

## ARTICLE

# Profiling the pattern of the human T-cell receptor $\gamma\delta$ complementary determinant region 3 repertoire in patients with lung carcinoma via high-throughput sequencing analysis

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$\gamma\delta$  T cells function as sentinels in early host responses to infections and malignancies. Specifically,  $\gamma\delta$  T cells recognize tumor-associated stress antigens via T-cell receptor (TCR)  $\gamma\delta$  and play important roles in the antitumor immune response. In this study, we characterized the pattern of the human TCR  $\gamma\delta$  complementary determinant region 3 (CDR3) repertoire in patients with lung carcinoma (LC) via high-throughput sequencing. The results showed that the diversity of CDR3 $\delta$  was significantly reduced, and that of CDR3 $\gamma$  was unchanged in LC patients compared with healthy individuals; in addition, LC patients shared significantly more CDR3 $\delta$  sequences with each other than healthy individuals. The CDR3 length distribution and N-addition length distribution did not significantly differ between LC patients and healthy individuals. In addition, the CDR3 repertoire tended to use more V $\delta$ 2 and fewer V $\delta$ 1 germline gene fragments among LC patients. Moreover, we found a combination of four TCR  $\gamma\delta$  repertoire features that focus on CDR3 $\delta$  and can be used as a biomarker for LC diagnosis. Our research suggests that the TCR  $\gamma\delta$  CDR3 repertoire changed in LC patients due to the antitumor immune response by  $\gamma\delta$  T cells *in vivo*, and these changes primarily focus on the amplification of certain tumor-specific CDR3 $\delta$  clones among patients. This study demonstrates the role of  $\gamma\delta$  T cells from the TCR  $\gamma\delta$  CDR3 repertoire in tumor immunity and lays the foundation for elucidating the mechanism underlying the function of  $\gamma\delta$ T cells in antitumor immunity. *Cellular and Molecular Immunology* advance online publication, 5 February 2018; doi:10.1038/cmi.2017.157

**Keywords:** CDR3 $\delta$ ; high-throughput sequencing; LC; TCR $\gamma\delta$  repertoire

## INTRODUCTION

During the past several years, several studies have characterized human  $\gamma\delta$  T lymphocytes, and findings regarding the immune functions of these cells, particularly their natural killer cell-like lytic activity against tumor cells, have suggested that these cells may be useful in the treatment cancer.<sup>1–4</sup> This is accomplished through the interaction of heterodimer T-cell receptor (TCR)  $\gamma\delta$  and other receptors expressed on the cell surface, such as natural killer cell-activated receptor (NKG2D).

Although primarily considered an innate immune cell,  $\gamma\delta$  T cell expresses TCR  $\gamma\delta$  due to the rearrangement of germline gene V–(D)–J–C fragments, similar to the diversity observed in

TCR  $\alpha\beta$ . The antigen-binding site of TCR  $\gamma\delta$  primarily consists of three complementary determinant regions (CDRs) contributed by each V $\gamma$  or V $\delta$  domain. Both CDR1 and CDR2 regions are encoded by germline V genes, whereas the CDR3 region is formed by the somatic rearrangement of V, (D) and J fragments, which embody TCR diversity.<sup>5</sup> However, the antigen recognition pattern of TCR  $\gamma\delta$  significantly differs that from TCR  $\alpha\beta$ . Without major histocompatibility complex, TCR  $\gamma\delta$  is thought to be able to directly recognize and respond to various peptide or non-peptide antigens in an unrestricted manner.<sup>6</sup> Previous studies reported the TCR $\gamma\delta$  CDR3 repertoire of an individual change according to the state of the cells.<sup>7–9</sup>

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**Table 1** Sample characteristics

Sample ID	Gender	Age (years)	Tumor type	Stage	Tumor size (cm)	Control sample (gender/age (years))
01	Female	52	Adenocarcinoma	I	4 × 2.7	Female/50
02	Male	48	Adenocarcinoma	III	3.5 × 2.7	Male/48
03	Male	55	Small cell carcinoma	Diffusion	unknown	Male/55
04	Male	55	Squamous cell carcinoma	III	unknown	Male/50
05	Male	73	Squamous cell carcinoma	III	9 × 7	Male/74
06	Male	70	Adenocarcinoma	III	3.5 × 3	Male/69
07	Female	45	Adenocarcinoma	III	7 × 6.5	Female/46

Because tumor-infiltrating  $\gamma\delta$  T lymphocytes have been detected in a broad spectrum of malignancies,  $\gamma\delta$  T cells are believed to contribute to the front line of tumor surveillance and bridge the gap between innate and adaptive immunity. The most abundant subset of circulating  $\gamma\delta$  T cells, V $\gamma$ 9V $\delta$ 2 cells, can be activated and expanded *in vitro* or *in vivo* following a single treatment with the phosphoantigen isopentenyl pyrophosphate and are widely used for antitumor immunotherapy.<sup>10</sup> Nevertheless, the specificity of  $\gamma\delta$  T cells for cancer patients remains poorly understood.

High-throughput sequencing is used to analyze the immune repertoire of TCR or immunoglobulin, and a comprehensive analysis of the diversity of the immune system is closely related to treatment effectiveness and patient prognosis in different diseases. The analysis of TCR diversity in tumor patients might also elucidate the pathogenesis and development of cellular immunotherapy approaches that target specific tumors.<sup>11</sup> However, little is known regarding the repertoire of TCR  $\gamma\delta$ . We previously characterized the TCR  $\gamma\delta$  CDR3 repertoire in 30 healthy donors using immune repertoire sequencing and found that the TCR $\gamma\delta$  CDR3 repertoire is quite diverse and differs between individuals.<sup>12</sup> Our findings provide a basic understanding of the diversity of the TCR $\gamma\delta$  repertoire under physiological conditions, which helps to elucidate the mechanism by which  $\gamma\delta$  T cells recognize pathogens and tumor antigens.

In this study, we conducted a comprehensive and systematic analysis of the TCR  $\gamma\delta$  CDR3 repertoires of seven patients with lung cancer and healthy individuals using high-throughput sequencing. This study clarifies the characteristics of the tumor-specific TCR  $\gamma\delta$  CDR3 repertoire for the first time and provides a theoretical basis for understanding the tumor antigen recognition pattern of  $\gamma\delta$  T cells and its mechanism of action in antitumor immunotherapy.

