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Original Research

Prevalence, clinical and molecular characteristics of early stage EGFR-mutated lung cancer in a real-life West-European cohort: Implications for adjuvant therapy



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## **KEYWORDS**

NSCLC; Early stage non-small cell lung cancer; Molecular diagnostics; Adjuvant therapy; Tyrosine kinase inhibitors

Abstract Objectives: The landmark ADAURA study recently demonstrated a significant disease-free survival benefit of adjuvant osimertinib in patients with resected EGFR-mutated lung adenocarcinoma. However, data on prevalence rates and stage distribution of EGFR mutations in non-small cell lung cancer in Western populations are limited since upfront EGFR testing in early stage lung adenocarcinoma is not common practice. Here, we present a unique, real-world, unselected cohort of lung adenocarcinoma to aid in providing a rationale for routine testing of early stage lung cancers for *EGFR* mutations in the West-European population.

Material and methods: We performed routine unbiased testing of all cases, regardless of TNM stage, with targeted next-generation sequencing on 486 lung adenocarcinoma cases between 01- January 2014 and 01 February 2020. Clinical and pathological data, including comutations and morphology, were collected. EGFR-mutated cases were compared to KRASmutated cases to investigate EGFR-specific characteristics.

Results: In total, 53 of 486 lung adenocarcinomas (11%) harboured an EGFR mutation. In early stages (stage 0-IIIA), the prevalence was 13%, versus 9% in stage IIIB-IV. Nine out of 130 (7%) stage IB-IIIA patients fit the ADAURA criteria. Early stage cases harboured more L858R mutations ( $p = 0.02$ ), fewer exon 20 insertions ( $p = 0.048$ ), fewer TP53 co-mutations  $(p = 0.007)$ , and were more frequently never smokers  $(p = 0.04)$  compared to late stage cases

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with *EGFR* mutations. The *KRAS*-mutated cases were distributed more evenly across TNM stages compared to the EGFR-mutated cases.

**Conclusion:** As (neo-)adjuvant targeted therapy regimes enter the field of lung cancer treatment, molecular analysis of early stage non-small cell lung cancer becomes relevant. Testing for EGFR mutations in early stage lung adenocarcinoma holds a substantial yield in our population, as our number needed to test ratio for adjuvant osimertinib was 14.4. The observed differences between early and late stage disease warrant further analysis to work towards better prognostic stratification and more personalised treatment.

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#### 1. Introduction

Almost 30% of patients with non-small cell lung cancer (NSCLC) present with resectable early stage disease [[1](#page-8-0)]. Unfortunately, recurrence rates after resection are high: up to 50% of patients present with lung cancer recurrence within 5 years, which underscores the need for effective (neo)adjuvant treatment strategies [[2](#page-8-1)]. Currently, in most patients with completely resected stage II-IIIA disease, adjuvant platinum-based chemotherapy is recommended. However, the 5-year survival benefit of adjuvant chemotherapy remains limited [[3](#page-8-2)]. Therefore, certain therapies that have proven to be effective in the advanced setting, such as immunotherapy and tyrosine kinase inhibitors (TKI), are now also of interest for the adjuvant setting. For instance, the landmark ADAURA trial has recently led to the approval of osimertinib, a third-generation TKI, as adjuvant treatment after complete resection in patients with stage IB-IIIA NSCLC harbouring *EGFR* exon 19 deletions or L858R substitution mutations [[4\]](#page-8-3).

Pathogenic mutations in the EGFR gene are one of the most common oncogene driver mutations in metastatic NSCLC. The incidence of EGFR mutations in advanced non-squamous NSCLC varies greatly, from around 10% in West-European populations, to as high as  $64\%$  in the East Asian population  $[5-11]$  $[5-11]$  $[5-11]$  $[5-11]$  $[5-11]$ . The introduction of TKIs that inhibit the downstream pathways of EGFR has greatly improved the outcome of patients with metastatic EGFR-mutated NSCLC [[12,](#page-9-0)[13](#page-9-1)]. Osimertinib increased the median progression-free survival to 18.9 months [[12\]](#page-9-0) and the overall survival to 38.6 months [\[14](#page-9-2)]. Recently, the ADAURA investigators also demonstrated a substantial clinical benefit of adjuvant osimertinib in patients with resected EGFR-mutated lung adenocarcinoma. The study was discontinued early due to a significant efficacy benefit shown at interim analysis: patients with stage IB-IIIA disease receiving adjuvant osimertinib had a 24-month disease-free survival of 89%, versus only 52% in the placebo group  $(p < 0.001)$ , with a hazard ratio of 0.20 for disease recurrence and death [\[4](#page-8-3)]. However, currently the secondary end-point of overall survival remains immature and is hampered by the early unblinding of the study.

Until now, molecular screening for EGFR has only been routinely performed as part of standard care in stage IIIB and IV disease to select patients for treatment with osimertinib or other *EGFR* TKIs [[5,](#page-8-4)[6](#page-8-5)[,15](#page-9-3)]. The expansion of routine molecular analysis to all early stage lung adenocarcinomas to select patients for adjuvant treatment warrants a well-founded approach. To construct such an approach, several questions still need to be answered. There is a considerable amount of literature available on the prevalence of EGFR mutations in late stage NSCLC and in the East Asian population  $[16]$  $[16]$ . However, as upfront *EGFR* testing in early stage disease is not common practice, most reports on early stage EGFR-mutated lung adenocarcinoma are from preselected cohorts, often enriched for EGFR mutations [\[17](#page-9-5)]. Therefore, it is still unclear how prevalent EGFR mutations are in early stage EGFR-mutated lung adenocarcinomas in the Western population, and how to identify the patients who are at higher risk of recurrence and would therefore potentially have greater benefit of adjuvant treatment. These lacunae are essential to fill, as they could have implications for justified patient selection for adjuvant TKI treatment.

