Title: CD8[+] T-cell memory induced by successive SARS-CoV-2 mRNA vaccinations is

characterized by clonal replacement

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Abstract

mRNA vaccines against the Spike glycoprotein of severe acute respiratory syndrome

type 2 coronavirus (SARS-CoV-2) elicit strong T-cell responses. However, it's not

known whether T cell clonotypes responding to the first vaccination repeatedly expand

with booster vaccinations. Here, we temporally tracked the $CD8^+$ T-cell repertoire in

individuals who received three shots of the BNT162b2 mRNA vaccine. By analyzing

the kinetic profile of $CD8^+$ T-cell clonotypes responding to the first, second, or third

shot, we demonstrated that newly expanded clonotypes elicited by the second shot

replaced many of those that responded to the first shot. Although these 2nd responder

clonotypes expanded after the third shot, their clonal diversity was skewed, and they

were partially replaced by newly elicited the 3rd responders. Furthermore, this

replacement of vaccine-responding clonotypes occurred within the same Spike epitope.

These results suggest that $CD8^+$ T-cell memory induced by repetitive mRNA

vaccination is characterized by the emergence of new dominant clones.

Introduction

mRNA vaccines against the Spike glycoprotein of severe acute respiratory syndrome

type 2 coronavirus (SARS-CoV-2), including Pfizer-BioNTech's BNT162b2 and

Moderna's mRNA-1273, are strikingly effective at reducing coronavirus disease 2019

(COVID-19)[1]. These mRNA vaccines elicit both humoral and cellular immune

responses specific for the viral Spike protein[2–4]. The cellular immune response may be

more protective to variants of concerns (VOCs) of SARS-CoV-2 than the humoral

response, because cellular immunity against the ancestral strain targets relatively

conserved regions of the Spike protein[5,6] and potentially cross-reacts with the other

variants[7,8]. Studies on the cellular immune responses to SARS-CoV-2 mRNA

vaccination have demonstrated that the numbers of Spike-reactive T cells increase in the

peripheral blood after the first shot, and are additionally boosted after the second

shot[4,9,10]. Furthermore, the third mRNA vaccination rapidly re-expands Spike-reactive T

cells that had waned after the second shot[11,12].

Previous studies demonstrated that secondary, or boost, vaccinations induce the

reactivation of memory CD8[+] T cells established following the initial vaccination[13–16].

However, repetitive antigen stimulation in mice alters the properties of memory T cells,

including enhancement of their effector function, and reductions in their proliferation

potential and ability to produce IL-2[14,17]. This suggests that memory CD8$^+$ T cells

induced by the first vaccination become poorly, or non-responsive during the course of

repetitive antigen stimulation. In line with this hypothesis, we previously reported that

older memory T cell populations were replaced by newly expanded T cell populations in

a serial adoptive transfer model characterized by repetitive antigen exposure[18].

However, in repetitive SARS-CoV-2 mRNA vaccinations, it is not known whether T

cell clonotypes that had responded to the first shot expanded repeatedly after subsequent

vaccination, or whether primary responder clonotypes were partially, or fully, replaced

by newly expanded clonotypes after each vaccination.

Pathogen-reactive T cells recognize distinct antigenic epitopes via their unique T cell

receptor (TCR). To analyze changes in T cell clonal dominance during SARS-CoV-2

mRNA vaccination, we undertook a longitudinal repertoire analysis by TCR

sequencing. This enabled us to comprehensively quantify changes in the frequencies of

specific T-cell clones ("kinetic profile") during primary and secondary responses to

mRNA vaccination. Specifically, we performed a longitudinal TCR repertoire analysis

on peripheral blood T cells at ten time points, before and after the first, second, and third

BNT162b2 mRNA vaccination. Furthermore, Spike reactivity, immunological

phenotype, and epitope specificity of T cell clonotypes were analyzed by an activation-

induced marker assay (AIM assay) using a Spike peptide pool, single-cell analysis of

gene expression and TCR sequence, and TCR motif analysis of Spike-specific T-cell

clonotypes.

Results

Novel clones dominated the T-cell response after the second vaccination.

We studied a cohort of 38 healthcare workers at Nara Medical University (Japan) who

had received three shots of the Pfizer-BNT162b2 vaccine[19] (Supplementary Table S1).

Peripheral blood mononuclear cell (PBMC) samples were longitudinally collected from

the participants at ten points (Fig. 1A). CD4$^+$ and CD8$^+$ T cells were separated from the

PBMC samples, and their TCR repertoire was analyzed ("bulk TCR repertoire

analysis"). To analyze the kinetics of T cell clonal responses to mRNA vaccination, we

first compared the frequency of clonotypes before and after the vaccination (P1-P2, P2-

P3, and P6-P8). We then identified clonotypes that significantly expanded after each

vaccination (i.e., vaccine-responding clonotype) (Figure 1B)[20]. For both CD4$^+$ and

CD8$^+$ T cells, the total frequency and diversity of clonotypes that expanded after the

second shot was greater than that of responding clonotypes to the first and third shots

(Figure 1C and D). This result demonstrated that the T cell clonal response to mRNA

vaccination peaked after the second shot.

Using the longitudinal bulk TCR-seq data, we analyzed which of the following two

models explained the T-cell responses following mRNA vaccinations: (i) repetitive

expansion model, in which the clonotypes responded to the first shot expanded

repeatedly after the second and third shot, or (ii) clonal replacement model, in which

primary responder clonotypes were partially or fully replaced by newly expanded ones

after each shot (Figure 1E). For this purpose, the responding clonotypes were classified

into four patterns based on their response to each shot (Figure 1F and Figure S1A): 1st

responders (expanded after the first shot but did not after the second shot), 2nd

responders (did not expand after the first shot but expanded after the second shot), dual

responders (expanded or increased after both the first and the second shot), and 3rd

responders (were not detected before the third shot and responded to the third shot)

(Materials and Methods). Then, the clonal response of each subject was summarized by

calculating the total frequency of the clonotypes in each response pattern (Figure 1F,

bold line). We longitudinally tracked the total frequency of each response pattern

(Figure 1G). After the first shot, the total frequency of the 1st and dual responders was

significantly higher than that of the 2nd responders. On the other hand, after the second

shot, the total frequency of 2nd responders exceeded the 1st and dual responders (Figure

1H). The fact that the 2nd responders, not the dual responders, were dominant after the

second shot suggests that, after the second shot, the majority of the responding

clonotypes were new clonotypes. The total frequency of responders after the third shot

was also analyzed (Figure 1H). At this point, although the expansion of 3rd responders

was observed, the 2nd responders were still dominant, and their total frequency was

more than twenty times that of 3rd responders. This result demonstrated that most of the

responding clonotypes were maintained between the second and third shots, unlike the

predominant replacement observed between the first and second shots. A similar

replacement of responding clones was also observed in CD4+ T cells (Figure S1A and

B).

2nd responders were more dominant in CD8+ Spike-reactive clonotypes than dual

responders

Next, we analyzed whether the predominant replacement of responding clonotypes

between the first and the second vaccination was also observed among Spike-reactive

clones (Figure 2A). To detect Spike-reactive clonotypes, an activation-induced marker

(AIM) assay was performed[9,21–23]. PBMCs collected after the vaccinations (P2, P3, and

P8) were stimulated with peptide pools of the SARS-CoV-2 Spike protein. Then,

CD137$^+$ or CD107a$^+$ non-naïve CD8$^+$ T cells and CD40L$^+$ CD69$^+$ non-naive CD4$^+$ T

cells were sorted as AIM$^+$ Spike-reactive cells (Figure 2B and Figure S2A). The

proportion of AIM$^+$ cells among CD8$^+$ and CD4$^+$ T cells quantified by flow cytometry

peaked after the second shot, consistent with the numbers and extent of expansion of

responding clonotypes in the CD8$^+$ and CD4$^+$ T-cell repertoire (Figure S2B, Figure 1C,

and 1D). We then performed TCR-seq on AIM$^+$ and AIM$^-$ non-naive T cells from the

samples after the second shot (P3) and identified AIM$^+$ CD8$^+$ and CD4$^+$ T cell

clonotypes ("AIM TCR-seq," Figure 1A, 2C, and D). The total frequency of AIM$^+$

clonotypes was significantly increased, not only after the second shot, but also after the

third shot (Figure 2E and Figure S2C). This observation confirms that CD8$^+$ and CD4$^+$

AIM$^+$ clonotypes include Spike-reactive clonotypes responded to the vaccination.

We next classified AIM$^+$ clonotypes into the response patterns described above (Figure

2F). In addition, we calculated the proportions of 1st, 2nd, and dual responders among

CD8$^+$ AIM$^+$ clonotypes (i.e., the number of AIM$^+$ 1st, 2nd, or dual responder clonotypes

divided by the total number of AIM$^+$ clonotypes). More than half of the CD8$^+$ AIM$^+$

clonotypes were not classified as responders, suggesting that some non-Spike-reactive

bystander clonotypes contaminated the AIM$^+$ clonotypes. At the same time, the

proportion of the CD8$^+$ 2nd responders was significantly higher than that of AIM$^+$ dual

responders (Figure 2G). Moreover, the total frequency of AIM$^+$ 2nd responders of CD8$^+$

T cells was also considerably greater than that of AIM$^+$ dual responders after the second

shot (Figure 2H). These results indicate that the predominant replacement of responding

clonotypes between the first and the second shot also occurred among Spike-reactive T

cells. Similar results were observed for CD4$^+$ AIM$^+$ T cell clonotypes (Figure S2D and

E).

