



# Circulating immune response proteins predict the outcome following disease progression of osimertinib treated epidermal growth factor receptor-positive non-small cell lung cancer patients

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**Background:** Lung cancer patients with sensitizing epidermal growth factor receptor (EGFR) mutations treated with osimertinib will eventually develop progressive disease (PD). The survival following PD varies greatly between patients, and no effective treatment strategy has been established. Furthermore, at the moment, no easily accessible and precise biomarker exists that can predict the survival after PD.

**Methods:** We analyzed blood samples drawn from non-small cell lung cancer patients harboring EGFR mutations that were treated with osimertinib. The levels of 92 circulating proteins were analyzed from plasma samples using a proximity extension assay (PEA). The results were evaluated with Gene Ontology (GO) enrichment analysis to reveal patterns of protein expression at progression while on osimertinib treatment.

**Results:** We found that the expression of 7 proteins were significantly altered at PD, compared to a sample taken at osimertinib response. GO enrichment analysis demonstrated that most of the significant proteins were related to the immune system, specifically the adaptive immune response. Defining two groups of patients, based on the levels of circulating immune response proteins at PD, revealed significant differences in the overall survival (OS) after PD [hazard ratio (HR) =3.04; 95% confidence interval (CI): 1.24–7.45; P=0.0046].

**Conclusions:** In this study, we discover novel circulating biomarkers that can predict the OS after PD on osimertinib. These findings support the recent acknowledgement of the immune system's importance in osimertinib resistance.

**Keywords:** Osimertinib; immune response; resistance; non-small cell lung cancer (NSCLC); epidermal growth factor receptor (EGFR)

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## Introduction

Lung cancer is one of the most frequent types of cancer worldwide and the type of cancer that causes most deaths (1,2).

Ten to 15 percent of non-small cell lung cancer (NSCLC) adenocarcinomas in Caucasians are caused by activating mutations (e.g., *EGFR-L858R* and *EGFR-ex19* deletion) in the ATP-binding pocket of the epidermal growth factor receptor (EGFR) (3,4). These mutations drive the cancer development (5), making it sensitive to EGFR-targeting tyrosine kinase inhibitors (EGFR-TKI), which is a current standard of care for these patients with advanced stage cancer (6-8). Unfortunately, resistance toward the drugs will develop over time, in most patients this is seen as the T790M mutation for first/second generation EGFR-TKIs (9-11). This resistance mutation has been overcome by the new third generation EGFR-TKI, osimertinib, which is currently the first line of treatment in many countries (12-14). However, most patients eventually develop osimertinib resistance as well (15). Compared to first/second generation EGFR-TKI's, in which *EGFR* mutations are the most common form of resistance, osimertinib resistance can be mediated by new *EGFR* mutations (e.g., *EGFR-C797S*) but more commonly through bypass mutations, such as *ERBB2* and *MET* amplifications, as well as *PIK3CA*, *APC*, *NF1*, and *BRAF* mutations (16-18). Because of this, osimertinib-resistant patients represent a genetically heterogeneous group (19), highlighting the need for ways to monitor tumor development in patients during their treatments.

Biomarkers found in the bloodstream, which portray the molecular state of a specific cancer, have been used for many years. Using cell-free DNA in liquid biopsies to monitor known oncogenic drivers, such as *EGFR*, *ALK*, and *KRAS* mutations, with quantitative real time polymerase chain reaction (qPCR) and next-generation sequencing (NGS) is an effective and acknowledged method in clinical practice and is often used as a supplement to biopsies (20-22). However, other types of biomarkers, such as circulating proteins, could provide additional information and be easier and cheaper to use in clinical practice.

Protein biomarkers in lung cancer have been investigated for many years. Carcinoembryonic antigen (CEA) is a well-known biomarker in lung cancer (23). Neuron specific enolase (NSE) and pro gastrin releasing peptide (proGRP) are biomarkers that have been suggested for small cell lung cancer (SCLC) and could be important as biomarkers for the resistance mechanism toward osimertinib, in which

EGFR-positive NSCLC transforms to SCLC (24-27).

More specific and precise biomarkers, such as NSE and proGRP that indicate specific resistance mechanisms, would be of great value in clinical practice. Therefore, we wanted to discover novel biomarkers by investigating circulating proteins in the bloodstream at different times during treatment of EGFR-mutated NSCLC patients with osimertinib. Two time points in the patient's course of treatment were used for further analysis: the time of response to osimertinib and the time of progressive disease (PD). The response blood sample was chosen over the baseline blood sample as we wanted to compare the situation with and without effect of osimertinib. Plasma samples from response and PD were analyzed using a proximity extension assay (PEA), applying the Olink target 96 Oncology panel II. We present the following article in accordance with the MDAR reporting checklist (available at <https://tldr.amegroups.com/article/view/10.21037/tlcr-22-577/rc>).