In the Erasmus Medical Center in Rotterdam, the Netherlands, all lung adenocarcinomas are subject to targeted next-generation sequencing (NGS) testing regardless of TNM stage, so-called 'reflex-testing'. This provides a unique opportunity to investigate the realworld prevalence of EGFR mutations in early stage NSCLC in a West-European patient population. Here, we present our prospective unselected cohort of consecutive lung adenocarcinomas that were diagnosed in our centre over the course of 6 years, using patients with KRAS-mutated NSCLC as a comparator for EGFR-mutated NSCLC. Additionally, we investigated the clinicopathological features, such as co-mutations and morphology, that are potentially associated with a higher risk for disease recurrence in early stage EGFRmutated NSCLC.

## 2. Materials and methods

## 2.1. Case collection and study setup

All in-house lung adenocarcinoma core needle biopsies, cytology specimens or resection samples of the Erasmus Medical Center Rotterdam (EMC) that were submitted to the pathology department for routine diagnostic purposes between 01 January 2014 and 01 February 2020- were evaluated for inclusion. Cases had to have been analysed with targeted DNA NGS with a customised oncogene-panel and have complete TNM staging for inclusion. In the case of multiple primary tumours per patient, each primary adenocarcinoma was eligible for inclusion if NGS had been performed. Both cytology and histology specimens were included, consisting of metastatic as well as primary tumour specimens. Only primary diagnostic specimens were allowed; liquid biopsy specimens and sequential biopsies after start of systemic treatment were excluded. Cases with insufficient tissue for DNA NGS or without complete TNM staging were excluded, which for example occurred if the patient opted to be referred to another medical centre for staging or if the patient was terminally ill with a concurrent disease.

To investigate whether possible differences between early and late stage cases are EGFR-specific, we compared the EGFR cases to the KRAS-mutated cases of our cohort.

## 2.2. DNA isolation

Formalin-fixed paraffin-embedded (FFPE) tissue, including cytology cell blocks, was used for DNA isolation. The DNA was isolated as previously described [\[18](#page-9-6)]. The acquired DNA was stored at  $-20$  °C until analysis.

## 2.3. DNA NGS

For targeted DNA NGS, an IonTorrent custom targeted NGS panel was used, including the following genes: CDKN2A (coverage 98%), PTEN (coverage 94%), TP53 (coverage 100%) and mutation hotspots in AKT1 (exon 3), ALK (20, 22-25), APC (14), ARAF (7), BRAF (11, 15), CTNNB1 (3, 7, 8), EGFR (18-21), HER2 (19-21), EZH2 (16), FBWX7 (9, 10), FGFR1 (4, 7, 12), FGFR2 (7, 9, 12), FGFR3 (7, 9), FOXL2 (1), GNA11 (4, 5), GNAQ (4, 5), GNAS (8, 9), HRAS (2-4), IDH1 (4), IDH2 (4), KIT (8, 9, 11, 13, 14, 17), KRAS (2-4), MAP2K1 (2, 3), MET (2, 14, 19), MYD88 (5), NOTCH1 (26, 27), NRAS (2-4), PDGFRA (12, 14, 18), PIK3CA (10, 21), POLD1 (12), POLE (9, 13), RAF1 (7), RET (11, 16), RNF43 (3, 4, 9), ROS1 (38, 41), SMAD4 (3, 9, 12),  $STK11$  (4, 5, 8) and *TERT* promotor, as previously described [[19\]](#page-9-7). Copy number calling was performed with SNPitty [\[20](#page-9-8)[,21](#page-9-9)].

Genomic alterations were classified according to the ACMG/AMP consensus paper in five classes of ascending likelihood of pathogenicity [\[22](#page-9-10)]. For EGFR mutations, both class 4 or 5 pathogenic mutations and variants of unknown significance (VUS) were included. We considered non-*EGFR* and non-*KRAS* mutations as co-mutations, including other driver mutations. Only class 4 and 5 pathogenic mutations were included, VUS were not considered co-mutations. Pathogenicity was assessed with reference databases, including Alamut, ClinVar, IARC, CKB and cBioportal. KRAS mutations were classified in G12C, G12D, G12V, Q61H and other mutations.

Additionally, we assessed the immunohistochemical expression pattern of  $p53$  in the *EGFR*-mutated cases if available.

#### 2.4. Clinical parameters

For all cases, clinical data regarding age at diagnosis, TNM stage (7th edition) and sex were collected. For patients with EGFR-mutated adenocarcinoma, we collected additional data on the smoking history, recurrence-free survival (RFS) for early stage cases, previous cytotoxic therapy for another malignancy, follow-up time, symptoms at the time of diagnosis and prior lung cancer screening or monitoring. Stage 0-IIIA were considered early stage disease, and stage IIIB and IV were considered late stage disease. RFS was defined as time from date of diagnosis until disease recurrence.

Patients were categorised as 'current smokers' if they smoked in the month before diagnosis. Patients were considered to be 'former smokers' if they quit smoking at least 1 month before diagnosis. Patients were considered to be 'never smokers' if they had accumulated less than one pack year and had not smoked in the month before diagnosis.

