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# **Research Article**

# Concordance and Deviations of the PDX Tumors from the Primary Tumors of NSCLC Patients: Effects of Murine Fibroblasts on Low Engraftment Rates

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# Abstract

Patient-Derived Xenograft (PDX) models of primary lung cancer have been reported. However, varying engraftment rates and their underlying mechanisms for specific subtypes of lung cancer (adenocarcinoma, squamous cell carcinoma, and large cell neuroendocrine carcinoma) have not been studied. The authors prepared subcutaneous tumors grown in NOD Scid Gamma Mouse (NSG<sup>TM</sup>) mice with primary tumors of lung cancer patients to develop lung cancer PDX models. Pathological features of the subcutaneous tumors were compared with those of the patients. One hundred 7teen lung cancer PDX models retaining the original pathologic features were obtained from 642 primary lung cancer patients. Nineteen PDX tumors and the corresponding patient tumors, representing three subtypes of lung cancer, were selected and analyzed with in-depth genomic and transcriptomic profiling. Results showed the PDX tumors retained most of the somatic and

oncogenic mutations with limited levels of additional xenograftspecific mutations. Significant downregulation of the genes involved in hypoxia-associated angiogenesis was found compared with the corresponding human tumors. This downregulation was associated with murine fibroblasts in the PDX tumor microenvironment, which might be an important factor in low engraftment rates in primary lung cancer PDX models.

### Keywords

Hypoxia; Angiogenesis; Murine fibroblast; Tumor microenvironment; Cell types; Primary lung cancer

#### Abbreviations

ANT: Adjacent Normal Tissue; CAF: Cancer-Associated Fibroblast; DEG: Differentially Expressed Gene; EBV: Epstein-Barr virus; EMT: Epithelial-Mesenchymal Transition; H&E: Hematoxylin and Eosin; IHC: Immuno Histo Chemistry; IRB: Institutional Review Board; LCNEC: Large Cell Neuroendocrine Carcinoma; LUAD: Lung Adenocarcinoma; LUSC: Lung Squamous Cell Carcinoma; NSCLC: Non-Small Cell Lung Cancer; PDX: Patient-Derived Xenograft; SCLC: Small Cell Lung Cancer; TME: Tumor Micro Environment; WES: Whole Exome Sequencing; WTS: Whole Transcriptome Sequencing; XALD: Xenograft-Associated Lymphoproliferative Disease.

# Introduction

Lung cancer is the leading cause of cancer-related mortality worldwide [1,2]. It is classified into two main histological categories: Non-Small Cell Lung Cancer (NSCLC) (85%) and Small Cell Lung Cancer (SCLC; 15%). NSCLCs are generally subcategorized into Lung Adenocarcinomas (LUADs), Squamous Cell Carcinomas (LUSCs), and Large Cell Neuroendocrine Carcinomas (LCNECs) [3,4]. With the aid of next generation sequencing technology, up to 60% of LUADs were shown to have a known oncogenic driver mutation as well as fusion or amplification in signaling pathways, which allowed the development of therapeutic agents that target specific molecular pathways. Despite this improvement in targeted therapy, secondary alterations in the downstream and or alternative pathways lead to acquired resistance and disease progression. On the contrary, therapeutic targets have not been clearly identified in LUSC and in LCNEC due to the rarity of these cancers [5,6].

Patient-Derived Xenograft (PDX) models have been developed using NSG<sup>TM</sup> mice as a means to preserve the histological structures in human tumors, even for limited passages [7]. These features allow the model to be used as a preclinical model for the development of target drugs against *de novo* resistance and as co-clinical models for the selection or combination of treatment regimens before clinical applications [8-13]. Cancer immunotherapy is one of the most promising approaches to refractory cancers and PDX tumors can be invaluable resources for preparing humanized PDX models for cancer immunotherapy using NSG mice infused with CD34 human hematopoietic stem cells [14]. These merits make the three major pathological subtypes of NSCLCs eligible for preparation of PDX models that can be used to find target drugs or immune therapeutics to control lung cancer.



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In this study, the authors established 117 PDX models from 642 primary lung cancers. Representative models of LUAD, LUSC, and LCNEC subtypes were selected and the pathological, genomic, and transcriptomic patterns of PDX tumors were compared with those of corresponding patient tumors based on our previous studies using LUSC PDX models [15]. The factors responsible for the low success rate of the PDX models, particularly in the case of adenocarcinomas, were considered when attempting to improve the efficiency of generating PDX models, which could increase the application opportunities.

# **Materials and Methods**

## Tumor samples from patients with primary NSCLCs

Tumor samples were obtained from 642 primary NSCLC patients between September 2015 and December 2019. All patients provided signed informed consent. This study was approved by the IRB of Samsung Medical Center (2014-10-069, 2015-04-018, 2018-03-110). Table 1 shows the clinical characteristics of the NSCLC patients. Clinical features such as age, gender, preoperative chemotherapy treatments, smoking status, stage, tumor size, differentiation, recurrence, vascular invasion, perineural invasion, lymphatic invasion, visceral pleural invasion, and survival were obtained from medical records (Table 1).

# Establishment of primary lung cancer PDX models

To establish primary lung cancer PDX models, tumor samples from patients with primary lung cancer were subcutaneously implanted into the flanks of NSG mice (Jackson Laboratory, Sacramento, CA, USA). The size of a mouse subcutaneous tumor was measured with a caliper twice a week until it reached 60 mm3 in volume. Tumor volumes were calculated as 0.5 x length x width2. The mice were sacrificed when the tumor size reached 600-800 mm3. Then, the subcutaneous tumors were surgically harvested for subsequent procedures. Expansion of the tumor tissues was carried out with three passages. Formalin-fixed paraffin-embedded samples were prepared for pathologic examination. Short tandem repeat analysis was carried out for direct identification of mouse subcutaneous tumors, and next generation sequencing analysis was subsequently performed. All animals were cared for and treated following an animal protocol that had been approved by the CHA Advanced Research Institute and Biomedical Research Institute at Seoul National University Hospital.

## Whole Exome Sequencing (WES)

Three micrograms of genomic DNA were used to establish DNA libraries. Using an Agilent SureSelect Human All Exon V3 kit (Agilent Technologies, Santa Clara, CA, USA), target enrichment was performed, following the manufacturer's instructions, to generate exome sequencing libraries. Exon capturing was then followed using an Agilent SureSelect 50Mb system. Paired-end DNA sequences were obtained with the Illumina sequencing system HiSeq 2000 (Illumina Inc., San Diego, CA, USA). The sequenced reads were aligned to the human genome information from the University of California Santa Cruz hg19. MuTect, VarScan 2, and the GATK Somatic Indel Detector were used to identify somatic mutations, and these mutations were later verified through Sanger sequencing. Significantly mutated genes were identified with MutSigCV, and functional enrichment of the somatic mutations was assessed with Metacore (GeneGo Inc., St. Joseph, MI, USA). The GRCh37 reference was used for sequencing data analysis.

# Whole transcriptome sequencing (WTS)

mRNA libraries (insert size of ~300 bp) were prepared with a

TruSeq RNA Library Preparation Kit v2 (Illumina Inc., San Diego, CA, USA). A total of 1  $\mu$ g of RNA from each case sample was used to create the library. The samples were subjected to 101-bp paired-end sequencing using the Illumina sequencing system HiSeq 2000. Library preparation and sequencing were performed at DNA Link, Inc.

#### **Differentially Expressed Gene (DEG) analysis**

Genes with at least one sample indicating a sequencing read count of at least two for each were initially screened. Differential expression of each gene was analyzed by calculating the  $\log_2$  (fold change) value for the gene expression of PDX tumors relative to that of patient tumors, or the Adjacent Normal Tissue (ANT), depending on the purpose of the analysis. The genes with a false discovery rate <0.05 and a  $|\log_2$  (fold change)|>2 were selected as upregulated or downregulated genes, respectively.

