

# **MHC ligand generation in T cell-mediated immunity and MHC multimer technologies for T cell detection** Bakker, A.H.

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## **Chapter 6**

## Parallel detection of antigen-specific T-cell responses by multidimensional encoding of MHC multimers

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# Parallel detection of antigen-specific T-cell responses by multidimensional encoding of MHC multimers

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The use of fluorescently labeled major histocompatibility complex multimers has become an essential technique for analyzing disease- and therapy-induced T-cell immunity. Whereas classical major histocompatibility complex multimer analyses are well-suited for the detection of immune responses to a few epitopes, limitations on human-subject sample size preclude a comprehensive analysis of T-cell immunity. To address this issue, we developed a combinatorial encoding strategy that allows the parallel detection of a multitude of different T-cell populations in a single sample. Detection of T cells from peripheral blood by combinatorial encoding is as efficient as detection with conventionally labeled multimers but results in a substantially increased sensitivity and, most notably, allows comprehensive screens to be performed. We obtained proof of principle for the feasibility of large-scale screening of human material by analysis of human leukocyte antigen A3–restricted T-cell responses to known and potential melanoma-associated antigens in peripheral blood from individuals with melanoma.

T cells recognize virus-infected cells and tumor cells by detecting the presence of disease-specific peptide–major histocompatibility complexes (pMHC) with their clone-specific T-cell receptor. Both for the monitoring of disease-specific immune responses and for the development of new immunotherapeutics, it is essential to specifically detect only those T cells that recognize a given pMHC complex within the large pool of irrelevant T cells<sup>1</sup>. The use of soluble multimeric pMHC complexes to detect such antigenspecific T cells by flow cytometry was first described in 1996 (ref. 2) and has since then become a cornerstone of T-cell monitoring<sup>3</sup>. However, a major limitation in the use of this methodology is that at most, a few antigen specificities can be monitored in a single biological sample because of limitations on the number of available fluorochromes<sup>4</sup>.

Prior work has shown that it is feasible to detect antigen-specific T cells by the binding of two different fluorochrome-coded major histocompatibility complex (MHC) multimers containing the same or a related peptide. This technology of double MHC multimer staining has been used to reveal the fine specificity of T cells for variants of single peptide epitopes<sup>5</sup>. If a large set of such dual-colorencoded pMHCs could be combined in a single sample without interfering with the ability of each single pMHC to detect specific T cells, such a technology could conceivably be used to detect a much larger number of T-cell specificities than is currently possible with classical MHC multimer analysis.

Here we demonstrate that a large number of antigen-specific T-cell responses (at least 25) can indeed be analyzed in parallel through the use of pMHC multimers that are each coupled to a unique combination of fluorochromes, with the same fluorescent label being used many times, but in each case in a unique combination with one or more other labels. We exemplify the value of this 'combinatorial encoding' by dissecting melanoma-associated T-cell responses in peripheral blood from individuals with melanoma.

#### RESULTS

#### The concept of combinatorial encoding

In this approach, a specific T-cell population is no longer defined by a single fluorescent signal, as is the case in standard MHC multimer stainings, but instead is visualized by the joint binding of multiple fluorochromes. Conceptually, the approach can be considered a self-assembling molecular coding scheme, in which unique codes are only assembled at the moment of T-cell binding (Fig. 1a). The power of such a scheme becomes evident with an increasing number of available fluorochromes (Fig. 1b). In this study, we explored two-dimensional combinatorial encoding with eight fluorochromes, which deliver 28 unique codes (Supplementary Table 1), and demonstrated the ability to expand to three-dimensional combinatorial encoding using the five most intense fluorochromes.

#### Feasibility of combinatorial encoding

We first determined the feasibility of using six different quantum dots (Qdots) as fluorescent labels for pMHC multimers, in addition

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to allophycocyanin (APC) and phycoerythrin (PE) fluorescent labels (Supplementary Table 1), which are more commonly used for the detection of antigen-specific T-cell responses. By analyzing peripheral blood samples for cytomegalovirus (CMV)-specific CD8+ T-cell responses, we established that pMHC complexes that were multimerized by coupling to streptavidin-conjugated Qdots, APC or PE could all be used to detect antigen-specific T cells (Supplementary Fig. 1). Subsequently we analyzed whether antigenspecific T-cell populations could reliably be identified by the binding of two pMHC multimers that contain the same antigenic peptide but that are coupled to a different fluorochrome (Fig. 1a). Testing of pMHC complexes conjugated to all 28 possible combinations of two different fluorochromes demonstrated that such dual encoding can in all cases reveal the appropriate T-cell population, with only limited variation in detection efficiency between the different color combinations (Fig. 2a). As expected, simultaneous staining of T cells with two differentially labeled pMHC multimers that contain the same antigenic peptide leads to a small reduction in fluorescence intensity for each channel (an expected factor of 2 at equimolarity). To limit this negative effect, we used the three Qdots that yielded the lowest intensity signal on our flow cytometric system (Qdots QD565, QD585 and QD800) in a 2:1 rather than 1:1 ratio relative to the other fluorochromes, and we did not use the Qdot combinations QD565 and QD585; QD565 and QD800; and QD585 and QD800 in subsequent experiments, thereby reducing the number of combinations to 25.