2nd responder clonotypes exhibit effector memory phenotype after the second and

third vaccination

Our data demonstrate that 2nd responder clonotypes predominate in T cell responses

after the second and the third vaccination. Therefore, we next analyzed the phenotype of

2nd responders after the second and the third vaccination. Targeted single-cell RNA-

sequencing (scRNA-seq), single-cell TCR sequencing (scTCR-seq), and protein

expression analysis using oligo-conjugated antibodies (AbSeq) were performed on

blood CD8$^+$ T cells of seven participants collected after the second or third vaccination

(P3 and P8) (Figure 3A, S3A, and Supplementary Table S2). After removing γδ T cells

and mucosal-associated invariant T cells (MAITs), we categorized conventional non-

naïve CD8$^+$ T cells into six clusters using integrated mRNA and surface protein

expression data (Figure 3B and Figure S3A). We then evaluated the characteristics of

these clusters based on the mRNA and protein expression levels of marker genes

(Figure 3C, 3D, S3B, and S3C) and signature scores for previously reported blood CD8$^+$

T cell clusters[24] and CD8$^+$ T cell characteristics (BD Immune response panel, Hs)

(Figure S3D and S3E). Cluster 3 cells expressed *TCF7*, CCR7, and CD127, and

exhibited a higher score for stem-like and progenitor-exhausted T cells, which were

considered to be central memory T cells (T$_{CM}$). In addition, we regarded Cluster 2 cells

as effector-memory T cells (T$_{EM}$), because they expressed *CCR5*, *CD38*, and HLA-DR,

and exhibited a higher score for EM-like T cells. Moreover, this cluster included

TOP2A$^+$ proliferating T cells. Cells in the remaining four clusters (#0, 1, 4, and 5) were

CD45RA^{high}, *GZMB*^{high}, and CCR7^{low}, and exhibited higher effector function scores,

matching the characteristics of effector memory T cells expressing CD45RA

(T$_{EMRA}$)[25,26]. Among them, cluster 0 cells were terminal effector (T$_{TE}$), based on their

expression of CD56 and *GNLY*, and clusters 4 and 5 cells were named OX40 (CD134) $^+$

and Tim3$^+$ by their surface marker expression, respectively. Finally, we named cluster 1

cells transitory (Trans.) T cells because this cluster exhibited an intermediate phenotype

between T$_{EM}$ and T$_{TE}$ clusters. The clonality of these CD8$^+$ T-cell clusters was

calculated from the size distribution of clonotypes determined by scTCRseq. These data

indicated that clusters 0 and 1 were primarily comprised of oligoclonal T cells, while

cluster 3 was primarily comprised of polyclonal T cells (Figure S3F). This tendency in

clonality was consistent after the second and third vaccinations.

To analyze the phenotype of 2nd responder clonotypes, the 1st, 2nd, and dual responder T

cells were plotted in a dimensionality reduction plot (Figure 3E). This analysis revealed

that over 90% of T cells in 2nd responder clones exhibited a T_{EM} phenotype after the

second shot. On the other hand, the proportion of T_{EM} cells was lower in 1st and dual

responders (30. 8% and 76.6 %, respectively) (Figure 3F). Furthermore, the proportion

of T_{EM} in the 2nd responders was nearly unchanged after the third shot (94.2% after the

second shot, and 92.7 % after the third shot) (Figure 3F). These results demonstrate that

2nd responders are mainly comprised of T_{EM} cells after the second and third vaccination.

We also identified differentially expressed genes in 2nd responder T_{EM} cells between the

second and third shots to examine their shift of gene expression profile (Figure 3G).

Genes whose expression was significantly decreased after the third shot included genes

associated with the cell cycle (*TYMS* and *MCM4*), transcription factors associated with

memory formation (*BACH2* and *STAT3*)[27,28], and costimulatory receptors (*CD28*, *ICOS*,

and *DPP4* (coding CD24))[29,30]. Moreover, T_{EM} cells in the 2nd responder pool exhibited

higher scores for the TE-like T cells and effector function after the third shot (Figure

199 3H). These results suggest that, although still exhibiting T_{EM} phenotype, 2nd responders

200 are more differentiated towards a T_{EMRA}-like phenotype after the third shot.

202 **Skewed re-expansion of 2nd responder clonotypes after the third shot**

203 Next, we analyzed the changes in the repertoire of 2nd responders after the second and

204 the third shot in more detail. The total frequency and fold expansion of 2nd responders

205 after the third shot was significantly decreased compared to that after the second shot

206 (Figure 4A and S4A), suggesting that the expansion of 2nd responders was diminished

207 after the third shot. Notably, the count of expanded clonotypes after the third shot within

208 2nd responders ("re-expanded 2nd responders") was significantly lower than the total

209 count of 2nd responders (Figure 4B): the proportion of re-expanded 2nd responders was

210 only about 30% (Figure S4B). These re-expanded 2nd responder clonotypes were present

211 at a higher frequency after the second shot than 2nd responders that did not expand

212 ("Unchanged") or were not detected after the third shot (Figure S4C). In line with the

213 reduction of expanding clonotypes among 2nd responders, the relative distribution of 2nd

214 responder clonotypes was also changed after the third shot: their clonality was increased

215 while the evenness of their distribution was decreased (Figure 4D). On the other hand,

216 the appearance of the 3rd responders (about 5% of 2nd responder clonotypes, Figure

S4B), partially rescued the decreased diversity of the 2nd responders. These changes in

CD8[+] 2nd responders were also observed in CD4[+] T cell repertoire (Figure S4D-H).

Based on these results, we modeled the response of CD8[+] T-cell clonotypes to mRNA

vaccination (Figure 4E). After the second shot, novel responding clonotypes (2nd

responders) largely replaced the clonotypes that expanded after the first shot (1st

responders) and dominated the responses. After the third shot, a subset of 2nd responders

expanded again resulting in a narrowing of the repertoire (i.e. a reduction in the number

of re-expanded clonotypes). At the same time, 3rd responders appeared after the third

shot and partially compensated for the decrease in 2nd responders' diversity.

Induction of CD8[+] 2nd responders was associated with anti-RBD antibody titers

induced by the vaccination.

Next, we analyzed the association between the T cell repertoire and other variables,

including the participants' background, anti-SARS-CoV-2 Spike receptor-binding

domain (RBD) IgG antibody titer, and strength of the adverse events (Figure 5A).

Before doing so, we identified mutually correlated repertoire parameters (e.g., the total

frequency of CD8[+] dual responder at P2, P3, and P8) and merged them into repertoire

meta-parameters (e.g., CD8[+] Dual Responders: DualResp) (Figure 5B and S5A,

Materials and Methods). The correlation heatmap between CD8$^+$ repertoire meta-

parameters and variables related to vaccine response revealed that the total frequency of

2nd responders after the second and the third shot ("2ndResp_P3" and "2ndResp_P8")

was positively correlated with the anti-RBD antibody titers after the second and the

third shot, respectively (Figure 5C). Notably, 2ndResp_P3 was significantly correlated

with the antibody titer to RBD of the Omicron variant (Figure 5D). These results imply

that some participants respond more readily to mRNA vaccination. At the same time,

the total frequency of 1st responders ("1stResp") was positively associated with the

severity of adverse events after the vaccination (Figure 5C). As for CD4$^+$ T cells, the

positive correlation between the repertoire meta-parameters and the severity of adverse

events was also shown (Figure S5B). These observations are consistent with the study

reporting the association between the T-cell response and the severity of adverse

reactions following mRNA-1273 vaccination[31]. Finally, we observed a positive

correlation between the related meta-parameters between CD8$^+$ and CD4$^+$ T-cell

repertoire; CD8$^+$ 3rdResp and CD4$^+$ 3rdResp, CD8$^+$ ExpDiv_P8 and CD4$^+$ 2ndResp_P8,

CD8$^+$ AIM and CD4$^+$ AIM or 2ndResp_AIM, and so on (Figure S5C). This result

implies that the clonal responses of CD4$^+$ and CD8$^+$ T cells to the mRNA vaccine are

partly coordinated. Notably, we observed no significant association between CD4$^+$ and

CD8[+] repertoire meta-parameters and sex, history of SARS-CoV-2 infection, or the

presence of specific HLA genotypes.

Temporal kinetics of T-cell clonotypes were analyzed within Spike epitopes

The results above demonstrate that the replacement of vaccine-responding clonotypes

occurred between the first and the second shot. However, it remained unknown how this

clonal replacement occurred (Figure 6A). One working hypothesis is "inter-epitope

replacement," in which different epitopes induce the 1st and 2nd responder clonotypes.

The other hypothesis is "intra-epitope replacement," in which both 1st and 2nd responder

clonotypes exist in T cells specific to the same Spike epitope. To determine whether

these two models explained the observed clonal replacement, we analyzed the temporal

kinetics of Spike-specific T-cell clonotypes at an individual epitope level.

For this purpose, two SARS-CoV-2 Spike epitopes were selected (S_{448} and S_{1208}). These

two epitopes are reported as immunodominant[32–34] and presented by HLA-A24:02, the

most frequent HLA class I allele in an Asian population. Then we prepared peptide-

MHC (pMHC) tetramers and identified S_{448}- or S_{1208}-specific CD8[+] T cells from

A24:02[+] participants using flow cytometry (Figure 6B and S6A). The positivity of S_{448}-

specific cells among CD8[+] T cells increased after the first shot, while that of S_{1208}-

specific cells increased only after the second shot (Figure S6B). Moreover, the positivity

of S_{1208}-specific cells was significantly lower than that of S_{448}-specific cells until after

the first shot; however, they became comparable after the second shot (Figure S6C).