# **Pathological analysis**

Formalin-fixed paraffin-embedded tumor tissues from primary lung cancer patients and corresponding subcutaneous tumors were freshly cut into slices of 4 µm. Following the manufacturer's instructions, Hematoxylin and Eosin (H&E) staining was performed using Symphony (Ventana Medical Systems, Inc., Roche, Basel, Switzerland). Immuno Histochemical (IHC) staining for CK5, p63, Thyroid Transcription Factor (TTF-1), pan-cytokeratin, or CD56 was performed on a single representative block with the following procedures. Deparaffinized slides were treated with citrate buffer (pH 6.0) for antigen retrieval. Next, the primary antibody was incubated with the Dako Antibody Diluent (S3022, Dako, Agilent Technologies, Inc., Santa Clara, CA, USA) and then with Dako REAL EnVision Detection System (K5007, Dako, Agilent Technologies, Inc., Santa Clara, CA, USA). The images obtained from H&E and IHC staining were analyzed with a Scan Scope® XT scanner (Aperio, Leica Biosystems, Newcastle, UK). Antibody sources and dilution factors are shown in Table S1. LUAD was determined by TTF-1<sup>+</sup> CK5<sup>-</sup> CD56<sup>-</sup> p63<sup>+/-</sup>, LUSC by TTF-1<sup>-</sup> CK5<sup>+</sup> CD56<sup>-</sup> p63<sup>+</sup>, and LCNEC by TTF-1<sup>+/-</sup> CK5<sup>-</sup> CD56<sup>+</sup> p63<sup>-</sup>. Pathologically unmatched subcutaneous tumors were further categorized into Xenograft-Associated Lymphoproliferative Disease (XALD) or epithelial tumor not identical to that of the patient.

## Statistical analyses

The association between PDX model success rates and patient characteristics was investigated with a chi-squared test. The Cox proportional hazards model was used for multiple analyses of clinically significant prognostic variables. Statistical analyses were carried out with R software for Windows version 4.2.1 (The R Foundation, St. Miami, FL, USA). The odds ratio and its confidence interval were calculated with the "epitools" package of R software. All p-values were two-sided and less than 0.05 was considered statistically significant.

## Results

# Establishment of primary lung cancer PDX models

A total of 642 patients with LUADs, LUSCs, and LCNECs were enrolled in the study between September 2015 and December 2019. Tumor samples from these patients were grafted into NSG mice to establish primary lung cancer PDX models for each cell type. The subcutaneous tumor generation rates were 27.0% in 118 cases from 437 LUAD tumor samples, 58.3% in 109 cases from 187 LUSC tumor samples, and 38.9% in 7 cases from 18 LCNEC tumor samples, as shown in Figure 1a.

n=642		PDX success	PDX failure			
n=642		(n=117)	(n=525)	p-value	Odds Ratio (95% cont.)	
Age (mean ± sd) Gender Male (n=395)		65.2544 ± 8.6052	62.9261 ± 9.6130	-	-	
	Male (n=395)	102	293	<0.0001	5.3843 (3.0489, 9.5086)	
Gender	Female (n=247)	15	232			
Smoking status	Former or current (n=393)	102	291	<0.0001	5.4680 (3.0965, 9.6560)	
Preoperative chemotherapy	Never (n=249)	15	234	-	-	
	Yes (n=60)	3	57	0.0053	0.2161 (0.0665, 0.7024)	
Preoperative chemotherapy	No (n=582)	114	468			
	I (n=284)	28	256	< 0.0001	0.3306 (0.2091, 0.5226)	
pTNM stage (7th)	II (n=173)	53	120	-	-	
	III (n=152)	29	123	-	-	
	IV (n=33)	7	26	-	-	
	<3cm (n=252)	21	231	<0.0001	<3cm:0.2784 (0.1684, 0.4602)	
Tumor size	3<<5 (n=259)	46	213	-	<5cm:0.2445 (0.1580, 0.3781)	
	5<<7 (n=104)	41	63	-	-	
	7>(n=27)	9	18	-	-	
	Well (n=12)	1	11	0.0554	0.6021 (0.3905, 0.9282)	
	Moderate (n=418)	66	352	-	-	
Differentiation	Poor (n=179)	42	137	-	-	
Differentiation	UK (n=2)	0	2	-	-	
	NA (n=31)	8	23	-	-	
Decomposition	Yes (n=256)	51	205	0.3642	1.2062 (0.8043, 1.8090)	
Recurrence	No (n=386)	66	320	-		
	Yes (n=52)	16	36	0.0134	2.1728 (1.1603, 4.0689)	
Vascular invasion	No (n=583)	99	484	-	-	
	NA (n=7)	2	5	-	-	
	Yes (n=31)	10	21	0.0382	2.2417 (1.0259, 4.8984)	
Perineural invasion	No (n=605)	106	499	-	-	
	NA (n=6)	1	5	-	-	
	Yes (n=214)	48	166	0.0497	1.5096 (0.9989, 2.2812)	
Lymphatic invasion	No (n=423)	68	355	-	-	
	NA (n=5)	1	4	-	-	
	PL0 (n=500)	81	419	0.0005	0.3693 (0.2257, 0.6129)	
	PL1 (n=44)	5	39	-	-	
0.Visceral pleural invasion	PL2 (n=55)	17	38	-	-	
	PL3 (n=34)	13	21	-	-	
	NA (n=9)	1	8	-	-	
Note: UK: Unknown; NA: Not Applic	able.					

Table 1: Clinical parameters affecting the success rate of primary lung cancer Patient-Derived Xenograft (PDX) models.



To validate pathological concordance with the patient tumors, cell types were examined with antibodies against TTF-1, CK5, p63, and CD56 proteins to differentiate human LUAD, LUSC, and LCNEC. For each cell type, representative Immuno Histo Chemistry (IHC) images of PDX tumors and the corresponding patient tumors are shown in Figure 1b. Subcutaneous tumors that did not match the cell types of the patient tumors were further classified into either epithelial or non-epithelial (XALD) cell types (Table 2a).

The order of efficiency in subcutaneous tumor generation was LUSC, LCNEC, and LUAD; however, except for the pathologically irrelevant tumor, the PDX model success rate was in the order of LCNEC, LUSC, and LUAD. When LUAD was subtyped further into five categories based on histological characteristics, the PDX model success rates were highest in the solid subtype and lowest in the papillary subtype. LUAD had the lowest PDX model success rate (6.6% on average), which was only between 1/6 and 1/7 of those for LUSC or LCNEC (43.33% and 38.9%, respectively; (Table 2b). Tumors from patients with an advanced stage of NSCLC tended to have higher PDX model success rates (Table 2c).

Among the pathologically irrelevant subcutaneous tumors, the ratio between the epithelial *vs* non-epithelial (XALD) cases were 22.5% *vs* 77.5% in LUADs, and 28.6% *vs* 71.4% in LUSCs, indicating no major difference between the two cell types. A total of 29 LUAD PDX tumors, 81 LUSC PDX tumors, and 7 LCNEC PDX tumors displayed the same pathology as the patient tumors. Clinical parameters of 642 patients were analyzed to select 12 parameters that influenced the engraftment rates (Table 1). The odds ratios were highest in the patients who were not treated with preoperative chemotherapy and second highest in males. In males, visceral pleural invasion and pStage III or lower were next highest among the advanced stage factors, while in females, tumor size and lymphatic invasion were the next highest.

# Concordance of somatic mutations in OncoPanel genes in PDX tumors

Seven LUAD cases, eight LUSC cases, and four LCNEC cases were selected from 117 pathologically relevant PDX models to compare the somatic mutations between PDX and patient tumor pairs. OncoPanel genes were analyzed to test whether the driver mutations of the patient tumors were retained in the PDX tumors (Figure S1) [16].

Somatic mutations that were absent in the ANT were classified into three groups; that is, those common to PDX models and patient tumors, those found only in patient tumors, and those only in PDX models. In general, most somatic mutations were commonly seen in both PDX models and patient tumors, but a significant number of patient- or PDX-specific somatic mutations that were different depending on the patients and the cell types were also found (Table 3).

Most somatic mutations found in the patient tumors were retained in the PDX tumors, suggesting that the PDX models could be utilized in preclinical studies. Nonetheless, as not all mutations in the patient tumors were retained in the PDX models; e.g., Kirsten Rat Sarcoma Virus (KRAS) mutation negative in LUAD PDX-367 in Table 3, retention of the mutations of interest should be confirmed in the early stages of use of the PDX model.