#### Sensitivity of combinatorial encoding

Antigen-specific T-cell populations can be present at very low frequencies, and pMHC multimers do show low-level background staining. To test whether the detection of antigen-specific T cells with combinatorial encoding affects background staining or the frequency of antigen-specific T cells detected, we stained peripheral blood mononuclear cells (PBMCs) containing a low-frequency T-cell response to the human leukocyte antigen (HLA)-A2–restricted CMV epitope NLVPMVATV (CMV-NLV) with HLA-A2 CMV-NLV multimers or with irrelevant HLA-A2 multimers and analyzed them by flow cytometry. Specifically, we incubated PBMCs either with the eight different single-color pMHC multimers in eight separate stainings or with the 25 dual-color–encoded MHC multimers in 25 separate stainings. We considered T cells positive for MHC multimer binding when detected above background either in

Figure 1 | Overview of the combinatorial encoding approach. (a) MHC molecules with different peptide specificities (green, red and orange peptides, top) are conjugated with different fluorochrome color codes (red, green and blue fluorochromes, second row) to generate differentially encoded pMHC multimers (third row). Combinatorial codes are then assembled on T-cell surfaces (fourth row) and these T-cell samples are analyzed by flow cytometry (bottom). (b) The theoretical number of unique color combinations that can be made using fluorochromes for the indicated numbers of available channels in either one-, two- or three-dimensional coding schemes.

one channel (for single-color stainings) or when detected in both relevant channels (for dual-color encodings). Notably, the

frequency of false positive cells observed upon staining with irrelevant HLA-A2 multimers was approximately tenfold lower when using a dual encoding scheme as compared to the traditional single-staining approach (Fig. 2b). This is because most background events are only positive in a single channel and are therefore excluded by combinatorial encoding.

Having established the feasibility of dual-color encoding, we examined whether multiple dual-color–encoded MHC multimer stainings can be performed in parallel on a single sample. To analyze T cells reactive with any of the dual-color–encoded pMHC multimers in a single sample, we developed a gating strategy. In brief, we identified single live CD8+ T cells (Fig. 2c and Online Methods) and analyzed T-cell populations reactive with any of the dual-color–encoded pMHC multimers by gating on each of the eight individual fluorochromes used to form the 25 different unique combinations (Fig. 2c), as exemplified by gating PE and QD705 double positive CD8+ T cells from both a relevant and an irrelevant mix of pMHC multimers. This strategy identified T cells with signal above background in a given combination of two channels and that are negative in the remaining six channels, thereby allowing the simultaneous analysis of 25 different combinations in one flow cytometry experiment.

#### Single-sample visualization of up to 25 T-cell responses

We generated 25 different pMHC multimers containing various viral and cancer epitopes for the human MHC alleles HLA-A1, -A2, -A3 and -B7 (Supplementary Table 2) by MHC peptide exchange<sup>6-8</sup>. Then, we coupled each of these pMHC multimers to two fluorochromes, generating a set of unique codes (Supplementary Table 2). To compare the data obtained by combinatorial encoding with conventional MHC-multimer analysis, we made PE-labeled pMHC multimers in parallel using the same T-cell epitopes. To determine the background of combinatorial encoding, we also prepared irrelevant pMHC multimers in all two-color combinations.

We analyzed PBMCs from three healthy donors covering all four HLA alleles (Fig. 3a–c) by (i) one single staining with the mix of dual-color–encoded viral and cancer epitope pMHC multimers, (ii) 25 separate stainings with all individual dual-color–encoded pMHC multimers, (iii) one single staining with the mix of dualcolor–encoded irrelevant pMHC multimers or (iv) 25 separate stainings with all 25 PE-labeled pMHC multimers. We performed the experiment in a blinded fashion with respect to HLA haplotype