## Methods

### Patients

The patients included for this retrospective study's cohort were all enrolled in a prospective, observational, multicenter study of advanced stage lung cancer patients, with a verified *EGFR* mutation, during which blood samples were taken consecutively during various treatment lines (ID NCT02284633). The study was conducted at the Department of Oncology, Aarhus University hospital, and included patients from four oncology departments in the western part of Denmark between August 2014 and December 2018. The study was conducted according to criteria's set by the Declaration of Helsinki (as revised in 2013) and was approved by the National Committee on Health Ethics (No. 1-10-72-83-14) and the Danish Data Protection Agency (No. 1-16-02-431-14). All subjects provided written informed consent before inclusion.

Eighty-five patients from the prospective study received treatment with osimertinib, and, therefore, were available for inclusion in this retrospective study. Patients included were all treated with osimertinib as a first- or second-line of treatment. All patients receiving osimertinib as second-line of treatment received erlotinib as first-line of treatment. Inclusion required that the patient responded to treatment with osimertinib, followed by PD, and had blood samples available. Response to treatment was based on the response

evaluation criteria in solid tumors (RECIST), and PD was either defined as RECIST, smaller than RECIST, and/or as a clinical judgement by the patient's physician (28). The primary outcome of this study was to evaluate the OS following PD on osimertinib. Progression free survival (PFS) was defined as the time from osimertinib start until PD. OS was defined as the time from osimertinib start until death or censoring of data, whereas OS after PD was defined as the time from PD until death or censoring of data.

### **Data collection**

Data regarding treatment and demographics before start of treatment were extracted from the Aarhus Lung Cancer database (AALCR). Data were updated from medical records to the lung cancer database on January 3, 2022.

### **Blood samples**

Peripheral blood was drawn from each patient approximately every 4–6 weeks in 10 mL EDTA tubes and centrifuged within 6 h at 1,400 g for 15 min at room temperature. Plasma was aliquoted and stored at  $-80^{\circ}\text{C}$  (29).

Two blood samples from each patient were selected: a response blood sample and a progression blood sample. A response blood sample was defined as a blood sample taken from the patient after treatment with osimertinib was initiated, and the patient showed response to the treatment according to the RECIST criteria. More specifically, the patient should have stable disease (SD), partial response (PR) or complete response (CR) at the time of blood withdrawal or a maximum of two months before or after the scan. The progression sample was the blood sample taken at the first PD during osimertinib treatment, identified by the oncologist, or a blood sample taken a maximum of one month before or after. If the sample was taken after the scan, it was only applicable if no new treatment was initiated in the meantime.

### **PEA**

Response and PD plasma samples were analyzed using PEAs at BioXpedia, Aarhus, Denmark, which is described in detail in previous studies (30,31). In this study, we applied the Target 96 Oncology II panel (Olink). This panel is a high-throughput, multiplex immunoassay targeting 92 oncology-associated proteins. In brief, the technology applies two oligonucleotide-conjugated antibodies for

each protein, which, upon binding to the target, allow hybridization of the oligonucleotides. Addition of a DNA polymerase amplifies a unique PCR reporter sequence, which is detected using qPCR (Fluidigm Biomark HD system). Subsequently, the C<sub>q</sub>-values are normalized to an interplate control and converted to Normalized Protein eXpression (NPX) units on a Log<sub>2</sub> scale.

### **Gene Ontology (GO) enrichment analysis**

GO enrichment analysis (32,33) was performed using the topGO package (v. 2.49.0, <https://topgo.bioinf.mpi-inf.mpg.de/>) (34). The analysis was performed in R version 4.2.1. Of the 92 proteins in the Target 96 Oncology II panel (Olink), 91 were analyzed using the biological process (BP) ontology database (SEZ6L was excluded because it was not associated with any BP GO terms). The gene universe was defined as the 91 proteins, and the significant genes were defined as differentially expressed proteins at PD compared to the response (two-tailed  $q < 0.05$ ). Significantly enriched GO terms were defined as having a  $P < 0.05$  based on the classic algorithm and Fisher exact test.

Patients were divided into groups based on their summarized NPX (sNPX) values for proteins associated with the GO terms “immune response” (GO:0006955) and “adaptive immune response” (GO:0002250). sNPX values are calculated by adding the NPX values for individual proteins related to a specific GO term together for each patient. Patients with sNPX values above the median for all patients were classified as “high”, whereas patients with sNPX below the median were classified as “low”.

