Accepted version Licence CC BY-NC-ND Please cite as: Relli V. et al. Abandoning the notion of non-small cell lung cancer. Review Trends Mol Med. 2019; 25(7):585-594. doi: 10.1016/ 1 Trends in Molecular Medicine – Opinion i.molmed.2019.04.012. 2 3 Abandoning the notion of non-small cell lung cancer 4 5 Valeria Relli¹, Marco Trerotola^{1,2}, Emanuela Guerra^{1,2} and Saverio Alberti^{1,3}* 6 7 8 ¹ Laboratory of Cancer Pathology, CeSI-MeT, University "G. d'Annunzio", Chieti, Italy 9 ² Department of Medical, Oral and Biotechnological Sciences, University "G. d'Annunzio", Chieti, 10 Italy 11 ³ Unit of Medical Genetics, BIOMORF Department of Biomedical Sciences, University of Messina, 12 Italy. 13 14 *Correspondence: salberti@unime.it (S. Alberti). 15 16 **Author Expertise** 17 V.R. is expert in cancer NGS transcriptome profiling and DNA microarray data meta-analysis in 18 silico and in prognostic profiling of lung cancer subtypes. 19 M.T. has a long-standing experience in cancer-driving genetic and epigenetic alterations and in the 20 functional analysis of driver-gene interaction networks. 21 E.G. has identified key cancer drivers and regulatory signalling pathways, during normal 22 development and in transformed tissues. E.G. has extensive expertise in cluster analysis of 23 determinants of cancer progression with prognostic impact in cancer patients. 24 S.A. has discovered novel classes of oncogenes and of metastatic drivers, together with novel 25 epigenetic and post-transcriptional regulatory mechanisms of tumor progression. S.A. has long-26 standing expertise in the prognostic analysis of large cancer patient case series and in the 27 development of targeted anti-cancer therapies.

Keywords: lung cancer, prognosis, therapy, tumor classification.

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Abstract

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35 Non-small cell lung cancers (NSCLC) represent 85% of lung tumors. NSCLC encompass multiple cancer types, such as adenocarcinomas (LUAD), squamous cell cancers (LUSC) and large cell 36 37 cancers. Among them, LUAD and LUSC are the largest NSCLC subgroups. LUAD and LUSC 38 appear sharply distinct at the transcriptomic level, as well as for control cellular networks. LUAD 39 show distinct genetic drivers and divergent prognostic profiles versus LUSC. NSCLC therapeutic 40 clinical trials indicate differential LUAD versus LUSC response to treatments. Hence, LUAD and 41 LUSC appear as vastly distinct diseases at the molecular, pathological and clinical level. 42 Abandoning the notion of NSCLC may critically help develop novel, more effective subtype-43 specific, molecular alteration-targeted therapeutic procedures.

- 45 Glossary
- **Body mass index (BMI):** body weight divided by the square of body height. The BMI quantifies
- 47 the amount of different tissue components (muscle, fat, and bone), for categorizing that person as
- underweight (under 18.5 kg/m²), normal weight (18.5 to 25), overweight (25 to 30) or obese (over
- 49 30).
- 50 Control pathways: signal transduction cascades, through which individual genes exert their
- effects. Control pathways are non-linear, and converge into networks of multiple, intertwined
- 52 signaling paths. Key components of such networks are represented as nodes. Node-node
- interactions are represented by connecting lines.
- 54 Disease classification: disease classification consolidates knowledge on disease origin,
- 55 pathogenetic mechanism, natural history and response to therapy. This body of knowledge is
- tilized to classify diseases as separate entities.
- Hazard ratio (HR): the ratio of the frequency of adverse events in the two subgroups under
- 58 comparison.
- 59 Immunohistochemistry (IHC): procedure for detecting antigens in tissue sections through
- 60 antibody binding. Antibody-bound enzymes, such as horseradish peroxidase or alkaline
- 61 phosphatase, are used to catalyze a color-producing reaction, which can be visualized and
- 62 quantified under the microscope.
- 63 Kaplan-Meier curves: disease relapse curves, which indicate the time of any adverse event and
- compute the remaining cases as a percentage of patients that remain alive or disease-free at any
- 65 given time. Kaplan-Meier curves depict cancer biological history as a cascade of disease events
- over time.