Then, we performed TCR-seq on S_{448}- or S_{1208}-specific CD8+ T cells sorted from the

samples after the vaccinations (P2, P3, and P8) and identified S_{448}- or S_{1208}-specific

clonotypes ("Tetramer-TCRseq," Figure S6D). Furthermore, for each participant, we

determined whether the vaccine-induced S_{448}- or S_{1208}-specific T-cell responses were

observed (S_{448}- or S_{1208}-responders, Figure S6D). Among nineteen participants in whom

S_{448}-specific clonotypes were detected, seven were classified as S_{448}-responders, while

twelve were not (Figure 6D and Figure S6E). All nine participants in whom S_{1208}-

specific clonotypes were detected were S_{1208}-responders (Figure 6D). We focused on the

S_{448}- and S_{1208}-responder participants ("respondent") in the following section. In these

respondents, the total frequency of S_{448}- and S_{1208}-specific clonotypes increased after the

first shot and peaked after the second and third shots. At the peak of their response, the

total frequency of S_{1208}-specific clonotypes surpassed that of S_{448}-specific ones (Figure

S6F).

Finally, we examined whether the intra-epitope replacement of clonotypes was observed

for S_{448} and S_{1208}. S_{448}- and S_{1208}-specific clonotypes were classified into 1st, 2nd, dual,

and 3rd responders, and the total frequency of these responder clonotypes was calculated

for each participant, as in Figure 1 (Figure 6E and Figure S6G). Among S_{1208}-specific

clonotypes, 2nd and dual responders were observed in more than half of the respondents

(Figure 6E, thick line). Moreover, the total frequency of S_{1208}-specific dual responders

tended to be higher than 2nd responders after the first shot, while S_{1208}-specific 2nd

responders tended to surpass the dual responders after the second shot (Figure 6F).

These results are consistent with the replacement of clonotypes specific for the Spike

epitope S_{1208}. On the other hand, as for S_{448}-specific clonotypes, only 2nd responder

clonotypes were observed in more than half of the respondents, while dual and 3rd

responders were rare, and 1st responders were not observed (Figure S6G).

Clonal replacement during mRNA vaccination occurs between and within Spike

epitopes

TCRs recognizing the same pMHC often share conserved sequence motifs[35]. Based on

this property, we identified clonotypes specific for Spike epitopes for which pMHC

tetramer had been prepared (S_{448} and S_{1208}), and also clonotypes specific for other Spike

epitopes. From our original data of Tetramer TCR-seq and the public database of Spike-

specific TCRs[36,37], shared TCR sequence motifs of Spike-specific clonotypes were

constructed using tcrdist3 pipeline (Figure 7A)[38]. Then, we searched for T cell

clonotypes possessing the Spike-specific TCR motifs, based on the participants' HLA

alleles (Figure 7A). Through this TCR motif analysis, we identified clonotypes specific

for two Spike epitopes (S_{269}-A02:01 and S_{919}-B15:01), in addition to two epitopes used

in Tetramer TCR-seq (S_{448}-A24:02 and S_{1208}-A24:02). Spike-specific clonotypes

identified by TCR motif analysis were overlapped with those identified by Tetramer

TCR-seq (Figure S7A), and there were no clonotypes to which different specificities

were assigned between TCR motif analysis and Tetramer TCR-seq. On the other hand,

the overlap between clonotypes with Spike-specific TCR motifs and AIM^+ clonotypes

was negligible (Figure S7B), suggesting that the Spike epitopes used in TCR motif

analysis were presented to T cells less efficiently in our AIM assay with Spike peptide

pool.

We then quantified the temporal kinetics of T-cell responses specific to the four Spike-

epitopes by TCR motif analysis. Among these four Spike-epitopes, S_{919}-B15:01 was

most conserved between other human coronaviruses, while S_{448}-A24:02 was least

conserved and most unique to SARS-CoV-2 (Figure S7C). We observed that the

temporal kinetics of the Spike-specific T-cell response differed between these epitopes

(Figure 7B): S_{448}- and S_{1208}-specific responses were induced after the first shot and

peaked after the second and third shots, as observed in Tetramer TCR-seq analysis. The

S_{269}-specific response also peaked after the second and third shots, while induction after

the first shot was not observed (Figure 7B). The S_{919}-specific response peaked after the

first shot, but was not induced after the second and third shots (Figure 7B).

Furthermore, the total frequency of S_{919}-specific clonotypes was significantly higher

than S_{1208} and S_{269} after the first shot, while this was inverted after the second and third

shots (Figure S7D). These results suggest that inter-epitope replacement of vaccine-

responding clonotypes can occur between S_{919} and S_{269} in HLA-B15:01^{+} A02:01^{+}

participants, and between S_{919} and S_{448} or S_{1208} in HLA-B15:01^{+} A24:02^{+} participants.

However, we could not observe an example of the inter-epitope replacement within a

single participant in our cohorts.

Furthermore, we classified Spike-specific clonotypes into 1st, 2nd, dual, and 3rd

responders to examine whether the intra-epitope replacement of clonotypes was

observed. Among S_{269}- and S_{919}-specific clonotypes, only 2nd and 1st responders were

observed in more than half of the respondents, respectively (Figure S6E and F). On the

other hand, 1st and 2nd responders among S_{448}-specific clonotypes, and 2nd and dual

responders among S_{1208}-specific clonotypes were observed in more than half of the

respondents (Figure 7C, thick line). As for S_{448}-specific clonotypes, the total frequency

of 1st responders tended to be higher than 2nd responders after the first shot, while 2nd

responders were significantly more abundant than 1st responders after the second shot

(Figure 7D). Similarly, as for S_{1208}-specific clonotypes, the total frequency of dual

responders tended to be higher than that of 2nd responders after the first shot, while 2nd

responders tended to be more abundant than dual responders after the second shot

(Figure 7E). Moreover, we observed replacement between 1st and 2nd responders in four

of eight S_{448}-respondents and between dual and 2nd responders in three of twelve S_{1208}-

respondents (Figure S7H and G). These results provide examples of intra-epitope

replacement of vaccine-responding clonotypes within Spike epitopes S_{448} and S_{1208}.

In summary, temporal tracking of Spike-specific clonotypes using TCR motif analysis

demonstrated that the replacement of vaccine-responding clonotypes can occur within a

Spike epitope, which does not require the differences in the target epitope between the

1st and the 2nd responder clonotypes.

Discussion

Through a longitudinal TCR repertoire analysis combined with an AIM assay, single-

cell TCR sequencing, and TCR motif analysis, we demonstrated that clonotypes newly

expanded after the second vaccination largely replaced the clonotypes that had

responded to the first shot. Moreover, although these 2nd responder clonotypes expanded

again with an effector memory phenotype, their diversity was further skewed after the

third shot, and they were partially replaced by the mobilization of the 3rd responders.

Furthermore, this replacement of vaccine-responding clonotypes can occur not only

between, but also within, clones specific for Spike epitopes. These data are consistent

with a clonal replacement model of T-cell memory responses under repetitive antigen

challenges in humans receiving SARS-CoV-2 mRNA vaccinations[18].

To fully understand T cell clonal replacement following repeated mRNA vaccination, it

is essential to clearly define the nature of 1st, 2nd, and dual responders. Secondary

memory T cell responses are faster and more aggressive than the primary responses

being medicated by naïve cells[39]. Based on this notion, we consider the 2nd responder

clonotypes as those that exerted the primary response after the first shot and recall

response after the second shot. In our analysis, the primary response of most of the 2nd

responders was not detected after the first shot. We suppose this is because the cell

count of 2nd responders at the sampling point after the first shot is too small to detect

through our bulk TCR-seq at P2, day 7 after the first shot.

In contrast, the dual and the 1st responder clonotypes expanded quickly and vigorously

after the first shot, which appeared closer to a recall response than a primary one.

Memory T cells cross-reactive to SARS-CoV-2 and 'common cold' coronaviruses

(CCCoV) likely existed in many individuals before the COVID-19 pandemic[40–43].

Therefore, 1st and dual responders may be "pre-existing memory" clonotypes that have

been primed by CCCoV before the pandemic and exerted recall response by recognizing

the SARS-CoV-2 Spike after the first shot. We further propose that their weak response

after the second and third shot is that they differentiate into secondary memory with a

weaker proliferative ability[44–46]. This is in line with the report that the contribution of

CD4$^+$ cross-reactive T cells to the Spike-reactive T-cell pool is minimal after

vaccination against SARS-CoV-2[47].

Consistent with this interpretation for 1st, 2nd, and dual responders, we propose that the

T-cell response to S_{919}, the most conserved Spike epitope analyzed in this study, was

exerted by 1st responder clonotypes. Moreover, the response to the less conserved S_{269}

and S_{1208} epitopes was mainly exerted by 2nd responders. On the other hand, the 1st

responder clonotypes were broadly observed in S_{448}-specific clonotypes, contrary to the

fact that S_{448} was least conserved among the four Spike epitopes, implying that pre-

existing memory to SARS-CoV-2 S_{448} was less likely to exist. To explain this, we

propose that there are pre-existing memory T cells that recognize epitopes similar to

S_{448} derived from pathogens other than human coronavirus. Further studies are needed

to prove the relationship between 1st and dual-responder clonotypes and pre-existing

memory T cells.

Determining whether clonal replacement through mRNA vaccination occurs between

different Spike epitopes (inter-epitope replacement), or even within, a single Spike

epitope (intra-epitope replacement) is an important step to understand the mechanism of

clonal replacement. In the case of anti-Spike B cell responses following mRNA

vaccination, differences in the response kinetics were reported between the target: the

faster response to the S2 domain occurring after the first shot, which is cross-reactive to

CCCoV, and the slower response to the S1 domain occurring after the second shot[48].