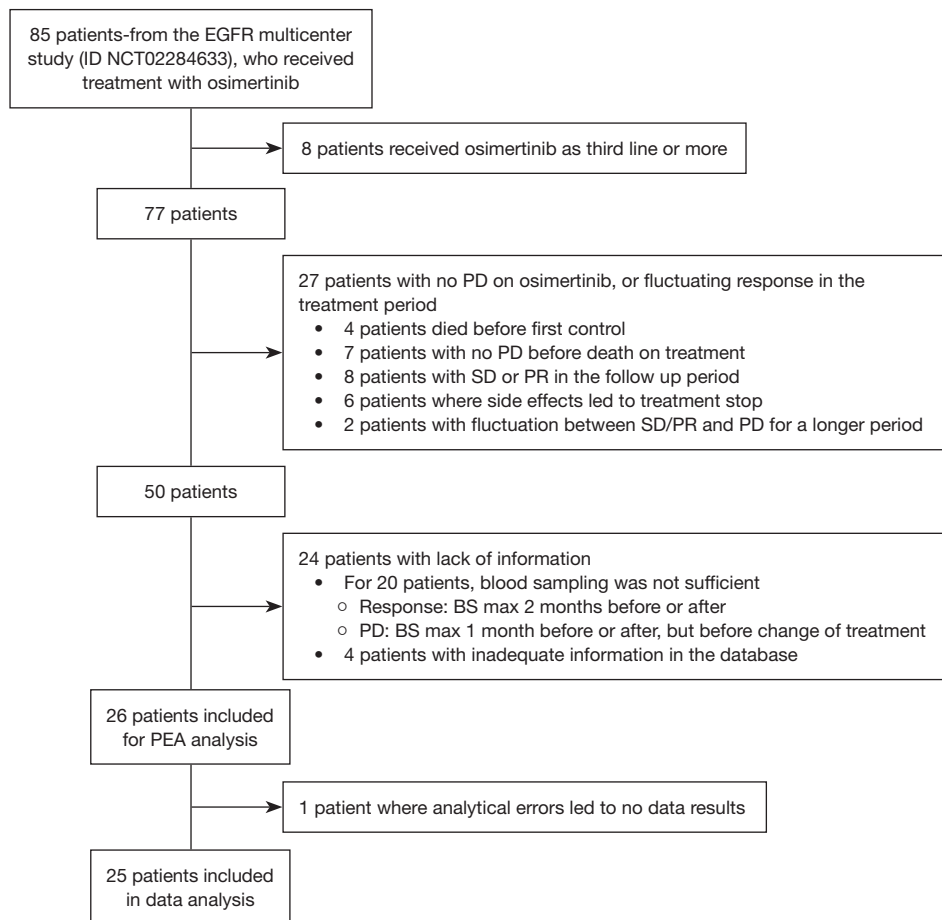
### **Statistical analysis**

Differences in protein levels at response compared to PD were analyzed using the Wilcoxon signed-rank test. To correct for multiple testing, false discovery rate (FDR) adjustment (35) was performed where a two-tailed  $q$ -value  $< 0.05$  were considered significant. The Kaplan-Meier method including a log-rank test was used to study the overall survival (OS) after PD. Data analyses were performed in R v. 4.2.1, as well as GraphPad Prism v. 9.3.1.

## **Results**

### **Patients**

Twenty-six patients were included in the study, and



**Figure 1** Inclusion and exclusion of patients in this study. EGFR, epidermal growth factor receptor; PD, progressive disease; SD, stable disease; PR, partial response; BS, blood sample; PEA, proximity extension assay.

plasma samples were investigated with PEA analysis. The inclusion of patients for the study is described in *Figure 1*. Unfortunately, one patient's blood sample was not of a sufficient quality to be analyzed; therefore, only 25 patients are included in the following results.

The patient's demographics and characteristics at the start of osimertinib treatment are based on high or low sNPX values at PD for "Immune response" proteins (*Table 1*). There was a predominance of women in the cohort (68%). At the start of osimertinib treatment, the mean age was 64.1 years (range, 28–82 years); the majority had disseminated disease TxNxM1b (68%), no brain metastases (BM) (76%), were former or current smokers (56%), with a PS score at 0 or 1 (60%), and a baseline comorbidity score of 0 (72%), based on Charlson comorbidity index. Only one patient harbored a rare *EGFR* mutation (S768I), while the rest had a common *EGFR* mutation: del19 (18 patients) or L858R (6 patients).