Pre-existing mutations might disappear or additional mutations might appear in PDX tumors, for the following reasons: 1) The patient tumor fragments used for pathological examination did not have an identical genetic makeup from those for PDX models due to intra-tumoral heterogeneity, and or 2) *de novo* mutations might occur during multiple passage processes for the expansion of tumor tissues. For example, new PDX-specific mutations were found in TP53 in four independent models and in Neuro Fibromatosis Type 1(NF1), Neurogenic Locus Notch Homolog Protein 2 (NOTCH2), Checkpoint Kinase 2 (CHEK2), EP300, Succinate Dehydrogenase Complex Flavoprotein Subunit A (SDHA), Dedicator of Cytokinesis Protein 8 (DOCK8), and Estrogen Receptor 1 (ESR1) in more than two independent models.

#### Deviations in gene expression in PDX tumors

Despite most somatic mutations being commonly found in both the patient and PDX tumors, existence of the patient or PDX-specific mutations suggested possible discrepancies in gene expression. To address this question, 460 genes in OncoPanel were analyzed for gene expression, and those with  $|\log_2$  (fold change)| >2 with respect to the ANT were selected as DEGs in patient or PDX tumors (Figure S1 and Table 4).

First, there was a trend for more genes to be either up or downregulated in PDX tumors than in patient tumor tissues. HIST1H3B was significantly upregulated in both patient and PDX tumors with little exception, which might indicate a cancer-specific phenomenon, supported by the fact that it is engaged in wrapping newly synthesized DNA as a core component of the nucleosome [17]. On the other hand, ENG was downregulated in both patient and PDX tumors; particularly, in more than 60% of the cases, ENG and Platelet Derived Growth Factor Receptor Alpha (PDGFRA) were downregulated together. Those genes related to wound healing (COL7A1), or tumor cell proliferation (HIST1H3B, Breast Cancer Gene1 (BRCA1), Cyclin-Dependent Kinase Inhibitor 2A (CDKN2A), and POLQ) were upregulated, and those involved in angiogenesis, hypoxia, and connective tissue remodeling (Endoglin (ENG), Platelet Derived Growth Factor Receptor Alpha (PDGFRA), GATA Binding Protein 2 (GATA2), and Kinase Insert Domain Receptor (KDR)) were downregulated [18-23].

Lung Cancer cell type			Pathologically			
	Number of engraftment	Number of subcutaneous	matched (n=117)	unmatched (n=117)		
	attempts	tumor generated(% attempts)	Model (% subcutaneous tumor)	Epithelial tumor(% unmatched)	Non-epithelial tumor(XALD:% unmatched)	
LUAD	437	118(27.0%)	29(24.6%)	20/89(22.5%)	69/89(77.5%)	
LUSC	187	109(58.3%)	81(74.3%)	8/28(28.6%)	20/28(71.4%)	
LCNEC	18	7(38.9%)	7(100%)	0	0	

Table 2a: Engraftment of human tumors and statistics for primary lung cancer Patient-Derived Xenograft (PDX) models, statistics for overall PDX model success rates.

Tumor cell type		Α	В	С
		437	29	6.60%
	Solid	113	14	12.40%
	Lepidic	16	1	6.30%
LUAD	Micropapillary	66	3	4.50%
	Acinar	122	4	3.30%
	Papillary	82	1	1.20%
	others	38	6	15.80%
LUSC	-	187	81	43.30%
LCNEC	-	18	7	38.90%

Table 2b: Engraftment of human tumors and statistics for primary lung cancer PDX models, PDX model success rates for the subtypes of primary lung cancer.

Stage	LUAD			LUSC			LCNEC		
	Α	В	С	Α	В	С	Α	В	С
Ι	219	7	3.20%	58	20	34.50%	7	1	14.30%
II	85	9	10.60%	81	42	51.90%	7	2	28.60%
III	102	8	7.80%	46	17	37.00%	4	4	100%
IV	31	5	16.10%	2	2	100%	-	-	-
Total	437	29	6.60%	187	81	43.30%	18	7	38.90%

Table 2c: Engraftment of human tumors and statistics for primary lung cancer PDX models, PDX success rates depending on the tumor stage.

Tumor cell turo	DDV model ID	Patient	PDX models			
rumor cen type	FDA model ID	Patient     PDX models       Patient-specific     Common somatic       mutations     mutations       ERCC5, HNF1A, STAG2     CDKN2A, CUX1, FLT3, NF PBRM1, POLE, TP53, TSC2       none     none       none     MET, POT1       SDHA, CARD11, FAH, PARK2     ABCB11, BCL2, BRCA2, EI       none     BRCA1, CDH4, ERCC3, JA MGA, MYB, TP53	Common somatic	PDX model-specific		
		mutations	mutations	mutations		
	13	ERCC5, HNF1A, STAG2	CDKN2A, CUX1, FLT3, NF1, NOTCH1, PBRM1, POLE, TP53, TSC2	DOCK8, ERCC4, MAP2K2		
	41	none	none	TP53, NF1, ESR1, POLE, SLX4, CCNE1, PIK3R1, TRIM37		
	48	none	MET, POT1	TP53, JAK2, KCNQ1		
ADC	75	SDHA, CARD11, FAH, PARK2	ABCB11, BCL2, BRCA2, ENG, SLX4, TP53	NF1, NOTCH2		
	81	none	BRCA1, CDH4, ERCC3, JAK2, KEAP1, MGA, MYB, TP53	FOXL2		
	29	none	PBRM1	CHEK2, FAT1		
	216	TDG, CRTC3	FGFR4, NOTCH1, REL, TP53	none		

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			COL7A1, DCLRE1C, FLT1, FLT3, GNAS,		
	231	TDG	KEAP1, MET, NF2, NR4A3, NUP214, STK11,	APC, SMO, KDM5C	
			TP53		
	244	EDCC5 EANCE NTDV1	ABCB11, CUX1, HLEQ, PIK3CA, SETBP1,	ED200 ADHCAD25 II 7D	
	244	ERCC3, FANCE, NTRKI	SMARCA4, TET1, TP53	EF 500, AKHOAF 55, IL/K	
	205			TP53, BCOR, ETV1, FLCN, TFE3, USP8,	
	295	none	none	WT1	
	363	NRG1	ASXL1, BRCA2, NEIL3, TP53	CHEK2, SDHC, GATA2, POLQ, SOX2	
SQCC		ATM, KRAS, BARD1, NRG1,			
	367	POT1, ARHGEF12, BRCC3,	RBM10	ERBB4, ARID1A, PDGFRA, TDG	
		EXO1, FOXL2, KIF1B			
	369	SDUC	ALK, ATM, CREBBP, GBA, KRAS, PDGFRB,		
		SDHC	TP53	none	
	415		APC, CDKN2A, CREBBP, DNMT3A,	FIT2 CDUA CNAO CW D	
		none	NFE2L2, TP53	FLI3, SDHA, GNAQ, CYLD	
	416		ATR, ERBB4, HFE, MITF, POLD1, RB1,		
	416	none	SMC3, SMO, TP53	NOTCH2, SDHA, ESKI	
	438	SDHC, PTEN	EGFR, GNAS	TP53, DOCK8, ABL1, MDM2	
			ATM, CDK8. ERBB4, FGFR4, FLT3,		
	451	FAT1, MAX	NOTCH2, PDGFRB, PHOX2B, PIK3CA, QKI,	EP300, EXT2, JAK1	
LCNEC			TP53		
	482	BARD1	GNAQ, HELQ, KRAS, PIK3CA	DIS3L2	
	509	COLTAL CNAO KDD MTOD	CHEK2, MECOM, NF1, NOTCH1, RB1,	IUSTILIOD VATO DITI	
	508	COL/AI, GNAQ, KDK, MIOK	SDHA, TP53	пізтіпэв, катов, кітт	

Table 3: Somatic mutations in OncoPanel genes in tumors of PDX models and patients.