## MATERIALS AND METHODS

### Study subjects

Peripheral blood samples were obtained from seven patients (age  $56.9 \pm 10.7$  years, male:female ratio = 5:2) with lung carcinoma (LC). All of the patients in this study were presurgery and had no treatment. The clinical characteristics of these patients are summarized in Table 1. Seven age- and gender-matched healthy volunteers (age  $56.0 \pm 11.0$  years, male:female ratio = 5:2) were included as controls (con). The

features of these LC patients and healthy controls are shown in Table 1. The study was approved by the Ethical Committee of the Chinese Academy of Medical Sciences (Project No. 008-2014) before initiation. All samples were frozen in RNA protection reagent (Qiagen, Hilden, Germany) for further processing.

### RNA isolation and arm-PCR procedure

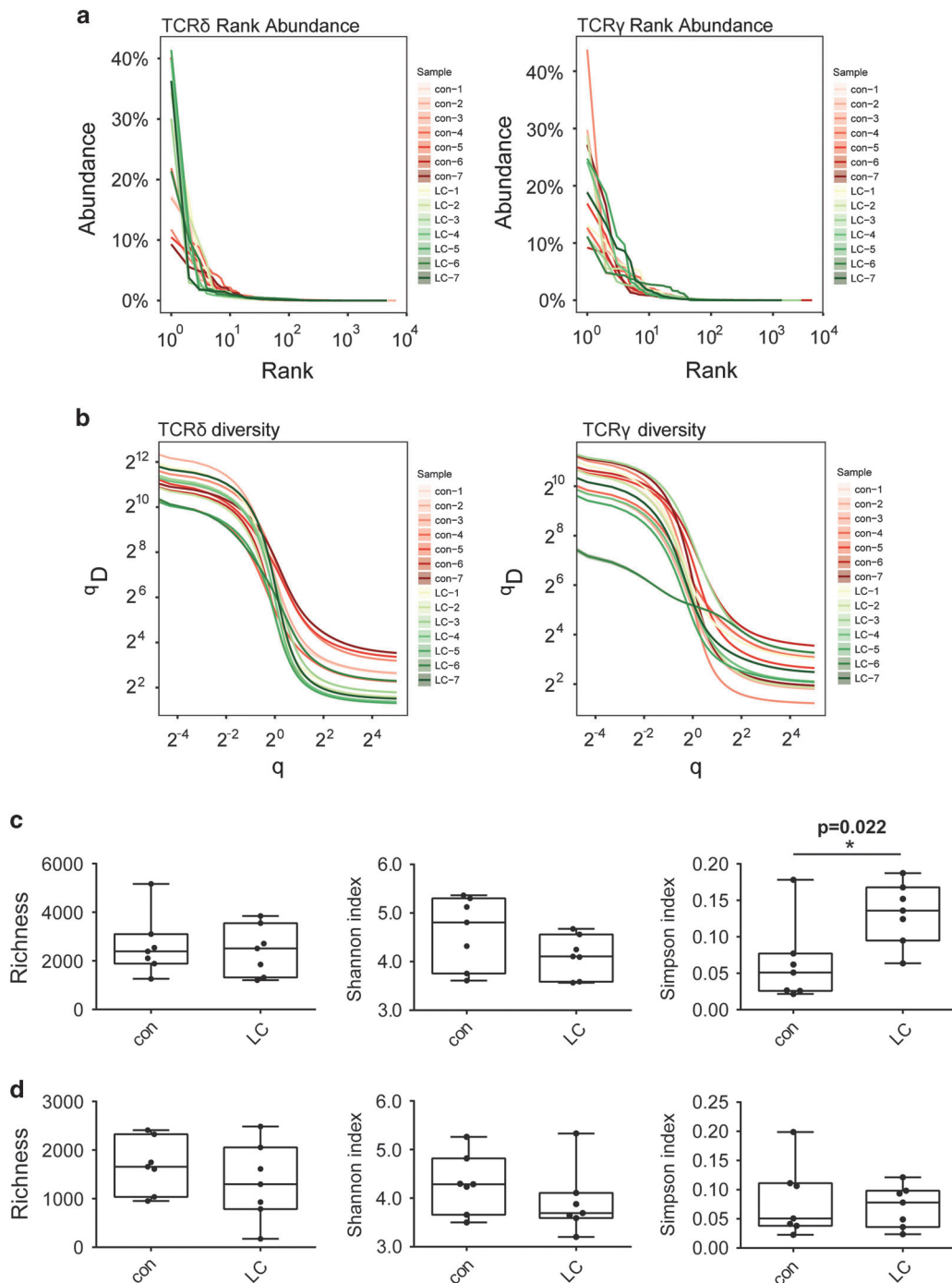
Total RNA of was extracted from whole blood using a Qiagen RNeasy Mini Kit (No. 74104, Qiagen, Hilden, Germany) according to the manufacturer's instructions. The RNA samples were then subjected to reverse-transcription PCR (RT-PCR) using a Qiagen OneStep RT-PCR Kit (No. 210212, Qiagen, Hilden, Germany). Arm-PCRs were performed to amplify the complementary DNAs, which were normalized to the  $\gamma\delta$  T-cell percentage in each sample according to the manufacturer's instructions (iRepertoire Inc., Huntsville, AL, USA), as described previously.<sup>12-14</sup> Each PCR primer contained a barcode to identify samples after sequencing. A second PCR was performed using a Qiagen Multiplex PCR Kit (No. 206143, Qiagen, Hilden, Germany) and Illumina communal sequence primer, again under conditions specified by iRepertoire.

### TCR $\gamma\delta$ repertoire sequencing and alignment of CDR3 sequences

The PCR products were purified and sequenced using the Illumina Mi-seq Platform with the PE150 Kit (Illumina, San Diego, CA, USA). Raw data were analyzed by iRepertoire using the IRmap program to identify CDR3s for each sample. The best matches of the germline V and J gene were identified by determining alignments between the Illumina platform product and germline sequences in the IMGT/GENE-DB database. All of the TCR $\gamma\delta$  CDR3 repertoire analyses in this paper were limited to in-frame sequences.