#### 2.5. Morphology

Growth patterns were assessed by one or multiple experienced thoracic pathologists, using a continuous score for each of the following categories: percentage lepidic, percentage acinar-papillary, percentage micropapillary-solid. The continuous scores for each category were used to assess the 'most prevalent growth pattern' and the 'worst growth pattern'. The 'most prevalent growth pattern' was the pattern which was most prevalent. If two patterns were equally prevalent, the worst growth pattern was used as the most prevalent growth pattern.

Literature has previously suggested that the type of growth pattern has potential prognostic value, with micropapillary-solid having the worst prognosis, followed by acinar-papillary, and a lepidic growth pattern having the most favourable prognosis [\[23](#page-9-11)]. We therefore also scored the cases according to the pattern with the

assumed worst prognosis, i.e. the 'worst growth pattern', to evaluate whether the presence of a less favourable growth pattern indeed has prognostic value. Growth pattern assessment was only performed for cases in which tissue from the primary tumour was available. Cytology specimens and metastasis biopsies were not scored for growth pattern. Examples of these scoring systems are outlined in Supplementary Table 1.

#### 2.6. Statistics

We used IBM SPSS Statistics software, version 25 for statistical analysis. Statistical significance was set at  $p < 0.05$ . Categorical data were compared using the chisquare test or Fisher exact test, as appropriate. For tdistributed stochastic neighbour embedding (t-SNE) data visualisation, we adapted the dataset. We normalised all continuous and ordinal data, such as age and TNM stage to values between 0 and 1. We used one-hotencoding for non-ordinal categorical data, including

<span id="page-4-0"></span>Table 1

Case overview per TNM stage (TNM  $7<sup>th</sup>$  edition).

Case characteristics	All cases $(n = 486)$	EGFR-mutated $(n = 53)$	KRAS-mutated $(n = 129)$	
Stage 0	11 $(2%)$	3(6%)	$3(2\%)$	
Stage IA	114(23%)	$21(40\%)$	31 $(24%)$	
Stage IB	38 $(8%)$	4(8%)	13 $(10\%)$	
Stage IIA	16(3%)	2(4%)	$3(2\%)$	
Stage IIB	17 $(3%)$	$\theta$	5 $(4%)$	
Stage IIIA	59 (12%)	3(6%)	13 $(10\%)$	
Stage IIIB	25(5%)	$1(2\%)$	7(5%)	
Stage IV	206(42%)	$19(36\%)$	54 (42%)	
Early stage (0-IIIA)	255 (52%)	33 $(62\%)$	68 (53%)	
Late stage (IIIB-IV)	231 (48%)	20 (38%)	61 $(47%)$	

EGFR mutations and co-mutations. We performed mean imputation for missing values in normally distributed continuous data and binary data. We performed median imputation for missing non-normally distributed continuous data and categorical data [[24\]](#page-9-12). T-SNE was created with Python 3.7, using scikit-learn and perplexity values of 4 and 12 to plot these t-SNE figures [\[25](#page-9-13)]. The stage labels were excluded from the t-SNE data.

#### 2.7. Ethics

This study was approved by the local medical ethical committee, registration number: MEC-2020-0732. Informed consent was not necessary and patient data were anonymised before processing.

## 3. Results

## 3.1. Case characteristics

We included 486 new lung adenocarcinoma cases, 53 (11%) harboured an EGFR mutation and 129 (27%) harboured a *KRAS* mutation. Cases were spread unevenly across TNM stages, with fewer patients in stage 0 (in situ carcinoma) and II and more patients in stage I and IV ([Table 1](#page-4-0)).

#### 3.2. Prevalence of EGFR mutations per TNM stage

EGFR mutations were more prevalent in early stage adenocarcinoma (13% of stage 0-IIIA patients harboured an EGFR mutation), compared to late stage (9% of stage IIIB-IV patients harboured an EGFR

<span id="page-4-1"></span>

Fig. 1. Mutation prevalence across stages. Prevalence of EGFR-mutated cases, KRAS-mutated cases and other cases per TNM stage (TNM 7th edition). Blue: EGFR; Orange: KRAS; Green: other cases. KRAS is evenly distributed across stages, whereas EGFR prevalence differs across stages.

#### <span id="page-5-0"></span>Table 2

Significant differences between early stage  $EGFR$ -mutated lung adenocarcinomas ( $n = 33$ ) and late stage  $EGFR$ -mutated lung adenocarcinomas  $(n = 20)$ . Co-mutations were assessed only in cases with complete coverage of the panel, as described in the Methods. Predominant growth pattern was not available for cytology and metastasis specimens. P-values were calculated with (a) Fisher's exact test or (b) chi-squared test. For categories 'smoking status' and 'prior to diagnosis', missing data were omitted from percentage calculations and statistic testing. \* 'Other' *EGFR*<br>mutations included p.G779F, p.G719A and p.L861R. \* 'Other' *EGFR* mutatio p.V774L.

