Sex determining Region Y-box 2
TH	Tyrosine Hydroxylase
TRKA/TRKC	Tropomyosin Receptor Kinase A/C
TUBB3	βIII-tubulin
VIM	Vimentin

## Supplementary Information

The online version contains supplementary material available at <https://doi.org/10.1186/s13046-022-02399-x>.

**Additional file 1.**

**Additional file 2.**

**Additional file 3.**

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### Authors' contributions

MAH designed the study. LSA, MM, JLP, ARG, and TL performed cell assays and Western blots. LSA carried out metabolic analysis and lipid staining. LSA, MM, and ARG performed animal studies. YY carried out bioinformatic analyses on the four cohorts, and OBR analyzed single nuclei data. MVRP and SS contributed expertise. LSA, MM, JLP, and MAH analyzed data and wrote the manuscript. All authors commented on the text and approved the final manuscript.

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### Availability of data and materials

All data generated and/or analyzed during the current study are available from the corresponding author on reasonable request. The patient datasets analyzed during the current study (SEQC, GSE62564; Kocak, GSE45547; Suntosva, GSE96631), are available in the GEO repository (<https://www.ncbi.nlm.nih.gov/geo/>), and Oberthuer (E-MTAB-38) dataset in the ArrayExpress platform (<https://www.ebi.ac.uk/arrayexpress/>). The single-cell nuclei transcriptomic dataset was obtained from Supplementary Dataset 2 in Bedoya-Reina et al. 2021 and Dong et al. 2020.

### Declarations

#### Ethics approval and consent to participate

The procedures for all animal experiments were in accordance with the ethical principles and guidelines of Karolinska Institutet and the Swedish law. Ethical permit numbers N71/15 and 10579-2020 approved by the Ethical Committee at the Northern court of Stockholm.

#### Consent for publication

Not applicable.

#### Competing interests

Authors declare no competing interests.

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### References

- Irwin MS, Park JR. Neuroblastoma: paradigm for precision medicine. *Pediatr Clin N Am*. 2015;62(1):225–56.
- Matthay KK, Maris JM, Schleiermacher G, Nakagawara A, Mackall CL, Diller L, et al. Neuroblastoma. *Nat Rev Dis Prim*. 2016;2:16078.
- Nickerson HJ, Matthay KK, Seeger RC, Brodeur GM, Shimada H, Perez C, et al. Favorable biology and outcome of stage IV-S neuroblastoma with supportive care or minimal therapy: a Children's Cancer group study. *J Clin Oncol Off J Am Soc Clin Oncol*. 2000;18(3):477–86.
- Gustafsson G, Kogner P, Heyman M. Childhood Cancer incidence and survival in Sweden 1984-2010. *Child Cancer Incid Surviv Sweden*. 2013;1984-2010:1–91.
- Brodeur GM. Neuroblastoma: biological insights into a clinical enigma. *Nat Rev Cancer*. 2003;33:203–16.
- Reynolds CP, Matthay KK, Villablanca JG, Maurer BJ. Retinoid therapy of high-risk neuroblastoma. *Cancer Lett*. 2003;197(1–2):185–92.
- Petit A, Delaune A, Falluel-Morel A, Goullé J-P, Vannier J-P, Dubus I, et al. Importance of ERK activation in As2O3-induced differentiation and promyelocytic leukemia nuclear bodies formation in neuroblastoma cells. *Pharmacol Res*. 2013;77:11–21.
- Li Z, Takenobu H, Setyawati AN, Akita N, Haruta M, Satoh S, et al. EZH2 regulates neuroblastoma cell differentiation via NTRK1 promoter epigenetic modifications. *Oncogene*. 2018;37(20):2714–27.
- Garattini E, Gianni M, Terao M. Retinoids as differentiating agents in oncology: a network of interactions with intracellular pathways as the basis for rational therapeutic combinations. *Curr Pharm Des*. 2007;13(13):1375–400.
- Cañón E, Cosgaya JM, Scsucova S, Aranda A. Rapid effects of retinoic acid on CREB and ERK phosphorylation in neuronal cells. *Mol Biol Cell*. 2004;15(12):5583–92.
- Westermarck UK, Wilhelm M, Frenzel A, Henriksson MA. The MYCN oncogene and differentiation in neuroblastoma. *Semin Cancer Biol*. 2011;21(4):256–66.
- Wuarin L, Chang B, Wada R, Sidell N. Retinoic acid up-regulates nuclear retinoic acid receptor-α expression in human neuroblastoma cells. *Int J Cancer*. 1994;56(6):840–5.
- Ladenstein R, Pötschger U, Valteau-Couanet D, Luksch R, Castel V, Yaniv I, et al. Interleukin 2 with anti-GD2 antibody ch14.18/CHO (dinutuximab beta) in patients with high-risk neuroblastoma (HR-NBL1/SIOOPEN): a multicentre, randomised, phase 3 trial. *Lancet Oncol*. 2018;19(12):1617–29.
- Øra I, Eggert A. Progress in treatment and risk stratification of neuroblastoma: impact on future clinical and basic research. *Semin Cancer Biol*. 2011;21(4):217–28.
- Simon T, Hero B, Schulte JH, Deubzer H, Hundsdoerfer P, Von Schweinitz D, et al. 2017 GPOH guidelines for diagnosis and treatment of patients with Neuroblastic tumors. *Klin Padiatr*. 2017;229(3):147–67.
- Lovén J, Zinin N, Wahlström T, Müller I, Brodin P, Fredlund E, et al. MYCN-regulated microRNAs repress estrogen receptor-α (ESR1) expression and neuronal differentiation in human neuroblastoma. *Proc Natl Acad Sci U S A*. 2010;107(4):1553–8.
- Dzieran J, Garcia AR, Westermarck UK, Henley AB, Sánchez EE, Träger C, et al. MYCN-amplified neuroblastoma maintains an aggressive and undifferentiated phenotype by deregulation of estrogen and NGF signaling. *Proc Natl Acad Sci U S A*. 2018;115(6):E1229–38.
- Ribeiro D, Klarqvist MDR, Westermarck UK, Oliynyk G, Dzieran J, Kock A, et al. Regulation of nuclear hormone receptors by MYCN-driven miRNAs