Figure 2 | Feasibility of T-cell staining with dual-color-encoded pMHC multimers. (a) Flow cytometry plots displaying fluorescence intensity for the fluorochromes listed at the top and right side of the plot matrix. PBMCs stained using the 28 possible two-color combinations of HLA-A2 CMV-NLV MHC multimers in separate stainings were analyzed, as indicated. Each plot is labeled with the percentage of HLA-A2 CMV-NLV–specific T cells out of total CD8+ cells and, in parentheses, the number of detected HLA-A2 CMV-NLV–specific T cells divided by the average number of HLA-A2 CMV-NLV–specific cells found for all color combinations (average of three experiments using three different donors). Dot plots were gated on approximately 10,000 CD8+ lymphocytes. Gray dots represent CD8+ T cells with no MHC multimer binding, colored dots represent MHC multimer–reactive CD8+ T cells (b) Percentage of MHC multimer–positive T cells found with the indicated techniques. Data are mean  $\pm$  s.d.,  $n = 25$  for gray bars and  $n = 8$  for black bars. (c) Schematic overview of the gating strategy used for identification of pMHC-specific T cells after staining with dual-color–encoded MHC multimers. PBMCs were stained with relevant pMHC complexes to visualize antigen-specific T cells (left) or with irrelevant pMHC complexes to indicate background staining (right). CD8+ and 'dump' (FITC) negative cells are selected (dark gray; top). Cells positive in two different MHC multimer channels (PE, QD705) are indicated in purple, and cells positive in any of the other multimer channels indicated in black (second row). Then one determines whether cells are double positive for the two selected colors (third row). Cells positive in three or more MHC multimer channels are removed (bottom). In typical final data plots, an antigen-specific T-cell population is indicated by fluorescence in two defined channels (bottom, left).

and to prior analysis of antigen-specific T-cell responses in these donors. Combinatorial encoding of pMHC multimers allowed the simultaneous visualization of a large number of antigen-specific T-cell populations in one single sample (Fig. 3 and Supplementary Fig. 2). Notably, we found the same virus-specific T-cell populations in each donor when analyzed by individual PE-multimer stainings. Furthermore, statistical comparison between staining strategies i, ii and iv revealed a high interclass correlation (interclass correlation coefficient ( $\rho$ ) = 0.84 (95% confidence interval: 0.78–0.89)), describing an almost perfect agreement between the outcomes of the three strategies<sup>9</sup>. Individual comparison between the mix of 25 dual-color–encoded pMHC multimers in one sample (strategy i) with either the PE-tetramer stainings (strategy iv) or the same set of dual-color–encoded pMHC multimers in 25 separate stainings (strategy ii) reveal similarly high correlations ( $\rho = 0.79$ (95% confidence interval: 0.68–0.86) and  $\rho = 0.83$  (95% confidence interval: 0.74-0.89), respectively) (Fig. 4). Thus, the simultaneous detection of multiple antigen specificities with sets of pMHC multimers, in which each multimer is coupled to a distinct combination of fluorochromes, is feasible. Finally, comparison of the signals from the dual-color–encoded pMHC set containing virus and tumor-associated epitopes (strategy i) with the signals from the pMHC set containing 25 irrelevant MHC multimers (strategy iii) indicates that the sensitivity of the approach is high

and that T-cell populations as infrequent as 0.02% of CD8+ cells can be identified (Figs. 3a–c and 4a) (average background: 0.0012% of CD8<sup>+</sup> T cells, s.d. = 0.0035,  $n = 100$ ).

To validate the T-cell responses observed by MHC multimer staining using a non–flow cytometry–based method, we performed an INFg enzyme–linked immunosorbent spot (ELISPOT) assay with these PBMCs using the same 25 peptides (Fig. 3a–c). All T-cell responses detected by MHC multimer analysis were confirmed by detection of INF<sub>Y</sub> secretion. Note that the magnitude of T-cell responses, as measured by INF $\gamma$  secretion, was in some cases substantially lower than that measured by any of the MHC multimer approaches, consistent with the observation that a variable fraction of antigen-specific T cells acquires the capacity to secrete effector cytokines.

To provide proof of principle for higher-dimension encoding of antigen-specific T-cell responses, we generated eight different combinations of five high-intensity fluorochromes (PE, APC, QD605, QD655 and QD705), in which each antigen specificity was encoded by a unique combination of three different fluorochromes. Even though the frequency of antigen-specific T cells detected was lower as compared to two-dimensional encoding (0.29% versus 0.47% of CD8+ T cells), identification of CMV-NLV–specific T cells in healthy donor PBMCs was feasible using this three-dimensional encoding strategy (Supplementary Fig. 3).

Finally, combinatorial encoding can be combined with singlecolor antibody staining to determine the phenotype of pMHCspecific T cells. To illustrate this, we analyzed the phenotype of three virus-specific T-cell populations, HLA-A2 Inf-GIL, CMV-NLV and EBV-GLC. As described previously10,11, HLA-A2 CMV-NLV–specific T cells displayed a more differentiated phenotype (CD45RA+, CCR7–, CD62L– and CD57+ or CD57-), as compared to HLA-A2 EBV-GLC and Inf-GIL T-cell populations



