Spliced peptides and cytokine driven changes in the 1 immunopeptidome of melanoma 2 3 Pouya Faridi^{1,9}, Katherine Woods^{2,3,9}, Simone Ostrouska^{2,3}, Cyril Deceneux^{2,3}, 4 Ritchlynn Aranha¹, Divva Duscharla¹, Stephen O, Wong^{4,5}, Weisan Chen⁶, Sri 5 Ramarathinam¹, Terry C.C. Lim Kam Sian¹, Nathan P. Croft¹, Chen Li^{1,7}, Rochelle 6 Ayala¹, Jonathan Cebon^{2,3}, Anthony W. Purcell^{1*}, Ralf B. Schittenhelm^{1,8*}, Andreas 7 Behren^{2,3*} 8 9 ¹Department of Biochemistry and Molecular Biology and Infection and Immunity 10 Program, Monash Biomedicine Discovery Institute, Monash University, Clayton,

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5 Running title: Spliced and linear HLA-I peptides in melanoma.

6

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8 Post-translational splicing, Melanoma, Antigen processing, IFND, Inflammation,

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- 10

11 Summary

12 Antigen-recognition by $CD8^+$ T cells is governed by the pool of peptide antigens 13 presented on the cell surface in the context of HLA class I complexes. Recent studies 14 have shown not only a high degree of plasticity in the immunopeptidome, but also that 15 a considerable fraction of all presented peptides is generated through proteasome-16 mediated splicing of non-contiguous regions of proteins to form novel peptide 17 antigens. Here we used high-resolution mass-spectrometry combined with new 18 bioinformatic approaches to characterize the immunopeptidome of melanoma cells in 19 the presence or absence of interferon- γ . In total, we identified more than 60,000 20 peptides from a single patient derived cell line (LM-MEL-44) and demonstrated that 21 interferon- γ induced marked changes in the peptidome with an overlap of only ~50% 22 between basal and treated cells. Around 6-8% of the peptides were identified as *cis*-23 spliced peptides, and 2213 peptides (1827 linear, 386 cis-spliced peptides) were 24 derived from known melanoma-associated antigens. These peptide antigens were 25 equally distributed between the constitutive and interferon- γ induced peptidome. We

1	next examined additional HLA-matched patient derived cell lines to investigate how
2	frequently these peptides were identified and found that a high proportion of both
3	linear and spliced peptides were conserved between individual patient tumors,
4	drawing on data amassing to over 100,000 peptide sequences from these extended
5	data sets. Moreover, several of these peptides showed in vitro immunogenicity across
6	multiple melanoma patients. These observations highlight the breadth and complexity
7	of the repertoire of immunogenic peptides that can be exploited therapeutically and
8	suggest that spliced peptides are a major new class of tumor antigens.
0	

1 Introduction:

2 Antigen recognition by cytotoxic T cells and subsequent tumor cell destruction is the 3 key component underlying cancer immunotherapy strategies. Its importance has been 4 widely demonstrated, and loss-of-function of elements in the antigen processing and 5 presentation pathways has been shown to confer therapeutic resistance(1). Correlative 6 findings point to neo-antigens arising from tumor mutations as an important source of 7 immunogenic antigens in the context of melanoma and other cancers(2). Nonetheless, 8 tumors with low mutational burdens can respond to checkpoint inhibitor therapy, and 9 the presence of a high tumor-mutational load does not necessarily correspond to the 10 efficacy of treatment(3). The human leukocyte antigen (HLA) class I-bound peptides 11 (*p*-HLA-I) arising from the mutant proteins are mostly heterogeneously expressed and 12 additionally determined by the patient-specific HLA-subtypes, making predictions 13 about their presentation and immunogenicity unreliable. While a number of recent 14 studies have reported the utility of mass spectrometry combined with exome 15 sequencing in identifying HLA-presented peptides derived from mutated proteins(4-16 6), the analysis of the contribution of mutational neoantigens to the overall tumor 17 immunogenicity remains complicated and unresolved.

18 Against this background, the composition of the immunopeptidome, or the repertoire 19 of HLA-bound peptides presented on the surface of the cell and their contribution to 20 tumor immune recognition, becomes significant. The immunopeptidome is largely 21 shaped by antigen processing through the proteasome complex for subsequent 22 presentation of short peptide epitopes on MHC molecules(7). Several forms of the 23 proteasome complex exist, each with differing enzymatic activities(8). In melanoma 24 cells, the constitutive proteasome is expressed under steady state conditions. The 25 expression of an immunoproteasome, the subtype expressed by dendritic cells and

1 other cells of the immune system, may be induced in tumor cells in a cytokine-2 dependant manner (9), leading ultimately to changes in the peptides presented to the 3 immune system(10,11). We have previously demonstrated induction of the 4 immunoproteasome in a range of human melanoma cell lines in the presence of the 5 inflammatory cytokine IFN \square in vitro, and in melanoma patient inflamed tumors 6 (characterized by presence of tumor infiltrating lymphocytes (TILs)) ex vivo(12). 7 Dependant on the proteasome subtype expressed by the cell, we have shown that a 8 single melanoma antigen (NY-ESO-1) can be processed into several different 9 epitopes. These differences in antigen processing led to concomitant change in the 10 ability of antigen specific T cells to target the tumor cell. Thus, the potential for a 11 tumor cell to 'look' substantially different to CD8⁺ T cells, depending on 12 inflammation at the tumor site, arises. Moreover, recent studies by ourselves and 13 others(13,14) have shown that a significant proportion of p-HLA-I are not 14 genomically templated and result from post-translational proteasome splicing (ligation 15 of non-contiguous small polypeptide segments from the same or different proteins). 16 To date, these peptides have been missed in most neoantigen discovery studies due to 17 the lack of appropriate bioinformatics tools(15,16).