Like the B-cell response, our analysis identified a differential kinetics of Spike-specific

T-cell responses between epitopes (i.e., response induced only after the first shot (S_{919}),

only after the second shot (S_{269}), or both after the first and second shot (S_{448} and S_{1208})).

This result supports the inter-epitope replacement model, possibly due to a shift of

immunodominance in Spike epitopes through vaccination. Cases of inter-epitope

replacement within a single participant were not observed, but might be found if we

analyze larger cohorts with various combinations of HLA alleles, or if the Spike-

specific TCR database was expanded to cover more diverse Spike epitopes. On the other

hand, replacement between 2nd responders and 1st or dual responders was observed

within the same epitopes (S_{448} and S_{1208}) even in the same individual, which supports

the inter-epitope replacement model. This observation implies the coexistence of two

groups of clonotypes within a single Spike epitope: pre-existing memory clonotypes

cross-reactive to CCCoV and newly expanded clonotypes specific to SARS-CoV-2.

This complex nature of T-cell clonal responses within a single Spike epitope should be

addressed through more intensive analysis of epitope-specific T cells and the

identification of TCR motifs related to the responding patterns of clonotypes.

The third- and fourth-vaccination induces a more robust humoral and cellular immune

response to SARS-CoV-2 than the second-vaccination[49,50], and increases the protection

against SARS-CoV-2 infection, including the Omicron variant[51,52]. As of April 2023,

nearly 70 % and 50 % of the population in Japan have undergone more than three and

four shots of vaccination, respectively. Our TCR repertoire analysis after the third

vaccination demonstrated that the 2nd responders were still dominant among vaccine-

responding clonotypes and not significantly replaced by the 3rd responders. However,

after the third shot, 2nd responders exhibited a more differentiated phenotype, and their

diversity was significantly decreased compared to that after the second shot, resulting in

the skewing of the 2nd responders' repertoire. The key question remains whether the

diversity of 2nd responders continued to decrease after four or more shots and whether

3rd or 4th responders can compensate for it. If this is the case, strategies may be needed

to maintain the diversity of vaccine-responding clonotypes by replenishing the novel

expanding ones under repetitive vaccination. Extending our TCR repertoire analysis

after the fourth vaccination would provide critical information for optimizing the

protocol for mRNA vaccination.

As far as we know, this study provided the first bulk TCR repertoire analysis dataset on

more than 30 participants covering the entire time course of mRNA vaccinations (from

the first shot to six months after the third shot). Moreover, the sampling time point is

uniform across the participants, enabling the comprehensive analysis of the kinetics of

T-cell clonotype expansion following vaccination. In addition to the analysis of the

responding pattern of clonotypes, the comparison of the rate of contraction between

vaccine-responding clonotypes would provide important information for understanding

T-cell responses induced by mRNA vaccination. Moreover, the majority of the

participants in our cohort reported neither clear infection history nor signs of past

SARS-CoV-2 infection. Thus, our data reflect the effect of vaccination on T-cell

repertoire more accurately. One defect in our dataset, however, is that the sampling

point after the first vaccination (P2, day 7 after the first shot) was a few days earlier than

the peak of T-cell responses to the first shot (around day 9-12)[53]. This earlier sampling

can lead to an underestimation of the T cell response after the first shot: recall response

of 1st and dual responder clonotypes, and the primary response of 2nd responders.

However, an expansion of Spike-specific T-cell clonotypes (to S_{919}, S_{448}, and S_{1208}) was

observed at P2, confirming that this time point is not too early to detect vaccine-induced

T-cell responses.

An important question is whether the clonal replacement we demonstrated in this study

is specific to the mRNA vaccination or is common to the other types of vaccination or

natural infections. We initially reported the clonal replacement in the antigen delivery

systems using plasmid and viral vectors[18]. In addition, in the case of vaccination to

yellow fever virus (YFV), the clonal composition of YFV-specific $CD4^+$ T cells is

reshaped by a single vaccination[54], and the vaccine-responding $CD8^+$ clones are also

turned over between the prime and boost shots[55]. On the other hand, the trivalent

influenza vaccination induces a response by T cells mainly recruited from the pre-

existing memory clones[56]. This inconsistency in whether the clonal replacement occurs

may be attributed to the type of vaccine (mRNA or live attenuated versus inactivated) or

the novelty of the antigen (SARS-CoV-2 or YFV versus seasonal flu). Further study is

needed to elucidate the requirements for clonal replacement after vaccination. In

addition, considering that natural SARS-CoV-2 infection generates tissue-resident

memory T cells (T_{RM}) in the lung[57], the replacement of antigen-specific clonotypes in

blood after re-infection, if it occurs, may be associated with the re-distribution of older

clonotypes from the blood to peripheral tissues and their differentiation to T_{RM}.

Collectively, along with the temporal analysis of blood T cell repertoire as done in the

current study, a systemic analysis of the T cells in peripheral tissues is essential to

understand the kinetics of T-cell clonal response by natural infection.

In summary, we demonstrated the replacement of memory T-cell clones during SARS-

CoV-2 mRNA vaccination. In contrast to humoral immunity mediated by memory B

cells and long-lived plasma cells, where the memory response to the first viral variant

encountered in childhood is preferentially employed even after the challenge of other

variants in adults (original antigenic sin)[58,59], T cells appear to be able to reshape the

memory population after repetitive challenges. This "re-writability" of T cell

immunological memory may enable them to effectively generate responses to variant

strains of the virus.

Methods

Study design

38 healthcare workers (≥20 years old) at Nara Medical University in Japan who had

received the first shot of Pfizer-BNT162b2 vaccine between 10 March and 30 March

2021 were invited to participate as volunteers in the study. The Nara Medical University

Ethics Committee approved the study (No. 2954 and 3168). In this cohort, no one

reported a SARS-CoV-2 infection history before or during the initial sampling period.

Four and two participants showed signs of past SARS-CoV-2 infection before the first

and third vaccination, respectively (inferred by the anti-Nucleoprotein (N) antibody

titer). Peripheral blood samples were collected before receiving the first dose (P1), 1

week after the first shot (P2), 1 week (P3), 1 month (P4), 3 months (P5), and 6 months

(P6) after the second shot, and 1 week (P8), 1 month (P9), 3 months (P10), and 6

months (P11) after the third shot. One participant (ID18) was not sampled at P11

because they had received the fourth vaccination before this time point. Participants

were asked to report the following adverse events after each vaccination: pain, swelling,

heat, fever, fatigue, headache, chills, joint pain, and muscle pain. PBMCs were isolated

from whole blood with BD vacutainer CPT tubes (BD reagents used in this study are

summarized in Supplementary Table S3), resuspended in CELLBANKER 1 (Takara),

and stored at -80°C. The detailed study design was described in Kitabatake et al.[19].

Study approval

The study was conducted in accordance with the Declaration of Helsinki and Good

Clinical Practice Guidelines, following approval by the ethics board in each institution.

All study participants provided written informed consent.

Evaluation of anti-SARS-CoV-2 antibodies

Serum samples were tested for antibody titer against RBD of SARS-CoV-2 ancestral

strain, SARS-CoV-2 Omicron spike variant protein, and nucleocapsid protein of SARS-

CoV-2 ancestral strain, were tested using RayBio COVID-19 S1 RBD protein Human

IgG ELISA Kit (RayBiotech), RayBio COVID-19 Omicron Spike Variant Human IgG

ELISA Kit (RayBiotech), and RayBio COVID-19 N protein Human IgG ELISA Kit

(RayBiotech) per the manufacturer's instructions, respectively.

T-cell isolation from PBMCs

$CD4^+$ and $CD8^+$ T cells were magnetically isolated from PBMC. PBMC were thawed by

warming frozen cryovials in a 37°C water bath. Cells were stained for 20 minutes at

4°C with 1st antibody mix (Antibody Mix 1 in Supplementary Table S4). After washing

with MACS buffer [0.5% BSA (Nacalai), 2 mmol/L EDTA (NIPPON GENE) in PBS

(Nacalai)], Cells were stained for 20 minutes at 4°C with 2nd antibody mix; BD IMag

anti-PE Magnetic Particles-DM (Clone E31-1459, BD) and anti-APC-Biotin (clone

APC003, BioLegend). Then, the cell suspension was diluted with MACS buffer and set

on a magnet plate (DynaMag96SideSkirted, Veritas). The positive fraction was collected

as CD4$^+$ T cells. The negative fraction was stained with BD IMag Streptavidin Particles

Plus-DM (BD) for 20 minutes at 4°C. Then, the cell suspension was diluted with MACS

buffer and set on a magnet plate. The positive fraction was collected as CD8$^+$ T cells

and B cells. The counts of CD4$^+$ T cells, CD8$^+$ T cells, and B cells were determined

using Flow-Count fluorospheres (Beckman) and a Cytoflex flow cytometer (Beckman)

and FlowJo software (version 10.8.1; BD Biosciences, software and algorithms used in

this study are summarized in Supplementary Table S5).

HLA genotyping

Genome DNA was extracted from PBMC using Geno Plus Genomic DNA Extraction

Miniprep System (VIOGENE) using serum and animal cell protocol with RNase A

treatment. DNA was quantified on the NanoDrop (Thermo Fisher Scientific). HLA

genotyping was performed on genome DNA using the reverse sequence-specific

oligonucleotide probe Luminex method at HLA Laboratory (Kyoto, Japan).

AIM assay and sorting Spike-reactive T cells.