Figure 3 | Multiplex detection of virus-specific T-cell responses through combinatorial encoding. (a-e) Donor 1. (f-j) Donor 2. (k-o) Donor 3. Dot plots of antigen-specific T-cell populations detected at a frequency >0.03% are shown by staining one sample with a mix of 25 different dual-color pMHC multimers<br>(**a,f,k**); by staining 25 individual samples with 1 of the 25 dual-co pMHC multimers (c,h,m); and by staining 25 individual samples with classical PE-labeled pMHC multimers each containing one of the 25 peptides (d,i,n). All dot plots are shown with bi-exponential axes and display fluorescence intensity (a.u.) for the fluorochrome indicated on each axis. Graphical representation of the frequency of antigen-specific CD8\* T cells directed against the 25 epitopes **(Supplementary Table 2**), when measured using the four different flow<br>cytometry–based strategies shown in <mark>a–d, f–l</mark> and **k–n**, and IFNγ E



detected in the same sample (CD45RA<sup>+</sup> or CD45RA<sup>-</sup>, CCR7<sup>-</sup>, CD62L– and CD57–) (Supplementary Fig. 4).

#### Identification of melanoma-associated T-cell epitopes

Having established the feasibility of combinatorial encoding for the parallel measurement of a large number of antigen-specific T-cell populations in a single sample, we next determined the potential value of combinatorial encoding in epitope identification. In a recent screen<sup>8</sup>, we had identified 22 peptides from four different melanomaassociated proteins that display a high affinity for HLA-A3 (Supplementary Table 3). This set included all four previously described HLA-A3–associated epitopes as well as 18 potential new epitopes. To address the feasibility of screening small patient samples for responses to sets of potential epitopes, we generated MHC reagents by UV-light–induced peptideexchange reactions<sup>6–8</sup> for all 22 epitopes,

Figure 5 | T-cell responses to melanoma-associated peptides. (a) Dot plots show a representative example of pMHC multimer–enriched PBMCs from an individual with melanoma analyzed by combinatorial encoding. Antigen-specific T-cell populations were detected for gp100-LIY (PE and QD565) (green) and Nodal-SLY (APC and QD585) (pink). All dot plots are shown with bi-exponential axes and display fluorescence intensity (a.u.) for the indicated fluorochromes. (b) Summary of antigen-specific T-cell responses of 28 individuals to 22 melanoma-associated peptides (MEL), 20 HIV- and HCV-derived T-cell epitopes (HIV-HCV) and three HLA-A3–restricted virus-derived T-cell epitopes (EBV-FLU). The response of each individual is shown for detection directly ex vivo (top) and after enrichment and in vitro expansion (bottom). (c) T-cell cultures (from different individuals) that responded to the indicated peptide in an intracellular IFN<sub>Y</sub> staining assay. Assays were performed on sorted pMHC multimer–reactive T-cell populations incubated with T2-A3 cells pulsed with or without the indicated peptide. Data from representative cultures are shown for each epitope.

Figure 4 | Correlation between different T-cell detection strategies. (a) Correlation between antigen-specific T-cell frequencies as detected by classical PE-labeled MHC multimer staining and by dual-color–encoded MHC multimer staining with 25 specificities per sample. (b) Correlation between antigen-specific T-cell frequencies as detected by dual-color–encoded MHC multimers with one pMHC specificity per sample and by dual-color–encoded MHC multimer staining with 25 specificities per sample. Donors are the same as in Figure 3.  $\rho$ , interclass correlation coefficient. For transforming to logarithmic scale all zero values were converted to 0.0015. Dashed lines represent the optimal linear correlation.

as well as for three HLA-A3–associated Epstein-Barr virus (EBV) derived and influenza A–derived epitopes, and we encoded these reagents to form fluorescently labeled pMHC multimers as described in Supplementary Table 3. Subsequently, we screened



PBMCs from 28 HLA-A3–positive individuals with melanoma for T-cell responses to these potential antigens, either directly ex vivo or after antigen-specific T-cell enrichment. In the latter case, we only performed enrichments with pMHC multimers containing melanoma-associated antigens, to avoid potential overgrowth of virus-specific T cells during culture. As expected, we detected EBV- and influenza A–specific responses in the majority (15 out of 28) of the individuals with melanoma directly ex vivo. Additionally, we detected a single melanoma-associated antigenspecific response directly ex vivo. Notably, using parallel MHC multimer staining, we detected many T-cell responses specific for different potential melanoma-associated antigens after enrichment (Fig. 5a). In total, we detected 24 responses targeting eight distinct epitopes (Fig. 5b). Three of these epitopes consisted of previously described gp100-derived peptides that have been shown to be presented by tumor cells<sup>12–14</sup>. In addition, we observed responses to five previously unknown T-cell epitopes from gp100 (QLRALDGGNK), Nodal (SLYRDPLPR and HAYIQSLLK) and Tyrp2 (GTYEGLLRR and RMYNMVPFF). In all cases, we confirmed peptide specificity of the T cells with subsequent analysis by conventional MHC multimer staining followed by MHC tetramer– based sorting. We assayed the functional activity of these T-cell populations by measuring IFN $\gamma$  production upon incubation with peptide-loaded T2-A3 target cells; we confirmed the functional activity of 18 out of 22 cultures analyzed and for four out of the five newly identified epitopes (Fig. 5c). We performed the same type of combinatorial encoding analysis using HIV- and hepatitis C virus (HCV)-derived peptides (Supplementary Table 4), antigens to which the group of individuals we tested has presumably not been exposed. In these analyses, a sample from only one individual with melanoma showed reactivity against HCV-derived epitopes (HCV-GVA and GCV-KVF) (Fig. 5b). Although we could not attribute this single response to a known HCV exposure, the lack of T-cell responses against any of the other viral antigens in these individuals with melanoma suggests that the frequent detection of T-cell responses to the HLA-A3–restricted melanoma-associated antigens in this cohort is a consequence of disease state. Although it remains to be established whether T-cell responses against these antigens can contribute to tumor control, these data make a strong case for the value of combinatorial encoding in epitope identification.