Feature n $(\% )$	Early stage $EGFR (n = 33)$	Late stage $EGFR$ (n = 20)	p-value	Early stage $KRAS$ (n = 68)	Late stage $KRAS$ (n = 61)	p-value
<b>EGFR L858R</b>		3(15%)	0.02 <sup>a</sup>	N/A	N/A	N/A
	15(45%)					
<i>EGFR</i> exon 20 ins	2(6%)	5(25%)	$0.048^{\rm a}$	N/A	N/A	N/A
EGFR exon 19 del	13 $(39%)$	9(45%)	0.7 <sup>a</sup>	N/A	N/A	N/A
Other EGFR	$3*(9%)$	3'(15%)	$0.5^{\mathrm{a}}$	N/A	N/A	N/A
TP53	9(27%)	13 $(65\%)$	$0.007^{\rm a}$	21(31%)	32 $(52%)$	0.02 <sup>a</sup>
TP53 disruptive	$\boldsymbol{0}$	$8(40\%)$	${<}0.001$ <sup>a</sup>	6(9%)	9(15%)	0.4 <sup>a</sup>
Most prevalent growth pattern			0.003 <sup>b</sup>			0.6 <sup>b</sup>
Lepidic	20(65%)	$0(0\%)$		22(38%)	6(33%)	
Acinar or papillary	9(29%)	3(15%)		31(53%)	$9(50\%)$	
Solid or micropapillary	2(6%)	3(15%)		5(9%)	3(17%)	
Not scored	2(6%)	14 $(70\%)$				
<b>Smoking status</b>			${<}0.001^{\rm b}$			$0.4^{\rm b}$
Never smoker	21(64%)	1(5%)		2(3%)	$\mathbf{0}$	
Former smoker	$10(30\%)$	15(75%)		34 $(56\%)$	27(48%)	
Current smoker	2(6%)	4 $(20\%)$		25(41%)	29(52%)	
Unknown	$\bf{0}$	$\mathbf{0}$		$7(10\%)$	5(8%)	
<b>Prior to diagnosis</b>			$0.02^{\rm a}$			0.7 <sup>a</sup>
Prior follow-up	9(27%)	$\theta$		5 $(9%)$	1(4%)	
No prior follow-up	24(73%)	19 $(100\%)$		52 (91%)	$26(96\%)$	
Unknown	$\boldsymbol{0}$			11	34	

mutation). The percentage of patients harbouring EGFR mutations was especially high in stage 0 (27%) and 1A  $(18\%)$ , compared to the other stages (p = 0.03) ([Fig. 1](#page-4-1)). Of the 33 patients with early stage EGFR-mutated NSCLC, 9 (27%) fit the ADAURA criteria (L858R mutation or exon 19 deletion, stage IB-IIIA). Since we included 130 stage IB-IIIA in our EMC cohort, the number of stage IB-IIIA cases needed to test in order to identify one patient eligible for adjuvant osimertinib following the ADAURA regimen, is 14.4.

## 3.3. Characteristics of early versus late stage EGFRmutated adenocarcinoma

We compared clinical, molecular and morphological parameters between the early stage and the late stage EGFR cases ([Table 2\)](#page-5-0), as well as between EGFR and KRAS cases [\(Fig. 2](#page-6-0)). EGFR-mutated, early stage cases harboured significantly more EGFR L858R mutations  $(45\%$  versus 15%,  $p = 0.02$ ) and were more likely to have a predominantly lepidic growth pattern (65% versus  $0\%$ ,  $p = 0.003$ ) than the late stage *EGFR*mutated cases. Late stage cases more often harboured EGFR exon 20 insertions (25% versus 6%,  $p = 0.048$ ) and were enriched for TP53 co-mutations (65% versus  $27\%$ , p = 0.007). Within the TP53 mutated cases, late stage harboured more disruptive TP53 mutations than early stage cases (40% versus 0%,  $p < 0.001$ ). The *KRAS* early and late stage cohorts differed with regard to TP53 mutation prevalence (31% versus 52%, respectively,  $p = 0.02$ , with late stage cases again harbouring more disruptive TP53 mutations, though not significantly  $(15\%$  versus 9%, p = 0.4).

Additionally, early and late stage EGFR-mutated cases differed significantly with regard to smoking history ( $p = 0.04$ ). We did not identify differences in age, sex, and worst growth pattern between early and late stage disease. In eight of the  $TP53$  mutated cases  $p53$ immunohistochemistry was performed, seven showed strong nuclear expression for p53, whereas one had absent nuclear expression.

Prior to diagnosis, nine patients (27% of all early stage EGFR-mutated cases) were monitored with computed tomography (CT) scans for a 'ground glass' lesion or pulmonary node, for an average time period of 3.1 years (range  $1-7$  years). Of these cases, four harboured a L858R mutation, four an exon 19 deletion, and one an exon 20 insertion. Four cases harboured a nondisruptive TP53 mutation. Seven had a predominantly lepidic growth pattern, and the remaining two cases had acinar growth patterns. Two other patients were not monitored, but the tumour had in retrospect been visible on previous imaging, 15 and 17 years prior to the diagnosis, respectively.