18 In this study we have used high resolution mass spectrometry approaches combined 19 with a novel bioinformatics workflow to identify linear and spliced p-HLA-I 20 presented in the melanoma immunopeptidome in the presence or absence of the 21 cytokine IFNy. These included a number of linear and *cis*-spliced peptides derived 22 from melanoma-associated antigens. A series of identified linear and cis-spliced 23 peptides were tested for *in vitro* immunogenicity across multiple melanoma patients 24 and healthy donors. While the peptide repertoire changed significantly, 25 immunogenicity of selected peptide pools from different treatment conditions (+/-

IFNγ) *in vitro* did not change across melanoma patients. However, T lymphocyte responses to pools of IFNγ upregulated peptides were not seen in healthy donors. We also demonstrate that *cis*-spliced peptides were widely presented by melanoma cells and immunogenic in multiple donors. These findings have significant implications for cancer immunotherapy as well as for fundamental questions such as induction of immune-tolerance, T cell repertoires and immune recognition.

1 **Results:**

2 The melanoma immunopeptidome is composed of linear and spliced peptides

3 We have established a comprehensive repository of HLA class I peptide ligands 4 presented by a patient derived melanoma cell line (LM-MEL-44) utilizing either the 5 constitutive proteasome (-IFN- γ) or the immunoproteasome (+IFN- γ). Using three 6 biological replicates for each condition, we identified around 60,000 peptides 7 presented across all HLA class I allotypes expressed by LM-MEL-44 cells (Table S1). 8 Approximately 6-8% of the peptides in each sample were conservatively assigned as cis-spliced in origin (Fig. 1A, Table S1), being derived from non-contiguous 9 10 sequences of the same protein. This proportion of peptides of *cis*-spliced origin is in 11 agreement with previous studies (14,17,18). As expected for HLA class I epitopes, the 12 majority of peptides were 9 amino acids in length with no apparent difference 13 between linear and *cis*-spliced sequences (Fig.1B).

14 Using NetMHC 4.0 binding prediction algorithm, more than 80% of the linear 15 peptides were assigned to at least one of the HLA class I alleles expressed on the 16 surface of the LM-MEL-44 cells (HLA-A*02:01, B*40:01/*44:02, 17 C*03:04/*05:01 (19) suggesting that the majority of the identified peptide sequences 18 can be considered genuine HLA class I ligands (Fig. 1C, Table S2). The percentage of 19 cis-spliced peptides predicted to bind to HLA-A or HLA-C molecules was found to be 20 comparable to linear epitopes, but intriguingly substantially fewer *cis*-spliced peptides 21 were predicted to bind to HLA-B*40:01 and HLA-B*44:02, suggesting that LM-22 MEL-44 cells generate a lower number of *cis*-spliced peptides that conform to the 23 consensus-binding motif of these HLA-B allotypes (Fig. 1C). Moreover, a 24 significantly higher percentage of unassigned sequences was observed amongst the 25 *cis*-spliced epitopes, which is in agreement with previous reports (13,14) and which 1 can be attributed to the fact that binding algorithms such as NetMHC 4.0 are

2 exclusively trained on linear peptide sequences.

In addition, it should be noted that we did not identify in our entire dataset any of the mutational neoantigens that have been described for the LM-MEL-44 cell line based on exome sequencing data (20). However, this is not surprising as this cell line has a relatively low mutational load (Table S3).

7

8 The generation of spliced peptides is not a random process

9 To address whether spliced peptides are randomly generated, we comparatively 10 analyzed the overlap of both linear and spliced peptides across our three biological 11 replicates. A total of 1399 and 1795 *cis*-spliced peptides were identified in at least two 12 13 corresponds to 47.6% and 52.2%, respectively (Fig. 2A). Importantly, a similar 14 overlap was observed for the linear epitopes (48.8% and 53.9%, respectively), which 15 suggests that the generation of *cis*-spliced peptides is not a random process. Of note, 16 the comparatively low overlap between the replicates can be rather attributed to the 17 stochastic nature of data-dependent acquisition mass spectrometry (DDA-MS), which 18 is particularly pronounced when acquiring highly complex samples that contain 19 individual analytes of low abundance (such as HLA peptide samples).

To investigate whether the identified *cis*-spliced peptides are also expressed on other cell lines with a similar HLA signature, we analysed the cell lines LM-MEL-53 and LM-MEL-33 by DDA-MS. LM-MEL-53 cells are derived from the same patient as LM-MEL-44 cells, but from another metastasis at a different point in time (21). In contrast, LM-MEL-33 (HLA-A*02:01/A*03:01, B*40:02/*47, C*03:04/*06:02) cells have been isolated from a different patient that shares three HLA alleles with LM- MEL-44 (21). 47% and 28% of the identified *cis*-spliced peptides from LM-MEL-44 were also identified on LM-MEL-53 and LM-MEL-33 cells, respectively (Fig. 2B, Table S1), which further confirms that the generation of *cis*-spliced peptides is not a random process, but more importantly, that *cis*-spliced peptides have a significant potential for cancer immunotherapy.

6

7 IFNy-treatment alters melanoma HLA class I immunopeptidome

8 Considering the well-described clinical relevance of so called "hot" versus "cold" 9 tumor microenvironments and previous work demonstrating the influence of cytokine 10 exposure on antigen-presentation pathways (10), we wanted to examine the impact of 11 IFN γ exposure on the immunopeptidome. IFN γ treatment led to the identification of a 12 considerably higher number of HLA epitopes than that from untreated cells, 13 consistent with the upregulation of HLA molecules at the cell surface (Fig. 3A, Fig. 14 S1) (10). Moreover, for common peptides we observed, on average, an increase in 15 peptide abundance in the cytokine treated samples. Of note, only 44.7% of the linear 16 and 52.5% of the spliced peptides were identified under both conditions suggesting 17 that the addition of IFN significantly impacts the composition of the 18 immunopeptidome.

