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# Aichi Cancer Center and NEC Develop an Efficient Method for Identifying Lung Cancer Antigens and Antigen-Specific T Cells

- Aichi Cancer Center and NEC developed a method for efficiently identifying lung cancer antigens (oncology marks) and antigen-specific T cells by combining single-cell analysis (\*1) of Tumor Infiltrating Lymphocytes (TIL) and NEC's AI-based antigen prediction system.
- Aichi Cancer Center and NEC clarified the characteristics of T cells that specifically recognize antigens.
- This study is expected to provide useful information for antigen-specific cancer vaccine therapy and engineered T cell therapy.

Aichi Cancer Center and NEC Corporation's research group with Gifu University, Toyama University and Kitasato University Medical Center, have developed a method for efficiently identifying the lung cancer antigens and the antigen-specific T cells that recognize the antigens through both a single-cell analysis of Tumor Infiltrating Lymphocytes (TILs) and NEC's AI-based antigen prediction system that predicts immune response. Our paper describing the results of this study was published on August 6, 2023 in the "Journal for ImmunoTherapy of Cancer," which is the official journal of the Society of Immunotherapy of Cancer (SITC) in the United States.

#### Research Background

Lung cancer is one of the most common cancers and one of the leading causes of cancer death worldwide. There are many types of cancer treatment, such as surgery, chemotherapy, radiation therapy, molecular targeted therapy, immunotherapy, and combinations of these. Recently developed immune checkpoint inhibitors (ICI) have attracted attention as a new therapy, and lung cancer is one of the most sensitive cancers to ICI, but it is effective in only a subset of individuals. Accordingly, new effective immunotherapies are required for lung cancer.

Cytotoxic T lymphocytes (CTLs) in TIL are crucial immune cells that can specifically recognize and eliminate tumor cells. Antigens targeted by CTL include patient-specific neoantigens and common antigens commonly expressed among patients such as cancer-testis antigens (CTA). In general, it is not easy to identify any antigens. If these antigens can be efficiently identified, a combination therapy with ICIs and antigen-specific immunotherapy may enhance the efficacy of treatment.

#### Contents and results of this research

In this study by Aichi Cancer Center and NEC, we performed a single-cell analysis to determine the TILs characteristics of patients with surgically resected non-small cell lung cancer (NSCLC) (n=3) (Figure. 1). Then, we divided the TILs into 10 clusters based on

gene expression profile, and identified the exhausted T cell cluster (Tex cluster) characterized by the expression of the genes called exhaustion markers (Figure. 2). We synthesized the TCRs contained in the identified exhausted T cell cluster and induced each of the TCRs into each corresponding T cell, and examined the immune responses to neoantigens predicted by NEC's AI-based antigen prediction system and typical CTAs. It was confirmed that NEC's AI-based antigen prediction system can accurately predict the antigens that cause the immune responses, and we identified four TCRs recognizing KK-LC-1 (one of the CTAs, \*2), and five TCRs recognizing the neoantigens (Figure. 3).

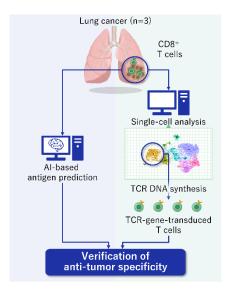


Figure 1. Overall scheme of this Study

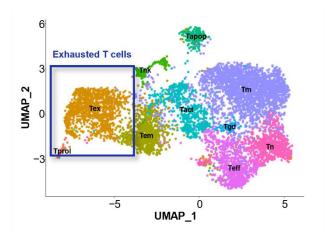


Figure 2. The uniform manifold approximation and projection (UMAP) of the expression profiles of the 6,998 TILs derived from the three surgical lung tumor tissues. TILs are classified into 10 distinct clusters.