Tumor cell type			Upregulated	Downregulated	
	DD 012	Patient	None	None	
DP-0 DP-0 DP-0 ADC	DP-013	PDX	None	None	
		Patient	None	None	
	DP-041	PDX	(7) HIST1H3B; (4) EXO1, MYB;(3) BCL2, BRCA1, CARD11, CDKN2A, DCLRE1C; (2) BARD1, COL7A1, NEIL3, POLD1	(-6) NR4A3; (-5) ENG, ETV1; (-4) PDGFRA; (-3) GNAQ, MECOM; (-2) CUX1, MET, MITF, NFE2L2, NOTCH2, QKI	
		Patient	(4) CDKN2A; (3) HIST1H3B	(-4) FGFR4	
	DP-048	PDX	(5) HIST1H3B; (4) CDKN2A, MET; (3) BRCA1, COL7A1, POLQ; (2) NF2, POT1, TRIM37	(-5) PIK3R1, (-4) PDGFRB, (-2) FANCC, IL7R	
		Patient	(5) COL7A1; (3) HIST1H3B; (2) FAT1, KRAS, POLQ	(-3) ENG	
	DP-075	PDX	(5) COL7A1, HIST1H3B; (3) KRAS, POLQ; (2) FAT1, SOX2	(-5) DOCK8, ETV1, PTEN; (-4) ENG; (-3) FLT1, GATA2, GNAQ, IL7R; (-2) ESR1, FGFR4, JAK2, MGA	
		Patient	(4) COL7A1; (3) HIST1H3B, SMO	None	
	DP-081	PDX	(5) COL7A1; (4) HIST1H3B, NGR1; (3) CARD11, EXO1, POLQ; (2) BRCA1, MET	(-4) ETV1; (-3) ENG, IL7R, JAK2, KDR, MITF, PDGFRA, PDGFRB; (-2) DOCK8, GATA2, GNAQ, PIK3R1, QKI	
		Patient	(3) HIST1H3B, TSC1; (2) BCOR	(-3) KDR	
	SP-029	PDX	(3) BCOR, POLE; (2) ARID1A, DNMT3A, ETV1, HIST1H3B	(-5) FLT1; (-4) IL7R, JAK2, QKI; (-3) ETV1, MET, MITF, PIK3R1; (-2) ENG, MECOM, REL	
		Patient	(5) CDKN2A, HIST1H3B; (4) EXO1; (3) POLQ; (2) BARD1, BRCA1, POLE, TRIM37	(-5) DOCK8; (-4) IL7R, JAK2, QKI; (-3) ETV1, MET, MITF, PIK3R1; (-2) ENG, MECOM, REL	
	SP-216	PDX	(5) CDKN2A; (4) EXO1, HIST1H3B; (3) POLQ; (2) BARD1, BRCA1, POLE, BCL2, BCOR, BRCA2, BRCC3, HFE, MYB, STAG2, TET1	(-5) DOCK8, QKI; (-4) FGFR4, JAK2, PDGFRA; (-3) ENG, IL7R, MET, PIK3R1, FAH, FLT1, PDGFRB; (-2) ETV1, REL, KCNQ1, KDR, PTEN, SMO	

		Patient	(4) COL7A1	(-3) NR4A3; (-2) EGFR, MECOM	
	SP-231	PDX	(4) HIST1H3B; (3) CDKN2A, NRG1, POLD1, TDG; (2) BRCA1, BRCA2, CHEK2, FAT1, KIF1B, MTOR, POLE, SMO	(-5) ENG, IL7R, KDR, MECOM, PDGFRA; (-4) APC, PIK3R1; (-3) CYLD, GNAQ; (-2) ESR1, GATA2, NOTCH1, NR4A3, QKI	
		Patient	(3) HIST1H3B, KDR; (2) BARD1	(-2) ENG, GATA2, SETBP1	
	SP-244	PDX	(3) BARD1, HIST1H3B; (2) TET1	(-5) ENG, ETV1, PDGFRA; (-4) FLT1, IL7R; (-3) DOCK8, GATA2, QKI; (-2) NOTCH1, PIK3R1	
S SQCC		Patient	None	None	
	SP-295	PDX	(6) NRG1; (3) FAT1, POLQ; (2) ATR, BRCA1, BRCA2, CDK8, CHEK2, HIST1H3B, KEAP1, SMARCA4	(-5) NR4A3; (-4) GATA2; (-3) ETV1, FGFR4, WT1; (-2) DOCK8, ALK, ESR1, PDGFRB	
	SP 2(2	Patient	(6) CDKN2A, HIST1H3B; (3) BRCA1, CHEK2; (2) NEIL3, SOX2	(-3) ENG, NR4A3, PDGFRA, PDGFRB; (-2) DOCK8, JAK2, KDR	
	SP-363	PDX	(7) HIST1H3B; (4) BRCA1, CDKN2A; (3) NEIL3; (2) CHEK2, SOX2, BRCC3, DNMT3A, GBA, HFE, SMO,	(-5) PDGFRA; (-4) FLT1; (-3) DOCK8, IL7R, MECOM; (-2) ENG, FGFR4, JAK2, NOTCH1, RB1, STAG2	
		Patient	(3) HIST1H3B	(-3) GATA2	
SP-367	SP-367	PDX	(5) HIST1H3B; (4) BCL2, POLQ; (3) BRCA1, CARD11, MYB; (2) BARD1, BRCA2, CDKN2A, POLE	(-5) IL7R, MECOM; (-4) PDGFRA; (-3) MITF, PIK3R1; (-2) FLT1, NOTCH2	
		Patient	(4) HIST1H3B, SOX2; (3) CARD11, COL7A1; (2) EGFR, KEAP1	(-4) NR4A3; (-3) KDR, PTEN, REL; (-2) DOCK8, ENG, FLT1, IL7R, MITF	
	SP-369	PDX	(6) SOX2; (4) IST1H3B; (3) CARD11, COL7A1, KEAP1, POLQ, SMO; (2) EGFR,, BRCA1, MAP2K2, SDHA	(-6) PTEN; (-4) ENG, IL7R, PDGFRA; (-3) DOCK8, FGFR4; (-2) MITF, REL	
		Patient	None	(-3) NR4A3	
	SP-415	PDX	(6) MYB; (5) EXO1; (3) BRCA1, CDKN2A, POLQ; (2) ATR, CHEK2, EP300, HIST1H3B, KRAS, POLE, SMARCA4	(-5) FAT1, FLT1, MECOM; (-4) ENG, KDR, PDGFRA; (-3) JAK1, PIK3R1; (-2) CYLD, PTEN	
	SP-416	Patient	(5) COL7A1, HIST1H3B, SOX2; (4) CDKN2A; (3) CHEK2, EXO1, SMO; (2) ATR	(-4) GATA2; (-3) ENG, IL7R; (-2) ERBB4, KDR	
		PDX	None	None	
		Patient	(6) COL7A1; (4) HIST1H3B; (3) CARD11, MET; (2) EGFR	(-2) MECOM, SETBP1	
	SP-438	PDX	(4) HIST1H3B, MET; (3) COL7A1; (2) CARD11, EGFR	(-4) DOCK8, IL7R; (-3) ENG, KCNQ1, PIK3R1; (-2) ERBB4, GATA2, NOTCH1, QKI	
	CD 451	Patient	(6) COL7A1; (4) HIST1H3B; (3) FAT1, SMO, STAG2; (2) BRCA1	(-3) FGFR4, GATA2, KDR, NR4A3; (-2) ERBB4	
LCNEC	SP-451	PDX	(6) COL7A1; (5) HIST1H3B; (4) BRCA1, SMO; (3) NRG1; (2) ATR, CARD11, CHEK2, EGFR, FAT1, MYB, TET1	(-4) PDGFRB; (-3) DOCK8, ENG, ETV1, GATA2, PDGFRA; (-2) IL7R	
		Patient	(3) HIST1H3B, MDM2; (2) GNAS, SOX2	(-3) FGFR4; (-2) GATA2, NR4A3, SETBP1	
	SP-482	PDX	(5) HIST1H3B; (3) MDM2, SOX2, EXO1, NEIL3; (2) BCL2, BRCA1, BRCC3, CCNE1, DNMT3A, EGFR, GNAS, POLD1, POLE, POLQ, SMO, TP53	(-5) MECOM, PDGFRA; (-4) DOCK8, IL7R; (-3) JAK1; (-2) ESR1, NFE2L2, PIK3R1, QKI, RB1	
	SD 500	Patient	None	None	
	Sr-308	PDX	None	None	

Table 4: Differentially expressed oncopanel genes in tumors of PDX models and patients with respect to ANTs The numbers in parenthesis indicate the value of log<sub>2</sub> (fold change).