From the 486 included cases, 129 were KRASmutated, including 68 early stage and 61 late stage cases. The characteristics for the KRAS cohort are outlined in Supplementary Table 2. The EGFR-mutated and KRAS-mutated cohorts differ with regard to smoking history and pre-diagnosis follow-up, with more current

<span id="page-6-0"></span>

Fig. 2. Unsupervised clustering of EGFR- and KRAS-mutated cases. Unsupervised clustering, using t-distributed stochastic neighbour embedding (t-SNE). A: t-SNE of EGFR-mutated lung adenocarcinoma features, perplexity value 4. B: t-SNE of KRASmutated lung adenocarcinoma features, perplexity value 12. Blue dots: early-stage (0-IIIA, TNM 7th edition); yellow dots: late stage (IIIB-IV). Features used for this t-SNE include smoking history, symptoms, prior follow-up, T-stage, sex, age, growth pattern, EGFR mutations, KRAS mutations and co-mutations.

smokers in the  $KRAS$  cohort (42% versus 11%,  $p < 0.001$ ), more never-smokers in the *EGFR* cohort  $(28\%$  versus  $2\%$ ,  $p < 0.001$ ) and more often prediagnosis follow-up in the  $EGFR$  cohort (17% versus 5%,  $p = 0.03$ ). In contrast to the *EGFR*-mutated cases, the KRAS-mutated cases were distributed more evenly across TNM stages [\(Fig. 1\)](#page-4-1). Also, EGFR early and late stage cases differed significantly with regard to mutation type, predominant growth pattern and co-mutation prevalence, whereas this was not the case for the KRAS cohort.

#### 3.4. Recurrence free survival (RFS)

Within the early stage *EGFR* cases ( $n = 33$ ), three patients (9%) had presented with disease recurrence after 7, 48, and 60 months respectively; 12 patients (36%) were recurrence-free for at least 2 years after resection; and 18 (55%) patients had a follow-up duration of less than 2 years. Type of EGFR mutation, presence of TP53 mutations and clinical characteristics for the recurrencefree, recurrence and late stage cases are summarised in Supplementary Fig. 1. This illustrates that most late stage cases harbour similar clinicopathological features  $(EGFR)$  exon 20 insertions, presence of  $(TP53)$  comutations, growth pattern, previous or current tobacco smoke exposure), which can also partly be identified in the early stage cases with recurrence although in a limited number of cases and in some recurrence-free cases. With regard to the growth patterns, the recurrence-free cases were predominantly characterised by a lepidic growth pattern (67%), followed by an acinar growth pattern (10%). Growth patterns differed in the three cases with recurrence: one case had a predominantly solid, one predominantly acinar and one predominantly lepidic growth pattern. The patient with the solid growth pattern had a RFS of 7 months, versus 48 months in the patient with predominantly acinar growth pattern and 60 months in the patient with the lepidic growth pattern.

To illustrate these different growth patterns, [Fig. 3](#page-7-0)A depicts the aforementioned case with a solid growth pattern and disease recurrence after 7 months. This 64 year-old woman was referred to the pulmonologist with an asymptomatic pulmonary nodule, discovered via a coincidental finding. She was a former smoker and had accumulated 22 pack years. A lung biopsy was taken ([Fig. 3A](#page-7-0)), and the patient was diagnosed with a lung adenocarcinoma with 100% solid growth pattern. Staging showed that the tumour is stage cT2aN0M0, and the patient is eligible for surgical resection. In the resection specimen, the tumour had infiltrated the visceral pleura (pT2aN0M0PL1) and harboured an EGFR L858R mutation. After 7 months, she was diagnosed with bone metastases and treated with EGFR TKIs.

In contrast, [Fig. 3B](#page-7-0) illustrates a case with a lepidic growth pattern in which no disease recurrence occurred. This 65-year-old woman was referred to the pulmonologist with a pulmonary lesion on CT scan, discovered via a coincidental finding. She had smoked in the past but had accumulated less than 10 pack years. On CT, a 'ground glass' lesion was identified, not suspicious for invasive malignancy. She was followed every 6 months with a CT scan. After 2 years, the lesion had grown a few millimetres and now had a small solid component. A lung biopsy ([Fig. 3](#page-7-0)B) revealed a 100% lepidic lung adenocarcinoma (IASLC grade 1). The patient was diagnosed with a cT1aN0M0 lung adenocarcinoma. NGS revealed an exon 19 deletion in

<span id="page-7-0"></span>

Fig. 3. Case descriptions. A: Case 1 biopsy. First image:  $4 \times$ , closeup:  $40 \times$ . B: Case 2 biopsy. First image:  $4 \times$ , close-up:  $40 \times$ .

EGFR and no co-mutations. After surgical resection of the tumour, the patient is now recurrence free for 6 years.

## 4. Discussion

In this study, we investigated the prevalence of EGFR mutations across TNM stages in an unselected West-European cohort of 486 lung adenocarcinomas in which NGS reflex testing was performed. We found that EGFR mutations are unevenly spread over TNM stages, with a prevalence of 13% in early stage, and 9% in late stage. The latter is in line with previously reported prevalence rates of EGFR mutations in metastatic NSCLC in the Netherlands [\[9](#page-9-14),[11\]](#page-9-15). Nine out of 130 (7%) stage IB-IIIA cases met the ADAURA inclusion criteria  $(L858R)$  or exon 19 deletion) [\[4](#page-8-3)], which indicates that the number of stage IB-IIIA tumours needed to test in order to identify one patient eligible for adjuvant osimertinib is 14.4. Of note, we found that  $36\%$  of early stage *EGFR*mutated cases had current or previous tobacco smoke exposure. This highlights that selection for molecular analysis in the early stage setting should also not be guided by clinical characteristics such as smoking history. These real-world data provide a rationale for routine testing of early stage lung cancers for EGFR mutations in the West-European population.