- 67 **Prognostic impact:** specific genetic changes or protein/mRNA biomarkers can show association to
- distinct cancer groups or to disease severity. The intensity of such association quantifies their
- 69 impact on disease prognosis.
- 70 **Transcriptome:** the ensemble of all RNAs transcribed by the genome in a specific tissue or cell
- 71 type. Transcriptome analysis, whether by RNA sequencing or DNA array hybridization, thus
- 72 provides quantitative details on the trascription of all expressed genes. This information is utilized
- 73 to infer gene function and gene expression regulation.

Lung cancer identity

Lung cancers are traditionally classified as small cell (SCLC) or non-small-cell (NSCLC) [1, 2].

SCLC are malignant tumors which account for approximately 15% of lung cancers and can be identified through their neuroendocrine features [2]. NSCLC account for about 85% of all lung cancers [1, 3] and include any type of lung cancer other than small cell lung carcinomas. Such distinction reflects the different histopathology, disease course and therapeutic options of the two subgroups.

On the other hand, it is unclear whether NSCLC classifications may effectively categorize heterogeneous tumor subgroups and guide corresponding therapeutic strategies [4-6].

Recent influential reviews [3], key therapeutic clinical trials [7, 8], latest NCCN guidelines (V.3 2019, Feb. 12, 2019) (www.nccn.org/professionals/physician_gls/pdf/nscl_blocks.pdf) and the current WHO classification of lung cancer [9, 10] still refer to NSCLC as a tumor classification benchmark (Box 1). On the other hand, experimental and clinical evidence is accumulating, that indicates profound dishomogeneity among NSCLC subtypes, calling into question the founding reason for their joint categorization as NSCLC.

We have analyzed transcriptome profiles, prognostic markers and genetic drivers, versus histopathology, biological history and response to therapy of NSCLC subgroups. Vast diversity between subgroups was revealed for all such parameters (Figure 1, Key Figure). Such sets of indicators are founding elements for disease classification, as they closely associate to disease origin, biological history and outcome. Hence, our findings indicate that the NSCLC classification actually comprise distinct diseases, which should be recognized as such.

Lung cancer fundamentals

SCLC show rapid growth and can develop paraneoplastic syndromes, such as Cushing's disease, carcinoid syndrome, inappropriate production of hormones, neurodegenerative diseases, such as progressive multifocal leukoencephalopathy and subacute cerebellar degeneration. SCLC almost exclusively occur in smokers. Extensive exposure to carcinogens from tobacco smoke induces a high mutational load. *TP53* mutations occur in 75-90% of SCLC, and associate with frequent DNA amplifications and deletions [11, 12], including a nearly obligate loss of *RB1*. Loss of PTEN and activation of PI3K [13] are found in a substantial fraction of cases [2]. Most SCLC are already metastatic at presentation and require to be managed primarily by chemotherapy and radiotherapy.

NSCLC that are localized at the time of presentation can undergo surgery or radiotherapy with curative intent. On the other hand, NSCLC do not respond to chemotherapy as well as SCLC do. NSCLC encompass multiple cancer types, such as adenocarcinomas (**LUAD**), squamous cell

111 (LUSC) and large cell cancers, or mixed histotypes. Among them, LUAD and LUSC represent the 112 largest subgroups [1]. LUAD account for 40% of lung cancers. LUSC squamous cancers represent

about 25-30% of all lung cancers.

Histopathology of LUAD and LUSC

LUAD originate from cells that secrete surfactant components. Morphologic patterns of LUAD include acinar, papillary, solid, micropapillary and invasive-mucinous types. Lepidic components or pure lepidic patterns stand for noninvasive forms, previously classified as bronchoalveolar carcinoma, which can be associated to an invasive mucinous or acinar LUAD. Less frequently, LUAD show colloid, fetal or enteric features. When adenocarcinoma morphology patterns are not clearly apparent, diagnosis can be supported by staining for thyroid transcription factor 1 (TTF-1) or napsin-A, both of which show approximate 80% sensitivity for LUAD identification.