#### **DISCUSSION**

With regard to the technical aspects of our approach, three points are noteworthy. First, the use of differentially labeled pMHC complexes carrying the same peptide led to a reduction in signal in each individual channel owing to competition for available binding sites, but such competition is apparently not a major factor. In a setup that used eight channels for encoding, we detected a signal that was clearly discernable above background for 25 out of 28 possible two-dimensional combinations. Based on these data, it seems plausible that with additional improvements in flowcytometric detection, multiplex analysis will be possible for most or all potential combinations of fluorochromes even when moving to higher-dimension encoding. Second, the sensitivity of detection of antigen-specific T-cell responses by combinatorial encoding is as high or higher than that of classical MHC multimer staining. Background staining in MHC-based detection of T-cell responses can generally be attributed to interaction of cells with a single fluorescent marker or because of random interaction with all

fluorescent markers used. Thus, by restricting detection to those T cells that interact with a defined combination of two and only two of the fluorochromes used for encoding, such background events are effectively removed. Finally, a potentially serious issue with the use of combinatorial encoding is the fact that T cells are considered highly cross-reactive. As an example, if CMV-specific T cells would show a spurious cross-reactivity with any of the other pMHC complexes used, such T cells would be detected in more than two channels and thereby be excluded from analysis. Notably, for all antigen-specific T-cell responses that we analyzed in parallel by combinatorial encoding and classical MHC multimer staining, there was a full match between the antigen-specific T-cell populations detected by the two assays and the correlation between the assays was high. Thus, when using sets of dozens of unrelated pMHC multimers, a possible cross-reactivity of T cells appears not to be a measurable factor. We note that such cross-reactivity can be expected to become a relevant issue in the case of highthroughput analysis of T-cell responses with sets of pMHC multimers with substantial structural homology, for instance, involving peptide variants.

Prior work in animal models has demonstrated the value of MHC-based detection of T-cell responses using large sets of pMHC multimers by conventional single-channel analysis. Specifically, for all four tested pathogens (H5N1 influenza A, Chlamydia trachomatis, MHV-68 and Toxoplasma gondii<sup>6,15-17</sup>), new epitopes had been identified in screens using 150–2,000 peptides. Notably, if the same screens were to be performed on human PBMCs, this would require approximately 300 ml to 4 l of peripheral blood. However, with the ability to analyze at least 25 antigen specificities per sample, this is reduced to substantially more realistic amounts. As a first demonstration of the potential value of largescale screening of human T-cell responses, we analyzed cytotoxic T-cell responses to potential melanoma-associated antigens. Based on these data, it seems likely that MHC-based detection of T-cell responses will be of substantial value for large-scale screening efforts aimed at the identification of pathogen-, cancer- or autoimmune-associated epitopes. In addition, multiplexed measurement of antigen-specific immune responses could form a useful addition to current analyses of bulk T-cell frequencies in routine human diagnostics.

#### **METHODS**

Methods and any associated references are available in the online version of the paper at http://www.nature.com/naturemethods/.

Note: Supplementary information is available on the Nature Methods website.

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#### AUTHOR CONTRIBUTIONS

S.R.H., A.H.B. and C.J.S. designed research, performed research, analyzed data and wrote the paper; R.S.A. performed research and analyzed data; J.v.V. performed research; P.H. and E.C. provided practical assistance; P.t.S., C.B. and J.B.H. contributed material from individuals with melanoma; M.H.H., designed research and analyzed data; T.N.S., designed research, analyzed data and wrote the paper.

#### COMPETING INTERESTS STATEMENT

The authors declare competing financial interests: details accompany the full-text HTML version of the paper at http://www.nature.com/naturemethods/.