### Analysis of sequencing data

The rank abundance was applied to describe the total distribution of T-cell receptor  $\delta$ -chain (TRD) and T-cell receptor  $\gamma$ -chain (TRG) repertoire between LC patients and controls. We used diversity Hill index including Richness, Shannon index and Simpson index to evaluate the diversity characteristics of total samples. Meanwhile, we used diversity 50 (D50), the unique CDR3/total CDR3, the CDR3 clonal size and the frequency of dominant sequences to comprehensively



**Figure 1** The total distribution of T-cell receptor  $\delta$ -chain (TRD) and T-cell receptor  $\gamma$ -chain (TRG) repertoire between lung carcinoma (LC) patients and healthy controls. **(a and b)** The rank abundance distribution curve **(a)** and the diversity Hill index distribution curve **(b)** of 14 sequenced TRD and TRG repertoire. The left panel shows TRD, and the right panel shows TRG. Different samples are shown in different colors. The red spectrums represent healthy individuals and green represent LC patients. **(c and d)** Richness, Shannon index and Simpson index about the diversity Hill index distribution curve of TRD **(c)** and TRG **(d)** repertoire between LC patients and controls. \* $P < 0.05$ .

analyze differences between lung patients and healthy controls in terms of CDR3 diversity as described previously.<sup>12</sup>

We calculated the percentage of shared CDR3 and showed the overlap of TRD CDR3 sequences to evaluate common tumor-associated CDR3s among patients by Venn diagram.

Then we analyzed the Jaccard index to present the results of shared sequences.

The number of CDR3 nucleotides and random insert (N-addition) for each unique CDR3 (normalized data) were recorded, and related distribution plots were prepared in

accordance with the proportion to demonstrate the distribution of the entire CDR3 repertoire. Based on the length and proportion, we calculated the weighted average to evaluate the differences in CDR3 and N-addition length distribution.

We used the Smith–Waterman algorithm to align the local V and J segment sequences in CDR3 $\gamma$  and CDR3 $\delta$  between sequencing reads and the germline gene reference (human consensus from IGMT). The percentages of each germline V and J alleles are plotted to easily identify the frequently and infrequently used V and J alleles based on normalized data.

### Statistical analysis

The data were statistically analyzed using GraphPad Prism v.6 (GraphPad Software, San Diego, CA, USA). The mean values for each parameter were compared between LC patients and controls using the Bootstrapping analysis and Mann–Whitney *U*-test.  $P < 0.05$  was considered significant. Unexpected clustering (cluster 3.0) and a principal component analysis (Metabo Analyst) were used to analyze selected parameters.

## RESULTS

### The diversity of TRD is significantly reduced in LC patients

The diversity of the TCR $\gamma\delta$  CDR3 repertoire, which reflects the proliferation of specific  $\gamma\delta$  T-cell clones, is one of the most important features of LC patients. We represented the rank abundance distribution curve of the total seven LC patients and seven healthy controls we sequenced. The results revealed that LC patients had higher abundance at low-rank scope than controls in the TCR $\delta$  chain (TRD) (Figure 1a). Then we applied the Hill index distribution curve (Figure 1b) and analyzed three parameters about the diversity both in the TRD and TRG between LC patients and controls (Figures 1c and d). We found that LC patients had higher Simpson index than healthy controls in TRD chain (Figure 1c). However, no significant difference was observed in TRG chain (Figure 1d).

We also assessed group-wise differences between LC patients and controls based on the D50, unique CDR3/total CDR3, CDR3 clonal size and frequency of the dominant sequence (Figure 2), which did not identify significant differences in the D50 of both the TRD chain and TRG chain between LC patients and controls (Figure 2a). However, the unique CDR3/total CDR3 value of TRD was 1.8-fold lower in LC patients than in controls ( $P = 0.035$ ) (Figure 2b). The size of each clone was calculated based on its frequency in the repertoire, and scatterplots of the top 50 clones are shown in Figure 2c. CDR3 $\delta$  clones with a clonal size ranging from  $>20\%$  and  $>15\%$  were more common ( $P = 0.002$ ,  $P = 0.039$ , respectively), and those with a clonal size  $>1\%$  were less common ( $P = 0.001$ ) in the top 50 clones of the LC group than those of the control group (Figure 2d). We also analyzed the frequency of dominant sequences that most significantly contributed to the diversity of the entire repertoire, including the top 1, 5 and 10 clones for each sample (Figure 2e), which showed that the frequency of top 1 CDR3 $\delta$  clones was significantly higher in the LC group than in the control group. Taken together, these results

demonstrate that the diversity of TRD is significantly reduced in LC patients.