On the other hand, LUSC originate from cells which line the inside of lung airways. WHO reclassified LUSC into keratinizing, nonkeratinizing, and basaloid subtypes [10]. LUSC diagnosis is based on the presence of squamous cell patterns, keratinization and intercellular bridges [14]. When such patterns are not present, LUSC diagnosis can be supported by staining for p40, p63 or cytokeratin 5/6, and the lesion is classified as a non-keratinizing LUSC.

Clinicopathological features of LUAD and LUSC

Although LUAD can occur in smokers, this is the most common type of lung cancer seen in non-smokers. It is more common in women than in men, and it is more likely to occur in younger people than other types of lung cancer, and to present at more advanced stages of disease [15]. In the past 25 years, for unknown reasons, LUAD have replaced LUSC as the most frequent histologic subtype.

LUSC are linked to a history of smoking and are frequently found in the main bronchi, in central regions of the lungs. No significant differences have been detected across LUSC subtypes for clinicopathologic features, location, pleural involvement, lymphovascular invasion, age of appearance, molecular lesions, e.g. EGFR and ALK rearrangements [16] and prognosis [17].

Extrathoracic metastatic disease is found at autopsy in ≈50% of patients with LUSC, 80% of patients with LUAD and large cell carcinomas, versus >95% of patients with SCLC.

Transcriptomic profiles of LUAD versus LUSC

Whole **transcriptome** analysis, through RNA sequencing or array hybridization, provides a quantitative measure of actual transcription rates of all expressed genes. This information allows to gain insight into gene function and gene expression regulation, which, in turn, associate to the

biological processes that trigger the underlying disease. Correspondingly, distinct transcriptomes faithfully correlate to distinct tumor types [1].

Differentially-expressed genes between LUAD and LUSC included main Gene Ontology subgroups [18-22]. Among them, regulatory networks for cell proliferation, DNA replication, DNA repair and RNA splicing. Cellular-structure determinants were also differentially expressed, such as for cytoskeleton assembly, exosome secretion and cell-cell junction formation, which play a key role in tumor-cell loss of differentiation and tissue invasion.

Whole-transcription profiling thus indicates vast diversity in LUAD versus LUSC. These findings are cornerstone for differential classification of LUAD and LUSC as distinct diseases. They also indicate distinct regulatory settings for tumor progression pathways in LUAD versus LUSC, such as for regulation of cell proliferation and tissue invasion, which may have direct impact on the course of the disease.

Driver genetic changes in LUAD versus LUSC

Distinct **driver genetic changes** associate to distinct neoplastic diseases [1]. In lung cancers, the type of mutated oncogene and the cells of origin dictate LUAD versus LUSC formation, tumor aggressiveness and invasive capacity. Recent studies have identified several single nucleotide polymorphisms associated with increased risk for lung cancer development in never smokers, which are mostly LUAD [23]. EGFR mutations and EML4-ALK rearrangements were more frequently associated with LUAD in nonsmokers [15]. Overall, mutations in receptor tyrosine kinases were frequent in LUAD, but rare in LUSC [3]. Systematic analysis of mutated tumor genes [24] identified distinct determinants in LUAD (EGFR, MET, BRAF, TERT) versus LUSC (NOTCH mutations and amplification of FGFR1, SOX2, PIK3CA). Late evolutionary genetic changes appeared correspondingly distinct [3, 24], indicating distinct tumor progression trajectories. A notable example is that of the mutated tumor suppressor gene TP53 [3], which is frequently found at early stages in LUSC, but only at late stages in LUAD, suggesting a distinct role of TP53 during progression of the two tumor histotypes.

Control pathways and signaling networks

Distinct cancer types associate to differential cell **control pathways** [1, 4]. Keratins and other cytoskeletal components take part to terminal differentiation of cornified epithelia [14]. Correspondingly, *KRT5*, *KRT6A* were shown to associate to better prognosis in LUSC. On the other hand, overexpression of most keratins was shown to associate to tumor progression in LUAD (Figure 2) [25], whether by inference with differentiation processes or through perturbation of regulation of tumor stem cells [14]. A driving p53/p63/p73 axis was found strongly associated to

LUSC [26, 27], but not to LUAD (Figure 3). Notably, invasion determinants, such as *SERPINS*, distinctly associated to lung cancer subtypes. *SERPINB5* overexpression associates to bad prognosis of adenocarcinomas, such as LUAD and ductal pancreatic adenocarcinomas [26, 28]. *SERPINB13* down regulation associates with decreased survival in squamous tumors, such as LUSC and head and neck cancers [26, 29].