To understand whether IFN γ exposure changes the abundance of individual epitopes independent of the HLA expression levels, we identified epitopes that were present across all replicates (a total of 4942 peptides) and calculated their log2 fold change between IFN \Box treated and untreated samples after median normalization of their ms1 intensities to remove any bias introduced through varying levels of IFN γ -induced HLA expression (Fig. 3B, Table S1). A considerable number of epitopes changed in abundance by a factor of at least 2 (both up- and down), confirming that the addition of IFN□ substantially alters HLA class I presentation, while not affecting the
proportion of presented *cis*-spliced epitopes on LM-MEL-44 melanoma cells.
Interestingly and despite median-normalized ms1 intensities, most of the peptides
predicted to bind to HLA-B*40:01 and HLA-B*44:02 were still upregulated upon
IFN□ exposure, which correlates to the enhanced upregulation of HLA-B molecules
in response to IFN□ compared to HLA-A and HLA-C molecules (10).

7

8 *Identification of novel cancer specific peptides in the melanoma immunopeptidome*

9 Next we screened a panel of identified peptides including sequences from 10 melanoma/cancer-associated antigens (MAA) (22,23) and tumor antigens with 11 demonstrated immunogenicity(24-26). We identified a total of 2213 peptides in our 12 dataset (1827 linear, 386 spliced peptides) derived from 142 different MAAs (Fig. 4A, 13 Table S4). A large proportion (\sim 45%) of linear peptides have not been previously 14 reported (Fig. 4B) (24). Furthermore, almost all of those peptides generated by 15 splicing constitute potentially novel epitopes. Of the previously reported epitopes, the 16 majority were detected in both the presence and absence of IFN \Box , whereas >58% of 17 novel peptides were exclusive to IFN [] treated samples, demonstrating the importance 18 of carefully considering experimental conditions for epitope discovery (Fig. 4C).

19

20 Melanoma patients expressing immunoproteasome genes have a survival advantage

Tumor recognition *in vivo* relies on the processing and generation of cognate peptides within the tumor cells. Using OncoLnc(27), we mined gene-expression data generated by the TCGA Research Network (http://cancergenome.nih.gov/) for correlation of both immuno- and constitutive- proteasome-specific genes with survival in melanoma patients. We found that expression of all three immunoproteasome-specific subunits

was significantly associated with survival in melanoma patients. Conversely,
 constitutive proteasome-specific subunits were associated with decreased melanoma
 patient survival (Fig. S2).

4 Since immunoproteasome subunits are also expressed by immune cells, including 5 intra-tumoral T cells that are themselves associated with better prognosis, we removed 6 the top quartile of samples with the highest CD3 expression. Following removal of 7 these samples, we found that a significant survival benefit, associated with 2/38 immunoproteasome subunits, was maintained (Fig. 5). Furthermore, presence of the 3 9 constitutive proteasome subunits was associated with a trend towards decreased 10 survival. This indicates that patients whose tumors express an immunoproteasome 11 have survival benefit which is specifically associated with this proteasome type. This 12 effect persists, albeit to a lesser extent, when we removed to tumors that showed the 13 highest CD45 infiltration, thus including non T cell lineage immune cells and APCs 14 (Fig. 5). As immunoproteasome expression in tumors is largely driven by cytokine 15 exposure it remains unclear if this is merely a footprint of a (previous) successful 16 immune recognition or if it is part of the pre-conditions to allow for such an immune 17 response.

18

19 *CD8⁺ T lymphocytes frequently recognized novel linear melanoma-specific epitopes*

In this study we identified several novel linear melanoma-specific peptides predicted to be bind the HLA-allotypes presented by a tumor-derived melanoma cell line (HLA-A*02:01, B*40:01/*44:02, C*03:04/*05:01). Importantly, this included HLA-A*02:01, one of the most prevalent HLA-types, and therefore a common target for peptide identification and therapeutic focus. We addressed functional immunogenicity of a selection of these peptides, by using them to stimulate CD8⁺ T lymphocytes in

1 PBMC derived from healthy donors or melanoma patients (Fig.6, Table S5). In doing 2 these studies, selected donors were matched for at least two HLA-allotypes, (across 3 HLA-A/B/C) and 3 melanoma patients were matched across all three. Of note, the 4 LM-MEL-44 cell line was derived from melanoma patient 2 and, melanoma patient 6 5 shares none of the HLA alleles from this cell line, serving as a negative control. 6 Alongside these assays using melanoma antigen-derived peptides, we also assessed 7 differences in functional immunogenicity of immuno- or constitutive- proteasome 8 processed epitopes. This was done by pooling a selection of those peptides which 9 were most strongly up- or down- regulated following IFN \Box treatment (Fig. 6A and B, 10 Table S5). We found that though also observed in healthy donors, $CD8^+$ T 11 lymphocyte responses to the tested peptides were more frequently seen in melanoma 12 patients (Fig. 6A (individual) and 6B (combined donors)). Novel peptides derived 13 from 15 of the melanoma antigens identified in our screen stimulated specific CD8⁺ T 14 lymphocyte responses (over 2% TNF α^+ cells) in three or more donors, demonstrating 15 novel, functional, melanoma T cell epitopes (Fig. 6A, Table S5, S6, representative 16 examples, Fig. S3A). Of those where a clear HLA-binding prediction could be 17 determined, 54.5% (n=6) were predicted to bind to HLA-A*02:01, 36.4% (n=4) to 18 HLA-B*44:02, and 9.1% (n=1) to HLA-C*05:01. The strongest responses were 19 induced by the peptides derived from SART1 (U4/U6.U5 tri-snRNP-associated 20 protein 1) and PGK1 (Phosphoglycerate kinase 1), both of which stimulated responses 21 in 2-7% of T lymphocytes from 4 melanoma patients. Both of these peptides were 22 predicted to bind to HLA-A*02:01. When a selection of peptides were pooled in 23 groups of those up/down regulated or unchanged following IFN treatment, no 24 appreciable difference in functional immunogenicity in melanoma patients was 25 observed between groups. One pool in each group was made on the basis of higher in