### LC patients shared more CDR3 $\delta$ sequences

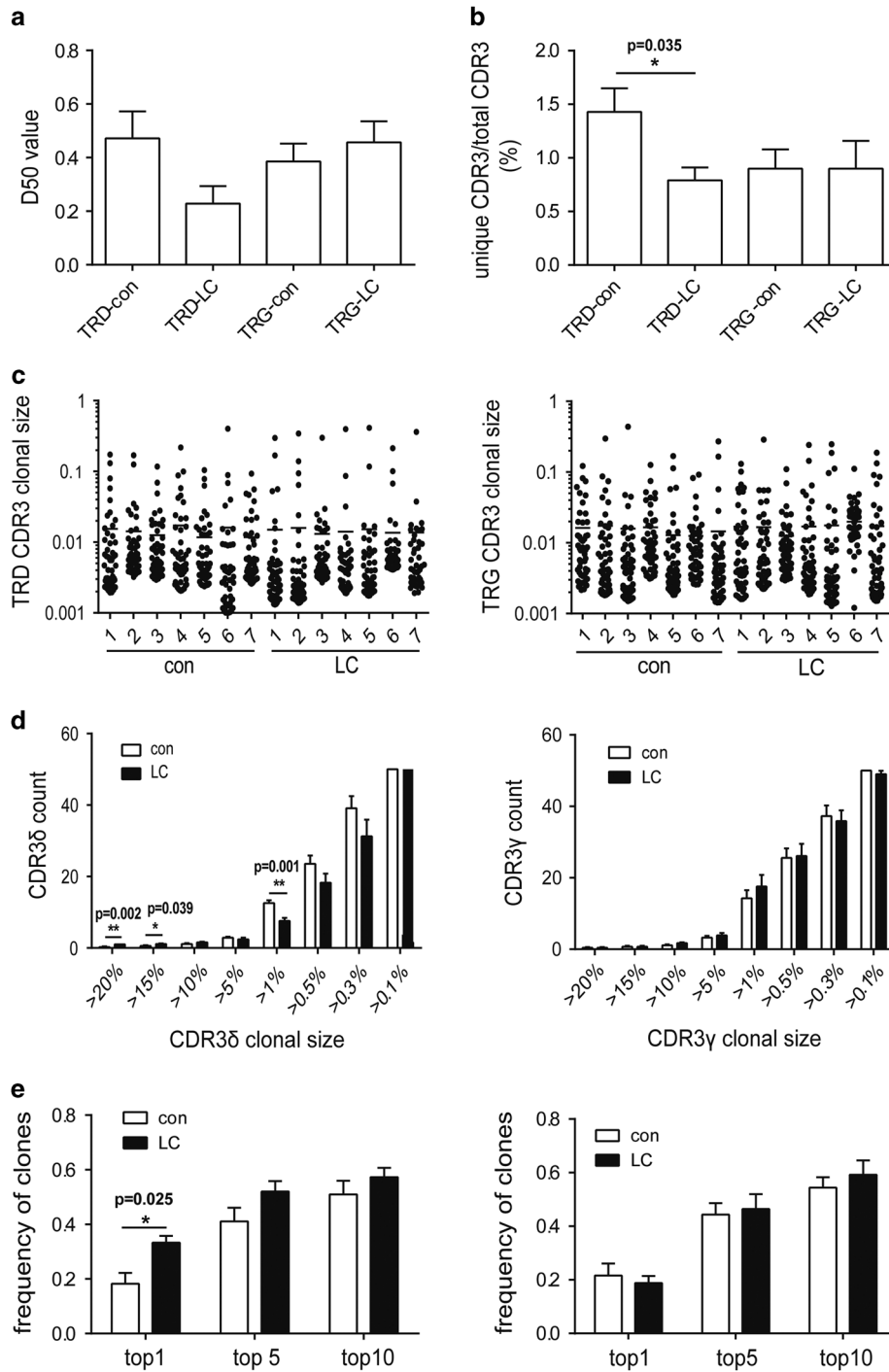
We analyzed the differences in the shared CDR3 sequences between seven LC patients and seven healthy individuals. However, the results showed no significant difference, which may be due to the different types of LC (data not shown). Therefore, we analyzed the shared CDR3 sequences of four LC patients with adenocarcinoma and four age- and gender-matched healthy controls. The results showed that the percentage of shared CDR3 $\delta$  sequences was 6.81% in LC patients, which was 4.2-fold higher than that in healthy individuals ( $P = 0.008$ ) (Figure 3a), and this difference remained significant when the percentage of shared CDR3 $\delta$  sequences between patients and controls was set to a threshold clonal size  $>0.01\%$  ( $P = 0.013$ ) (Figure 3b). However, the proportion of CDR3 $\gamma$  sequences did not significantly differ between groups, when analyzing either the entire repertoire or clones with a clonal size  $>0.01\%$ . Figure 3c shows the number of CDR3 $\delta$  sequences shared between four LC patients and four healthy individuals in detail. We used Jaccard index to measure the shared diversity, and the results revealed that the LC patients had significant more shared sequences than controls no matter shared by 4, 3 or 2 samples (Figure 3d). Although LC patients shared more CDR3 $\delta$  sequences, the consistent proportion of the TRD repertoire remained very limited. Because LC patients appear to share more CDR3 $\delta$  sequences, these sequences may be associated with specific tumor antigens. Table 2 lists the 26 common shared CDR3 $\delta$  sequences among LC patients (V1: 4/26; V2: 21/26; V3: 1/26).

### The CDR3 and N-addition length distributions were similar in LC patients and healthy individuals

The CDR3 region consists of V–(D)–J fragments and N-additions between the V–D, D–J and V–J fragments added during TCR rearrangement. The number of CDR3 nucleotides and N-additions for each unique CDR3 were recorded, and related distribution plots were generated in accordance with the proportion to demonstrate the distribution of the entire CDR3 repertoire. The results indicate that the average CDR3 and N-addition lengths of TRD and TRG exhibited a standard distribution in both groups, and the weighted averages of the CDR3 and N-addition lengths did not significantly differ between the two groups (Figure 4).

### The TCR $\gamma\delta$ repertoire contained more hTRDV2 germline gene segments in LC patients than healthy individuals

The germline V–J gene usage of the TCR $\gamma\delta$  repertoire, including three V gene segments of TRD (hTRDV1/2/3), six V gene segments of TRG (TRGV2/3/4/5/8/9), four J gene segments of TRD (hTRDJ1/2/3/4) and five J gene segments of TRD (hTRGJ1/P1/2/P2/P) were analyzed. An in-group analysis showed significant differences in the frequency of hTRDV1 and hTRDV2 (Figure 5): hTRDV2 was more common and