Overall network analysis [22, 27, 30, 31] indicated that key signaling networks appeared starkly different in LUSC versus LUAD (Figure 3, Table 1). Differentially activated pathways included those of growth factors and growth factor receptors, transcription factors, cell cytoskeleton and cell-cell junction components, together with constituents of the intercellular matrix. Only three genes were found to be shared between LUSC and LUAD networks, i.e. DSG3, TGFBR2, SKP2 (Figure 3). However, DSG3 is a heavy risk factor for LUAD, whereas it is a protective determinant in LUSC. TGFBR2 is vastly protective for LUAD (HR 0.35; P = 2.2e-16), much less so for LUSC (HR 0.76; P = 0.021). Thus, even the few LUSC/LUAD shared determinants appear to play a rather distinct role in the two diseases [26].

Risk factors

Many risk factors are linked to the development of lung cancer, e.g. smoking, lung infections (HPV and *Mycobacterium tuberculosis*), hormonal factors, diabetes mellitus, radon exposure, occupational/domestic exposure to carcinogens and pre-existing lung disease [1, 15]. Main ones among them are smoking and second-hand smoking [23]. LUSC are tightly linked to a history of smoking.

McKay et al. [32] performed a genome-wide SNP lung cancer association study in 29,266 cases and 56,450 controls. They found a strikingly different genetic architecture in LUAD versus LUSC. Altogether, 18 risk-enhancing loci were identified, many of which only associated with LUAD. Data from 1.6 million people and 23,732 incident lung cancer cases showed that body mass index (BMI) associated with an overall decreased risk for NSCLC [33]. However, this associations varied by histological type, as BMI associated with lower risk for LUAD and with a higher risk for LUSC [33]. Hence, risk factor profiles appear profoundly different in LUAD versus LUSC.

Prognostic determinants in LUAD versus LUSC

Prognostic impact stems from fundamental mechanics of tumor progression [13, 34]. Patient prognosis is mostly assessed using **Kaplan-Meier curves** of disease relapse according to risk factors and associated **hazard ratios** (HR). This analysis identified *TROP2*, a widespread driver of cancer growth [13, 34], as having a negative bearing on unselected cases of NSCLC and LUAD [26]. On the other hand, Trop-2 expression did not have a negative impact on LUSC, where it

216 associates to terminal differentiation to cornified cells. This suggested that distinct determinants may associate to distinct functional states and to differential impact on distinct lung cancer 217 218 subgroups. A systematic analysis of a large series of genes differentially overexpressed in LUAD 219 versus LUSC [18, 22] revealed 69 genes, that acted as prognostic determinants. These are 220 summarized in Table 1 and are described in detail in Relli et al. [26]. Remarkably, prognostic impacts in LUAD versus LUSC were only concordant in 10% of the cases [26]. This figure is even 222 lower than that of concordant impact versus benchmark breast cancers (25% of prognostic concordance for LUAD parameters; 31% for LUSC) (Figure 2). 223

In summary, tumor progression trajectories in LUAD and LUSC are distinct. Of note, the prognostic impact of individual determinants was often found blunted, if not entirely obscured, when LUAD and LUSC were categorized together as NSCLC [26] (Figure 2, 3A), suggesting inappropriate averaging of starkly heterogeneous tumor parameters. This correspondingly implies that separate classification of LUAD and LUSC may lead to immediate improvement of clinical prognosis assessment procedures.