Additionally, we provided a descriptive analysis of the characteristics of EGFR-mutated NSCLC over disease stages. We found that early stage EGFR-mutated cases differ from late stage cases with respect to clinical, genomic, and morphological characteristics. The late stage group harbours more exon 20 insertions and fewer L858R mutations, more TP53 mutations, more patients with previous or current tobacco smoke exposure, and more high-grade growth patterns. Although the KRASmutated late stage cases also had a higher prevalence of TP53 mutations than the early stage cases, the KRASmutated cohort seemed more homogeneous over tumour stages. This could imply that the differences between early and late stage disease in the EGFRmutated cohort are EGFR-specific.

In our EGFR-mutated early stage cases, three patients presented with disease recurrence after an average of 3.2 years. This is longer than the average time to recurrence in NSCLC, as in most post-surgical NSCLC cases occult metastases present within 2 years after surgery [[26,](#page-9-16)[27](#page-9-17)]. In addition, we found that 27% of all early stage EGFR-mutated cases had been monitored prior to diagnosis because of 'ground glass' lesions. Recent data showed a 5-year overall survival rate of 100% in patients with surgically resected clinical stage 1A EGFR-mutated lung adenocarcinoma with ground glass opacity component [\[28](#page-9-18)]. In the KRAS cohort, significantly less patients were followed up prior to diagnosis. This could suggest that some EGFR-mutated tumours are 'slow growers', and occult metastases  $-$  if present  $-$  are only identified after a long follow-up. Therefore, further studies with long survival data could aid in optimising the timing of resection and surveillance strategies of resected EGFR-mutated carcinomas.

In all, these results suggest that EGFR-mutated lung adenocarcinoma is not one homogeneous disease, but rather that there are subgroups that could be defined by their different phenotypes. Although we have a limited sample size, it seems that some patients with (high) tobacco exposure, high grade growth pattern, EGFR exon 20 insertion and TP53 mutation often present at a higher TNM stage and often progress to a higher stage. On the other hand, patients who have never smoked, with common *EGFR* mutations without co-mutations and with a low-grade growth pattern are rare in the high TNM stage group and the metastasis group. We should further investigate whether these findings truly indicate a 'high risk' and 'low risk' subtype in larger case series, as this could potentially help clinicians and pathologists identify patients who are at a higher risk of recurrence after surgery than others. It can be hypothesised that 'high risk' patients could derive more benefit from adjuvant TKI treatment than patients who were already at a low risk of recurrence, which could have implications for the prevention of over- and undertreatment.

The main limitation of our study is the sample size. While we screened a substantial number of cases  $(n = 486)$ , 53 cases harboured an *EGFR* mutation. This is a limited dataset, especially in subset analyses. Consequently, our comparison between, for example, early stage recurrence and recurrence free disease only included a small number of patients. Therefore, it is possible that our analysis lacked the power to detect smaller differences. However, this did not limit our primary objective of determining EGFR prevalence rates across TNM stages.

In conclusion, the prevalence of EGFR mutations in early stage lung adenocarcinoma in our West-European patient population is 13%, and the prevalence of ADAURA-eligible EGFR mutations in stage IB-IIIA is 7%, which constitutes a substantial yield when combining this number with the demonstrated benefit of adjuvant osimertinib [[4\]](#page-8-3). However, we must emphasise that screening for EGFR mutations in early stage lung adenocarcinoma is only a first step. Our data add to a growing body of evidence that suggests that EGFRmutated lung cancer, although seemingly one homogeneous group, actually consists of several genomic and clinical subgroups, in which we can potentially start to define low-risk and high-risk phenotypes that are correlated to clinical disease behaviour. This underlines the intrinsic heterogeneity in NSCLC and the importance of comprehensive tumour characterisation in clinical practice, as well as in future research. It would be of interest to investigate potential differences in outcomes between patients with low and high-risk phenotypes receiving adjuvant TKIs such as osimertinib, in order to guide future therapy decisions.

#### Author contributions

 $L.M.$  Hondelink  $-$  Conceptualisation, Methodology, Investigation, Writing  $-$  original draft, Writing  $-$  review and editing, Visualisation. S.M. Ernst  $-$  Conceptualisation, Methodology, Investigation, Writing  $$ original draft, Writing  $-$  review and editing, Visualisation. P. Atmodimedjo  $-$  Data Curation, Resources, Writing  $-$  review and editing. D. Cohen  $-$  Conceptualisation, Methodology, Writing  $-$  review and editing. J.L. Wolf  $-$  Data curation, Resources, Writing  $-$  review and editing. A.M.C. Dingemans  $-$  Conceptualisation, Methodology, Resources, Writing  $-$  review and editing. H.J. Dubbink  $-$  Conceptualisation, Methodology, Resources, Data curation, Writing  $-$  review and editing, Supervision. J.H. von der Thüsen  $-$ Conceptualisation, Methodology, Resources, Data curation, Writing  $-$  original draft, Writing  $-$  review and editing, Supervision, Project administration, Funding acquisition.

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#### Conflict of interest statement

This study received funding from AstraZeneca for the generation of data. Payments were made to the institution. Dr Dubbink declares grants from AstraZeneca and Merk, personal fees from Abbvie, AstraZeneca, Bayer, Janssen, Lilly, Merck and Pfizer and non-financial support from Illumina. Dr von der Thüsen declares consulting fees from AstraZeneca, Eli Lilly, Pfizer, Roche, Roche Diagnostics and MSD and honoraria for educational events from AstraZeneca, Eli Lilly, Pfizer, Roche, Roche Diagnostics and MSD. Prof Dingemans declares a grant from Amgen, consulting fees from Roche/Genentech, Boehringer Ingelheim, Amgen, Bayer, Sanofi, AstraZeneca and Janssen Oncology, honoraria from Eli Lilly, Pfizer and AstraZeneca and a Speakers Bureau fee from Jansen. The other authors declare no conflicts of interest.