- 1 *silico*-predicted immunogenicity (www.iedb.org(28), Fig. 6A,B, asterisks). However,
- 2 these groups did not display enhanced ability to activate CD8⁺ T lymphocytes in
- 3 either melanoma patients or healthy donors.
- 4
- 5

6 Spliced peptides are immunogenic across patients and represent novel targets for
7 immunotherapy

8 The potential implications of the presence of spliced peptides for all facets of 9 immunity have sparked intense discussions in the last 4 years(14,29-31). In cancer, 10 their presence would dramatically widen the repertoire of potentially targetable 11 epitopes and may allow for many more tumor-specific antigens (including mutational 12 derived neoantigens) being presented in various HLA-contexts(16). So far only 6 13 immunogenic *cis*-spliced HLA-I bound peptides derived from 4 different proteins(29) 14 have been described and most of them have been discovered by T cell assays rather 15 than by mass spectrometry (32-37). To test some of the identified spliced peptides for 16 their ability to activate CD8⁺ T cells *in-vitro* we synthesized 26 *cis*-spliced peptides 17 based on (i) their de novo sequencing confidence score, (ii) their binding prediction 18 score for HLA alleles expressed on LM-MEL-44 cells (HLA-A*02:01, HLA-19 B*40:01, HLA-B*44:02 or HLA-C*05:01) and (iii) the quality of their peptide 20 spectrum matches (PSMs). When employed as pools of 8-9 individual peptides, all 3 21 pools evoked immune-responses as measured by intracellular TNF α production in 22 CD8⁺ T cells (Fig. 7A and peptide sequences listed in Fig. 7B) in multiple melanoma 23 patient and healthy donor derived PBMCs (example shown in Fig. S3B).

Given the differences in the potential to stimulate HLA-A2 positive vs. negative patient and healthy donor samples, most of the immunogenic peptides derived from

1 Pools I and III in our assays seem to be HLA-A2 associated. To identify specific 2 immunogenic peptides, PBMCs were stimulated with the listed peptide pools (Fig. 3 7B) for 10-12 days followed by single peptide re-stimulation. Six out of 26 peptides 4 induced a TNF- α response above DMSO background (Fig. 7C) in more than one 5 patient sample. Of note, the peptide demonstrating the highest immunogenicity (1832, 6 shown as example in Fig. S3C) based on these assays is a spliced peptide derived 7 from the cancer-testis antigen MAGE-C2 (LILGLLTKV) and showed CD8⁺ T cell 8 activation across all 4 patients. Matched mixed effect analysis showed significant 9 differences across peptides and peptide 1832 and FEC represented the treatments with 10 significant differences to DMSO. However, the other shown peptides displayed higher 11 immunogenic potential when compared to their respective DMSO control, but with 12 very high patient-to-patient variability, as expected in these types of data, 13 Interestingly, peptide 1832 was identified across all replicates of LM-MEL-44, -33 14 and -53 (Table S6). All spliced peptides that tested positive for immunogenicity in our 15 assays were subjected to T2 peptide binding assays to examine HLA-A2 binding. As 16 shown in Fig. S4, these peptides all stabilize HLA-A2, albeit to a lesser extent than 17 the well described modified ELAGIGILTV HLA-A2 peptide (aa26-35) from the 18 melanoma antigen Melan-A(38) with some just showing minor stabilization.

Of note, we did not find any particular pattern in the length of the *N*- and *C*-terminal segments of these spliced peptides nor in the distance between these segments on the protein level (Fig. S5). Taken together, these data show that these spliced peptides can serve as *bona fide* anti-cancer targets and provide a large number of additional targets would have not been considered using previous MS-based epitope discovery strategies.

25

1 **Discussion:**

2 In this study we have described a detailed and in-depth immunopeptidome presented 3 on a patient-derived melanoma cell line (LM-MEL-44) generated from a lymph node 4 metastasis. Our qualitative assessment of the immunopeptidome yielded around 5 60,000 high confidence peptide identifications that encompassed two culture 6 conditions (+/- IFN γ) to gain insights into the influence of differences in the 7 microenvironment of the cells on the global immunopeptidome. Furthermore, we 8 demonstrated consistence of over 50% of these peptides with a temporally distinct 9 autologous tumor sample, and 37% with a tumor from a different donor. The well-10 described effect of IFN \square in mediating changes to the composition of the antigen 11 processing machinery, coupled with reports of differences in antigen processing 12 between the constitutive and the immunoproteasome, led us to expect a degree of 13 difference between the two immunopeptidomes. Nevertheless, our observation that 14 ~55% of linear and 47% of spliced HLA class I epitopes were exclusive to either 15 IFNy treated or untreated conditions, was striking. Our observations are also 16 consistent with recent studies in ovarian and lung cancer(10,11) that demonstrated 17 profound changes between cytokine treatment conditions.

18 To have a closer look at the "tumor-specific" immunopeptidome landscape, we 19 focussed on MAA-derived peptides. More than 50% of novel peptides that we 20 identified were exclusively presented in the presence of IFN^{\[]}. Interestingly, of the 21 MAA epitopes that have been previously described in other studies, only 27.7% were 22 present uniquely in IFN γ treated conditions (Fig. 4C). This observation suggests that 23 many immunoproteasome processed epitopes may be as yet undescribed, since 24 traditional approaches to identify tumor associated antigens have largely been 25 undertaken using cells lines under steady state conditions (*i.e.* which express only the

1 constitutive form of the proteasome). It is evident from our study that the steady state 2 immunopeptidome may vary dramatically from the *in vivo* tumor scenario depending 3 on the tumor microenvironment at any given time. Though our functional studies did 4 not reveal a difference in the immunogenicity of peptides derived from either 5 IFN γ treated or untreated conditions, in the *in vivo* setting a T cell response to IFN γ 6 related epitopes is likely to be aided by correlative IFN γ influences, such as 7 upregulation of surface HLA(39). The potential for tumor escape from $CD8^+$ T 8 lymphocyte killing due to whole scale change to the immunopeptidome upon 9 initiation of an anti-tumor responses, and corresponding induction of IFN γ , is clear 10 from our studies. These data become particularly significant in the context of recent 11 studies demonstrating that tumors with an IFN -inflamed, or 'hot' microenvironment 12 are associated with better prognosis, and are more likely to be amenable to treatment 13 with immune checkpoint inhibitors(40). It seems conceivable that in vivo the 14 difference between immunopeptidomes is indeed of immunological relevance to 15 disease progression and overall patient prognosis. Taken together, it is tempting to 16 speculate that antigens processed via the immunoproteasome may represent an 17 untapped resource of "IFNy-associated neo-epitopes".