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Response to therapy

- 232 Chemotherapy
- 233 In 2002 a pivotal study by Schiller et al. [35] compared four different chemotherapy regimens for
- 234 advanced NSCLC. The response rate and survival did not significantly differ between patients
- 235 assigned to receive any of the four regimens, Based upon those results, clinicians generally didn't
- 236 distinguish LUAD and LUSC, since the management was identical. However, in 2011, Scagliotti
- 237 and colleagues reported a phase III trial finding that pemetrexed/platinum was superior to
- gemcitabine/platinum in LUAD and equally inferior in LUSC. This trial formed the clinical basis 238
- 239 for distinguishing between the two histologies [36].
- 240 More recently, the tumor suppressor FBW7 was found frequently mutated or down-
- 241 regulated in human LUSC, and FBW7-linked LUBAC-mediated NF-κB signaling was identified as
- a determinant of chemotherapy resistance. Inhibition of NF-κB activation using TAK1 or LUBAC 242
- 243 inhibitors resensitized LUSC tumors to cisplatin, suggesting avenues for more effective
- 244 chemotherapeutic management of LUSC [37].

- 246 *Molecular-targeted therapy*
- 247 Recently, targeted anti-VEGF bevacizumab therapy was found to improve the survival of LUAD-
- 248 bearing patients [4], whereas it ended up as contraindicated in patients with LUSC because of fatal
- 249 hemoptysis [4]. On the other hand, the anti-EGFR necitumumab was only found effective in LUSC

[4]. ALK rearrangements, ROS1 fusions and BRAF mutations prevail in LUAD, whereby they provide actionable mutations for targeted therapy [4].

ASCO guidelines on systemic therapy for stage IV NSCLC recommended afatinib, erlotinib, or gefitinib for tumors bearing sensitizing EGFR mutations; crizotinib for those with ALK or ROS1 gene rearrangement. In the second-line setting, recommendations include docetaxel, erlotinib, gefitinib, or pemetrexed for patients with LUAD; docetaxel, erlotinib, or gefitinib for those with LUSC: and chemotherapy or ceritinib for those with ALK rearrangement who experience progression after crizotinib. [38].

Efficacy of osimertinib was amply assessed in EGFR T790M bearing tumors [5-7, 39-43]. In the FLAURA trial [NCT02296125], osimertinib showed efficacy superior to that of standard erlotinib/gefitinib in the first-line treatment of EGFR mutation-positive advanced NSCLC, with a similar safety profile and lower rates of serious adverse events [7]. The EGFR T790M mutation is more prevalent in LUAD than in other NSCLC [39]. However, only a minority of studies on osimertinib utilized subgroup classification for therapy outcome evaluation [6, 43]. EGFR mutations are found in 10-15% of patients with NSCLC. However, as essentially all of them occur in LUAD, they can account for up to a quarter of these cases. Hence, a subgroup analysis in NSCLC therapeutic clinical trials, as based on both histology and mutation spectrum, is recommended.

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Immune-checkpoint inhibitors

Immune-checkpoint inhibitors, albeit being effective in multiple cancer types, appear differentially active in LUAD versus LUSC [44], though ongoing large phase III studies may shed additional light on this issue. Nivolumab, a monoclonal antibody that blocks programmed death 1 (PD-1) proteins, was recently approved by the FDA for use in patients with advanced LUSC. Pembrolizumab, an anti-PD-1 antibody, in combination with pemetrexed, and platinum 275 chemotherapy was recently approved by EMA as first-line treatment of metastatic LUAD.

Atezolizumab in combination with carboplatin/paclitaxel/bevacizumab, was recently granted FDA approval in untreated LUAD patients. Consistent, the addition of atezolizumab to bevacizumab plus chemotherapy significantly improved progression-free survival and overall survival among patients with metastatic LUAD, regardless of PD-L1 expression and EGFR or ALK genetic alteration status [45]. It should be noted that no responses were seen upon pembrolizumab treatment in EGFR mutated tumors. As high PD-L1 expression does not exclude the presence of a targetable mutation, if both are present, the targetable mutation should thus be treated first.

Of note, durvalumab, an anti-PD-L1 antibody, was recently tested after treatment with chemoradiotherapy [8]. In contrast with the above evidence of subtype specificity of both immune checkpoint inhibitors and pemetrexed [36], as yet no subtype-specific data analyses have been made available in this seminal study, suggesting that reevaluation of current guidelines on the use of the NSCLC categorization is an urgent need.