## Appendix A. Supplementary data

Supplementary data to this article can be found online at <https://doi.org/10.1016/j.ejca.2022.12.010>.

#### <span id="page-8-0"></span>References

- [1] [Le Chevalier T. Adjuvant chemotherapy for resectable non](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref1)[small-cell lung cancer: where is it going? Ann Oncol 2010;](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref1) [21\(Suppl 7\): p. vii196](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref1)-[v198.](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref1)
- <span id="page-8-1"></span>[2] [Kratz JR, et al. A practical molecular assay to predict survival in](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref2) [resected non-squamous, non-small-cell lung cancer: development](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref2) [and international validation studies. Lancet 2012;379\(9818\):](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref2)  $823 - 32$  $823 - 32$
- <span id="page-8-2"></span>[3] [Pignon JP, et al. Lung adjuvant cisplatin evaluation: a pooled](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref3) [analysis by the LACE Collaborative Group. J Clin Oncol 2008;](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref3)  $26(21):3552-9.$  $26(21):3552-9.$  $26(21):3552-9.$  $26(21):3552-9.$
- <span id="page-8-4"></span><span id="page-8-3"></span>[4] [Wu YL, et al. Osimertinib in resected EGFR-mutated non-small](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref4)[cell lung cancer. N Engl J Med 2020;383\(18\):1711](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref4)-[23.](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref4)
- [5] [Barlesi F, et al. Routine molecular profiling of patients with](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref5) [advanced non-small-cell lung cancer: results of a 1-year nation](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref5)[wide programme of the French Cooperative Thoracic Intergroup](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref5) [\(IFCT\). Lancet 2016;387\(10026\):1415](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref5)-[26.](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref5)
- <span id="page-8-5"></span>[6] [Cohen D,HL, Solleveld-Westerink N, Uljee SM, Ruano D, Cle](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref6)ton-Jansen AM, von der Thüsen JH, Ramai SRS, Postmus PE, [Graadt van Roggen JF, Hoppe BPC, Clahsen PC, Maas KW,](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref6) [Ahsmann EJM, Ten Heuvel A, Smedts F, van Rossem RN, van](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref6)

[Wezel T. Optimizing mutation and fusion detection in NSCLC by](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref6) [sequential DNA and RNA sequencing. J Thorac Oncol 2020;](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref6)  $15(6)$ :1000-14