The T790M mutation was found in 76% of patients before osimertinib was initiated, either in blood samples using the Cobas *EGFR* V2 mutation test by Roche or in tumor biopsies. Two patients received osimertinib as first-line of therapy while the rest received osimertinib as second-line of treatment. The majority of the patients had PD based on RECIST (60%). A significant difference between smokers versus nonsmokers was found in the low versus high group. Patients in the high group had a higher proportion of smokers (former and current), compared to the low group who had a higher proportion of nonsmokers (never and passive). Apart from this, there was no significant difference in demographics between the groups.

#### *Discovering differences in circulating proteins*

Plasma samples from 25 patients were investigated for

**Table 1** The demographics of the patients included in this study

Demographics	All patients (n=25)	Low (n=12; 48%)	High (n=13; 52%)	P value
Gender, n [%]				
Female	17 [68]	7 [58]	10 [77]	0.4110
Male	8 [32]	5 [42]	3 [23]	
Age (years)				
Mean age	64.1	62.9	65.1	0.6951
<64.1, n [%]	11 [44]	6 [50]	5 [38]	
≥64.1, n [%]	14 [56]	6 [50]	8 [62]	
TNM stage, n [%]				
M0 and M1A	8 [32]	5 [42]	3 [23]	0.4110
M1B	17 [68]	7 [58]	10 [77]	
Smoking status, n [%]				
Never	11 [44]	8 [67]	3 [23]	0.0472
Former/current	14 [56]	4 [33]	10 [77]	
PS, n [%]				
0 or 1	15 [60]	9 [75]	6 [46]	0.3358
2 or more	7 [28]	2 [17]	5 [39]	
Unknown	3 [12]	1 [8]	2 [15]	
Comorbidity score at BL, n [%]				
0	18 [72]	9 [75]	9 [69]	>0.9999
1 or more	7 [28]	3 [25]	4 [31]	
EGFR mutation, n [%]				
Common (del19, L858R)	24 [96]	12 [100]	12 [92]	>0.9999
Rare	1 [4]	0	1 [8]	
T790M status, n [%]				
Yes	19 [76]	8 [67]	11 [85]	0.3782
No	6 [24]	4 [33]	2 [15]	
BM, n [%]				
Yes	6 [24]	2 [17]	4 [31]	0.6447
No	19 [76]	10 [83]	9 [69]	
Line of therapy, n [%]				
First-line	2 [8]	1 [8]	1 [8]	>0.9999
Second-line	23 [92]	11 [92]	12 [92]	
PD, n [%]				
RECIST	15 [60]	6 [50]	9 [69]	0.4283
Other	10 [40]	6 [50]	4 [31]	

“Immune response” proteins median sNPX: 41.49. Patients with sNPX values above the median for all patients were classified as “high”, whereas patients with sNPX below the median were classified as “low”. All demographics, except for PD and comorbidities, are defined at osimertinib start. Differences between groups are tested using Fisher’s exact test. TNM, tumor-node-metastasis; PS, performance status; BL, baseline; EGFR, epidermal growth factor receptor; BM, brain metastases; PD, progressive disease; RECIST, response evaluation criteria in solid tumors; sNPX, summarized Normalized Protein expression.

circulating proteins using PEA. The plasma samples taken at the time of positive treatment response (called response sample, [Table S1](#)) were compared to the plasma samples taken at disease progression (called PD sample, [Table S2](#)), and the differences between the two samples were determined. *Figure 2A* displays the seven proteins that were differentially regulated at response compared to PD samples. Just one of the seven proteins were upregulated in progression samples, whereas six proteins were downregulated ([Table 2](#)). The patients were then grouped based on the median difference between the response and the PD blood sample for each of the seven significant proteins (*Figure 2B*). Patients with a difference in NECTIN4 levels below the group median (0.29) demonstrated a longer OS following PD than the patients above the median [hazard ratio (HR) =4.06; 95% confidence interval (CI): 1.57–10.45; P=0.00033]. For the remainder of the proteins, no difference was detected between the groups. None of the differentially regulated proteins had a significant impact on PFS ([Figure S1](#)).

Although not statistically significant, CEACAM5 had the highest Log<sub>2</sub> fold change (Log<sub>2</sub>FC) (Log<sub>2</sub>FC =1.55, equivalent to 2.93 increase in linear values). This is supported by previous studies describing CEA as a marker for tumor burden, associated with PFS and OS in lung cancer (23,36). In this study, we find that a high level of PEA measured CEACAM5 in the response sample was associated with a reduced PFS as well as OS ([Figure S2](#)). However, the dynamic changes of CEACAM5 did not predict the outcome following PD. These findings validate the PEA protocol as a way to study tumor dynamics in the blood.