This remarkable plasticity in the peptide landscape of melanoma is further increased by the presence of spliced peptides. The identification of spliced peptides as tumor antigens in cancer was first described in 2004 in both the FGF5 protein in renal cancer(32) and the gp100 protein in melanoma(33), and since then only a further 4 *cis*-spliced peptides have been described in cancer(29). Of these 6 spliced peptides, 3 have been shown to be processed exclusively by the constitutive proteasome, and 2 by both the constitutive and immunoproteasome (and 1 undetermined)(29).

1 Several bioinformatics tools are now available to reliably identify spliced 2 peptides(13,14,17,18,41). Nevertheless, the contribution of spliced peptides to the 3 overall immunopeptidome has been reported in a range from 2 to 40% and is still 4 heavily debated. Recent studies have identified *cis*-spliced peptides in the cancer and 5 viral infection context (16,17,41), but few have provided experimental evidence of 6 their immunogenicity (41). In this study we identified 386 cis-spliced peptides that 7 were potentially derived from MAA and therefore considered as potential candidates 8 to induce therapeutic immune responses. We demonstrated that generation and 9 presentation of spliced peptides is not a random process since within three biological 10 replicates we found comparable reproducibility of both linear and spliced peptides. 11 Interestingly, more than 50% of spliced peptides identified in the LM-MEL-44 cell 12 line were present on at least one of the other two distinct cell lines (LM-MEL-53 and 13 33). In addition, we demonstrated the immunogenicity of 6 *cis*-spliced epitopes tested 14 across multiple patients, strengthening the argument that *cis*-splicing is a random, 15 functional process leading to diversification of the antigenic pool of peptides. In how 16 far increased potential to evoke CD8+ T cell activation reflects meaningful and 17 translatable anti-tumour effects remains to be tested in much larger patient cohorts 18 with additional clinical data and in a more formal setting.

This study and other recent publications which focused on the identification of spliced peptides (16,42,43) and their impact on the plasticity of the immunopeptidome, will beyond doubt open up new questions and opportunities in the field. These will range from the basic understanding of immune-tolerance, autoimmunity and thymic selection to opportunities for development of novel peptide-based therapeutics. This includes vaccines in an infectious and cancer setting where predictability and HLA-

- 1 binding characteristics of linear and constitutive proteasome-derived peptides were
- 2 potentially limiting factors.
- 3

4 Materials and Methods

5 *Human ethics approval*

6 Samples used in this study were derived from patients who consented to participate in
7 a clinical research protocol approved by Austin Health Human Research Ethics
8 Committee (HREC H2006/02633).

9

10 Melanoma cell line culture

Establishment and characterization of the melanoma cell lines used has been previously described(44,45). Cells were cultured in RF10 consisting of RPMI 1640, 2 mM Glutamax, 100 IU/ml Penicillin, 100 μ g/ml Streptomycin and 10% heatinactivated fetal calf serum (all Invitrogen). For induction of immunoproteasome catalytic subunits, cells were incubated with 100 ng/ml IFN γ (Peprotech) for 72 h prior to experiments.

17

18 Melanoma cell line sequencing

Whole exome sequencing of the LM-MEL-44 cell line was performed using the NimbleGen EZ Exome Library v2.0 kit and run on a Illumina Hiseq2000 instrument as previously described(46). Sequence reads were aligned to the human genome (hg19 assembly) using the Burrows–Wheeler Aligner (BWA) program(47). Single nucleotide variants (SNVs) and indels were identified using the GATK Unified Genotyper(48), Somatic Indel Detector(49) and MuTect (Broad Institute)(50).

25

1 Isolation of peptides bound to HLA class I molecules

2 HLA class I peptides were eluted from LM-MEL-44, 33 and 53 cells (prior to or after 3 treatment with IFN γ) as described previously(51-54). In brief, for replicate one of LM-MEL-44, 3 x 10⁹ cells were lyzed in 0.5 % IGEPAL, 50 mM Tris-HCl pH 8.0, 4 5 150 mM NaCl supplemented with protease inhibitors (CompleteProtease Inhibitor 6 Cocktail Tablet; Roche Molecular Biochemicals) for 45 min at 4 °C. Lysates were 7 cleared by ultracentrifugation at 40,000 g and HLA class I complexes were 8 immunoaffinity purified using DT9 (anti HLA-C) and W6/32 (pan anti-HLA-I) 9 monoclonal antibodies. For replicate two and three of LM-MEL-44 and also LM-MEL-33 and LM-MEL-53, 5 x 10^8 cells (for each sample) were lyzed in 0.5 % 10 11 IGEPAL, 50 mM Tris-HCl pH 8.0, 150 mM NaCl supplemented with protease 12 inhibitors for 45 min at 4 °C. Lysates were cleared by ultracentrifugation at 40,000 g 13 and HLA class I complexes were immunoaffinity purified using W6/32 (pan anti-14 HLA-I) monoclonal antibody.