- [7] [Collisson Ea CJ, Brooks AN, Berger AH, Lee W, Chmielecki J,](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref7) [Beer DG, Cope L, Creighton CJ, Danilova L, Ding L, Getz G,](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref7) [Hammerman PS, Hayes DN, Hernandez B, Herman JG,](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref7) [Heymach JV, Jurisica I, Kucherlapati R, Kwiatkowski D,](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref7) [Ladanyi M, Robertson Gordon, Schultz Nikolaus, Shen Ronglai,](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref7) [Sinha Rileen, Sougnez Carrie, Ming-Sound Tsao William D](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref7) [Travis, Weinstein John N, Wigle Dennis A, Wilkerson Matthew](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref7) [D, Chu Andy, Cherniack Andrew D, Hadjipanayis Angela,](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref7) [Rosenberg Mara, Weisenberger Daniel J, Laird Peter W,](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref7) [Radenbaugh Amie, Singer Ma, Joshua M, Stuart Lauren,](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref7) [Byers Averett, Baylin Stephen B, Govindan Ramaswamy,](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref7) [Meyerson Matthew. Comprehensive molecular profiling of lung](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref7) [adenocarcinoma. Nature 2014;511:543](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref7)-[50](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref7).
- [8] [Shi Y, et al. A prospective, molecular epidemiology study of](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref8) [EGFR mutations in Asian patients with advanced non-small-cell](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref8) [lung cancer of adenocarcinoma histology \(PIONEER\). J Thorac](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref8) [Oncol 2014;9\(2\):154](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref8)-[62](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref8).
- <span id="page-9-14"></span>[9] [Ten Berge D, et al. A population-based study describing charac](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref9)[teristics, survival and the effect of TKI treatment on patients with](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref9) [EGFR mutated stage IV NSCLC in The Netherlands. Eur J](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref9) [Cancer 2022;165:195](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref9)-[204](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref9).
- [10] [Gao B, et al. Spectrum of LKB1, EGFR, and KRAS mutations in](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref10) [Chinese lung adenocarcinomas. J Thorac Oncol 2010;5\(8\):](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref10)  $1130 - 5$  $1130 - 5$  $1130 - 5$ .
- <span id="page-9-15"></span>[11] [Koopman B, et al. A nationwide study on the impact of routine](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref11) [testing for EGFR mutations in advanced NSCLC reveals distinct](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref11) [survival patterns based on EGFR mutation subclasses. Cancers](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref11) [\(Basel\) 2021;13\(14\).](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref11)
- <span id="page-9-0"></span>[12] [Soria J, Ohe Y, Vansteenkiste J, Reungwetwattana T,](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref12) [Chewaskulyong B, Lee KH, Dechaphunkul A, Imamura F,](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref12) [Nogami N, Kurata T, Okamoto I, Zhou C. Osimertinib in un](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref12)[treated EGFR-mutated advanced non](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref12)-[small-cell lung cancer. N](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref12) [Engl J Med 2018;378:113](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref12)-[25.](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref12)
- <span id="page-9-1"></span>[13] [Mok Ts WY-L, Ahn M-J, et al. Osimertinib or platinum](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref13)[pemetrexed in EGFR T790M-positive lung cancer. N Engl J](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref13) [Med 2017;376\(7\):629](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref13)-[40](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref13).
- <span id="page-9-2"></span>[14] [Ramalingam SS, et al. Overall survival with osimertinib in un](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref14)[treated, EGFR-mutated advanced NSCLC. N Engl J Med 2019;](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref14)  $382(1):41-50.$  $382(1):41-50.$  $382(1):41-50.$
- <span id="page-9-3"></span>[15] [Herbst RS, Morgensztern D, Boshoff C. The biology and man](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref15)[agement of non-small cell lung cancer. Nature 2018;553\(7689\):](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref15)  $446 - 54.$  $446 - 54.$  $446 - 54.$  $446 - 54.$
- <span id="page-9-4"></span>[16] [Pi C, et al. EGFR mutations in early-stage and advanced-stage](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref16) [lung adenocarcinoma: analysis based on large-scale data from](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref16) China. Thorac Cancer  $2018;9(7):814-9$  $2018;9(7):814-9$  $2018;9(7):814-9$ .
- <span id="page-9-5"></span>[17] [Saw SPL, et al. Association of clinicopathologic and molecular](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref17) [tumor features with recurrence in resected early-stage epidermal](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref17) [growth factor receptor-positive non-small cell lung cancer. JAMA](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref17) [Netw Open 2021;4\(11\):e2131892](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref17).
- <span id="page-9-6"></span>[18] [van Lier Mg WA, van Leerdam ME, Biermann K, Kuipers EJ,](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref18) [Steyerberg EW, Dubbink HJ, Dinjens WN. A review on the](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref18) [molecular diagnostics of Lynch syndrome: a central role for the](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref18) [pathology laboratory. J Cell Mol Med 2010;14:181](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref18)-[97](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref18).
- <span id="page-9-7"></span>[19] [Pruis MA, et al. Highly accurate DNA-based detection and](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref19) [treatment results of MET exon 14 skipping mutations in lung](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref19) [cancer. Lung Cancer 2020;140:46](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref19)-[54.](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref19)
- <span id="page-9-8"></span>[20] [van Riet J, et al. SNPitty: an intuitive web application for](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref20) [interactive B-allele frequency and Copy number visualization](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref20) [of next-generation sequencing data. J Mol Diagn 2018;20\(2\):](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref20)  $166 - 76$  $166 - 76$  $166 - 76$
- <span id="page-9-9"></span>[21] [Dubbink HJ, et al. Diagnostic detection of allelic losses and im](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref21)[balances by next-generation sequencing: 1p/19q co-deletion](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref21) analysis of gliomas. J Mol Diagn  $2016;18(5):775-86$ .
- <span id="page-9-10"></span>[22] [Richards S, et al. Standards and guidelines for the interpretation](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref22) [of sequence variants: a joint consensus recommendation of the](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref22) [American college of medical genetics and genomics and the as](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref22)[sociation for molecular pathology. Genet Med 2015;17\(5\):](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref22)  $405 - 24$  $405 - 24$  $405 - 24$
- <span id="page-9-11"></span>[23] [Warth A, et al. The novel histologic international association for](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref23) [the study of lung cancer/American thoracic society/European](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref23) [respiratory society classification system of lung adenocarcinoma is](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref23) [a stage-independent predictor of survival. J Clin Oncol 2012;](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref23)  $30(13):1438-46.$  $30(13):1438-46.$  $30(13):1438-46.$
- <span id="page-9-12"></span>[24] Jäger S, Allhorn A, Bießmann F. A benchmark for data impu[tation methods. Frontiers in Big Data 2021;4](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref24).
- <span id="page-9-13"></span>[25] [Maaten Lvd, Hinton GE. Visualizing data using t-SNE. J Mach](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref25) [Learn Res 2008;9:2579](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref25)-[605.](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref25)
- <span id="page-9-16"></span>[26] [Boyd JA, et al. Timing of local and distant failure in resected lung](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref26) [cancer: implications for reported rates of local failure. J Thorac](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref26) Oncol  $2010;5(2):211-4$  $2010;5(2):211-4$ .
- <span id="page-9-17"></span>[27] [Demicheli R, et al. Recurrence dynamics for non](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref27)-[small-cell lung](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref27) [cancer: effect of surgery on the development of metastases. J](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref27) Thorac Oncol  $2012:7(4):723-30$  $2012:7(4):723-30$ .
- <span id="page-9-18"></span>[28] [Li M, et al. Pan-driver-negatives versus epidermal growth factor](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref28) [receptor mutants for C-stage IA lung adenocarcinoma with](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref28) [ground-glass opacity. Ann Thorac Cardiovasc Surg 2022.](http://refhub.elsevier.com/S0959-8049(22)01812-3/sref28)