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#### ONLINE METHODS

Generation of pMHC complexes. All peptides were synthesized in-house using standard Fmoc chemistry or purchased from Pepscan (Pepscan Presto BV). The UV light–sensitive building block J was synthesized as described<sup>6-8</sup>. Recombinant HLA-A1, -A2, -A3 and -B7 heavy chains and human  $\beta_2$ m light chain were produced in Escherichia coli. MHC class I refolding reactions were performed as described<sup>18</sup> and MHC class I complexes were purified by gel-filtration high-performance liquid chromatography in PBS (pH 7.4). Specific peptide-MHC complexes were generated by MHC peptide exchange<sup>6–8</sup>. In brief, UV light–sensitive pMHC complexes  $(100 \text{ µg m}^{-1})$  were subjected to 366 nm UV light (Camag) for 1 h in presence of the various peptides (200  $\mu$ M). After exchange, samples were centrifuged at 16,000g for 5 min, and supernatants were used for pMHC multimer formation.

Generation of pMHC multimers. pMHC multimers were generated using eight different fluorescent streptavidin (SA) conjugates (Invitrogen): SA-QD565, SA-QD585, SA-QD605, SA-QD655, SA-QD705, SA-QD800, SA-PE and SA-APC. For each 100 µl of<br>MHC monomer (concentration, 100 µg ml<sup>–1</sup>) 7.08 µl of SA-Qdot<br>conjugate (1 µM), 10.8 µl SA-PF (1 mg ml<sup>–1</sup>) or 6 µl SA-APC conjugate (1  $\mu$ M), 10.8  $\mu$ l SA-PE (1 mg ml<sup>-1</sup>) or 6  $\mu$ l SA-APC  $(1 \text{ mg ml}^{-1})$  was added, followed by incubation on ice for 20 min. Assuming a 100% rescue after MHC peptide exchange, this would result in an occupancy of 30 MHC monomers per SA-Qdot and 4 monomers per SA-PE or SA-APC. To block residual binding sites, p-biotin (Sigma) was added to a final concentration of 26.4 µM, followed by incubation on ice for 20 min. PE- and APC-labeled complexes were diluted twofold in PBS with 0.02% (wt/vol) NaN3. For each pMHC complex, multimers were made with two different fluorescent labels according to the schemes in Supplementary Tables 2–4. For combinatorial T-cell staining, multimer complexes of the same specificity were mixed 1:1 for QD605-, QD655-, QD705-, PE- and APC-labeled complexes and 2:1 for QD565-, QD585- and QD800-labeled complexes in combination with any other color. Combinations of QD565, QD585 and QD800 with each other were excluded. Combined pMHC mixtures for analysis of T-cell responses by combinatorial encoding were generated by pooling and were stored with 0.02% NaN3 (Sigma) at  $4 °C$  as 50-fold concentrated ready-to-use stocks for T-cell staining (concentration was 100  $\mu\mathrm{g\,\,ml^{-1}}$  based on initial monomer concentration). Before use, pMHC multimers were centrifuged at 17,000g for 2 min, and the supernatant was used. Although the stability of pMHC complexes can be expected to differ between individual pMHC complexes, we have successfully used pMHC mixtures stored in this manner for up to 2 months.

PBMC samples and T-cell staining. PBMCs were obtained from healthy individuals and from individuals with stage IV melanoma in accordance with local guidelines, with informed consent and with approval from the local ethics committee (METC). All T-cell staining was performed on cryopreserved material. For T-cell staining of approximately  $1 \times 10^6$  PBMCs or  $2 \times 10^5$  cultured T cells, 2 µl of single pMHC multimer, or 50 µl of dual-colorencoded pMHC collections (final concentration: 2  $\mu$ g ml<sup>-1</sup> per distinct pMHC based on initial monomer concentration) was used. Final staining volume was 80 µl and cells were incubated for 10 min at 37  $^{\circ}$ C. Next, 20 µl of a fivefold concentrated antibody mix consisting of CD8-Alexa700 (Caltag MHCD0829) (final

dilution 1/200), CD4-FITC (BD 345768) (final dilution 1/8), CD14-FITC (BD 345784) (final dilution 1/32), CD19-FITC (BD 345776) (final dilution 1/16), CD40-FITC (Serotech MCA1590F) (final dilution 1/40), CD16-FITC (BD 347523) (final dilution 1/64) was added, and cells were incubated for 20–30 min at 4 °C. Before flow cytometry analysis, cells were washed twice and propidium iodide was added to allow dead-cell exclusion.