Concluding Remarks

- A large body of experimental evidence indicates that LUAD and LUSC are vastly distinct diseases at the molecular, pathological and clinical level. Hence, different diagnostic, prognostic and therapeutic procedures should be followed in patients bearing LUAD or LUSC. Challenges remain, as adequately powered analyses will be required to assess corresponding parameters on remaining NSCLC subgroups, the lesser incidence of which has prevented as yet correspondingly detailed analyses. A distinct need is that for large cell carcinomas, because of the severe clinical course of such a disesase [1].
- We envisage, though, that it will soon be possible to develop molecular signatures that would sharply distinguish among lung cancer subgroups, as driven by distinct clusters of activated oncogenes, such as mutated *EGFR*, *ALK*, *ROS1*, *TP53*, *MET*, *BRAF*, *TERT*, *NOTCH*, *FGFR1*, *SOX2*, *PIK3CA* and others [3, 24].
- Of note, MET amplification can mediate primary and secondary resistance of EGFR mutant forms to targeted tyrosine kinase inhibitors [46, 47], suggesting benefit for the simultaneous inhibition of the two genes. Correspondingly, combined EGFR and RET inhibition is performed in case of acquired resistance to osimertinib in EGFR-mutant NSCLC carrying RET fusions [48]. Hence, cluster analysis of lung cancer oncogenic determinants may impart therapeutic indications. Mutated oncogene clusters occur with distinct frequency in LUAD versus LUSC. It is thus expected that better knowledge of oncogenic drivers of LUAD and LUSC and of corresponding molecular signatures may rapidly lead to much more effective, subgroup-specific therapies.

Finally, as genetic drivers and tumor control networks at work in LUAD versus LUSC are vastly diverse, a wealth of novel targets is provided, for developing novel, cancer-subgroup focused, molecular-targeted therapies. Hence, abandoning the notion of NSCLC, for adopting a subtype-centered tumor classification, is expected to critically help develop better personalized diagnostic, prognostic and therapeutic procedures (See Outstanding Questions).

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Table 1. Genes sets identified as differentially expressed in LUAD versus LUSC

Category	Expression/Cell function	Genes	Refs.
Diagnostic determinants by differential expression	Expression in LUAD	ABCC5, YWHAS, TMPRSS11D, FOXE1, SNA12, GRHL3, HsT19447, PARD6G, PTHLH, SOX2, S100A, CLCA2, DLX5, ST6GALNAC2, GPC1, PTPRZ1, JAG1, CSTA, DSG3, SERPINB13, VSNL1, TRIM29, ATP1B3, KRT14, PERP, KRT17, SERPINB5, PPKNEFD, KRT6A, KRT5, COL7A1, FGFBP1, SLC2A1, SFTA2, COL4A6	[18]
	Expression in LUSC	TMEM125, NKX2-1/TTF1, CLDN3, KCNK5, TMC5, CGN, ACSL5, TESC, FOLR1, RORC, QSOX1, KRT7, SFTA3, CEACAM6, ATP11A, PLEKHA6	
Top discriminants of LUAD versus LUSC	Omnibus gene expression profiles	HSP90AA1, BCL2, CDK2, KIT, HDAC2	[49]
	Gene interaction networks	E2F, CTGF, PDGF	[21]:
Pathway- based diagnostic gene signatures	Regulation of Epidermis development	HsT19447, COL7A1, KRT5, KRT14, KRT17, PTHLH, GRHL3	[19, 20, 22]
	Regulation of intermediate filament components	KRT5, KRT6A, KRT14, KRT17, PPKNEFD	
	Regulation of Exosome formation	ATP1B3, CSTA, DSG3, YWHAS, GPC1, KRT5, KRT6A, KRT6B, KRT14, KRT17, SERPINB5, SERPINB13, SLC2A1, TMPRSS11D, PPKNEFD	
	Regulation of cell proliferation	IGF1R, GSK3B, ATR, SKP2, CDK1, CDK2, SMC3, PLK1, CCND3	
	Regulation of DNA replication and repair	RFC2, PRIM2, MCM4, MCM5, ATR	
	Regulation of RNA splicing Regulation of cell-cell junction formation	PRPF19, SRSF2, THOC4 TGFBR2, CTNND1, CKD4, CASK, MPP5	