### GO enrichment analysis

To better understand which processes were differently expressed between response and progression samples, we applied GO enrichment analysis to the PEA-measured proteins. In total 3,423 BP GO terms were assigned to 91 of the 92 proteins in the Olink Target 96 Oncology II panel. Based on the significant proteins presented in *Figure 2* and [Table 2](#), we found 31 significantly enriched GO terms (P<0.05; [Table S3](#)), and the top 10 GO terms are displayed in *Figure 3*. The figure displays how most of the significant GO terms are associated with the immune system. Therefore, we conclude that, during osimertinib treatment, the patient's immune system is altered from the time of response to progression. The six proteins associated

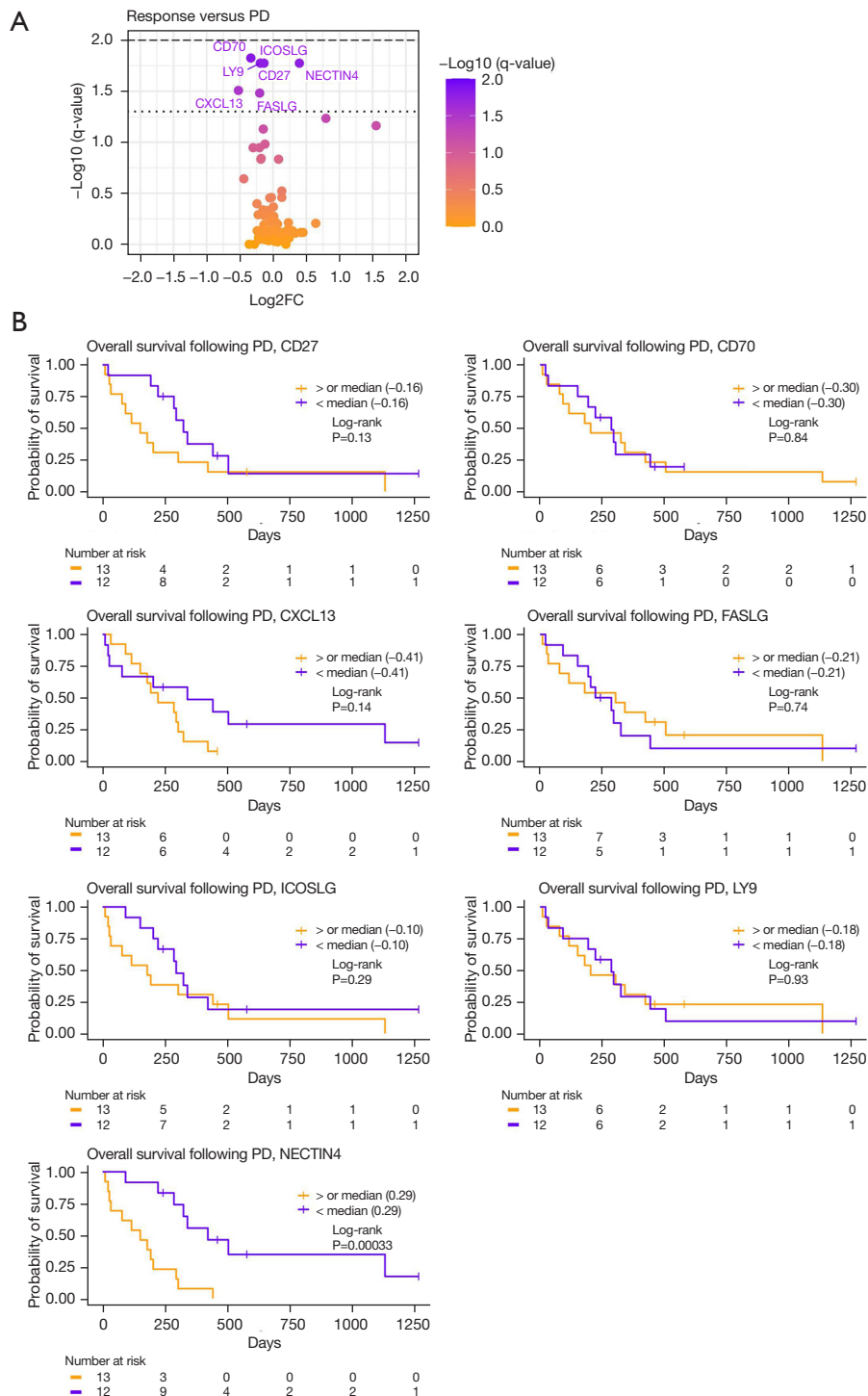
with the GO term immune response all showed a decrease between the two samples ([Table 2](#), [Table S3](#)). These results demonstrate that immune biomarkers are declining overall at the time of PD compared to response.