15

16 Fractionation of HLA-bound peptides by reversed-phase high-performance liquid
17 chromatography (RP-HPLC)

The HLA-peptide eluates were loaded onto a 4.6 mm internal diameter x 50 mm monolithic C18 RP-HPLC column (Chromolith Speed Rod; Merck) at a flow rate of 1 ml/min using an EttanLC HPLC system (GE Healthcare) with buffer A (0.1 % trifluoroacetic acid (TFA)) and buffer B (80 % ACN / 0.1 % TFA) as mobile phases. The bound peptides were separated from the class I heavy chains and β 2m molecules using an increasing concentration of buffer B. Peptide-containing fractions (500 µl) were collected, vacuum concentrated to ~5 µl and combined into nine pools,

- 1 reconstituted to 12 µl with 0.1 % formic acid (FA). Indexed retention time (iRT)
- 2 peptides(55) were spiked in for retention time alignment.
- 3

4 Identification of HLA bound-peptides using data-dependent acquisition (DDA)

5 For the first replicate of LM-MEL-44 we used a Dionex UltiMate 3000 RSLCnano 6 system equipped with a Dionex UltiMate 3000 RS autosampler, the samples were 7 loaded via an Acclaim PepMap 100 trap column (100 µm x 2 cm, nanoViper, C18, 5 8 μm, 100 Å; Thermo Scientific) onto an Acclaim PepMap RSLC analytical column (75 9 um x 50 cm, nanoViper, C18, 2 µm, 100 Å; Thermo Scientific). The peptides were 10 separated by increasing concentrations of 80 % ACN / 0.1 % FA at a flow of 250 11 nl/min for 65 min and analyzed with a QExactive Plus mass spectrometer (Thermo 12 Scientific). In each cycle, a full ms1 scan (resolution: 70.000; AGC target: 3e6; 13 maximum IT: 120 ms; scan range: 375-1800 m/z) preceded up to 12 subsequent ms2 14 scans (resolution: 17.500; AGC target: 1e5; maximum IT: 120 ms; isolation window: 15 1.8 m/z; scan range: 200-2000 m/z; NCE: 27). To minimize repeated sequencing of the same peptides, dynamic exclusion was set to 15 s and the 'exclude isotopes' 16 17 option was activated.

18 For second and third replicates of LM-MEL-44, LM-MEL-33 and LM-MEL53 we

19 used a Dionex, Sunnyvale, CA, UltiMate 3000 RSLCnano system equipped with a

- 20 Dionex UltiMate 3000 RS auto sampler, the samples were loaded via an Acclaim
- 21 PepMap 100 trap column (100 μ m × 2 cm, nanoViper, C18, 5 μ m, 100å; Thermo-
- 22 Fisher Scientific, Waltham, MA) onto an Acclaim PepMap RSLC analytical column
- 23 (75 μ m × 50 cm, nanoViper, C18, 2 μ m, 100 Å; ThermoFisher Scientific). The
- 24 peptides were separated by increasing concentrations of 80 % ACN/0.1 % FA at a
- 25 flow of 250 nL/min for 158 min and analyzed with an Orbitrap FusionTM TribridTM

- 1 mass spectrometer (ThermoFisher Scientific). 6 μL of each sample fraction was
- 2 loaded onto the trap column at a flow rate of $15 \,\mu$ L/min.

3	Orbitrap Fusion TM Tribrid TM mass spectrometer (ThermoFisher Scientific) was set to
4	data-dependent acquisition mode with the following settings: All MS spectra (MS1)
5	profiles were recorded from full ion scan mode 375-1800 m/z in the Orbitrap
6	at 120,000 resolution with automatic gain control (AGC) target of 400,000 and
7	dynamic exclusion of 15 s. The top 12 precursor ions were selected using top speed
8	mode at a cycle time of 2 s. For MS/MS, a decision tree was made which helped in
9	selecting peptides of charge state 1 and 2-6 separately. For single charged analytes
10	only ions falling within the range of m/z 800-1800 were selected. For +2 to +6 m/z s
11	no such parameter was set. The c-trap was loaded with a target of 200,000 ions with
12	an accumulation time of 120 ms and isolation width of 1.2 amu. Normalized
13	collision energy was set to 32 (high energy collisional dissociation (HCD)) and
14	fragments were analyzed in the Orbitrap at 30,000 resolution.

15

16 DDA data analysis

17 Linear and *cis*-spliced peptide sequences were identified as described previously(14). 18 In brief, the acquired .raw files from six LM-MEL-44 line were searched with 19 PEAKSStudio X (Bioinformatics Solutions Inc., Waterloo, Ontario, Canada) against 20 the human UniProtKB/SwissProt (v2017 10) database, which was manually corrected 21 for the single nucleotide variants characteristic of the LM-MEL-44 cell line as 22 identified by whole exome sequencing. The parent mass error tolerance was set to 10 23 ppm for *de novo* sequencing and database search and the fragment mass error 24 tolerance to 0.02 Da for both searches. Oxidation of M and deamidation of N & Q 25 were set as variable modifications and a FDR cutoff of 1% was applied. High

1 confidence *de novo* peptide sequences without any linear peptide match in the 2 provided database were further interrogated with the "Hybrid finder" algorithm and 3 the identified *cis*-spliced candidate sequences from all 6 samples combined together 4 and added back to the original UniProtKB/SwissProt database and all data researched 5 using PEAKS DB. Linear and cis-spliced peptides in this search were extracted at 5% 6 FDR to create the final list of identified peptides. For identification of linear and *cis* 7 spliced peptides from LM-MEL-33 and 53, we used this combined database and the 8 same setting on PEAKS studio. 9 10 **Binding** prediction 11 We used the NetMHC4 (56,57) algorithms for binding predictions for both spliced

12 and linear peptides. A default rank cut-off of 2 was implemented as a binder peptide.

13

14 *Immunogenicity prediction.*

We used the Immune Epitope Database and Analysis Resource (IEDB:
www.iedb.org), Class I Immunogenicity algorithm for immunogenicity predictions of
linear peptides(58). The peptides used in functional assays indicated as "predicted
immunogenic" had an immunogenicity score of between 0.37 and 0.55 (Table S5).