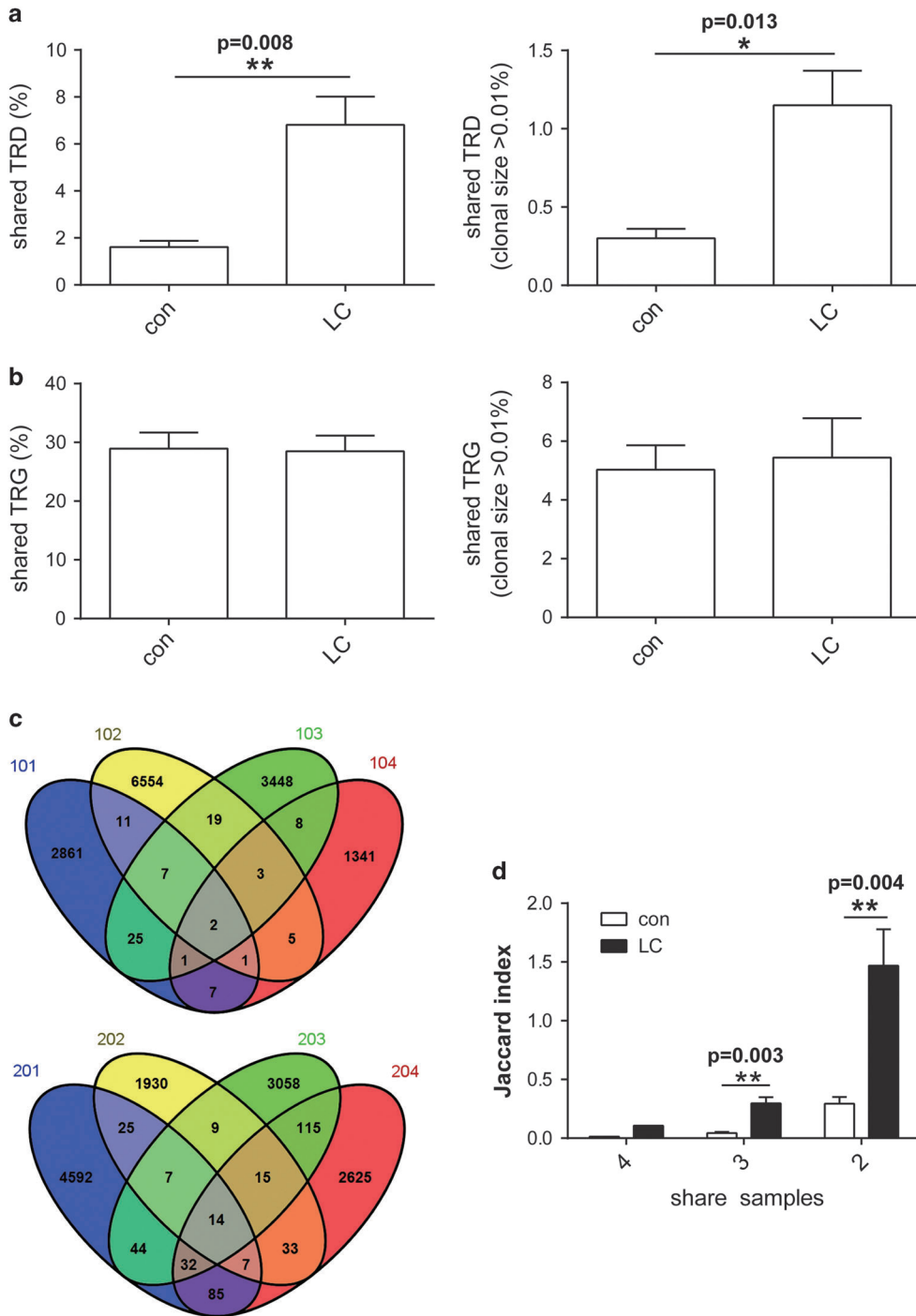


**Figure 2** The diversity of T-cell receptor  $\delta$ -chain (TRD) is significantly reduced in lung carcinoma (LC) patients. (a) The D50 of the TRD and T-cell receptor  $\gamma$ -chain (TRG) repertoires in LC patients. (b) The unique complementary determinant region 3 (CDR3)/total CDR3 value of the TRD and TRG repertoires in LC patients. \* $P < 0.05$ . (c) The scatter plot of the distribution of the top 50 CDR3 clones in LC patients. (d) The statistical analysis of the proportion of top 50 CDR3 sequences by clone size (>20%, >15%, >10%, >5%, >1%, >0.5%, >0.3%, >0.1%). \* $P < 0.05$ , \*\* $P < 0.01$ . (e) The frequency of the top 1, top 5 and top 10 CDR3 sequences in LC patients. \*\* $P < 0.01$ . The left panel shows TRD, and the right panel shows TRG in (c–e). Mean values with error bars representing the  $\pm$  standard error (s.e.m.) are plotted, and the Bootstrapping analysis and Mann–Whitney  $U$ -test was used to analyze differences between groups.

hTRDV1 was less common in LC patients than healthy individuals, suggesting that rearrangement of V $\delta$ 2 T cells to increase tumor cytotoxicity were more common in LC patients due to the antitumor immune response.

### Specific features associated with the TCR $\delta$ chain repertoire effectively identified LC patients

An in-group analysis of the TCR  $\gamma\delta$  CDR3 repertoire identified a total of four relatively independent characteristics that



**Figure 3** Lung carcinoma (LC) patients shared more complementary determinant region 3 $\delta$  (CDR3 $\delta$ ) sequences than healthy individuals. (a) The proportion of total shared CDR3 T-cell receptor  $\delta$ -chain (TRD) and T-cell receptor  $\gamma$ -chain (TRG) sequences among four LC patients and among four healthy controls. (b) The proportion of shared CDR3 TRD and TRG sequences among four LC patients patients and among four healthy patients for a threshold clonal size >0.01%. The left panel shows TRD, and the right panel shows TRG. Mean values with error bars depicting the  $\pm$ s.e.m. are shown. \*\* $P$ <0.01 by the Bootstrapping analysis and Mann–Whitney  $U$ -test. (c) The Venn diagram shows the exact number of shared CDR3 $\delta$  sequences among four LC patients and four healthy individuals. Different samples are shown in different colors. The numbers in the overlap of different colors represent the number of shared CDR3 $\delta$  sequences. (d) The Jaccard index analysis of mean shared sequences shared by 4, 3 and 2 samples in groups. \*\* $P$ <0.01.