441 Figure legends

- Figure 1. Key Figure. NSCLC subtype-feature identification.
- 443 Top: block diagrams of comparative analyses of NSCLC subgroups for diagnostic, prognostic and
- 444 therapeutic procedures.
- Transcriptomics: DNA array analysis flow chart; Genomics: gene mutation sequence analysis
- 446 (TP53 mutation chromatogram; wild-type: blue peak; mutated: red peak); Histopathology
- expression pattern of diagnostic/prognostic proteins in adenocarcinomas (LUAD) versus squamous
- cell carcinomas (LUSC) (www.proteinatlas.org) (GLUT1 protein staining).
- 449 Bottom: tumor-subtype-specific subgrouping.
- 450 Prognostic profile: Schematics of Kaplan-Meier survival curves for high (red) versus low (black)
- 451 target gene expression (DSG3 mRNA). Interaction networks: protein-protein interaction networks
- of overexpressed genes in LUAD versus LUSC.

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454 Figure 2. Analysis of prognostic determinants in LUAD and LUSC versus breast cancer.

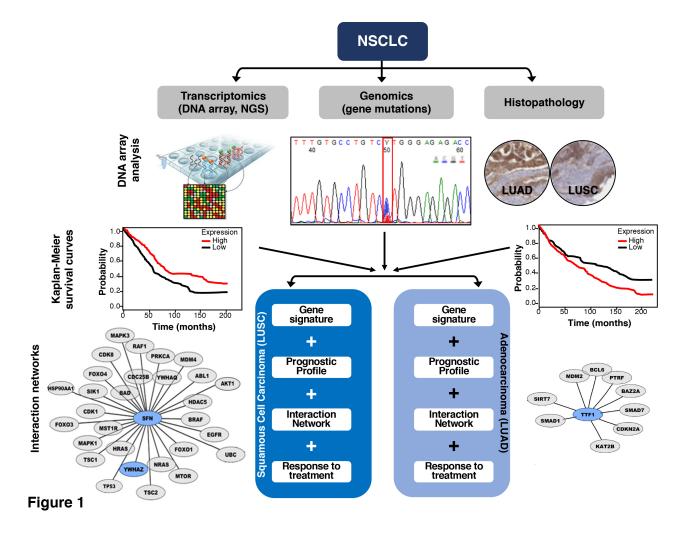
- 455 (A) Representative examples of Kaplan-Meier survival curves of LUAD, LUSC and breast cancer-
- bearing patients, as obtained from Relli et al. [26]. Correlation between survival curves and tumor
- histology was computed. Tumor samples were analyzed for mRNA levels for each of the markers
- analyzed by DNA microarray hybridization or next-generation sequencing. Histopathology data and
- immunohistochemistry analysis of randomly selected subsets of individual tumors were utilized for
- validation of gene expression at the protein level. Patient survival was compared for cases that
- showed high (red) versus low (black) tumor expression of the genes indicated on the right. Median
- survival, hazard ratios and correlated P values are indicated.
- TMPRSS1D is a favorable prognostic determinant for LUSC, that shows corresponding impact on
- breast cancer, but not on LUAD.
- 465 ACSL5 is a favorable prognostic determinants for LUAD, which shows corresponding impact on
- breast cancer, but not on LUSC.
- 467 CLDN3 is an unfavorable prognostic determinants for LUAD, which show corresponding impact
- on breast cancer, but not on LUSC.
- 469 (B) Bar plots show the hazard ratio/prognostic impact of the genes indicated on LUAD, LUSC and
- benchmark breast cancers, as computed in Relli et al. [26].
- 471 (top) diagnostic genes for LUSC.
- 472 (bottom) diagnostic genes for LUAD.
- The genes are listed in alphabetical order. The red bars indicate hazard ratios = 1. The graphs are
- 474 plotted on a log scale.