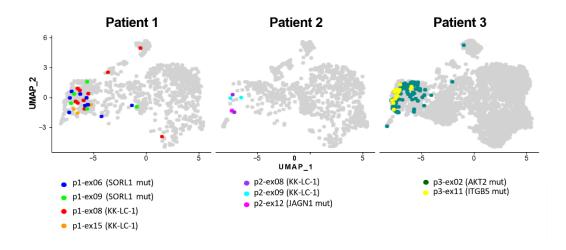


Figure 3. A total of five tumor antigens (KK-LC-1, mutant SORL1, mutant JAGN1, mutant AKT2, mutant ITGB5) and nine tumor antigen-specific TCRs (shown in different colors, 140 TCR clones in total) were identified.

In addition, by re-clustering of TCR clones (n=140) that express nine TCRs, it was discovered that even antigen-specific TCR clones have different differentiation stage and functional status among individual TCR clones (Figure 4A), and that there is a bias in differentiation and function of TCRs for each antigen (Figure 4B).

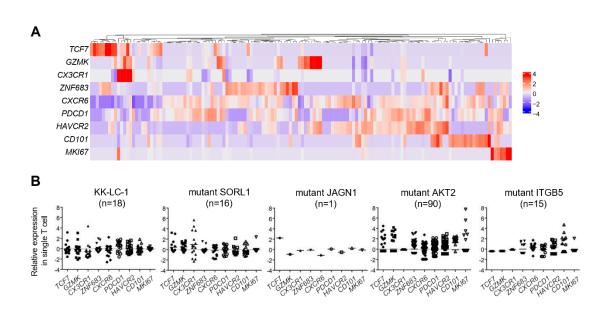


Figure 4. (A) Re-clustering of TCR clones (n=140) that express nine TCRs. (B) The expression analysis of T cell subset-defining

genes in each antigen.

TIL single-cell analysis and AI to predict cancer antigens will facilitate the identification of lung cancer antigens and may lead to the development of personalized cancer vaccine therapies and engineered T cell therapies in NSCLC in the future.

#### ■Researcher's comment

· Dr. Hirokazu Matsushita, Chief, Division of Translational Oncoimmunology, Aichi Cancer Center

In collaboration with NEC and leading research institutes, the Aichi Cancer Center has developed a procedure for efficiently identifying antigens and antigen-specific T cells using surgical samples from patients with cancer. Looking ahead, we will add a spatial analysis of the cancer microenvironment that contains antigens and antigen-specific T-cells to this system to further clarify the nature of the T-cells infiltrating the cancer. In addition to aiming to develop innovative cancer immunotherapies from these studies, we will apply the knowledge gained to other cancers as well.

· Yoshiko Yamashita, Ph.D. Senior Professional, AI Drug Development Division, NEC Corporation

NEC is conducting clinical trials of personalized cancer vaccine therapies targeting neoantigens. We believe that we have taken a step forward in realizing even more sophisticated personalized cancer vaccine immunotherapies and engineered T cell therapies by using a method to identify antigen-specific T cells constructed in this study and an Attentive Variational Information Bottleneck (AVIB) method (\*3) to predict interactions between TCRs and antigens using AI newly developed by NEC. We will continue to accelerate research and development to provide effective treatments to patients.

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(\*1) Single-cell analysis is an analysis method that is capable of detecting RNA, which is a DNA transfer product for each cell, rather than as a mass of tissue, and understanding the individuality and diversity of individual cells based on the level of gene expression.
(\*2) KK-LC-1 (KitaKyushu Lung Canner antigen-1): Cancer and testis antigens that have been reported to be expressed in cancer.
(\*3) Attentive Variational Information Bottleneck (AVIB) Method: Variation information bottleneck method developed by NEC Laboratories Europe and NEC Laboratories America to predict interactions between TCRs and antigens using AI. (https://www.neclab.eu/about-us/press-releases/detail/nec-laboratories-advances-therapeutic-cancer-vaccine-research-with-new-ai-model-attentive-variational-information-bottleneck)

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#### Appendix

### Research Paper Title

Single-cell sequencing on CD8<sup>+</sup> TILs revealed the nature of exhausted T cells recognizing neoantigen and cancer/testis antigen in nonsmall cell lung cancer

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