It is known that extracellular matrix remodeling or angiogenesis is induced by hypoxia, and the oxygen concentration in the tumor is regulated by the master regulator HIF-1a [24]. Therefore, it was necessary to investigate the association between HIF-1a expression levels with hypoxia or angiogenesis in PDX tumors. The HIF-1a expression in PDX tumors, patient tumors, and ANTs was comparatively analyzed for hypoxia (Table S2). HIF-1a expression levels in LUAD and LUSC PDX tumors were higher than ANTs, but lower than the patient tumors, at the level of 62%~75%. In other words, hypoxia occurred in most PDX tumors at a relatively lower level than the patient tumors, which was similar to the above observation that the four genes in OncoPanel (ENG, PDGFRA, GATA2 and KDR) were involved in hypoxia and angiogenesis were downregulated in PDX tumors compared with patient tumors.

# Downregulated expression of hypoxia- and angiogenesisrelated genes in PDX tumors

To understand whether the lower expression of hypoxia- or angiogenesis-associated genes in PDX tumors was a consistent phenomenon, data from Gene Set Enrichment Analysis and the signature genes for hypoxia or angiogenesis in recent reports were consolidated to create expanded gene sets (Tables S3 and S4). Among these two gene sets, DEGs with |log<sub>2</sub> (fold change)|>2 were selected from the DEG mother database described in the Methods section. The selected genes were associated with the TME component cells in which those genes were generally expressed; i.e., epithelial tumor cells, murine Cancer-Associated Fibroblasts (CAF), Endothelial cells, and Immune cells of PDX tumors (Table 5).

In comparison to the patient tumors, hypoxia-related genes that were downregulated in PDX tumors commonly to LUAD and LUSC, to LUAD and LCNEC, and to LUSC and LCNEC are listed in Table 5a. Twenty genes were mainly expressed in fibroblasts, and four genes in endothelial cells. Likewise, angiogenesis-related genes that were downregulated in PDX tumors commonly to LUAD and LUSC, to LUAD and LCNEC, and to LUSC and LCNEC are listed in Table 5b. Thirty-five genes were mainly expressed in fibroblasts and 28 genes were mainly expressed in endothelial cells. C-X-C Chemokine Receptor Type 4 (CXCR4), Versican (VCAN), Familial Adenomatous Polyposis (FAP), Fibronectin 1(FN1), FOS, Transforming Growth Factor Beta-3 (TGFB3), and C-C Motif Chemokine Ligand 2 (CCL2) were expressed in fibroblasts, and Fms Related Receptor Tyrosine Kinase 1(FLT1), TEK, Angiopoietin 2 (ANGPT2), and Secreted Phospho Protein 1(SPP1) were expressed in endothelial cells that belonged to both hypoxia- and angiogenesis gene sets.

Most hypoxia and angiogenesis-related genes that were mainly expressed in fibroblasts were downregulated. Therefore, low HIF-1a expression as well as low levels of expression in hypoxia- and angiogenesis-associated gene sets in PDX tumors might be caused by the murine TME, specifically murine fibroblasts. Unlike LUAD or late stage LUSC PDX tumors, early stage LUSC PDX tumors had relatively upregulated genes, compared to the patient tumors: For the hypoxia-related genes, Cyclin Dependent Kinase Inhibitor 3 (CDKN3) and Trophoblast Glycoprotein (TPBG) were expressed in fibroblasts, and FOSL1 and Glutamate Ionotropic Receptor NMDA type subunit 2D (GRIN2D) were expressed in endothelial cells. For angiogenesis-related genes, Aurora A Kinase (AURKA), Baculo Viral IAP Repeat Containing 5 (BIRC5), E2F Transcription Factor 1 (E2F1), Epithelial Cell Transforming 2 (ECT2), and Ubiquitin-Conjugating Enzyme E2T (UBE2T) were expressed in tumor cells, AURKB, Jagged Canonical Notch Ligand 2 (JAG2), Mannose-Binding Lectin 2 (MBL2), SOX2 in fibroblasts, and ETS Translocation Variant 4 (ETV4), High Mobility Group A1(HMGA1), Solute Carrier Family 7 Member 5 (SLC7A5) in endothelial cells. Relatively high PDX engraftment rates in LUSCs appeared partly associated with upregulation of the hypoxia- and angiogenesis-related genes. On the contrary, PDX tumors of late stage LCNEC cell types had one upregulated gene (i.e., Proline Oxidase Dehydrogenase PRODH) in tumor cells and one upregulated gene (i.e., Inhibitor of Differentiation1 (ID1)) in endothelial cells.

# Discussion

PDX animal models are generated by grafting patient-derived tumors to immune deficient mice, which reconstitutes the tumors with pathological relevance to the original patients. It is necessary to timely generate the PDX models effectively when studies with animal models are needed for specific cancer patients. In spite of the effort paid to establish PDX models, not much in-depth discussion has occurred on the key factors that determine the PDX engraftment rates. Molecular genetic deviations from the original patient tumors, such as somatic mutations and altered gene expression , may produce pathologically irrelevant subcutaneous tumors, causing transitions to different epithelial cell types or to non-epithelial tumors (XALD) (70% and 30%, respectively in Table 2), resulting in low engraftment rates [25,26].

In this study, by analyzing the differences in somatic mutations and gene expression between the PDX tumors and the tumor of primary NSCLC patients, we aimed to understand the reason for low PDX engraftment rates in NSCLC at a molecular level. To this end, the authors took a retrospective data-collection and analyses approach, rather than hypothesis-generation and test approach. Typically, tumors generate local hypoxia as they grow, and hypoxiarelated genes, including HIF-1a, are activated. A variety of adaptive autophagic responses are initiated, such as Epithelial-Mesenchymal Transition (EMT) of tumor cells and dedifferentiation into cancer stem cells [27-31].

Tumor hypoxia increases mutation burdens, particularly enriching driver mutations in Tumor Protein (TP53), MYC, and Phosphatase and Tensin Homolog deleted on Chromosome 10 (PTEN10) [32-35]. At the same time, a local oxygen gradient appears in CAF in the TME that aids tumor subclonal evolution, resulting in further intratumor heterogeneity [36]. Through aberrant paracrine signaling and matrix remodeling, the niches necessary to maintain cancer stem cells are generated and the angiogenic signals stimulated by hypoxia support endothelial sprouting and tumor growth as well [37-45]. Angiogenesis reoxygenates tumors and HIF-1a becomes inactivated, but as the tumor grows local hypoxia is re-generated [46,47]. Through this cycling hypoxia, further clonal evolution facilitates an even more complex genomic situation [48-50] (Figure 2).

When grafted to NSG mice, most tumors form internal hypoxia at a relatively early stage, as supported by increased TP53 somatic mutations in a PDX-specific manner (Table S2, Table 3). During serial passaging to expand the PDX tumors, the fore-mentioned cycling hypoxia increases tumor heterogeneity and diversifies growth rates, generating epithelial tumors with rare cell types that may not match the initially grated tumors of the patients [51]. Histological interconversion between LUAD and LUSC or conversion from NSCLC to SCLC has been reported when lung cancer patients are treated with EGFR-tyrosine kinase inhibitor or chemotherapy, but the similarities and differences with our pathologically deviant PDX tumors require further investigation [52-56].

TME cell type Fibroblast	Downregulated			Upregulated		
	ASL	AS	SL	AL	S early	L late
Fibroblast	BGN, CXCR4,		COL1A1, COL6A3,			
	COL5A1, DCN, DUSP1,		CTHRC1, FAP, FN1,	ACKR3, CCL2	CDKN3, TPBG	
	OLFML2B, TAGLN,	-	FOS, LOX, PLIN2,			-
	VCAN		RRAGD, TGFB3			
Endothelial cells	FLT1	TEK	ANGPT2, SPP1	-	FOSL1, GRIN2D	
Others (None of the					GPRIN1, MFI2,	ATP11, BASP1, CP,
above, or ubiquitous)	-	-	-	-	ANLN	ITPR3

Table 5a: Differentially expressed hypoxia- and angiogenesis-related genes in tumors of PDX models with respect to patients and their association with TME component cell types, Hypoxia-related genes.