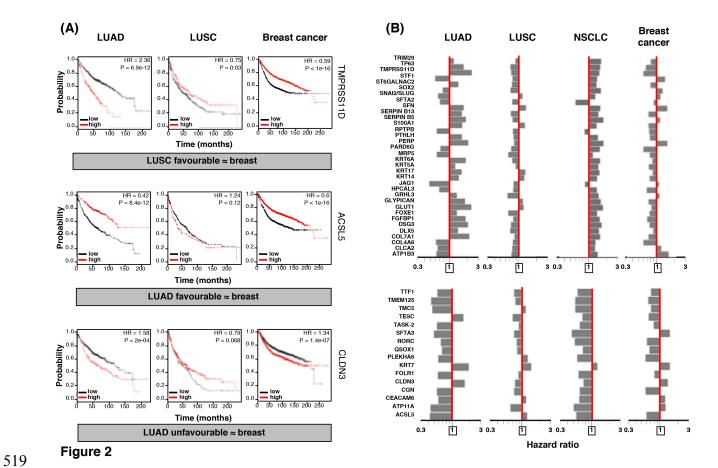
- 476 Figure 3. LUAD versus LUSC control gene networks.
- 477 (A) Prognostic determinant sets in LUAD versus LUSC. Genes with positive prognostic impact are
- highlighted in red, tumor progression determinants are in blue.
- 479 (B) Graphical representation of control gene networks of LUAD versus LUSC, as modified from
- 480 Relli et al. [26]. Genes are represented as nodes, biological relationships between nodes are
- 481 represented as lines (network edges). Direct relationships, solid lines; indirect relationships, dashed
- lines. Shared determinants between LUSC and LUAD networks are highlighted in red; genes
- identified in LUSC are in blue; gene interactors are in white.

486 Clinician's Corner (Box 1) 487 488 Lung tumors are classified as small-cell (SCLC) or non-small cell lung cancer (NSCLC). The usefulness of distinguishing NSCLC from SCLC is clear. The NSCLC classification, on the other 489 hand, is raising issues of appropriateness and usefulness, as mounting clinical and experimental data 490 491 indicate great heterogeneity among NSCLC subtypes. 492 493 Vast diversity was found in genetic drivers of cell transformation in adenocarcinomas (LUAD) 494 versus squamous cell lung cancers (LUSC), suggesting distinct tumor progression trajectories. This 495 associated to great diversity of gene transcription profiles and of cellular control networks. 496 497 Consistent with profound diversity between tumor types, distinct biomarkers, prognostic indicators 498 and tumor progression paths were found in LUAD versus LUSC. Correspondingly, joint 499 categorization of LUAD and LUSC as NSCLC was shown to blunt prognostic impact estimates, 500 due to averaging of heterogeneous tumor parameters. Hence, separate classification of LUAD and 501 LUSC is expected to lead to immediate improvement of clinical prognostic determination 502 procedures. 503 504 The therapeutic-response profiles of LUAD versus LUSC are correspondingly different. Targetable 505 tyrosine kinase mutations essentially are only present in LUAD. Profoundly different response of 506 the two NSCLC subtypes to immune check-point inhibitors and to pemetrexed-based chemotherapy 507 has also been shown. 508 509 Recent influential reviews, therapeutic clinical trials, and current NCCN and WHO guidelines still refer to NSCLC as a tumor classification benchmark. Hence, formally abandoning the notion of 510 511 NSCLC appears urgently needed. This is expected to critically help develop novel, more effective, subtype-specific diagnostic, prognostic and therapeutic procedures. 512

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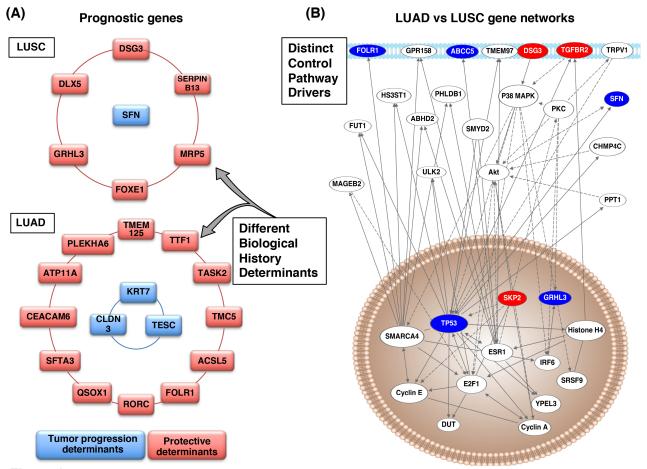


Figure 3