AIM assay was performed on PBMC samples collected at P2, P3, and P8. PBMC were

thawed by warming frozen cryovials in a 37°C water bath and resuspended in 10mL of

in Culture Medium (CM) [10% fetal bovine serum (MP Bio Japan), 1% HEPES

(Nacarai) and 1% penicillin/streptomycin (Nacarai) in RPMI-1640 medium (Nacarai)].

Cells were resuspended in 1mL of CM, then plated in 24-well plates and incubated

overnight (about 16 hours) in an incubator at 37°C, with 5% CO_2. After incubation, cells

were then stimulated for 24 hours in stimulation medium [CM with BD FastImmune

CD28/CD49d Costimulatory Reagent (final x100, BD Biosciences) and anti-human

CD40 (final concentration of 0.5μg/mL, clone HB14, BioLegend)] with or without

PepTivator SARS-CoV-2 Prot_S Complete (final concentration of 1 mg/mL, Miltenyi).

20 hours post-stimulation, an anti-CD107a-FITC antibody (final concentration of

5μg/mL, clone H4A3, BioLegend) was added to the culture. After four hours, cells were

washed in PBS supplemented with 10% FBS (10% FBS/PBS). Cells were stained for 20

minutes at 4°C with antibody mix 2 (Supplementary Table S4). Cells were washed once

in 10% FBS/PBS. AIM$^+$ non-naïve CD4$^+$, AIM$^-$ non-naïve CD4$^+$, AIM$^+$ non-naïve

CD8$^+$, and AIM$^-$ non-naive CD8$^+$ cells were sorted using FACS Aria II or Aria III (BD

Biosciences) and FACSDiva software (BD Biosciences, v8.0.1). AIM$^+$ CD4$^+$ T cells

were defined by dual expression of CD69 and CD40L. AIM$^+$ CD8$^+$ T cells were defined

by expression of either CD107a or CD137. Nonviable cells were excluded from the

analysis based on forward and side scatter profiles and propidium iodide staining (PI,

Sigma-Aldrich). Data were analyzed using FlowJo software.

Sample preparation for single-cell analysis

PBMC thawed as described above were resuspended with Cell Staining Buffer

(BioLegend) supplemented with Human TruStain FcX. After 2-3 minutes, 2x AbSeq

master mix of Immune Discovery Panel (BD Biosciences) prepared as the provider's

protocol was added to the cell suspension and stained for 15 minutes on ice. Then,

antibody mix 3 (Supplementary Table S4) with Sample Tag oligonucleotide-conjugated

antibodies (Single-Cell Multiplexing Kit, BD Biosciences) was added to the cell

suspension and left on ice for 15 minutes for staining. The correspondence between

samples and Sample Tags used was described in Supplementary Table S2. Stained cells

were washed with Cell Staining Buffer. Then non-naive $CD4^+$ and $CD8^+$ cells (ID2 and

ID27) or only non-naive $CD8^+$ cells (ID10, ID19, ID22, ID31, and ID35) were sorted

using FACS Aria II or Aria III and FACSDiva software (v8.0.1). Nonviable cells were

excluded from the analysis based on forward and side scatter profiles and PI staining.

Data were analyzed using FlowJo software (version 10.8.1).

Tetramer staining and sorting Spike-specific T cells.

S_{448} and S_{1208} peptides were purchased from GenScript. Peptides-MHC class I tetramers

for SARS-CoV-2 Spike epitopes (S_{448} and S_{1208}) were generated by QuickSwitchTM

Quant HLA-A*24:02 Tetramer Kit-BV421, and -PE (MBL), respectively, according to

the manufacturer's protocol. The rate of peptide exchange was reported to be more than

95% in our previous report[32]. Thawed PBMCs were treated with a protein kinase

inhibitor, Dasatinib (50 nM, AdooQ), for 30 min at 37 °C, and Human TruStain FcX for

5 minutes at room temperature. Then, PBMCs were stained with tetramers for 30

minutes at room temperature. After tetramer staining, cells were stained for antibody

mix 4 (Supplementary Table S4) for 20 minutes at room temperature. After washing

twice with FACS buffer, $CD8^+$ tetramer$^+$ cells were sorted using FACS Aria II or Aria

III and FACSDiva software (v8.0.1). Nonviable cells were excluded from the analysis

based on forward and side scatter profiles and PI staining. Data were analyzed using

FlowJo software (v10.8.1).

Library preparation and sequencing for TCR repertoire analysis

TCR sequencing libraries for next-generation sequencing were prepared according to

the previous report[60]. In brief, mRNA in T-cell lysates were captured by incubating with

10 µL of Dynabeads M270 streptavidin (Thermo Fisher Scientific) bound to 2.5 pmol of

BioEcoP-dT25-adapter primers for 30 minutes at room temperature under gentle

rotation. mRNA-trapped beads were suspended in 10 µL of RT mix and incubated for

60 min at 42ºC to perform reverse transcription (RT) and template-switching. The

composition of the RT mix was as follows; 1× First Strand buffer (Thermo Fisher

Scientific), 1 mM dNTP (Roche), 2.5 mM DTT (Thermo Fisher Scientific), 1 M betaine

(Sigma-Aldrich), 9 mM MgCl2 (NIPPON GENE), 1 U/µL RNaseIn Plus RNase

Inhibitor (Promega), 10 U/µL Superscript II (Thermo Fisher Scientific), and 1 µM of i5-

TSO. To amplify the TCR cDNA containing complementarity determining region 3

(CDR3), nested PCR of the TCR locus was performed using KAPA Hifi Hotstart

ReadyMix (KAPA Biosystems), followed by the purification of PCR product using an

AM Pure XP kit (Beckman Coulter) at a 0.7:1 beads-to-sample ratio. The third PCR was

performed to amplify TCR libraries and add adaptor sequences for the next-generation

sequencer. The third-PCR products were purified as described for the second PCR. Final

TCR libraries, whose lengths were about 600 base pairs, were quantified using a KAPA

SYBR Fast qPCR Kit (KAPA Biosystems), and size distribution was analyzed by

Microchip Electrophoresis System MultiNA (Shimadzu). TCR libraries were sequenced

using an Illumina Novaseq 6000 S4 flowcell (67 bp read 1 and 140 bp read 2)

(Illumina) using NovaSeq 6000 S4 Reagent Kit v1.5 (200 cycles, Illumina). Only read2

contained the sequence regarding the definition of T-cell clones. Oligonucleotides and

reaction conditions for library preparation were summarized in Table S6 and S7,

respectively.

For tetramer TCR-seq, the libraries were prepared on samples with (i) more than 100

tetramer[+] cells and (ii) the proportion of tetramer[+] cells was more than 0.1% in CD8[+] T

cells. S_{1208}-tetramer$^+$ samples with a high background (ID22) were excluded from the

analysis.

Library preparation and sequencing for single-cell analysis

Single-cell sequencing libraries were prepared according to the previous report[60]. Live

cells were stained with Calcein AM (Nacalai) and counted using Flow-Count

fluorospheres and a Cytoflex flow cytometer. About 25,000 - 30,000 labeled cells were

loaded on a BD Rhapsody cartridge (BD) and processed using BD Rhapsody™

Cartridge Reagent Kit (BD) following the manufacturer's instructions. Single-cell

mRNA, AbSeq barcodes, and Sample Tag barcodes were captured by BD Rhapsody

beads coated with poly(T) oligonucleotide with a unique cell barcode and molecular

barcode on each bead. Single-cell cDNA synthesis was performed using BD Rhapsody

cDNA Kit (BD) following the manufacturer's protocol. Targeted mRNA, TCRseq, and

Abseq Index libraries were prepared using Immune Response Panel HS (BD) according

to the manufacturer's instructions with the following modifications. (1) We used the

original set of primers for TCR amplification, as summarized in Table S6. (2) We

performed additional PCRs to introduce a unique dual index for sequencing (3rd PCR

for mRNA and TCR), as described in Table S8. (3) We used the ProNex Size-Selection

DNA Purification System (Promega) to purify PCR products, as summarized in Table

S8. Amplified libraries were quantified using a KAPA SYBR Fast qPCR Kit (KAPA

Biosystems), and size distribution was analyzed by Microchip Electrophoresis System

MultiNA (Shimadzu). Targeted RNAseq, TCRseq, and AbSeq libraries were sequenced

on an Illumina Novaseq 6000 S4 flowcell (67 bp read 1 and 140 bp read 2) using

NovaSeq 6000 S4 Reagent Kit v1.5 to a depth of approximately 20,000 reads, 7,000

reads, and 10,000 reads per cell, respectively.

Data processing of TCR sequencing reads

Data processing of TCRseq was performed as previously reported[60]. Briefly, Adapter

trimming and quality filtering of sequencing data were performed using Cutadapt-3.2[61]

and PRINSEQ-0.20.4[62]. Sequencing data were processed by MiXCR-3.0.5[63]. In

MiXCR, filtered reads were aligned to reference mouse TCR V/D/J sequences

registered in the international ImMunoGeneTics (IMGT) information system. The

parameters used in MiXCR are summarized in Supplementary Table S9. The Variable

(V) and Joining (J) segments of TCRs were represented in IMGT gene nomenclature. T-

cell clones were determined as TCR reads with the same TCR V segment, J segment,

and CDR3 nucleotide sequence.