TME cell type	Downregulated	Upregulated				
TME cen type	ASL	AS	SL	AL	S early	L late
Tumor cells	-	TNFRSF1B	AXL, SLC34A2	-	AURKA, BIRC5, E2F1, ECT2, UBE2T	PRODH
Fibroblast	COL3A1, COL15A1, CXCL12, CXCR4, DDR2, GREM1, ITGB2, LDB2, LUM, MMP9, PDGFRA, PDGFRB, POSTN, PRELP, SERPINF1, STAB1, TIMP3, VCAN	CCL19, ITGA11, LRRC32, MMP19	COL5A2, FAP, FN1, FOS, FSTL1, MEF2C, MMP11, TGFB3, THBS1, TIMP2	CCL2, CXCL14, JAM3	AURKB, JAG2, MYBL2, SOX2	-
Endothelial cells	A2M, ACVRL1, FLT1, OLR1, PLVAP, SPRACL1, VWF	APLNR, CD93, CLEC14A,	ANGPT2, ESAM, SPP1	CALCRL, RGS5, THY1	ETV4, HMGA1, SLC7A5	ID1
		CNRIP1, ECSCR, EDNRB, ELTD1, FLT4, GIMAP8, GPR124, ROBO4, RUNX1T1, TEK, THBD, TIE1				
Immune cells	-	-	TNFSF12	-	-	-

Table 5b: Differentially expressed hypoxia- and angiogenesis-related genes in tumors of PDX models with respect to patients and their association with TME component cell types, Angiogenesis-related genes.



Hypoxia in subcutaneous tumors affect the presence of Epstein-Barr Virus (EBV), which is ubiquitous in the human body [57]. Latent EBVs in lymphocytes that are infiltrated in patient tumors are lytically reactivated by HIF-1a that is activated by tumor hypoxia, which is formed when grafted into immune-deficient NSG mice [58,59]. Human lymphocytes transformed by P1 viral oncogenes can proliferate under normoxic as well as hypoxic conditions, forming XALD [60,61]. As such, tumor hypoxia seems to play a key role in the generation of pathologically unmatched subcutaneous tumors, such as phenotypic conversion of cell types or XALD.

In preclinical, co-clinical, or collateral studies using PDX models as a drug testbed, TME is a key factor determining the responses [62,63]. In PDX models, many murine stromal cells are not functional and B-cells and T-cells do not mature, and no natural killer cells exist, and myeloid cells, such as macrophages and dendritic cells, are defective, leaving murine fibroblasts as the only functional stromal cells in TME [64,65]. Human CAF in the patient tumor fragments is known to be diluted and gradually substituted by murine CAFs during serial passages in NSG mice [66,67]. Therefore, to utilize PDX tumors as a copycat of the patient tumor, not only somatic mutations but also changes in gene expression caused by TME modification need to be analyzed in-depth between patient and PDX tumors.

Unlike patient tumors in which the angiogenic factors are produced and released by tumor cells, CAF and tumor infiltrating immune cells, including lymphocytes and macrophages, in PDX tumors, the main sources of angiogenic factors, are the human tumor cells and the murine CAFs, which require effective cell-cell communication across species. In patient tumors, growing cancer cells are in continuous contact with human fibroblasts from early stages for extended periods of time to form conditioned CAFs, but in PDX tumors, direct abrupt contacts with unconditioned murine fibroblasts may cause prolonged chronic hypoxia and autophagy at an early stage. As a consequence, compared with patient tumors, HIF-1a activation levels were lowered (Table S2) and the weakened angiogenesis may delay tumor growth and decrease tumor engraftment rates, even leading to the failure of tumor formation (Table 2a). In PDX LUSC and LCNEC tumors, some of the angiogenesis-related genes were upregulated, but not in those of LUAD. Maybe this is why LUAD had significantly lower engraftment rates in NSG mice than other cell types (Table 5).

When PDX tumors were used to generate a humanized PDX model, the humanized mouse infused with CD34<sup>+</sup> human hematopoietic stem cells have fully differentiated functional human myeloid cells that substitute for the defective dendritic cells and macrophages to partly rescue TME in PDX tumors. Even so, the murine fibroblasts still have to play a role in mediating the crosstalk between the tumor mass and the tumor infiltrating immune cells as well as the endothelial cells [68,69]. Thus, murine fibroblasts make a critical contribution to angiogenesis for the successful growth of grafted human tumors in humanized PDX models as well as in PDX models.

Concordant with a number of previous studies, the pathologically relevant PDX models in this study showed that various somatic mutations, including driver mutations and intra-tumoral heterogeneities, were retained through serial passages, and relative to ANT, the patient and PDX tumors showed similar expression patterns (Table 3, Table 4) [70]. Expanded after serial passages, PDX models have potential for developing targeted drugs in preclinical studies, or in co-clinical or collateral studies for immunotherapies after being grafted to the humanized NSG mice.

Nonetheless, depending on the cell types of the patient tumors, some PDX tumors showed additional somatic mutations, and different fragments of the same patient tumors often showed a variety of growth patterns, which indicated that intratumor heterogeneity might be an inevitable factor causing variation in each individual, even within the specific PDX model. Unlike somatic mutations, differences in gene expression were considerable between the PDX and patient tumors. Therefore, caution is warranted when using PDX models to evaluate the systemic effects of targeted drugs and to translate the outcome into clinical applications.

There have been a number of studies pointing out the intratumor heterogeneity of PDX models [71-74]. To enhance the engraftment efficiencies of PDX tumors, and to minimize the clonal evolution during serial passages, mouse fibroblasts need to be conditioned quickly by the human tumors, with angiogenesis proceeding without delay, and EBV-activation needs to be interrupted effectively [75,76].

# Conclusions

Current protocols for PDX model preparation often result in significantly diverse engraftment rates, depending on tumor types, and rare patient tumors that are valuable for clinical research are frequently lost during the process. For PDX models to qualify for wide use in preclinical studies for drug development as well as in collateral studies for clinical benefit, the engraftment rate needs to be elevated, and TME, especially fibroblasts, close to that of the patient tumors needs to be established in the PDX models. Murine fibroblasts, defective murine macrophages, and EBV-infected lymphocytes are some of the key factors contributing to the inefficiency of PDX tumor generation when associated with tumor hypoxia, which may provide basic knowledge for a strategic improvement in graft efficiencies in the future. The presence of pathologically irrelevant subcutaneous tumors, including phenotypic conversions and XALD, was attributed to tumor hypoxia and EBV activation.

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## Author's contributions

J Lee wrote most of the manuscript. CH Seo and MY Park performed the genomic analysis. BK Kim assisted the data collection, image preparation and drafting. S-H Kim assisted the manuscript writing and editing. JH Lee, HK Kim, JH Cho, YS Choi, S Shin, J Kim provided the patients' tumor tissues and clinical information. Y-A Choi prepared the human tumor tissue for xenograft. JH Kang collected patients' clinical information and performed the H&E and IHC staining.HK Song, and HY Jang prepared the PDX models. J-E Lee supervised the entire process of PDX model development. S Lee supervised the genomic analysis. M Cho and D-S Son performed the statistical analysis of the patients' clinical information and their association with engraftment efficiency of PDX. J Lee, CH Seo, and BK Kim equally contributed to this study. J Lee, J-E Lee, and J Kim supervised the entire study. All authors read and approved the final manuscript.

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# Availability of data and materials

The datasets used and/or analyzed during the current study are available from the corresponding author on reasonable request.

# Ethics approval and consent to participate

All patients provided written informed consents authorizing the collection and use of their body tissues for study purposes. This study was approved by the IRB of Samsung Medical Cancer (2014-10-069, 2015-04-018, 2018-03-110).

# **Consent for publication**

All patients provided written informed consents authorizing the collection and use of their body tissues for study purpose.

# **Competing interest**

The authors declare that they have no competing interests.