19

20 T cell stimulation assay

To assess T cell responses selected peptides were synthesized (Mimotopes, VIC, Australia). PBMC from healthy donors (Australian Red Cross, VIC, Australia), or melanoma patients (Austin Health HREC approved protocol HREC H2006/02633) were purified by density centrifugation over Ficoll Hi-Paque. Cells were cultured in TCRPMI consisting of RPMI 1640, 2 mM Glutamax, 100 IU/ml Penicillin, 100 µg/ml

1 Streptomycin, 20 mM HEPES, 1% nonessential amino acids, 1 mM sodium pyruvate, 2 55 μ M β -mercaptoethanol, and 10% human AB serum (Australian Red Cross, VIC, 3 Australia). Peptides were combined into pools of 5-9 peptides as outlined in Supplementary Table 6. 10^6 PBMC/ml were incubated with 10 μ M of each peptide in 4 5 pools for 10 - 12 days at 37 °C. IL-2 (100 IU/ml) was added and replaced every 3 6 days. Statistics were performed using GraphPad Prism. For peptide responses in 7 Figure 6a a repeated-measures 2-way ANOVA was used, and for *cis*-spliced peptide 8 assays in Figure 7 a matched mixed effect analysis with Dunnett's multiple 9 comparison test was used to compare each column to DMSO.

10

11 Intracellular cytokine staining (ICS) of antigen-activated T-lymphocytes

12 To assess antigen responses, T-lymphocytes were restimulated (following 10 - 12 13 days incubation as outlined above) with peptide pools for 4-8 h in TCRPMI in 14 presence of 10 µg/ml brefeldin A (BFA, Golgi plug). Cells were washed with PBS 15 (Invitrogen) labeled with live/dead fixable violet stain (Invitrogen), then incubated 16 with antibodies against CD3 and CD8 (BD biosciences) for 15 min at 4°C. Samples 17 were washed and fixed for 20 min at 4°C. Cells were permeabilized and stained with 18 anti-TNF α (eBiosciences) for 25 min at 4°C. The gating strategy was: SSC/FSC; 19 Singlets; SSC/LD⁻; CD3⁺/CD8⁺; CD8⁺/TNF α^+ (Fig. S6). Data were acquired on a 20 FACSCanto (BD biosciences, VIC Australia) and analyzed with FlowJo software 21 (Version 10, FlowJo, Ashland OR, USA). To account for the large variation in DMSO 22 background CD8⁺ T cell activity across multiple donors, signals were normalized by 23 subtracting the background from DMSO control treated samples in each case.

24

1 HLA-A2 stabilization assays

2 The binding activity of the peptides was assayed by measuring peptide-induced 3 stabilization of HLA-A2 on TAP-deficient T2 cells by flow cytometry. T2 cells were 4 cultured in RF-10 (RPMI with 10% serum, 5% Glutamine, 5% Pen/Strep) in T25 flasks for 2 - 3 days before the assay. T2 cells ($2x \ 10^5$ cells/well) were cultured for 16 5 6 h at 37 °C in 5 % CO₂ in 200 µL RF10 in 96-well U-bottomed plates in presence or 7 absence of 10 μ g/ml of synthetic peptides. Peptides from Melan-A (modified aa26-35 8 ELAGIGILTV and aa 60-72) served as positive or negative controls respectively. All 9 peptides were tested in triplicate. 10 After 16 h stimulation the cells were washed and stained with anti-HLA A2 11 monoclonal antibody BB7.2 (Biolegend) for 30 min. at 4 °C. Cells were subsequently 12 stained with Fixable Viability Kit (Zombie NIRTM, Biolegend) for 15 min. at 4 °C 13 before flow cytometry on a FacsCanto (BD). Data was analyzed using FlowJo 14 software (Version 10, FlowJo, Ashland OR, USA).

15

16 Validation spliced peptides using retrospectively synthesized peptides and retention

17 *time prediction*

18 We validated the identity of a panel of spliced peptides (including peptides that were 19 tested for immunogenicity), using 28 synthetic peptides (Mimotopes, Melbourne, 20 Australia) by comparing chromatographic retention and MS/MS spectra with the 21 original p-HLA (Fig. S7). The PKL files of the synthetic peptide and corresponded 22 eluted peptides were exported from PEAKS X studio software. For evaluating the 23 similarity between two spectra, we predicted all b- and y-ions for each sequence and 24 then extracted the corresponding intensity for each ion (with a fragment mass error 25 tolerance of 0.1 Da). The Pearson correlation coefficient and the corresponding p-

1	value (Prism version 8.01, GraphPad) between the log10 intensities of identified b-
2	and y-ions in the synthetic and sample derived spectra were calculated (Fig. S7 and
3	S8) (59). The closer a correlation coefficient to 1, the more identical the spectra. All
4	tested peptides were found to have a <i>p</i> -value of less than 0.05.
5	We calculated the iRT index of each synthetic peptide and corresponding eluted
6	peptide using the retention time of a standard set of reference peptides (iRT kit,
7	Biognosys) that were spiked into all samples (Fig. S8) (55).
8	We also used GPTime tool (59) to compare the predicted versus actual
9	chromatographic retention time of both the identified linear and spliced peptides. For
10	each data set generated from LM-MEL-44 cell lines (6 replicates in total) we sorted
11	peptides (8-12 mer peptides without modification) based on the -logP score (high to
12	low) from Peaks Studio software. We used the first 1000 peptides for training the
13	algorithm and then used the trained algorithm to predict the retention times of all
14	linear and spliced peptides in the corresponding dataset (Fig. S9). We also calculated
15	Grand Average of Hydropathy (GRAVY) Score of all identified 8-12 mer peptides
16	(Table S1) (60).
17	

17

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15	Password: LIBn7t49).	
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17		
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- 8

1 Figure legends:

Figure 1. The melanoma immunopeptidome consists of linear and spliced peptides in the presence and absence of IFN ... A, 6-8 % of peptides presented by the LM-MEL-44 cell line were *cis*-spliced peptides across 3 replicates. B, Length distribution analysis showed that majority of linear and *cis*-spliced peptides were 9 mers in the presence and absence of IFN ... C, Using the NetMHC4.0 algorithm, binding of identified 8-12 mer peptides to all HLA-I haplotypes presented by LM-MEL-44 was predicted.