For bulk TCRseq data, we regarded the CD4$^+$-CD8$^+$ overlapping clones in the same

participant as contamination during T-cell isolation from PBMC because CD4$^+$ and

CD8$^+$ T-cell repertoire are mutually exclusive[64]. Thus, these overlapping clones were

categorized into either CD4$^+$ or CD8$^+$ according to their dominance in CD4$^+$ and CD8$^+$

repertoire using VDJtools-1.2.1[65]. Inter-sample contamination within samples using the

same UDIs was excluded by the "Decontaminate" function of vdjtools with the

parameter "-r 10". The sequencing reads of bulk TCR-seq samples were normalized to

100,000 reads by the "DownSample" command of VDJtools-1.2.1[65]. To preserve the

minor clonotypes, we performed the normalization ten times and pooled these down-

sampled repertoire data for each sample by the "JoinSamples" command of VDJtools-

1.2.1. The sequencing reads of AIM TCR-seq or tetramer TCR-seq samples were

normalized to 16 times the cell count (AIM assay-TCRseq data) in each sample by the

"DownSample" command of VDJtools-1.2.1[65], and TCR clones with 15 or fewer reads

were regarded as sampling noise and removed from the dataset[64].

Identifying vaccine-responding clonotype using bulk TCR-seq dataset

Clonotypes that significantly expanded after vaccination (vaccine-responding

clonotype) were identified by differential abundance analysis using the beta-binomial

model[20]. Before performing differential abundance analysis on clonotype frequency, the

total count of bulk TCRseq data was adjusted to 100,000. Then, vaccine-responding and

vaccine-increased clonotypes are defined for each vaccination (P2, P3, or P8).

Clonotypes are regarded as "responded to vaccination" when (i) they had a significant

increase in their frequency and (ii) their frequency was increased more than two-fold

between before and after the vaccination. Vaccine-responding clonotypes were also

identified between the baseline (P0) and after the second shot (P3). In addition,

clonotypes are regarded as "increased after vaccination" when (i) their frequency was

increased between before and after the vaccination, (ii) their frequency was increased

more than two-fold between the baseline (P1) and after the vaccination, and (iii) their

frequency was more than 0.0025% after the vaccination. Finally, Clonotypes that did

not meet the requirements for vaccine-responding or vaccine-increased clonotypes were

regarded as "did not respond to vaccination." The beta-binomial model incorporates

time-dependent variance of clonotype frequency using normal peripheral blood T cell

repertoire variance over two weeks[20].

Identifying 1st, 2nd, dual, and 3rd responder clonotypes in bulk TCR-seq dataset

1st responder clonotypes were defined as clonotypes that responded to the first shot, but

did not respond to the second one. 2nd responder clonotypes were defined as clonotypes

that responded to the second shot while did not respond to the first shot. Dual responder

clonotypes were defined as clonotypes that responded or increased after the first and

second shots, and that responded between the baseline (P0) and after the second shot

(P3). 3rd responder clonotypes were defined as clonotypes that were not detected before

the third shot and responded to the third shot. We excluded clonotypes whose frequency

was over 0.01% at baseline from 1st, 2nd, and dual responders.

Identifying Spike-reactive clonotypes through AIM TCR-seq dataset.

Spike-reactive clonotypes were identified using the dataset of AIM TCR-seq as in

Figure 2B. "AIM^{+} enrichment ratio" was calculated for each clonotype as (frequency in

AIM^{+} repertoire + 5×10^{-6}) / (frequency in AIM^{-} repertoire + 5×10^{-6}). Clonotypes with

an AIM^{+} enrichment ratio over 16 were defined as Spike-reactive clonotypes, and their

frequency was tracked in the bulk TCR-seq dataset.

Calculation of clonality or evenness of TCR repertoire

The 1 - Pielou index was used to evaluate the clonality of TCR repertoire, which was

calculated using the formula $1 - \sum_{i=1}^{n} p_i \log_e(p_i) / \log_e(n)$, where p_i is the frequency

of clone i for a sample with n unique clones. The DE90 index was used to evaluate the

evenness of the TCR repertoire, which was calculated as the ratio between the number of

clonotypes whose cumulative frequency is 90% and the total number of clonotypes in the

repertoire[66].

Identifying Spike-specific clonotypes through tetramer TCR-seq dataset.

S$_{448}$- and S$_{1208}$-specific clonotypes were identified using the dataset of tetramer TCR-

seq and bulk TCR-seq as in Figure S6D. "Tetramer$^+$ enrichment ratio" was calculated

for each clonotype as (frequency in tetramer$^+$ repertoire + 5×10^{-6}) / (maximum

frequency in bulk TCR-seq datasets from P1 to P11 + 5×10^{-6}). Clonotypes with a

tetramer$^+$ enrichment ratio over 16 were defined as S_{448}- or S_{1208}-specific clonotypes,

and their frequency was tracked in the bulk TCR-seq dataset. Then, epitope-responsive

participants were defined as those whose total frequency of epitope-specific clonotypes

was (i) more than 0.05% and (ii) 5-fold increased after the first or the second shot (red).

Identifying Spike-specific clonotypes through TCR motif analysis using tcrdist3

To identify Spike-specific clonotypes through TCR motif analysis in our dataset, we

utilized the framework introduced in Mayer-Blackwell et al.[38]. In this framework, we

first formed meta-clonotypes (groups of TCRs that were biochemically similar) of

Spike-specific TCRs. Then we searched TCRs conformant to the definition of the meta-

clonotypes (meta-clonotype conformant TCRs).

Spike-specific meta-clonotypes are formed using Spike-specific TCR sequences from

two public databases (vdjdb and immune epitope database: IEDB) and our tetramer

TCR-seq datasets as an input. In this step, the TCR sequence motif and optimal radii

were estimated for each meta-clonotype at which background TCRs were detected at a

frequency of $< 10^{-5}$. Then, Spike-specific TCRs were searched in our dataset using these

Spike-specific meta-clonotypes and meta-clonotypes reported in Mayer-Blackwell et

al.[38], which were identified from MIRA Spike antigen stimulation assay dataset[37] with

significant association for HLA-restricted epitopes. In this step, the query list of Spike-

specific meta-clonotypes was generated for each participant by selecting meta-

clonotypes whose epitope-presenting HLA allele matched the participant's HLA

genotypes. The frequency of Spike-specific clonotype was tracked in bulk TCR-seq

dataset, and epitope-responsive participants were defined as for the tetramer TCR-seq

data analysis.

Data processing of scRNAseq reads

Data processing of scRNAseq reads was performed as described in Shichino et al [67].

Adapter trimming of sequencing data was performed by using cutadapt 3.4[61]. Filtered

reads were chunked into 16 parts for parallel processing using Seqkit 0.15.0[68]. Filtered

cell barcode reads were annotated by Python script provided by BD with minor

modifications to be compatible with Python3.8. Associated cDNA reads were mapped to

reference RNA (build GRCh38 release-104) using bowtie2-2.4.2[69] by the following

parameters: -p 2 -D 20 -R 3 -N 0 -L 8 -I S,1,0.75 –norc –seed 656565 –reorder. Then,

cell barcode information of each read was added to the bowtie2-mapped BAM files, and

read counts of each gene in each cell barcode were counted by using mawk. The

resulting count data was converted to a genes x cells matrix file, and the knee-plot

inflection threshold was detected using the DropletUtils package in R version 4.1.2[70]. In

addition, we further estimate background beads using the emptyDrops formula in the

DropletUtils package. Cells of total read count over inflection point were considered

valid cells.

Data processing of sample tag reads

745   For sample tag data, adapter trimming of sequencing data was performed using

cutadapt 3.4[61]. Filtered reads were chunked to 64 parts for parallel processing using Seqkit

0.15.0[68]. Filtered cell barcode reads were annotated using the Python script provided by

BD with a minor modification to allow compatibility with Python3.8. Associated sample

tag reads were mapped to known barcode fasta using bowtie2-2.4.2[69] with the following

parameters: -p 2 -D 50 -R 20 -N 0 -L 14 -i S,1,0.75 –norc –seed 656565 –reorder –trim-

to 3:40 –score-min L,-9,0 –mp 3,3 –np 3 –rdg 3,3.

752   The cell barcode information for each read was added to the bowtie2-mapped

BAM files, and read counts of each Tag in each cell barcode were counted using mawk.

The resulting count data were converted to a Tags x cells matrix file using the data.table

package in R 3.6.3, and the top 1M cell barcodes were extracted. For the assignment of

individual tags to cell barcodes, read counts of each tag in each valid cell barcode, defined

by the cDNA matrix, were extracted from the tag/cell barcode expression matrix.

Unassigned cell barcodes were labeled as "not-detected" cells. The sum of the total read

counts of each tag was normalized to the minimum sum count of each tags, and $\log_2$ fold-

change between first most tag counts and second most tag counts within each cell barcode.

Each cell barcode was ranked by the fold-change ascending order, and top N cells were

identified as doublets (N was calculated as theoretically detectable doublets calculated

using the Poisson's distribution based on the number of loaded cells, total Rhapsody well

number, and the number of tags used).

Data processing of AbSeq reads

For AbSeq data, adapter trimming of sequencing data was performed using cutadapt 3.4

[61]. Filtered reads were chunked into 64 parts for parallel processing using Seqkit 0.15.0

[68]. Filtered cell barcode reads were annotated by Python script provided by BD with

minor modifications to be compatible with Python3.8. Associated AbSeq reads were

mapped to known barcode fasta by using bowtie2-2.4.2[69] by the following parameters: -

p 2 -D 20 -R 3 -N 0 -L 8 -I S,1,0.75 –norc –seed 656565 –reorder–trim-to 3:39 –score-

min L,-9,0 –mp 3,3 –np 3 –rdg 3,3. Then, the cell barcode information of each read was

added to the bowtie2-mapped BAM files, and read counts of each AbSeq tag in each

cell barcode were counted using mawk. The resulting count data were converted to tags

x cells matrix file by using the data.table package in R version 4.1.2, and top 1M cell

barcodes were extracted.