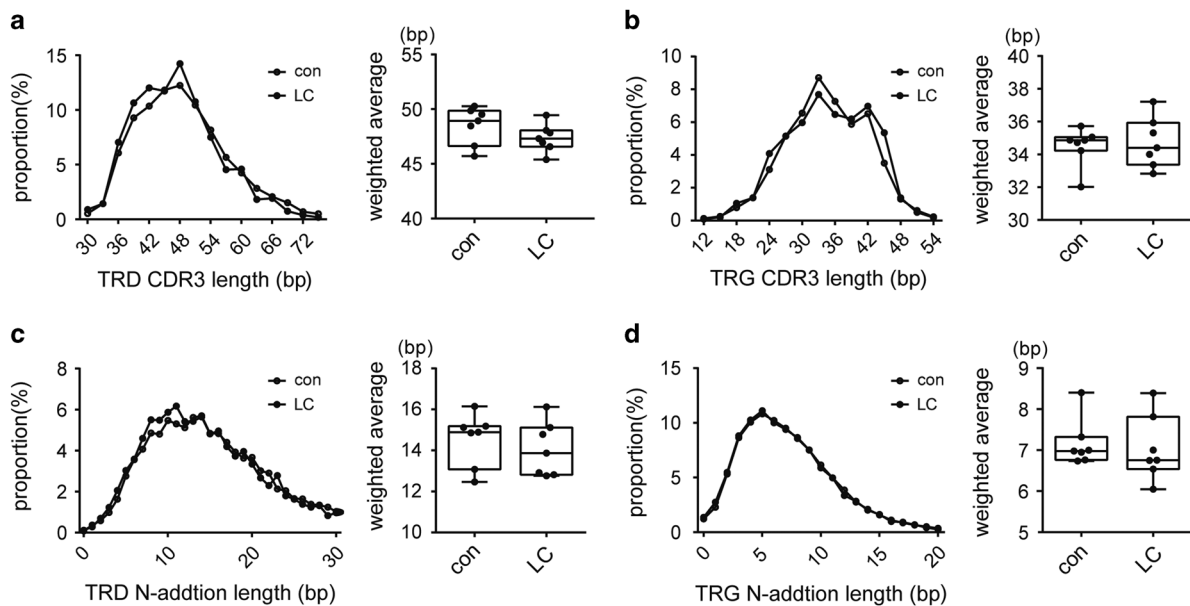
significantly differed between the LC and control groups, including the unique CDR3/total CDR3 ratio, top 1 CDR3 frequency, hTRDV1/hTRDV2 ratio and CDR3 clonal size

1–10%/<10% ratio of the TCR  $\delta$  chain. Thus, we tested the ability of these parameters to effectively distinguish LC patients from healthy individuals. Unexpected clustering results showed

**Table 2** The shared CDR3 $\delta$  sequences in LC patients

No.	CDR3 sequence	Length (AA)	V-D-J usage	No.	CDR3 sequence	Length (AA)	V-D-J usage
1	ACDTLGSYTDKLI	13	V2-D3-J1	14	ACEGIGTDKLI	11	V2-D3-J1
2	ACDPLGDSDKLI	12	V2-D3-J1	15	ACDVTLQGGPDTQDKLI	18	V2-D3-J1
3	ALGEAQFLVSYLGDTRSRLI	20	V1-D3-J1	16	ACDVTGGLKYTDKLI	16	V2-D3-J1
4	ACDTMGSGDWEVDKLI	16	V2-D3-J1	17	ACDTVLYTDKLI	12	V2-J1
5	ACDTLPGTGYGDKLI	15	V2-D3-J1	18	ACDVTGTGDRASDKLI	16	V2-D3-J1
6	ACDSVLGDRTRTDKLI	16	V2-D3-J1	19	ACDVTGPDTDKLI	13	V2-J1
7	ACDSLGGPYTDKLI	14	V2-D3-J1	20	ACDVTGDSPPGTDKLI	16	V2-D3-J1
8	ACDMLDTRYTDKLI	14	V2-D3-J1	21	ACDTLSRTDIGTDKLI	16	V2-J1
9	ACDGLNTDKLI	11	V2-J1	22	ACDSVLGPSFLDKLI	15	V2-D3-J1
10	ARILGPTPPTYTDKLI	16	V1-D3-J1	23	ACDSSLGDRTDKLI	14	V2-D3-J1
11	ALGEPAPGTDKLI	13	V1-J1	24	ACDPVLGDTPTPPYTDKLI	20	V2-D3-J1
12	ALGELIESLSDTGTYTDKLI	19	V1-D3-J1	25	ACDPLLGDRELI	12	V2-D3-J1
13	AFKGGYWGRNMYTDKLI	17	V3-D3-J1	26	ACDPLGDLPHTDKLI	15	V2-D3-J1

Abbreviations: AA, amino acid; CDR, complementary determinant region.



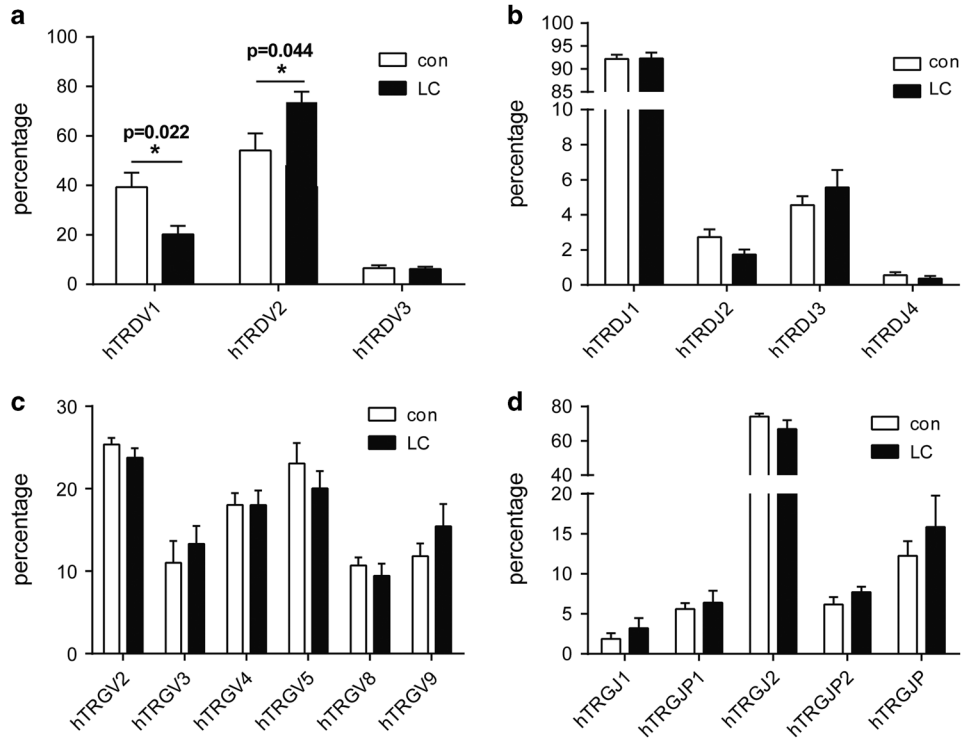
**Figure 4** The complementary determinant region 3 (CDR3) and N-addition length distributions in lung carcinoma (LC) patients and healthy individuals were similar. (a–d) show the distributions of T-cell receptor  $\delta$ -chain (TRD) CDR3 lengths, T-cell receptor  $\gamma$ -chain (TRG) CDR3 lengths, TRD N-addition lengths and TRG N-addition lengths, respectively. The left panel: the average length distribution curve of seven controls and LC patients. The right panel: the weighted average of each distribution curve.