### Immune proteins at progression predicts OS after PD

To investigate if the combined protein concentration of the immune proteins that were discovered in the GO enrichment analysis could predict the patients' OS after PD, a survival analysis was performed between groups with low and high sNPX. Proteins associated to the GO term "Immune response" were chosen because this term was associated to most proteins (CD27, CD70, CXCL13, FASLG, ICOSLG, LY9, [Table S3](#)). A significant difference between the high (median survival =442 days) and low (median survival =193 days) groups was discovered (*Figure 4A*, HR =3.04; 95% CI: 1.24–7.45; P=0.0046). The course of the disease is displayed for each patient after initiation of osimertinib until the time of death or last follow-up (January 3, 2022) in *Figure 4B*. This demonstrates a similar blood sampling, treatment, and follow-up for the two groups. A significant difference was also found when only looking at proteins related to the "Adaptive immune response" (CD27, CD70, CXCL13, ICOSLG, LY9, [Figure S3](#)), which was the GO term most significant in the GO enrichment analysis (*Figure 3*). Patients with a low sNPX (median survival =324 days) in relation to the adaptive immune response had a significantly longer OS after PD, compared to patients with high sNPX (median survival =193 days) at PD (HR =2.72; 95% CI: 1.12–6.57; P=0.0146). This indicates that patients with a low amount of circulating immune response proteins in the blood at PD have a longer survival after PD, compared with patients with a high. To investigate the relevance of each protein in the "immune response" patients were divided based on the level of the individual proteins ([Figure S4](#)). These results demonstrated that only CXCL13 levels could significantly predict the patient's outcome, however with an inferior HR of 2.55 (95% CI: 1.06–6.31; P=0.021), compared to the combined sNPX values (HR =3.04). This indicates that a combined evaluation of proteins related to the immune system is the strongest predictor of the patient's outcome following PD.

### Discussion

In this study, we found that immune-related proteins are differentially regulated in the blood taken from patients at

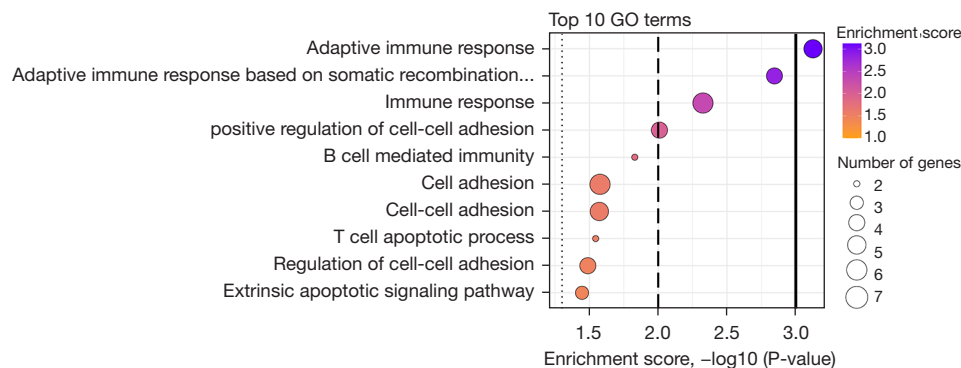


**Figure 2** Differentially regulated proteins at response versus PD. (A) The proteins are measured using PEA on plasma and analyzed with a Wilcoxon signed-rank test. Labeled proteins with a  $q < 0.05$  were statistically significant. Cut-off lines drawn at  $q = 0.05$  and  $q = 0.01$ . (B) For each significant protein the 25 patients are divided into groups below or above the group median difference between the response and progression sample. The OS following PD is estimated for each group and the difference between the groups was tested using a log-rank test. PD, progressive disease; Log2FC, Log2 fold change; PEA, proximity extension assay; OS, overall survival.

**Table 2** Significantly differentially regulated proteins in response versus progression samples

Protein	Log2FC	Median at response ( $\pm$ SE)	Median at progression ( $\pm$ SE)	q-value
CD27	-0.18	8.11 ( $\pm$ 0.09)	7.93 ( $\pm$ 0.09)	0.0167
CD70	-0.34	4.63 ( $\pm$ 0.08)	4.29 ( $\pm$ 0.09)	0.0149
CXCL13	-0.52	8.41 ( $\pm$ 0.27)	7.88 ( $\pm$ 0.29)	0.0310
FASLG	-0.20	9.93 ( $\pm$ 0.11)	9.73 ( $\pm$ 0.09)	0.0330
ICOSLG	-0.14	5.31 ( $\pm$ 0.05)	5.18 ( $\pm$ 0.04)	0.0167
LY9	-0.19	6.46 ( $\pm$ 0.09)	6.26 ( $\pm$ 0.09)	0.0167
NECTIN4	0.40	5.20 ( $\pm$ 0.13)	5.60 ( $\pm$ 0.19)	0.0167

Log2FC, Log2 fold change; SE, standard error.