Correct batch effect in scRNAseq and AbSeq data

scRNAseq/AbSeq data analysis was performed using the R software package Seurat

v4.0.1[71]. Expression data of targeted panel genes and surface proteins were converted to

the Seurat object. CD4$^-$ CD8$^+$ cells were extracted based on the expression level of CD4

and CD8 proteins determined by AbSeq. Then, expression data was log-normalized and

scaled using NormalizeData and ScaleData functions, respectively. For scRNAseq data,

the batch effect was corrected as in Stuart et. al.[72], using reciprocal principal component

analysis (PCA) in Seurat. Then, PCA was performed using RunPCA (the number of

calculated principal components (PCs) was 50). The enrichment of each PC was

calculated using the JackStraw and ScoreJackStraw function (num.replicate = 100), and

PCs that were significantly enriched ($p \leq 0.05$) were selected for further analysis. For

AbSeq data, genes unrelated to the phenotype of CD8$^+$ T cells (CD14, CD16, CD19,

CD3, CD4, CD8, CXCR5, IgD, and IgM) were excluded, then, the batch effect of

selected genes (CD27, CD28, CD56, CD62L, and CD161) were corrected using the

ADTnorm function in the package ADTnorm[73]. The expression data of the other genes

(CCR7, CD11c, CD25, CD45RA, CD127, CD134, CD137, CD183, CD196, CD272,

CD278, CD279, CXCR6, GITR, HLA-DR, and Tim3) was log-normalized using

NormalizeData function. After that, data scaling and PCR were performed using

ScaleData and RunPCA function.

Cell clustering through integrative analysis of scRNAseq and AbSeq data

Cell clustering was performed based on the weighted-nearest neighbor graph using

FindMultiModalNeighbors and FindClusters against the significant PCs of scRNAseq

and AbSeq[74]. The dimensional reduction was performed using RunUMAP based on the

nearest neighbor graph determined by FindMultiModalNeighbors. Marker genes of each

identified cluster were identified using the FindAllMarkers function (test.use="Wilcox",

min.pct=0.1, return.thresh=0.05). Clusters constituted with contaminant cells

determined by marker genes were excluded, and the above analysis procedure was

repeated.

Transcriptional signature analysis in scRNAseq

We computed the extent to which gene signatures were expressed in cells using

Seurat's "AddModuleScore" function. Signature genes related to the T-cell phenotypes

were obtained from the dataset published by Galleti et al.[75]. Effector and Cell cycle

signature genes were obtained based on the descriptions of Immune Response Panel HS.

Genes used for calculating signature scores are summarized in Supplementary Table S10.

Data processing and analysis of scTCRseq

Raw data from single-cell TCR sequencings were processed by the pipeline produced

by ImmunoGeneTeqs, Inc., as described previously[60]. Briefly, sequencing reads were

separated by cell barcode, then adapter trimming and quality filtering of sequencing

data were performed using cutadapt 3.4[61]. PCR and sequencing errors were corrected by

lighter v1.1.2[76] with the following parameters: -newQual 25 -maxcor 4 -K 20. Error-

corrected sequence reads were processed by MiXCR[63] to generate the list of TCRα or

TCRβ sequences for each cell barcode, using reference human TCR V/D/J sequences

registered in the international IMGT information system. Quality filtering of cell

barcodes was performed with the following criteria: (1) more than 32 TCR reads were

detected. (2) the proportion of the most frequent TCR sequence in cell barcodes was

over 0.6. (3) the cell barcode was annotated to the T cell cluster in scRNAseq/AbSeq

analysis. Parameters used in MiXCR are summarized in Supplementary Table S11.

Finally, the most frequent sequence of TCRα and TCRβ was adopted and paired in each

cell barcode. Identified TCRα or TCRβ sequence was imported into the meta.data

matrix in the Seurat object of scRNAseq/AbSeq data based on the cellular barcode

identities. T-cell clones were determined as cells with the same TCRβ sequence defined

by the V segment, J segment, and CDR3 nucleotide sequence. The frequency of each

clone was calculated as the proportion of cells belonging to the clone in all T cells

whose TCRβ sequence was assigned.

Calculating the TCR repertoire meta-parameter for correlation analysis

Co-regulated TCR repertoire parameters ("repertoire meta-parameters") were

independently determined for $CD4^+$ and $CD8^+$ T cells. First, a Spearman correlation

coefficient was calculated for all pairs of repertoire parameters; then, repertoire

parameters were grouped into 8 clusters based on the matrix of correlation coefficient

values. TCR repertoire meta-parameter were calculated by averaging the rank of

parameters in each cluster. Meta-parameters were used for correlation analysis.

Quantification and statistical analysis

Statistical analyses were performed using GraphPad Prism (ver9.5.1) software

(GraphPad Software). Friedman test with Dunn's multiple comparisons test was

performed on the comparison between the responding patterns of clonotypes or

temporal comparison of clonotype frequency. Wilcoxon matched-pairs signed rank test

was performed on the comparison of 2nd responder clonotypes after the second and the

third shot or comparison of the frequency of S_{448} and S_{1208} tetramer$^+$ cells determined by

flow cytometry. The Spearman test was performed on the correlation analysis between

repertoire meta-parameters and clinical parameters. Mann-Whitney test was performed

on the comparison of the total frequency of S_{448}- and S_{1208}-specific clonotypes

determined by tetramer TCR-seq in responding participants. Kruskal-Wallis test with

Dunn's multiple comparisons was performed on the comparison of the total frequency

of S_{448}-, S_{1208}-, S_{269}-, and S_{919}-specific clonotypes determined by TCR motif analysis in

responding participants. q-values are estimated from simultaneous testing (Figure 3H

and Figure 5, Supplementary Figure S5) using "qvalue" packaged in R[77]. Asterisks to

indicate significance corresponding to the following: ***$P<0.001$; **$P<0.005$; *$P<0.05$;

n.s. non-significant ($P \geq 0.05$).

Data and materials availability

All sequencing data (Bulk TCRseq, and Single-cell RNA/TCR sequencing) have been

deposited at GEO and are publicly available as of the date of publication (GEO:

GSE210231). All original code has been deposited at Github (https://github.com/hiro-

aoki-mriid/Covid_TCRrepertoire). The list of reagents, antibodies, and algorithms used

in this study was summarized in Supplementary Tables S3, 4, and 5, respectively.

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872   Author Contributions

HA, MK, TI, and SU performed conceptualization. HA performed data curation, formal

analysis, and visualization. HA and SS developed software. HA, SS, AH, CM, and SU

designed the methodology. HA, MK, HA, PX, MT, AH, NOS, and SU conducted a

research and investigation process. TI, KM, and SU acquired funds. TI and SU

administrated the project. SS and KM supervised the project. HA and SU wrote the

original draft, and all the authors participated in writing the final manuscript.

880   Competing Interests statement

H.A. reports stock for ImmunoGeneTeqs, Inc. S.S. reports advisory role for

ImmunoGeneTeqs, Inc; stock for ImmunoGeneTeqs, Inc, T.I. reports research funding

from Rohto Pharmaceutical Co., Ltd., and Biometrics Sympathies Inc. K.M. reports

consulting or advisory role for Kyowa-Hakko Kirin, ImmunoGeneTeqs, Inc; research

funding from Kyowa-Hakko Kirin, and Ono; stock for ImmunoGeneTeqs, Inc, IDAC

Theranostics, Inc. S.U. reports advisory role for ImmunoGeneTeqs, Inc; stock for

ImmunoGeneTeqs, Inc, IDAC Theranostics, Inc.

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Figures

Figure 1

Fig. 1 Identifying responding clonotypes after vaccination. (A) Schematic of

longitudinal sample collection before and after BNT162b2 vaccination. Time points for

Bulk TCR-seq (TCR). (B) Example for identifying responding clonotypes using the

beta-binomial model[20]. The scatter plot represents clonotype frequencies in samples

collected before and after vaccination. Significantly expanded (responding) and

contracted clonotypes were indicated as orange and cyan. (C) The total frequency of

CD8$^+$ (left) and CD4$^+$ (right) responding clonotypes after each vaccination. (D)

Diversity of CD8$^+$ (left) and CD4$^+$ (right) responding clonotypes after each vaccination.

The count of responding clonotypes normalized by the total number of clones for each

participant was plotted. (E) Models for T-cell responses following mRNA vaccinations.

(left) Repetitive expansion model: the clonotypes responded to the first shot and

expanded repeatedly after the second and third shots. (right) Clonal replacement model:

primary responder clonotypes were turned over after each vaccination shot. (F)

Classifying CD8$^+$ T-cell clonotypes into 1st, 2nd, dual, and 3rd responders. The frequency

of each clonotype was plotted longitudinally for each type of reaction (dashed lines).

The longitudinal changes of their total frequency were also plotted (thick line). The red

arrows represent the timing of vaccination. The grey horizontal line represents the

threshold for a clonotype to be regarded as "Increased." The data from one participant

(ID4) is shown. (G) Kinetics of CD8$^+$ 1st, 2nd, dual, and 3rd responder clone frequencies.

The median with 95% CI was plotted. (H) The comparison of the total frequency of

CD8$^+$ 1st, 2nd, dual, and 3rd responder clonotypes after each shot. The total frequency for

3rd responders was plotted only after the third shot (right). (C, D, H) Median was

plotted. Friedman test with Dunn's multiple comparison. n = 38 except for P11 (n=37).