that all seven LC patients and seven healthy individuals were clustered together based on these four parameters (Figure 6a), and a principal component analysis showed that the division between groups by principal component 1 based on the four indicators reached 95.9% (Figure 6b). These results show that the specific TCR repertoire features of LC patients primarily focused on the TCR  $\delta$  chain, suggesting that the key sites by which TCR $\gamma\delta$  recognizes tumor antigens may be located in the TCR  $\delta$  chain.

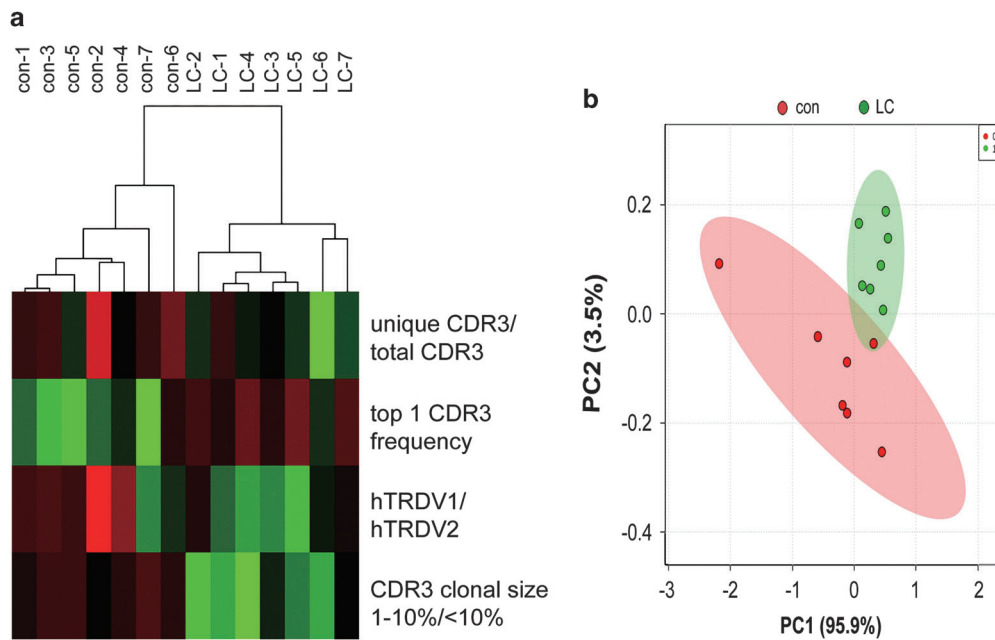
## DISCUSSION

Since the discovery of  $\gamma\delta$  T cells in the late 1980s, a significant amount of knowledge has accumulated regarding human  $\gamma\delta$  T lymphocytes.<sup>15</sup> Although they represent only ~5% of

peripheral T cells in the blood, epithelial tissues are rich in  $\gamma\delta$  T cells. The unconventional immune functions of  $\gamma\delta$  T cells, notably, their histocompatibility leukocyte antigen-unrestricted cytotoxic activity against malignant cells, have implicated them as possible therapeutic targets in cancer. Although they are primarily considered innate immune cells,  $\gamma\delta$  T cells exhibit a diverse TCR  $\gamma\delta$  repertoire due to V-(D)-J-C gene rearrangement in the thymus. However, the role of TCR  $\gamma\delta$  diversity in tumor antigen recognition and the antitumor immune responses of  $\gamma\delta$  T cells remain unclear. In an earlier study, we characterized the TCR  $\gamma\delta$  CDR3 repertoire in the normal population via high-throughput sequencing, which showed a wide variety in the TCR  $\gamma\delta$  CDR3 repertoire and interindividual differences, but this repertoire was significantly less diverse



**Figure 5** The frequency of germline V and J gene segments in the TCR  $\gamma\delta$  complementary determinant region 3 (CDR3) repertoire of lung carcinoma (LC) patients and healthy individuals. (a–d) The germline gene usage of three T-cell receptor  $\delta$ -chain (TRD) V segments (hTRDV1, hTRDV2 and hTRDV3), four TRD J segments (hTRDJ1, hTRDJ2, hTRDJ3 and hTRDJ4), six T-cell receptor  $\gamma$ -chain (TRG) V segments (hTRGV2, hTRGV3, hTRGV4, hTRGV5, hTRGV8 and hTRDV9) and five TRG J segments (hTRGJ1, hTRGJP1, hTRGJ2 and hTRDJP2), respectively. \* $P < 0.05$ .



**Figure 6** Specific features associated with the TCR $\delta$  chain repertoire effectively distinguished lung carcinoma (LC) patients. (a) Unexpected clustering results from the four selected parameters of the complementary determinant region 3 $\delta$  (CDR3 $\delta$ ) repertoire that significantly differ between LC patients and healthy individuals. (b) Principal component analysis for the four selected parameters. Sample con-1 to con-7 represent seven control samples, and LC-1 to LC-7 represent samples from seven patients with lung cancer. Four selected parameters are unique: CDR3/total CDR3, top 1 CDR3 frequency, hTRDV1/hTRDV2 and top 50 CDR3 clonal size 1–10%/<10%.



than the TCR  $\alpha\beta$  and Ig repertoires.<sup>12</sup> In this study, we profiled the pattern of the human TCR  $\gamma\delta$  CDR3 repertoire in LC patients using the same method to clarify the mechanism by which  $\gamma\delta$  T cells recognize tumor antigens based on TCR  $\gamma\delta$ .