- impacts neural differentiation and survival in neuroblastoma patients. *Cell Rep.* 2016;16(4):979–93.
19. Cheng HS, Lee JXT, Wahli W, Tan NS. Exploiting vulnerabilities of cancer by targeting nuclear receptors of stromal cells in tumor microenvironment. *Mol Cancer.* 2019;18(1):51.
  20. Kadmiel M, Cidlowski JA. Glucocorticoid receptor signaling in health and disease. *Trends Pharmacol Sci.* 2013;34(9):518–30.
  21. Folkert EJ, Dowsett M. Influence of sex hormones on cancer progression. *J Clin Oncol Off J Am Soc Clin Oncol.* 2010;28(26):4038–44.
  22. Solum DT, Handa RJ. Localization of estrogen receptor alpha (ER alpha) in pyramidal neurons of the developing rat hippocampus. *Brain Res Dev Brain Res.* 2001;128(2):165–75.
  23. Bondesson M, Hao R, Lin C-Y, Williams C, Gustafsson J-Å. Estrogen receptor signaling during vertebrate development. *Biochim Biophys Acta.* 2015;1849(2):142–51.
  24. Maggi A, Ciana P, Belcredito S, Vegeto E. Estrogens in the nervous system: mechanisms and nonreproductive functions. *Annu Rev Physiol.* 2004;66:291–313.
  25. Schneider CA, Rasband WS, Eliceiri KW. NIH image to ImageJ: 25 years of image analysis. *Nat Methods.* 2012;9(7):671–5.
  26. Harenza JL, Diamond MA, Adams RN, Song MM, Davidson HL, Hart LS, et al. Transcriptomic profiling of 39 commonly-used neuroblastoma cell lines. *Sci data.* 2017;4:170033.
  27. SEQC Consortium. A comprehensive assessment of RNA-seq accuracy, reproducibility and information content by the sequencing quality control consortium. *Nat Biotechnol.* 2014;32(9):903–14.
  28. Kocak H, Ackermann S, Hero B, Kahlert Y, Oberthuer A, Juraeva D, et al. Hox-C9 activates the intrinsic pathway of apoptosis and is associated with spontaneous regression in neuroblastoma. *Cell Death Dis.* 2013;4(4):e586–11.
  29. Oberthuer A, Berthold F, Warnat P, Hero B, Kahlert Y, Spitz R, et al. Customized oligonucleotide microarray gene expression-based classification of neuroblastoma patients outperforms current clinical stratification. *J Clin Oncol Off J Am Soc Clin Oncol.* 2006;24(31):5070–8.
  30. Petrov I, Suntsova M, Ilinskaya E, Roumiantsev S, Sorokin M, Garazha A, et al. Gene expression and molecular pathway activation signatures of MYCN-amplified neuroblastomas. *Oncotarget.* 2017;8(48):83768–80.
  31. Bedoya-Reina OC, Li W, Arceo M, Plescher M, Bullova P, Pui H, et al. Single-nuclei transcriptomes from human adrenal gland reveals distinct cellular identities of low and high-risk neuroblastoma tumors. *Nat Commun.* 2021;2021.03.26.437162.
  32. Dong R, Yang R, Zhan Y, Lai H-D, Ye C-J, Yao X-Y, et al. Single-cell characterization of malignant phenotypes and developmental trajectories of adrenal neuroblastoma. *Cancer Cell.* 2020;38(5):716–733.e6.
  33. Chowdhury PS, Chamoto K, Kumar A, Honjo T. PPAR-induced fatty acid oxidation in T cells increases the number of tumor-reactive CD8(+) T cells and facilitates anti-PD-1 therapy. *Cancer Immunol Res.* 2018;6(11):1375–87.