**Figure 3** GO enrichment analysis of differentially regulated proteins in PD samples compared to response samples. GO terms are ranked according to the enrichment score [-log10 (P value)] and the size represents the number of genes associated to each GO term. Cut-off lines drawn at P=0.05, P=0.01 and P=0.001. GO, Gene Ontology; PD, progressive disease.

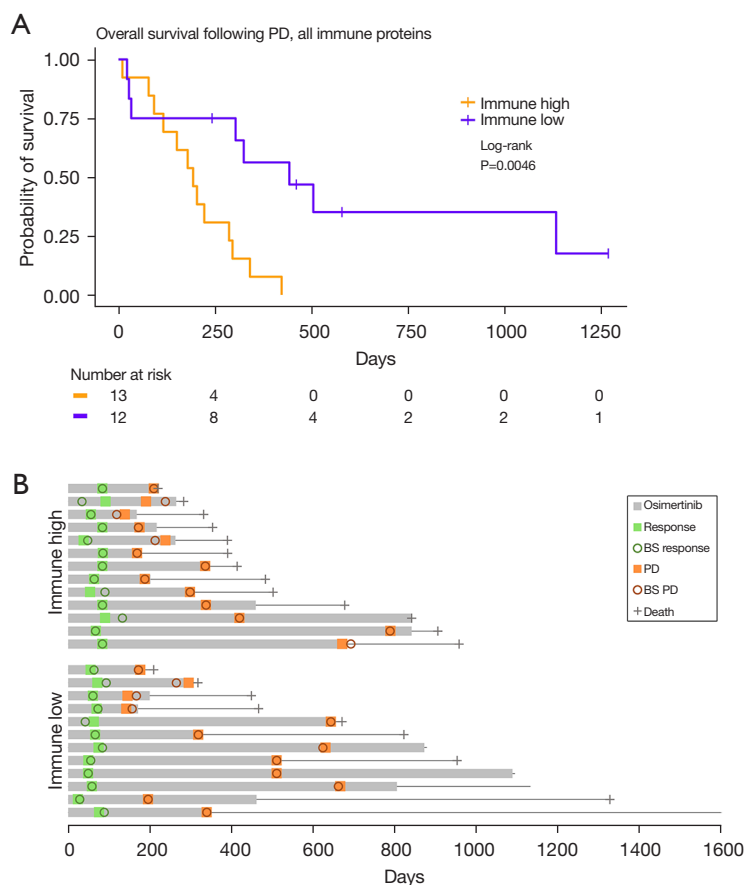
the time of osimertinib response compared to at PD. By defining two groups of patients based on sNPX values for immune response proteins, we found that patients with a lower amount of circulating immune response proteins at PD had a significantly longer OS after PD.

This study serves as a pilot study for the relation between the immune system and osimertinib resistance and lacks a suitable validation cohort to verify the findings. Future research with a more homogenous cohort consisting of first-line osimertinib treated patients could further strengthen the hypotheses presented in this study. Although this study identifies immune response-related proteins to be of importance during osimertinib treatment it is most likely that other protein pathways are also involved in osimertinib resistance which could be identified using a larger protein panel. Furthermore, future studies could address the causal link and temporal relationship between immune-related proteins in plasma and tumor progression on osimertinib.

Interestingly, this study demonstrates that patients with high amount of immune response-related proteins are more likely to have a smoking history compared to patients with a low amount of immune response-related proteins (Table 1). This supports the idea of smoking affecting the immune landscape of lung cancer patients (37) and future studies is needed to evaluate the involvement of smoking and the immune system at osimertinib progression.

Previous studies have found that the immune biomarkers are associated with the response to EGFR-TKI treatment (38,39). Recently, Gurule *et al.* used RNA extracted from tissue biopsies to demonstrate that, during the initial treatment, interferon-gamma related genes are upregulated (38). Furthermore, they found a positive correlation between the level of interferon-gamma upregulation and the time-to-progression, indicating that a strong innate immune response is associated with favorable clinical response to the treatment. Our findings add to this study by evaluating





**Figure 4** Proteins related to “Immune response” predict OS after PD. (A) OS after PD for patients with high or low levels of “Immune response” proteins. Statistical analysis was performed using a log-rank test. (B) The 25 patients are divided into “Immune-high” and “Immune-low” groups based on their sNPX values for adaptive proteins. The course of their disease, treatment, and blood samples are shown. PD, progressive disease; BS, blood sample; OS, overall survival; sNPX, summarized Normalized Protein eXpression.

the tumor dynamics at PD, rather than at the beginning of TKI-treatment. In this study, we evaluate tumor dynamics by analyzing the circulating proteins representing the protein expression of all cells shedding to the bloodstream, including tumor and immune cells, rather than RNA-seq on tumor biopsies.