Flow cytometry. Data acquisition was performed on an LSR-II flow cytometer (Becton Dickinson) with FacsDiva software using the following 11-color instrument settings. For the 488-nm laser: PI, 685LP, 695/40; PE, 550LP, 575/26; FITC, 505LP, 530/30; SSC, 488/10. For the 633-nm laser: Alexa700, 685LP, 730/45; APC, 660/20. For the 405-nm laser: QD800, 770LP, 800/30; QD705, 680LP, 710/50; QD655, 635LP, 660/40; QD605, 595LP, 650/12. For the 355-nm laser: QD585, 575LP, 585/15; QD565, 545LP: 560/20. Approximately 200,000 lymphocytes were recorded for each analysis. To identify antigen-specific T cells, the following gating strategy was used. (i) Selection of live (PI-negative) singlecell lymphocytes (FSC-W/H low, SSC-W/H low, FSC/SSC-A). (ii) Selection of  $CD8<sup>+</sup>$  and 'dump' (CD4, 14, 16, 19 and 40) negative cells. FITC was used as a 'dump channel' to gate away all irrelevant cells, as a means to reduce background<sup>19</sup>. (iii) Selection of CD8+ T cells that were positive in two MHC multimer channels and negative in the six other MHC multimer channels. Each cell population positive in two and only two MHC multimer channels received a unique color to facilitate analysis.

IFN<sub>7</sub> enzyme-linked immunosorbent spot assay. We coated 96-well nitrocellulose plates (Multiscreen MAIP N45; Millipore) with 7.5  $\mu$ g ml<sup>-1</sup> mouse monoclonal antibody to IFN $\gamma$  (1-D1k; Mabtech) in 75 µl PBS overnight at room temperature. After six washes and blocking with 200 µl X-Vivo medium (Biowhittaker), lymphocytes were added in three concentrations:  $1 \times 10^6$ ,  $5 \times 10^5$ and  $2.5 \times 10^5$  cells per well, together with indicated peptide (5  $\mu$ g ml<sup>-1</sup>). After overnight incubation, plates were washed and biotinylated secondary monoclonal antibody to IFN<sub>7</sub> was added (7-B6-biotin; Mabtech). After a 2-h incubation, plates were washed and avidin-enzyme conjugate (Life Technologies) was added to each well. After 1 h of incubation at room temperature, plates were washed and enzyme substrate (Dako) was added for 5–10 min. Reactions were terminated by addition of water, and the number of spots was assessed using an ELISPOT counter (Immunospot; CTL Inc.).

Enrichment of antigen-specific T cells. Antigen-specific T cells were stained with PE multimers (1.25  $\mu$ l of a 100  $\mu$ g ml<sup>-1</sup> stock of each individual PE-multimer for  $10^7$  PBMCs) for 1 h at 4 °C. Subsequently, cells were washed, and incubated with 20 µl magnetic beads coated with antibody to PE (Miltenyi). Cells were then isolated by MACS (Miltenyi), using an LS column, following the manufacturer's protocol. Eluted cells were washed and resuspended in 200 µl of T cell medium (IMDM (Gibco) with 10% human serum (Invitrogen), 100 IU ml<sup>-1</sup> IL-2 (Proleukin) and 20 ng ml–1 IL-15 (Peprotech)) with 5,000 anti-CD3/CD28–coated Dynabeads (Invitrogen). Enriched cells were cultured in 96-well plates and resuspended the next day. Cultures were split and medium was refreshed at least twice a week. Note that residual PE-multimer staining from the enrichment step disappears

within two days of culture (data not shown). After 2–3 weeks, antigen-specific T-cell responses were measured by combinatorial encoding-based MHC multimer flow cytometry.

T-cell sorting and culture. T cells were stained with the relevant pMHC multimer and then sorted on a MoFlo (Dako) or FACSAria (Becton Dickinson) into 10<sup>5</sup> irradiated feeder cells (JY plus allogeneic PBMCs). Cells were spun and resuspended in IMDM with 10% human serum, 100 IU ml<sup>-1</sup> IL-2 and 0.5  $\mu$ g ml<sup>-1</sup> PHA (Biochrom AG). Cultures were restimulated every second week. Established cultures were tested for antigen-specificity by MHC multimer staining.

Cytokine release assay. T2-A3 cells were loaded with the indicated peptides for 1 h and washed once. Then,  $1 \times 10^5$  T cells from indicated cultures were incubated with  $1 \times 10^5$  T2-A3 cells for 4 h at 37 °C in IMDM with 10% human serum and protein transport inhibitor (BD GolgiPlug). Cells were stained with PE-conjugated antibodies to CD8 (clone SK1, BD) for 15 min at 25  $^{\circ}$ C, fixed

and permeabilized (BD Cytofix/Cytoperm kit), and stained with APC-conjugated antibodies to IFN $\gamma$  (25723.11, BD) for 30 min at APC-conjugated antibodies to IFN $\gamma$  (25723.11, BD) for 30 min at 4 °C. Samples were analyzed by flow cytometry (Cyan, Dako), data analysis was performed using FlowJo.

Statistics. The three different staining approaches: (i) one single staining with the mix of 25 dual-color–encoded viral and cancer epitope pMHC multimers, (ii) 25 separate stainings with all 25 PE-labeled pMHC multimers or (iii) 25 separate stainings with all individual dual-color–encoded pMHC multimers were compared to determine the interclass correlation, using a two-way mixed model (ICC3.1), calculated based on consistency. Interpretation of the results is based on reference 9.