## References

- Barta JA, Powell CA, Wisnivesky JP (2019) Global epidemiology of lung cancer. Ann Glob Health 85(1):8.
- Park JY, Jang SH (2016) Epidemiology of lung cancer in Korea: recent trends. Tuberc Respir Dis 79(2):58-69.
- Casal-Mouriño A, Ruano-Ravina A, Lorenzo-González M, Rodríguez-Martínez Á, Giraldo-Osorio A, et al. (2021) Epidemiology of stage III lung cancer: frequency, diagnostic characteristics, and survival. Transl Lung Cancer Res 10(1):506.
- Griffin R, Ramirez RA (2017) Molecular targets in non–small cell lung cancer. Ochsner J 17(4):388-392.
- 5. Heist RS, Sequist LV, Engelman JA (2012) Genetic changes in squamous cell lung cancer: a review. J Thorac Oncol 7(5):924-33.
- Ferrara MG, Stefani A, Simbolo M, Pilotto S, Martini M, et al. (2021) Large cell neuro-endocrine carcinoma of the lung: current treatment options and potential future opportunities. Front Oncol 11:650293.
- Tentler JJ, Tan AC, Weekes CD, Jimeno A, Leong S, et al. (2012) Patient-derived tumour xenografts as models for oncology drug development. Nat Rev Clin Oncol 9(6):338-350.
- Gengenbacher N, Singhal M, Augustin HG (2017) Preclinical mouse solid tumour models: status quo, challenges and perspectives. Nat Rev Cancer 17(12):751-765.
- 9. Morgan KM, Riedlinger GM, Rosenfeld J, Ganesan S, Pine SR (2017) Patient-derived xenograft models of non-small cell lung cancer and their potential utility in personalized medicine. Front Oncol 7:2.
- 10. Jiang Y, Zhao J, Zhang Y, Li K, Li T, et al. (2018) Establishment of lung cancer patient-derived xenograft models and primary cell lines for lung cancer study. Journal of translational medicine. 16:1-8.
- 11. Hidalgo M, Amant F, Biankin AV, Budinská E, Byrne AT, et al. (2014) Patient-derived xenograft models: an emerging platform for translational cancer research. Cancer Discov 4(9):998-1013.
- 12.Fiebig HH, Schuchhardt C, Henss H, Fiedler L, Löhr GW (1984) Comparison of tumor response in nude mice and in the patients. Behring Inst Mitt. 74:343-352.
- 13.Boedigheimer MJ, Freeman DJ, Kiaei P, Damore MA, Radinsky R (2013) Gene expression profiles can predict panitumumab monotherapy responsiveness in human tumor xenograft models. Neoplasia 15(2):125-132.
- 14.Meraz IM, Majidi M, Meng F, Shao R, Ha MJ, et al. (2019) An improved patient-derived xenograft humanized mouse model for evaluation of lung cancer immune responses. Cancer Immunol ResAug 7(8):1267-179.

- 15.Jung HY, Kim TH, Lee JE, Kim HK, Cho JH, et al. (2020) PDX models of human lung squamous cell carcinoma: Consideration of factors in preclinical and co-clinical applications. J Transl Med Dec;18:1-3.
- 16. Wagle N, Berger MF, Davis MJ, Blumenstiel B, DeFelice M, et al. (2012) High-throughput detection of actionable genomic alterations in clinical tumor samples by targeted, massively parallel sequencing. Cancer Discov 2(1):82-93.
- 17. Weber CM, Henikoff S (2014) Histone variants: dynamic punctuation in transcription. Genes Dev 28(7):672-682.
- Nyström A, Velati D, Mittapalli VR, Fritsch A, Kern JS, et al. (2013) Collagen VII plays a dual role in wound healing. J Clin Invest Aug 123(8):3498-3509.
- 19.Liu Z, Lebrin F, Maring JA, van den Driesche S, van der Brink S, et al. (2014) ENDOGLIN is dispensable for vasculogenesis, but required for vascular endothelial growth factor-induced angiogenesis. PLoS One. 9(1):e86273.
- 20. Horikawa S, Ishii Y, Hamashima T, Yamamoto S, Mori H, et al. (2015) PDGFR $\alpha$  plays a crucial role in connective tissue remodeling. Sci Re. Dec 5(1):17948.
- 21.Zhang J, Cao R, Zhang Y, Jia T, Cao Y, et al. (2009) Differential roles of PDGFR- $\alpha$  and PDGFR- $\beta$  in angiogenesis and vessel stability. FASEB J (1):153-163.
- 22. Coma S, Allard-Ratick M, Akino T, van Meeteren LA, Mammoto A, et al. (2013) GATA2 and Lmo2 control angiogenesis and lymphangiogenesis *via* direct transcriptional regulation of neuropilin-2. Angiogenesis. 16:939-952.
- 23.Olszewska-Pazdrak B, Hein TW, Olszewska P, Carney DH (2009) Chronic hypoxia attenuates VEGF signaling and angiogenic responses by downregulation of KDR in human endothelial cells. Am J Physiol Cell Physiol 296(5):C1162-1170.
- 24. Wicks EE, Semenza GL (2022) Hypoxia-inducible factors: cancer progression and clinical translation. J Clin Invest 132(11): e159839.
- 25.Sueyoshi K, Komura D, Katoh H, Yamamoto A, Onoyama T, et al. (2021) Multi-tumor analysis of cancer-stroma interactomes of patient-derived xenografts unveils the unique homeostatic process in renal cell carcinomas. iScience 24, 103322.
- 26.Folaron M, Merzianu M, Duvvuri U, Ferris RL, Seshadri M (2019) Profiling the stromal and vascular heterogeneity in patient-derived xenograft models of head and neck cancer: Impact on therapeutic response. Cancers. 11(7):951.
- 27. Lugano R, Ramachandran M, Dimberg A (2020) Tumor angiogenesis: causes, consequences, challenges and opportunities. Cell Mol Life Sci 77:1745-1770.
- 28.El Hout M, Cosialls E, Mehrpour M, Hamai A (2020) Crosstalk between autophagy and metabolic regulation of cancer stem cells. Molecular Cancer 19(1):1-7.
- 29. Nazio F, Bordi M, Cianfanelli V, Locatelli F, Cecconi F (2019) Autophagy and cancer stem cells: molecular mechanisms and therapeutic applications. Cell Death & Differentiation. 26(4):690-702.
- 30. Wang P, Wan WW, Xiong SL, Feng H, Wu N (2017) Cancer stemlike cells can be induced through dedifferentiation under hypoxic conditions in glioma, hepatoma and lung cancer. Cell Death Discov 3(1):1-10.

- 31.Conley SJ, Gheordunescu E, Kakarala P, Newman B, Korkaya H, et al. (2012) Antiangiogenic agents increase breast cancer stem cells *via* the generation of tumor hypoxia. Proc Natl Acad Sci U S A 109(8):2784-9.
- 32.Hassan Venkatesh G, Bravo P, Shaaban Moustafa Elsayed W, Amirtharaj F, Wojtas B, et al. (2020) Hypoxia increases mutational load of breast cancer cells through frameshift mutations. Oncoimmunology 9(1):1750750.
- 33.Kondo A, Safaei R, Mishima M, Niedner H, Lin X, et al. (2001) Hypoxia-induced enrichment and mutagenesis of cells that have lost DNA mismatch repair. Cancer Res 61(20):7603-7.
- 34. Sethi N, Kikuchi O, McFarland J, Zhang Y, Chung M, et al. (2019) Mutant p53 induces a hypoxia transcriptional program in gastric and esophageal adenocarcinoma. JCI insight 4(15): e128439.
- 35.Bhandari V, Li CH, Bristow RG, Boutros PC (2020) Divergent mutational processes distinguish hypoxic and normoxic tumours. Nat Commun 11(1):737.
- 36. Ando Y, Ta HP, Yen DP, Lee SS, Raola S, et al. (2017) A microdevice platform recapitulating hypoxic tumor microenvironments. Sci Rep 7(1):15233.
- 37.Kim I, Choi S, Yoo S, Lee M, Kim IS (2022) Cancer-associated fibroblasts in the hypoxic tumor microenvironment. Cancers 14(14):3321.
- 38.Loh JJ, Ma S (2021) The role of cancer-associated fibroblast as a dynamic player in mediating cancer stemness in the tumor microenvironment. Front Cell Dev Biol 9:727640.
- 39.Petrova V, Annicchiarico-Petruzzelli M, Melino G, Amelio I (2018) The hypoxic tumour microenvironment. Oncogenesis 7(1):10.
- 40. Semenza GL (2017) Hypoxia-inducible factors: coupling glucose metabolism and redox regulation with induction of the breast cancer stem cell phenotype. EMBO J 36(3):252-9.
- 41. López de Andrés J, Grinan-Lison C, Jimenez G, Marchal JA (2020) Cancer stem cell secretome in the tumor microenvironment: a key point for an effective personalized cancer treatment. J Hematol Oncol 13:136.
- 42.Prager BC, Xie Q, Bao S, Rich JN (2019) Cancer stem cells: The architects of the tumor ecosystem. Cell Stem Cell 24:41–53.
- 43.Kugeratski FG, Atkinson SJ, Neilson LJ, Lilla S, Knight JRP, et al. (2019) Hypoxic cancer–associated fibroblasts increase NCBP2-AS2/ HIAR to promote endothelial sprouting through enhanced VEGF signaling. Sci Signal 12:eaan8247.
- 44.Fantozzi A, Gruber DC, Pisarsky L, Heck C, Kunita A, et al. (2014) VEGF-mediated angiogenesis links EMT-induced cancer stemness to tumor initiation. Cancer Res 74:1566-1575.
- 45. Chiavarina B, Whitaker-Menezes D, Migneco G, Martinez-Outschoorn UE, Pavlides S, et al. (2010) HIF1-alpha functions as a tumor promoter in cancer-associated fibroblasts, and as a tumor suppressor in breast cancer cells. Cell Cycle 9:3534-3551.
- 46.Bader SB, Dewhirst MW, Hammond EM (2021) Cyclic hypoxia: An update on its characteristics, methods to measure it and biological implications in cancer. Cancers (Basel) 13:23.
- 47.Lu H, Dalgard CL, Mohyeldin A, McFate T, Tait AS, et al. (2005) Reversible inactivation of HIF-1 prolyl hydroxylases allows cell metabolism to control basal HIF-1. J Biol Chem 280:41928-41939.
- 48.Pressley M, Gallaher JA, Brown JS, Tomaszewski MR, Borad P, et al. (2021) Cycling hypoxia selects for constitutive HIF stabilization. Sci Rep 11:5777.

