



TCR fingerprinting and off-target peptide identification

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Background

Adoptive T cell therapy using patient T cells redirected to recognize tumor-specific antigens by expressing genetically engineered high-affinity T-cell receptors (TCRs) has therapeutic potential for melanoma and other solid tumors. Clinical trials implementing genetically modified TCRs in melanoma patients have raised concerns regarding off-target toxicities resulting in lethal destruction of healthy tissue, highlighting the urgency of assessing which off-target peptides can be recognized by a TCR.

Methods

As a model system we used the clinically efficacious NY-ESO-1-specific TCR C259, which recognizes the peptide epitope SLLMWITQC presented by HLA-A*02:01. We investigated which amino acids at each position enable a TCR interaction boothers by sequentially replacing every amino acid position outside of anchor positions 2 and 9 with all 19 possible alternative amino acids, resulting in 134 peptides (133 altered peptides plus epitope peptide). Each peptide was individually evaluated 100 100 using three different in vitro assays: binding of the NY-ESOc259 TCR to the peptide, peptide-dependent activation of Normalized binding (%) Normalized activation (%) Normalized binding (% TCR-expressing cells, and killing of peptide-presenting target cells. To represent the TCR recognition kernel, we defined Position Weight Matrices (PWMs) for each assay by assigning normalized measurements to each of the 20 amino acids in vielded a strong linear relationship indicating a strong dependence between T cell activation level and killing efficiency. each position. To predict potential off-target peptides, we applied a novel algorithm projecting the PWM-defined kernel mparing binding with activation and killing assays resulted in a less linear relationship, and in many cases at least 75% binding efficiency is required to trigger T cell activation and killing mechanisms. into the human proteome, scoring NY-ESOc259 TCR recognition of 336,921 predicted human HLA-A*02:01 binding 9-mer peptides.

Results

Of the 12 peptides with high predicted score, we confirmed 7 (including NY-ESO-1 antigen SLLMWITQC) strongly activate human primary NY-ESOc259-expressing T cells. These off-target peptides include peptides with up to 7 amino acid changes (of 9 possible), which could not be predicted using the recognition motif as determined by alanine scans.

Figure 1. The NY–ESO peptide



The NY-ESO-1-derived SLLMWITQC peptide in complex with HLA-A*02:01.

Figure 2. Experimental validation of TCR NY-ESOc259 specificity



(D) Receiver operating characteristic (ROC) curve showing the performance of linear classifier to discriminate between (A) An overview of the assays used for TCR specificity assessment analyzing binding of the TCR to the peptide-MHC complex on antigen-presenting (A) Position Weight Matrices (PWMs) are constructed by assigning a normalized experimental value to each of the 20 amino acids (rows) at each activating(>75% normalized activation) and non-activating($\leq 75\%$ normalized activation) peptides based on TCR recognition 2 cells, activation of TCR-expressing cells by co-culturing with T2 cells and final killing of the target T2 cells. (B) The effect of amino acid substitution of the peptide-MHC score parameter. in the epitope peptide on TCR binding/activation/killing. Blue dots depict the average signal of at least two independent experimental replicates complex. (B) Scoring 336,921 HLA*A02:01 determined by (binding n=3, activation n=3, killing n=2). software package netMHCpan v3.0 and defined as IC50 score <= 500 nM.

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Figure 3. Pairwise comparisons of the normalized experimental values among the three Figure 5. Validation of NY-ESOc259 TCR predicted peptides in primary T cells and AK-D10R3 cells assays





Figure 4. Predicting TCR NY–ESOc259 cross–reactive antigens

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(A) An overview of the peptides selected for validation in primary T cells. An edit (Hamming) distance, the minimum number of operations required to transform a peptide sequence into an epitope peptide sequence (SLLMWITQC), is depicted. HLA binding affinity (IC50, nM) was predicted by the netMHCpan v3.0 software package. The TCR recognition score integrates the three assays.

(B) Experimental validation of the predicted peptides in primary T cell activation assay. Peptide pulsed T2 cells were co-cultured with effector T cells expressing TCR NY-ESOc259 and T cell activation was measured by quantifying the percentage of CD25 positive cells. Background noise was subtracted from activation measurements and individual values were normalized to the epitope peptide signal.

(C) Tested peptides: 1) 65 peptides with intermediate TCR recognition scores tested without replicates in AKD10R3 cells and 2) 20 peptides with high and low recognitionscores tested in primary T cells, were separated in two groups based on 75% activating threshold (left panel). Among the peptides with high predicted score (right panel), activating peptides (>75%) on average had a higher predicted score (0.923) than non-activating (0.896) peptides.

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(E) The distribution of TCR recognition scores (x-axis) and HLA-affinity binding values (IC50, nM) (y-axis) for all human 9-mer peptides (10,470,365). A vertical dashed line is an estimated cutoff of 0.905 for TCR recognition score separating activating peptides from non-activating peptides. A horizontal dashed line depicts the IC50 value of 500 nM separating peptides with high binding affinity to HLA*A02:01 from peptides with low binding affinity.

Figure 6. Estimating biological relevance of NY–ESOc259 TCR activating peptides



We computationally predicted and experimentally validated seven peptide sequences (including NY-ESO-1 antigen SLLMWITQC) capable of activating T cells through interaction with NY–ESO^{c259} TCR. These peptides, if naturally processed and presented on MHC molecules in normal human tissues, could potentially cause off-target effects in NY-ESO^{c259} TCR based adoptive cell therapies. To verify whether the predicted peptides are indeed presented and constitute a realistic off-target risk, we explored the publicly available gene expression and immunological data.

The expression values of the peptides are obtained from the associated genes. RNA levels in 37 tissues are depicted based on RNA-seq. Expression values are shown in Transcripts Per Million (TPM) units.

Conclusions

This replacement scan assay determines the "TCR fingerprint" and, when coupled with the algorithm applied to the database of human 9-mer peptides binding to HLA-A*02:01, enables identification of potential off-target antigens and the tissues where they are expressed. This platform enables both screening of multiple TCRs to identify the best candidate for clinical development and identification of TCR-specific cross-reactive peptide recognition and constitutes an improved methodology for the identification of potential off-target peptides presented on MHC class I molecules. We have used this platform to screen multiple tumor-targeting TCRs. We continue to improve the platform, including enhancements to the algorithm and internal reference mass-spectrometry HLA ligandome datasets.

For references, see original manuscript at https://agenusbio.com/tcr-fingerprint-manuscript/ Ligandomics: http://agenusbio.com/wp-content/uploads/2018/11/SITC_CRCPSV_Poster_PTM_version3.pdf



Acknowledgments

We thank Agenus' peptide synthesis unit, Sébastien Lalevée, Julien Sahiri and Achim Klein for establishing a protocol for "in vitro transcription", and Sébastien Lalevée for generation of the NY-ESOc259 expression-construct and for helpful discussion throughout the studies. Design: Carlos Barrientos

Disclosures

All authors are current or former employees of Agenus Inc. Lexington MA, USA or subsidiaries thereof (including AgenTus Therapeutics, Inc. and subsidiaries thereof).

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