<sup>18.</sup> Garboczi, D.N., Hung, D.T. & Wiley, D.C. HLA-A2–peptide complexes: refolding and crystallization of molecules expressed in Escherichia coli and complexed with single antigenic peptides. Proc. Natl. Acad. Sci. USA 89, 3429-3433 (1992).

<sup>19.</sup> van Oijen, M. et al. On the role of melanoma-specific CD8+ T-cell immunity in disease progression of advanced-stage melanoma patients. Clin. Cancer Res. 10, 4754–4760 (2004).

## **SUPPLEMENTARY INFORMATION**

### **Supplementary Figure 1**

Detection of antigen-specific T cells using MHC multimers coupled to different fluorochromes



pMHC-multimers

Staining of a clonal HLA-A2 CMV<sub>NLV</sub>-specific T cell population mixed with an excess of HLA-A2-negative PBMCs using MHC multimers conjugated to eight different fluorochromes: PE, APC, QD565, QD585, QD605, QD655, QD705 and QD800. Dot plots are gated on live, single-cell lymphocytes.



(a-c) Dot plots showing all 28 different 2-D representations of gated CD8+ T cells of three healthy donors analyzed by dual-color encoded MHC multimer staining using the peptide set described in Supplementary Table 2 online. (a) Donor 1. (b) Donor 2. (c) Donor 3. (d) Representative example of staining of PBMCs from a healthy donor analyzed by dual-color encoded MHC multimer staining using irrelevant peptide-MHC multimers. (e) Dot plots for healthy donor 2 gated on all lymphocytes.









Feasibility of 3D pMHC multimer staining



CMV<sub>NIV</sub>-specific T cells are stained with a combination of QD605, QD655 and QD705 labeled  $CMV<sub>NIV</sub>$ -MHC multimers. (a) The parameters QD605, QD655 and QD705, with the triple positive cells in white. (b) The parameters PE, APC and QD655 of the same sample. No triple positive cells were detected using this combination. 3D dot plots were made using FlowJo v7.5 (beta version).

### **aHLA-A2 Inf<sub>ou</sub>**  $\mathbf{A}^{\circ}$  **<b>HLA-A2 CMV**<sub>wy</sub>  $\mathbf{A}^{\circ}$  **HLA-A2 EBV**<sub>010</sub> Δ° **HLA-Q605 pHLA-Q605 pHLA-PE pHLA-PE pHLA-QD655 pHLA-QD655 pHLA-QD605** °c 18 مي.<br>س  $\overline{2A}$  $28$  $\overline{2}$  $-1.981$ **CCR7** ø. 6A **CD62L CD57**

### **Supplementary Figure 4**

Phenotypic characterization of virus-specific T cells detected by combinatorial encoding

 $(a-c)$  dot plots from three healthy donors gated on approximately 200,000 CD8<sup>+</sup> T cells after exclusion of 'triple' or 'single' pMHC multimer positive T cells. (**top row**) PBMCs were stained with pMHC–multimer complexes for HLA–A2 Inf<sub>GIL</sub> (QD605 + QD655, blue), HLA–A2 CMV<sub>NLV</sub> (PE + QD655, green), and HLA–A2 EBV<sub>GLC</sub> (PE + QD605, red). (**middle row**) Phenotypic characteristics of virus-specific T cells based on CD45RA and CCR7 expression: a density plot gated on CD8<sup>+</sup> T cells used to define quadrant gates (left), a dot plot showing all CD8<sup>+</sup> T cells with pMHC positive T cells depicted in the indicated colors (middle), and a dot plot showing only pMHC positive T cells (right). (**bottom row**) Phenotypic characteristics of virus-specific T cells based on CD62L and CD57 expression: a density plot gated on CD8+ T cells used to define quadrant gates (left), a dot plot showing all CD8+ T cells with pMHC positive T cells depicted in the indicated colors (middle), and a dot plot showing only pMHC We can also the positive T cells used to define<br>
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Phenotypic characterization of virus-specific T cells detected by combinatorial encoding



The 28 unique color combinations that can be made using a two-dimensional matrix of eight fluorochromes



Virus-derived and cancer-associated T cell epitopes



For each epitope MHC multimers were encoded by the indicated fluorochrome combination

Melanoma–associated HLA–A3 ligands



Three EBV- and influenza A-derived epitopes were included for direct ex-vivo stainings as a positive control. Sequences in bold are previously described T cell epitopes. Individual pMHC multimers were encoded by the indicated fluorochrome combination.

HIV– and HCV–derived HLA–A3 restricted T cell epitopes



Three EBV- and influenza A-derived epitopes were included for direct ex-vivo stainings as a positive control. Individual pMHC multimers were encoded by the indicated fluorochrome combination.