***P<0.001; **P<0.01; *P<0.05. (A) and (E) were created using BioRender.com.

Figure 2

Fig. 2 Response pattern of CD8⁺ Spike-reactive clonotypes. (A) Schematic of time

points of AIM-assay. AIM TCR-seq was performed only on P3 (bold). (B) Gating

strategy for sorting AIM⁺ and AIM⁻ non-naive CD8⁺ T cells. The proportion of AIM⁺

cells among non-naive CD8$^+$ T cells was also shown. (C) Flow chart for identifying

AIM$^+$ clonotypes. AIM$^+$ and AIM$^-$ T cells were sorted using the gating as (B), then

TCR-seq was performed on these T cell subsets. AIM$^+$ clonotypes were identified as

clonotypes that were enriched in the AIM$^+$ T-cell repertoire (Materials and Methods).

(D) Scatter plot of overlapping clones between AIM$^+$ and AIM$^-$ repertoire. Individual

dots represent clonotypes with their frequency in AIM$^+$ and AIM$^-$ repertoire. Red dots

represent AIM$^+$ clonotypes. (E) Kinetics of the total frequency of CD8$^+$ AIM$^+$

clonotypes of each participant (thin line, grey). The median was also plotted (thick line,

black). (F) Longitudinal tracking of individual CD8$^+$ AIM$^+$ clonotypes in one participant

(ID2). Clonotypes were plotted by response patterns (1st responders: blue, 2nd

responders: red, dual responders: purple, and other clonotypes: gray). Numbers indicate

the count of the AIM$^+$ responder clonotypes and that of all AIM$^+$ ones. (G) The

proportion of 1st, 2nd, and dual responders in CD8$^+$ AIM$^+$ clonotypes. The count of AIM$^+$

responder clonotypes divided by that of all AIM$^+$ clonotypes was compared. (H) The

total frequency of CD8$^+$ AIM$^+$ 1st, 2nd, and dual responders after the second vaccination.

(E, G, and H) Friedman test with Dunn's multiple comparisons. n = 38 except for P11

(n=37). ***P<0.001; **P<0.01. (A and C) were created using BioRender.com.

Figure 3

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Fig. 3 Single-cell analysis on non-naive CD8+ T cells after vaccination. (A)

Schematic of time points of single-cell analysis. (B) Weighted-nearest neighbor graph-

based uniform manifold approximation and projection (wnnUMAP) plot of the

scRNAseq/AbSeq data of non-naive CD8+ T cells. (C and D) Dot plot showing mRNA

(C) and protein (D) expression of marker genes in the T-cell clusters. The size of the

circle shows the percentage of cells in a cluster expressing the gene: color scale shows

the gene expression level. (E) wnnUMAP plot for T cells in 1st, 2nd, and dual responder

clones at TP3 or TP8. (F) Bar graph representing the cluster distribution of T cells in 1st,

2nd, and dual responder clonotypes. (G) Volcano plots of differential expression test of T

cells from TP3 versus TP8 2nd responder clonotypes. Genes expressed more than two-

fold with statistical significance ($p < 0.01$) after the second or third shot are plotted in

red or blue, respectively. (H) Violin plot showing gene signature scores of T cells in 2nd

responder clonotypes at TP3 or TP8. Signature genes are referred from the marker genes

of T-cell clusters described in Galleti et al.[24] and the datasheet of BD Rhapsody™

Immune Response Panel Hs. (H) Student's t-test was performed, and their q-values

were estimated. T_{TE}: terminal effector T cell; Trans: transitional; T_{EM}: effector memory

T cell; T_{CM}: central memory T cell; T_{STEM}: stem-like T cell; T_{PEX}: progenitor exhausted-

like T cell. ***q<0.001; **q<0.01; *q<0.05. (A) was created using BioRender.com.

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Figure 4

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Fig. 4 Re-expansion of CD8$^+$ 2nd responder clonotypes after the third shot. (A) The

total frequency of all (top) or AIM$^+$ (bottom) 2nd responders after the second or the third

shot. (B) Count of clonotypes that expanded after the second or the third shot within all

(top) or AIM$^+$ (bottom) 2nd responders. (C) Clonality of all (top) or AIM$^+$ (bottom) 2nd

responders after the second or the third shot. (D) Evenness of all (top) or AIM$^+$ (bottom)

2nd responders after the second or the third shot. (E) Schematic overview for the

response of CD8$^+$ T-cell clonotypes following mRNA vaccination. After the second

shot, 2nd responders turned over 1st responders and became dominant in vaccine-

responding T cells. After the third shot, 2nd responders expanded again, while their

diversity was reduced. 3rd responders also appeared after the third shot and partially

replenished the vaccine-induced T-cell responses. (A-D) Wilcoxon matched-pairs signed

rank test. (C and D) Clonality and evenness are calculated only when more than ten

clonotypes exist. n = 38 except for the bottom of (C) and (D) (n=17). ***P<0.001;

*P<0.05. (E) was created using BioRender.com.

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Figure 5

Fig. 5 Correlation between CD8$^+$ T cell repertoire meta-parameters and other variables regarding vaccination. (A) Schematic of time points of quantifying serum anti-RBD antibody titer and checking the presence of adverse vaccination events. Antibody titers against RBD of SARS-CoV-2 ancestral strain ("Anc") and Omicron variant ("Omi") were analyzed. (B) Heatmap of the correlation between CD8$^+$ T cell repertoire parameters. The repertoire meta-parameter is calculated as the average of mutually correlated repertoire parameters (Materials and Methods). The names of repertoire meta-parameters and their descriptions are also shown. (C) Heatmap of the correlation between CD8$^+$ T cell repertoire meta-parameters (row) and the age of participants, the titer of anti-SARS-CoV-2 RBD IgG antibodies ("Ancestral" or "Omicron"), or strength of the adverse events ("AE") (column). (D) Correlation between the repertoire parameters (x-axis) and the IgG antibody titers to RBD of Omicron variant ("Omicron") of SARS-CoV-2. The Spearman correlation coefficient between the two parameters is shown. (B and C). The Spearman correlation coefficient is colored in the heatmap. (C) q-values of the Spearman correlation coefficient between two parameters are plotted. **q<0.01; *q<0.05. (A) was created using BioRender.com.

Figure 6

1262

Fig. 6 Analysis of Spike-specific clonotypes using pMHC-tetramer staining. (A) The

working hypothesis for the clonal replacement during mRNA vaccination. (left)

different epitopes induce the 1st and 2nd responder clonotypes (inter-epitope

replacement). (right) Responding clonotypes are changed within each Spike epitope

(intra-epitope replacement). (B) Schematic of time points of Spike peptide-MHC

tetramer analysis. (C) Percentage of participants in whom S_{448} or S_{1208}-specific T-cell

responses were detected by flow cytometry. Spike-specific T-cell responses were

defined as more than 0.1% tetramer$^+$ cells among CD8$^+$ T cells. (D) The total frequency

of CD8$^+$ S_{448}^+ (left) or S_{1208}^+ (right) clonotypes of participants in whom epitope-specific

T-cell responses ("epitope-responsive participants") were detected by repertoire analysis

(thin line, grey). The median was also plotted (thick line, black). Epitope-responsive

participants were defined in Supplementary Figure 6D. (E) Kinetics of S_{1208}-specific 1st,

2nd, dual, and 3rd responder clonotype frequencies. The thin line represents the total

frequency for each participant. The thick line represents the median for S_{1208}-responsive

participants. (F) Comparison of the total frequency of S_{1208}-specific 1st, 2nd, dual, and 3rd

responder clonotypes after each shot. The total frequency for 3rd responders was plotted

only after the third shot (right). n = 7 and 9 for S_{448}- or S_{1208}- responsive participants,

respectively. (D and F) Friedman test with Dunn's multiple comparisons was performed.

***$P<0.001$; **$P<0.01$; *$P<0.05$. (A and B) were created using BioRender.com.

Figure 7

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Fig. 7 Analysis of Spike-specific clonotypes using TCR sequence motifs. (A)

Schematic overview. (left) We used Spike-specific TCRs in three public databases and

our original Tetramer-TCRseq datasets as input. (middle) Shared TCR sequence motifs

of Spike-specific clonotypes were constructed using the tcrdist3 pipeline[38]. TCR

sequence motifs are represented as logo plots, where the sizes and colors of the letters

represent the frequency and characteristics of amino acids (red: acidic, blue: basic,

green: polar, purple: neutral, black: hydrophobic). (right) T cell clonotypes possessing

the Spike-specific TCR sequence motifs were searched. When searching clonotypes

with sequence motif specific to each Spike-epitope, only participants with HLA that

presents the epitope were analyzed. (B) The total frequency of $CD8^+$ S_{448}, S_{1208}, S_{269}, or

S_{919}-specific clonotypes of epitope-responsive participants (thin line, grey). The median

was also plotted (thick line, black). Epitope-responsive participants were defined in

Supplementary Figure 6D. (C) Kinetics of S_{448}- (top) or S_{1208}- (bottom) specific 1st, 2nd,

dual, and 3rd responder clonotype frequencies. The thin line represents the total

frequency for each participant. The thick line represents the median for epitope-

responsive participants. (D and E) Comparison of the total frequency of S_{448}- (D) or

S_{1208}- (E) specific 1st, 2nd, dual, and 3rd responder clonotypes after each vaccination. The

total frequency for 3rd responders was plotted only after the third shot. n = 8 (S_{448}), 12

(S_{1208}), or 6 (S_{269} and S_{919}). (B, D, and E) Friedman test with Dunn's multiple

comparisons. ***$P<0.001$; **$P<0.01$; *$P<0.05$. (A) was created using BioRender.com.

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