- 49.Bhandari V, Hoey C, Liu LY, Lalonde E, Ray J, et al. (2019) Molecular landmarks of tumor hypoxia across cancer types. Nat Genet 51:308-318.
- 50.Qiu G-Z, Jin M-Z, Dai J-X, Sun W, Feng J-H, et al. (2017) Reprogramming of the tumor in the hypoxic niche: The emerging concept and associated therapeutic strategies. Trends Pharmacol Sci 38:669-686.
- 51.Peille AL, Vuaroqueaux V, Wong SS, Ting J, Klingner K, et al. (2020) Evaluation of molecular subtypes and clonal selection during establishment of patient-derived tumor xenografts from gastric adenocarcinoma. Commun Biol 3(1):367.
- 52.Xi YZ, Xie L, Tan XW, Zeng SL (2022) Transformation of adenocarcinoma to squamous cell carcinoma as a source of EGFR-TKI resistance: A case report and literature review. Front Oncol 12:942084.
- 53.Jukna A, Montanari G, Mengoli MC, Cavazza A, Covi M, et al. (2016) Squamous cell carcinoma "transformation" concurrent with secondary T790M mutation in resistant EGFR-mutated adenocarcinomas. Journal of Thoracic Oncology. 11(4):e49-51.
- 54. Kanazawa H, Ebina M, Ino-oka N, Shimizukawa M, Takahashi T, et al. (2000) Transition from squamous cell carcinoma to adenocarcinoma in adenosquamous carcinoma of the lung. Am J Pathol 156(4):1289-1298.
- 55.Sehgal K, Varkaris A, Viray H, VanderLaan PA, Rangachari D, et al. (2020) Small cell transformation of non-small cell lung cancer on immune checkpoint inhibitors: uncommon or under-recognized?. J Immunother Cancer 8(1): e000697.
- 56.Oser MG, Niederst MJ, Sequist LV, Engelman JA (2015) Transformation from non-small-cell lung cancer to small-cell lung cancer: molecular drivers and cells of origin. Lancet Oncol 16(4):e165-172.
- 57. Cho EY, Kim KH, Kim WS, Yoo KH, Koo HH, et al. (2008) The spectrum of Epstein-Barr virus-associated lymphoproliferative disease in Korea: incidence of disease entities by age groups. J Korean Med Sc Apr 23(2):185-192.
- 58. Murata T, Sugimoto A, Inagaki T, Yanagi Y, Watanabe T, et al. (2021) Molecular basis of epstein–barr virus latency establishment and lytic reactivation. Viruses. 13(12):2344.
- 59.Kraus RJ, Yu X, Cordes BL, Sathiamoorthi S, Iempridee T, et al. (2017) Hypoxia-inducible factor-1α plays roles in Epstein-Barr virus's natural life cycle and tumorigenesis by inducing lytic infection through direct binding to the immediate-early BZLF1 gene promoter. PLoS pathogens 13(6):e1006404.
- 60. Price AM, Dai J, Bazot Q, Patel L, Nikitin PA, et al. (2017) Epstein-Barr virus ensures B cell survival by uniquely modulating apoptosis at early and late times after infection. Elife 6:e22509.
- 61.Darekar S, Georgiou K, Yurchenko M, Yenamandra SP, Chachami G, et al. Epstein-Barr virus immortalization of human B-cells leads to stabilization of hypoxia-induced factor 1 alpha, congruent with the Warburg effect. PLoS ONE 7(7): e42072.
- 62. Mhaidly R, Mechta-Grigoriou F (2021) Role of cancer-associated fibroblast subpopulations in immune infiltration, as a new means of treatment in cancer. Immunol Rev 302(1):259-272.
- 63. Mao X, Xu J, Wang W, Liang C, Hua J, et al. (2021) Crosstalk between cancer-associated fibroblasts and immune cells in the tumor microenvironment: new findings and future perspectives. Mol cancer 20(1):1-30.

- 64.Cao X, Shores EW, Hu-Li J, Anver MR, Kelsail BL, et al. (1995) Defective lymphoid development in mice lacking expression of the common cytokine receptor γ chain. Immunity 2(3):223-238.
- 65. The Jackson Laboratory, Basic facts about NSG mice.
- 66. Yoshida GJ (2020) Applications of patient-derived tumor xenograft models and tumor organoids. J Hematol Oncol 13(1):1-6.
- 67.Blomme A, Van Simaeys G, Doumont G, Costanza B, Bellier J, et al. (2018) Murine stroma adopts a human-like metabolic phenotype in the PDX model of colorectal cancer and liver metastases. Oncogene 37(9):1237-1250.
- 68.Linxweiler J, Hajili T, Körbel C, Berchem C, Zeuschner P, et al. (2020) Cancer-associated fibroblasts stimulate primary tumor growth and metastatic spread in an orthotopic prostate cancer xenograft model. Sci Rep 10(1):12575.
- 69. Sahai E, Astsaturov I, Cukierman E, DeNardo DG, Egeblad M, et al. (2020) A framework for advancing our understanding of cancerassociated fibroblasts. Nat Rev Cancer 20(3):174-186.
- 70.Sun H, Cao S, Mashl RJ, Mo CK, Zaccaria S, et al. (2021) Comprehensive characterization of 536 patient-derived xenograft models prioritizes candidates for targeted treatment. Nat Commun 12(1):5086.

- 71.Kanaki Z, Voutsina A, Markou A, Pateras IS, Potaris K, et al. (2021) Generation of non-small cell lung cancer patient-derived xenografts to study intratumor heterogeneity. Cancers 13(10):2446.
- 72. Shi J, Li Y, Jia R, Fan X (2020) The fidelity of cancer cells in PDX models: Characteristics, mechanism and clinical significance. (2020) Int J Cancer 146(8):2078-2088.
- 73. Sprouffske K, Kerr G, Li C, Prahallad A, Rebmann R, et al. (2020) Genetic heterogeneity and clonal evolution during metastasis in breast cancer patient-derived tumor xenograft models. Comput Struct Biotechnol J 18:323-331.
- 74. Wellbrock C (2015) Spatial intra-tumour heterogeneity in acquired resistance to targeted therapy complicates the use of PDX models for co-clinical cancer studies. EMBO Mol Med 7(9):1087-1089.
- 75.Leiting JL, Hernandez MC, Yang L, Bergquist JR, Ivanics T, et al. (2019) Rituximab decreases lymphoproliferative tumor formation in hepatopancreaticobiliary and gastrointestinal cancer patient-derived xenografts. Sci Rep 9(1):5901.
- 76.Butler KA, Hou X, Becker MA, Zanfagnin V, Enderica-Gonzalez S, et al. (2017) Prevention of human lymphoproliferative tumor formation in ovarian cancer patient-derived xenografts. Neoplasia 19(8):628-636.