A previous study found that some patients have increased programmed death-ligand 1 (PD-L1) expression at PD, compared to baseline, when treated with osimertinib (39). In the study by Isomoto *et al.*, 27 patients were treated with anti-programmed death 1 (anti-PD-1) antibodies following their initial TKI treatment after PD. The patients with a high PD-L1 expression at PD responded well to the treatment. These results demonstrate that, in some patients, PD could be the result of changes in the tumor microenvironment inhibiting the antitumor immune

response. In this study, we found that patients with high levels of circulating adaptive immune proteins had a shorter OS following PD. Potentially, these patients represent patients with increased PD-L1 expression induced by EGFR-driven tumors (40,41) leading to PD, with an exhausted immune system reducing the survival after PD. This is supported by Dai *et al.* who demonstrated that clear cell renal cell carcinoma patients with high levels of intratumoral CD8<sup>+</sup>, CXCL13<sup>+</sup> T cells had inferior outcome and had elevated CD8<sup>+</sup> T cell exhaustion markers (PD-1, Tim-3, TIGIT) (42). Furthermore, exhausted CD39<sup>+</sup>, CD4<sup>+</sup> T cells have also demonstrated increased CXCL13 expression (43). Unfortunately, we were not able to obtain information on the PD-L1 status, or other biomarkers in the tumor at PD for the patients in this study; however, future studies could give more insights into this hypothesis.

Combined, these studies indicate that some patients with tumor progression on osimertinib could benefit from immune checkpoint inhibitor therapy. This is currently being investigated in combination with chemotherapy in the KEYNOTE-789 and CheckMate722 phase III clinical trials. Evaluating the immune-related proteins in plasma at PD on osimertinib, could potentially help to stratify which patients would benefit from immunotherapy.

One of the limitations of this study is the small number of patients used in the survival analysis, where the group median is necessary to distinguish the immune high and low groups. Another limitation is the definition of PD for the patients. It is a well-known problem that the RECIST criteria are difficult to translate onto a heterogenic group of patients, given that many factors in their course of disease can affect the choice for further treatment. Additionally, PD is a subjective decision made by the patient's oncologist based on radiologic scans and clinical assessments, which can be different between oncologists (44,45). For most patients, the PD was based on RECIST, but in some cases, it was described as PD based on clinical assessment of the patient. This variation in describing RECIST could interfere with the results.

Furthermore, patients were often treated beyond progression (Figure 4B). This is not uncommon, and treatment beyond progression can be used to avoid a withdrawal tumor flair (46,47). Treatment beyond progression is also seen in cases where the patient has localized progression and receives local radiation therapy in combination with EGFR-TKI, which results in another durable period without progression on the EGFR-TKI (48,49).

In many studies, baseline blood samples are used for comparison of the patient's oncological status with later blood samples in the patient's course of treatment. In this study, we decided to introduce the use of a response blood sample instead. Baseline blood samples are taken prior to the first line of treatment, and most patients had already been treated with erlotinib before osimertinib. Therefore, we assumed other proteins not related to the ongoing treatment would disturb the analysis.

## Conclusions

Based on blood samples taken during osimertinib treatment of EGFR-mutated NSCLC patients, we find that the level of circulating immune proteins at PD can predict OS after PD. These findings solidify the importance of the immune

system in EGFR-TKI resistance and demonstrate the need for future research to understand the interplay between targeted therapies and the effectiveness of the immune response.

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## Footnote

*Reporting Checklist:* The authors have completed the MDAR reporting checklist. Available at <https://tocr.amegroups.com/article/view/10.21037/tocr-22-577/rc>

*Data Sharing Statement:* Available at <https://tocr.amegroups.com/article/view/10.21037/tocr-22-577/dss>

*Peer Review File:* Available at <https://tocr.amegroups.com/article/view/10.21037/tocr-22-577/prf>

*Conflicts of Interest:* All authors have completed the ICMJE uniform disclosure form (available at <https://tocr.amegroups.com/article/view/10.21037/tocr-22-577/coif>). The authors have no conflicts of interest to declare.

*Ethical Statement:* The authors are accountable for all aspects of the work in ensuring that questions related to the accuracy or integrity of any part of the work are appropriately investigated and resolved. The research was conducted in accordance with the Declaration of Helsinki (as revised in 2013) and approved by the National Committee on Health Ethics (No. 1-10-72-83-14) and the Danish Data Protection Agency (No. 1-16-02-431-14). Written informed consent was obtained from all participating individuals.

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