  34. Bergen V, Lange M, Peidli S, Wolf FA, Theis FJ. Generalizing RNA velocity to transient cell states through dynamical modeling. *Nat Biotechnol.* 2020;38(12):1408–14.
  35. Jögi A, Vaapil M, Johansson M, Pählman S. Cancer cell differentiation heterogeneity and aggressive behavior in solid tumors. *Ups J Med Sci.* 2012;117(2 SE-Review Articles).
  36. Masetti R, Biagi C, Zama D, Vendemini F, Martoni A, Morello W, et al. Retinoids in pediatric onco-hematology: the model of acute promyelocytic leukemia and neuroblastoma. *Adv Ther.* 2012;29(9):747–62.
  37. Kalinyak JE, Dorin RI, Hoffman AR, Perlman AJ. Tissue-specific regulation of glucocorticoid receptor mRNA by dexamethasone. *J Biol Chem.* 1987;262(22):10441–4.
  38. Amatruda TT 3rd, Sidell N, Ranyard J, Koeffler HP. Retinoic acid treatment of human neuroblastoma cells is associated with decreased N-myc expression. *Biochem Biophys Res Commun.* 1985;126(3):1189–95.
  39. Thiele CJ, Reynolds CP, Israel MA. Decreased expression of N-myc precedes retinoic acid-induced morphological differentiation of human neuroblastoma. *Nature.* 1985 Jan;313(6001):404–6.
  40. Bayat Mokhtari R, Homayouni TS, Baluch N, Morgatskaya E, Kumar S, Das B, et al. Combination therapy in combating cancer. *Oncotarget.* 2017;8(23):38022–43.
  41. Ammer H, Schulz R. Retinoic acid-induced differentiation of human neuroblastoma SH-SY5Y cells is associated with changes in the abundance of G proteins. *J Neurochem.* 1994;62(4):1310–8.
  42. Chaudhari N, Talwar P, Lefebvre D'hellencourt C, Ravanan P. CDDO and ATRA instigate differentiation of IMR32 human neuroblastoma cells. *Front Mol Neurosci.* 2017;10:310.
  43. Wilhelm M, Schlegel J, Hahne H, Gholami AM, Lieberenz M, Savitski MM, et al. Mass-spectrometry-based draft of the human proteome. *Nature.* 2014;509(7502):582–7.
  44. Siaw JT, Javanmardi N, Van den Eynden J, Lind DE, Fransson S, Martinez-Monleon A, et al. 11q deletion or ALK activity curbs DLG2 expression to maintain an undifferentiated state in neuroblastoma. *Cell Rep.* 2020;32(12):108171.
  45. Hanahan D, Weinberg RA. Hallmarks of cancer: the next generation. *Cell.* 2011;144(5):646–74.
  46. DeBerardinis RJ, Chandel NS. Fundamentals of cancer metabolism. *Sci Adv.* 2016;2(5):e1600200.
  47. Agilent Technologies. Glycolysis Stress Test Kit - User Guide Kit. 2019. Available from: [https://www.agilent.com/cs/library/usermanuals/public/XF\\_Glycolysis\\_Stress\\_Test\\_Kit\\_User\\_Guide.pdf](https://www.agilent.com/cs/library/usermanuals/public/XF_Glycolysis_Stress_Test_Kit_User_Guide.pdf).
  48. Agilent Technologies. Mito Stress Test Kit User Guide Kit - Agilent Seahorse. 2019. p. 1–20. Available from: [https://www.agilent.com/cs/library/usermanuals/public/XF\\_Cell\\_Mito\\_Stress\\_Test\\_Kit\\_User\\_Guide.pdf](https://www.agilent.com/cs/library/usermanuals/public/XF_Cell_Mito_Stress_Test_Kit_User_Guide.pdf).