We found that the CDR3 $\delta$  repertoire was significantly less diverse in LC patients, and the LC patients shared significantly more CDR3 $\delta$  sequences, but not CDR3 $\gamma$  sequences, with each other than healthy individuals. This result indicates that CDR3 $\delta$  has a more important role in the recognition of and response to tumor-associated antigens than CDR3 $\gamma$ . TCR  $\gamma\delta$  is structurally similar to the B-cell receptor on B lymphocytes and directly binds to its antigens to trigger a rapid response. Heavy-chain CDR3 is the key determinant of the specificity of antigen binding to the B-cell receptor. Because the gene composition of the CDR3 $\delta$  of TCR  $\gamma\delta$  and heavy-chain CDR3 of B-cell receptor are similar, CDR3 $\delta$  has been considered to play a key role in the recognition of tumor antigens by TCR  $\gamma\delta$ . Our previous studies have demonstrated this hypothesis.<sup>16–19</sup> This study provides substantial evidence focus on TCR  $\gamma\delta$  repertoire to support this hypothesis.

However, unlike the 'one-to-one' specific identification of TCR  $\alpha\beta$  and Ig, TCR  $\gamma\delta$  exhibited oligoclonal expansion after antigen stimulation. Human MutS homolog 2 is a tumor-associated antigen recognized by TCR  $\gamma\delta$  that we identified in 2008.<sup>18</sup> We investigated the CDR3 $\delta$  diversity of human MutS homolog 2-specific  $\gamma\delta$  T cells and found that the diversity of CDR3 $\delta$  sequences was limited.<sup>9</sup> Although the recognition of antigens by TCR  $\gamma\delta$  is not strictly specific, LC patients shared more CDR3 $\delta$  sequences than healthy individuals. These results suggest that specific  $\gamma\delta$  T cells in the peripheral blood of LC patients undergo clonal expansion in response to an unknown stimulus. These CDR3 sequences shared among LC patients, which are likely related to tumor-associated antigens, can be used to identify more tumor antigens recognized by  $\gamma\delta$  T cells.

Human  $\gamma\delta$  T cells are divided into two subtypes, V $\delta$ 1 and V $\delta$ 2  $\gamma\delta$  T cells, whose locations and functions differ. V $\delta$ 2  $\gamma\delta$  T cells, which are often paired with V $\gamma$ 9, are a major subset of  $\gamma\delta$  T cells in the peripheral blood and regarded as a potential candidate for tumor immunotherapy because they exhibit strong antitumor activity against different types of cancer cells. However, V $\delta$ 1 cells, which are mainly found in tissues, are reported to regulate immune regulation.<sup>20</sup> We used both raw and normalized data to analyze the frequency of specific germline V–J mutations in the TCR  $\gamma\delta$  repertoire of LC patients, but these data were counted differently. The raw data consist of directly observed read count data, whereas the normalized data count each distinct CDR3 as one, irrespective of how it is observed. In other words, the raw data show the actual subset composition of  $\gamma\delta$  T cells, whereas normalized data better reflect the TCR  $\gamma\delta$  repertoire but do not consider the different clone sizes of each CDR. Interestingly, we found that V $\delta$ 2 germline gene fragments tended to be even more common in the CDR3 repertoire of LC patients than healthy controls based on the normalized data. This finding suggests that besides being stimulated by certain tumor-related antigens and subsequent expansion in the peripheral blood, more

V $\delta$ 2  $\gamma\delta$  T-cell clones are generated during TCR rearrangement in the thymus of LC patients.

Tumor markers are produced by tumor cells or during tumor development, and a good tumor marker is important for the diagnosis, therapy and monitoring of the tumor. Traditional tumor marker studies have focused on the search for tumor-associated protein antigens, such as carcinoembryonic antigen and serum amyloid A protein. Studying the immune repertoire primarily helps to understand the role of T and B lymphocytes in the occurrence and progression of disease and provides a new, immune-based strategy for the diagnosis and treatment of these diseases.<sup>21</sup> Our results suggest that some of the features of the TCR  $\gamma\delta$  repertoire, especially on the TCR  $\delta$  chain, can also be used as tumor biomarkers. However, this conclusion is only based on the analysis of the TCR  $\gamma\delta$  repertoire of seven pairs of LC patients and healthy individuals. Given the significant interindividual differences, we are planning to analyze a larger cohort in our follow-up studies.

Compared to  $\gamma\delta$  T cells in the peripheral blood, tumor-infiltrating  $\gamma\delta$  T cells are known to mediate potent antitumor activity. Thus, understanding the characteristics of a successful antitumor  $\gamma\delta$  T-cell response and exploiting this knowledge for patient stratification is increasingly important.<sup>22</sup> Several recent studies used next-generation sequencing technology to demonstrate that the tumor-infiltrating  $\alpha\beta$  T-cell repertoire of cancer patients is distinct from that of non-tumor sites and peripheral blood.<sup>23,24</sup> Therefore, the characteristics of the repertoire of tumor-infiltrating  $\gamma\delta$  T cells help to answer biological questions and define predictive biomarkers for cancer immunotherapy.

In this study, we analyzed the characteristics of the TCR  $\gamma\delta$  CDR3 repertoire of LC patients using high-throughput sequencing and found that the diversity of CDR3 $\delta$  was significantly reduced in this population. Specifically, these patients shared significantly more CDR3 $\delta$  sequences with each other, and V $\delta$ 2 germline gene fragments tended to be more common, whereas V $\delta$ 1 germline gene fragments tended to be less common in this group compared with the control group. In addition, we identified a combination of four TCR  $\gamma\delta$  repertoire features focused on CDR3 $\delta$  that may be used as a biomarker for LC diagnosis. Moreover, the CDR3 $\delta$  sequence shared by LC patients will be used to identify ligands recognized by TCR  $\gamma\delta$ , which may serve as new therapeutic targets for personalized treatment.

## CONFLICT OF INTEREST

The authors declare no conflict of interest.

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