  49. Qiu B, Ackerman D, Sanchez DJ, Li B, Ochocki JD, Grazioli A, et al. HIF2 $\alpha$ -dependent lipid storage promotes endoplasmic reticulum homeostasis in clear-cell renal cell carcinoma. *Cancer Discov.* 2015 Jun;5(6):652–67.
  50. Yue S, Li J, Lee S-Y, Lee HJ, Shao T, Song B, et al. Cholesteryl ester accumulation induced by PTEN loss and PI3K/AKT activation underlies human prostate cancer aggressiveness. *Cell Metab.* 2014;19(3):393–406.
  51. Kildisiute G, Kholosy WM, Young MD, Roberts K, Elmentaite R, van Hooff SR, et al. Tumor to normal single-cell mRNA comparisons reveal a pan-neuroblastoma cancer cell. *Sci Adv.* 2021;7(6):1–14.
  52. Smith MA, Adamson PC, Balis FM, Feusner J, Aronson L, Murphy RF, et al. Phase I and pharmacokinetic evaluation of all-trans-retinoic acid in pediatric patients with cancer. *J Clin Oncol Off J Am Soc Clin Oncol.* 1992;10(11):1666–73.
  53. Cheung BB. Combination therapies improve the anticancer activities of retinoids in neuroblastoma. *World J Clin Oncol.* 2015;6(6):212–5.
  54. Raif A, Marshall GM, Bell JL, Koach J, Tan O, D'andreti C, et al. The estrogen-responsive B box protein (EBBP) restores retinoid sensitivity in retinoid-resistant cancer cells via effects on histone acetylation. *Cancer Lett.* 2009;277(1):82–90.
  55. Finklestein JZ, Krailo MD, Lenarsky C, Ladisch S, Blair GK, Reynolds CP, et al. 13-cis-retinoic acid (NSC 122758) in the treatment of children with metastatic neuroblastoma unresponsive to conventional chemotherapy: report from the childrens cancer study group. *Med Pediatr Oncol.* 1992;20(4):307–11.
  56. Matthay KK, Villablanca JG, Seeger RC, Stram DO, Harris RE, Ramsay NK, et al. Treatment of high-risk neuroblastoma with intensive chemotherapy, radiotherapy, autologous bone marrow transplantation, and 13-cis-retinoic acid. *N Engl J Med.* 1999;341(16):1165–73.
  57. Komakech A, Im J-H, Gwak H-S, Lee K-Y, Kim JH, Yoo BC, et al. Dexamethasone interferes with autophagy and affects cell survival in irradiated malignant glioma cells. *J Korean Neurosurg Soc.* 2020;63(5):566–78.
  58. Inaba H, Pui C-H. Glucocorticoid use in acute lymphoblastic leukaemia. *Lancet Oncol.* 2010;11:1096–106.
  59. Gebru MT, Atkinson JM, Young MM, Zhang L, Tang Z, Liu Z, et al. Glucocorticoids enhance the antileukemic activity of FLT3 inhibitors in FLT3-mutant acute myeloid leukemia. *Blood.* 2020;136(9):1067–79.
  60. Sørensen S, Helweg-Larsen S, Mouridsen H, Hansen HH. Effect of high-dose dexamethasone in carcinomatous metastatic spinal cord compression treated with radiotherapy: a randomised trial. *Eur J Cancer.* 1994;30A(1):22–7.
  61. Jones LP, Tilli MT, Assefnia S, Torre K, Halama ED, Parrish A, et al. Activation of estrogen signaling pathways collaborates with loss of Brca1 to promote development of ERalpha-negative and ERalpha-positive mammary preneoplasia and cancer. *Oncogene.* 2008;27(6):794–802.
  62. Jia M, Andreassen T, Jensen L, Bathen TF, Sinha I, Gao H, et al. Estrogen receptor  $\alpha$  promotes breast cancer by reprogramming choline metabolism. *Cancer Res.* 2016;76(19):5634–46.



63. Guglielmi L, Cinnella C, Nardella M, Maresca G, Valentini A, Mercanti D, et al. MYCN gene expression is required for the onset of the differentiation programme in neuroblastoma cells. *Cell Death Dis.* 2014;5(2):e1081.
64. Ali SH, O'Donnell AL, Balu D, Pohl MB, Seyler MJ, Mohamed S, et al. Estrogen receptor-alpha in the inhibition of cancer growth and angiogenesis. *Cancer Res.* 2000;60(24):7094–8.
65. Sica V, Bravo-San Pedro JM, Stoll G, Kroemer G. Oxidative phosphorylation as a potential therapeutic target for cancer therapy. *Int J Cancer.* 2020;146(1):10–7.
66. Israelsen WJ, Dayton TL, Davidson SM, Fiske BP, Hosios AM, Bellinger G, et al. PKM2 isoform-specific deletion reveals a differential requirement for pyruvate kinase in tumor cells. *Cell.* 2013;155(2):397–409.
67. LL L, Xianlin H, LS E, Sylvaine C, FR V, OD S, et al. Triglyceride accumulation protects against fatty acid-induced lipotoxicity. *Proc Natl Acad Sci.* 2003;100(6):3077–82.
68. Jarc E, Kump A, Malavašič P, Eichmann TO, Zimmermann R, Petan T. Lipid droplets induced by secreted phospholipase A2 and unsaturated fatty acids protect breast cancer cells from nutrient and lipotoxic stress. *Biochim Biophys Acta Mol Cell Biol Lipids.* 2018;1863(3):247–65.
69. Cotte AK, Aires V, Fredon M, Limagne E, Derangère V, Thibaudin M, et al. Lysophosphatidylcholine acyltransferase 2-mediated lipid droplet production supports colorectal cancer chemoresistance. *Nat Commun.* 2018;9(1):322.
70. Oliynyk G, Ruiz-Pérez MV, Sainero-Alcolado L, Dzieran J, Zirath H, Gallart-Ayala H, et al. MYCN-enhanced oxidative and glycolytic metabolism reveals vulnerabilities for targeting neuroblastoma. *iScience.* 2019;21:188–204.
71. Ruiz-Pérez MV, Sainero-Alcolado L, Oliynyk G, Matuschek I, Balboni N, Ubhayasekera SJKA, et al. Inhibition of fatty acid synthesis induces differentiation and reduces tumor burden in childhood neuroblastoma. *iScience.* 2021;24(2).
72. Zirath H, Frenzel A, Oliynyk G, Segerström L, Westermark UK, Larsson K, et al. MYC inhibition induces metabolic changes leading to accumulation of lipid droplets in tumor cells. *Proc Natl Acad Sci U S A.* 2013;110(25):10258–63.
73. Meyer JS. Early adrenalectomy stimulates subsequent growth and development of the rat brain. *Exp Neurol.* 1983;82(2):432–46.
74. Meyer JS. Biochemical effects of corticosteroids on neural tissues. *Physiol Rev.* 1985;65(4):946–1020.
75. Bohn MC, McEwen B, Luine VN, Black IB. Development and characterization of glucocorticoid receptors in rat superior cervical ganglion. *Brain Res.* 1984;316(2):211–8.
76. Jansky S, Sharma AK, Körber V, Quintero A, Toprak UH, Wecht EM, et al. Single-cell transcriptomic analyses provide insights into the developmental origins of neuroblastoma. *Nat Genet.* 2021;53(5):683–93.
77. Kobayashi M, Fujii M, Kurihara K, Matsuoka I. Bone morphogenetic protein-2 and retinoic acid induce neurotrophin-3 responsiveness in developing rat sympathetic neurons. *Brain Res Mol Brain Res.* 1998;53(1–2):206–17.
78. Chandrasekaran V, Zhai Y, Wagner M, Kaplan PL, Napoli JL, Higgins D. Retinoic acid regulates the morphological development of sympathetic neurons. *J Neurobiol.* 2000;42(4):383–93.
79. Boeva V, Louis-Brennetot C, Peltier A, Durand S, Pierre-Eugène C, Raynal V, et al. Heterogeneity of neuroblastoma cell identity defined by transcriptional circuitries. *Nat Genet.* 2017;49(9):1408–13.
80. Van Groningen T, Koster J, Valentijn LJ, Zwijnenburg DA, Akogul N, Hasselt NE, et al. Neuroblastoma is composed of two super-enhancer-associated differentiation states. *Nat Genet.* 2017;49(8):1261–6.

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