9

10 Figure 2. Generation and presentation of spliced peptides is not random process.

A, Reproducibility of linear and *cis*-spliced peptides across biological replicates with around half of the of linear *cis*-spliced of peptides identified in at least two out of three replicates. **B**, A high proportion of linear and spliced peptides presented on LM-MEL-44 cell were also identified on other melanoma cell lines. The yellow circle (defined as 100%) represents all peptides that were identified across all six LM-MEL-44 samples. The green and orange circles represent the proportion of those peptides that were also identified to be presented on LM-MeI-53 and LM-MeI-33, respectively.

Figure 3. The melanoma immunopeptidome is substantially altered following exposure to IFNγ. A, Around 20% of linear and 25% of spliced peptides presented by HLA-I were lost following treatment with IFN□, alongside a concurrent increase in novel peptides. B, Among peptides identified in 3 replicates both with and without IFN□, an elevation in the number of peptides that bound to HLA-B, compared to HLA-A and C, was observed.

1 Figure 4. Novel and previously described linear and spliced peptides from 2 melanoma specific antigens were identified. A, Both linear and *cis*-spliced peptides 3 derived from MAA were identified in the LM-MEL-44 immunopeptidome. **B**, A 4 substantial proportion of identified MAA have not been previously described. C, Proportion of MAA-associated epitopes in the presence and absence of IFN \Box . 5 6 Almost 70% of novel identified peptides were solely present in the presence of IFNy 7 or generated thorough post translational splicing. IEDB website (www.iedb.or) (28), 8 SysteMHC (https://systemhcatlas.org/)(62) and (63) were used as resources for known 9 peptides.

10

11 Figure 5. Immunoproteasome expression is associated with survival benefit in 12 melanoma patients. Using the TCGA-SKCM and FM-AD datasets looking at nevi 13 and melanomas, we selected patients whose tumors had highest (top quartile) or 14 lowest (bottom quartile) expression of each immunoproteasome (IP) or constitutive 15 proteasome (cP) subunits as indicated in the figure. To correct for immune infiltration, 16 the top quartile of CD3g expressing samples were removed. The remainder of samples 17 with high or low expression of a given proteasome subunit were plotted on the basis 18 of patient survival over time using a Kaplan Meier survival curve 19 (astatsa.com/LogRankTest/).

20

21 Figure 6: Immunogenicity of identified melanoma-associated epitopes.

Selected MAA peptides were pooled and incubated at 10μ M final concentration with PBMC from healthy donors (n=4) or melanoma patients (n=6) for 10 days in presence of IL-2. Melanoma patient 2 is the patient from which the LM-MEL-44 cell line was derived. Melanoma patient 6 was a HLA-unmatched negative control. All other

1 donors were HLA-matched over at least two allotypes. On day 10, $CD8^+$ T 2 lymphocytes were re-stimulated with individual peptides. Additionally cells were 3 stimulated with pools of selected peptides whose HLA-presentation was found to be 4 up/down regulated or unchanged in presence of IFN \square as indicated. TNF α expression 5 measured by ICS. Data show the percentage of $TNF\alpha^+$ CD8⁺ T lymphocytes in 6 response to each peptide as individual values (A) or combined (B). * denotes peptides 7 with the highest in silico predicted immunogenicity. In (A) all responses shown were 8 significantly greater (p<0.05) than their respective matched DMSO control and the 9 line denotes a conservative, arbitrary, cut-off for peptides inducing an immune 10 response. Peptide pools outline in Table S5.

11

12 Figure 7. Immunogenicity of *cis*-spliced peptide pools. A, PBMCs from melanoma 13 patients and healthy donors (HD) were stimulated with pooled peptides (n=8-9) for 10 14 days in the presence of IL-2. Cells were re-stimulated with the same pools for 8 h in 15 the presence of BFA and TNF α expression measured by ICS. DMSO and FEC served as negative or positive control respectively. **B**, Amino acid sequence of peptide pools 16 17 used in A. C, PBMCs from melanoma patients pre-stimulated with the pooled 18 peptides as in A were re-stimulated with single peptides from the same pool after 12 19 days for 8 h in the presence of BFA and $TNF\alpha$ expression measured by ICS. DMSO 20 and FEC served as negative or positive control respectively. % of $TNF\alpha^+$ CD8⁺ cells 21 of peptides that gave a signal above background (DMSO) are shown. Statistics was 22 performed using Graphpad Prism as described in Material and Methods, **** 23 p<0.0001 and ** p<0.001 after Dunnett's multiple comparison test.

24

1 Supplementary Figures:

2 Figure S1. IFNy treatment increase the expression of HLA-I molecules. The

melanoma cell lines LM-MEL-33, -44, and -53 were cultured in presence/absence of
100 ng/ml IFNγ for 72 h. Cells were labelled with anti-pan HLA-I and the expression
of HLA-I on the cell surface was determined by flow cytometry. *=p<0.05,
**=p<0.001.

7

Figure S2. Using the TCGA-SKCM and FM-AD datasets looking at nevi and melanomas, we selected patients whose tumors had highest (top quartile) or lowest (bottom quartile) expression of each immunoproteasome (IP) or constitutive proteasome (cP) subunits as indicated in the figure. Samples with high or low expression of a given proteasome subunit were plotted on the basis of patient survival over time using a Kaplan Meier survival curve (astatsa.com/LogRankTest/).

14

Figure S3. The FACS plot examples for the peptide stimulations. A, FACS plot
showing TNFα vs CD8 in selected patients re-stimulated with either linear peptides.
B, pools of spliced peptides. C, or single spliced peptides. DMSO stimulations served
as negative and background control and FEC as positive control. Labelling denotes
first stimulation and re-stimulation.

- 20
- 21

Figure S4. *Cis*-spliced peptides that stimulated $CD8^+$ T cells as measured by TNF α to a higher degree than DMSO in at least 1 patient plus some randomly picked *cis*spliced peptides were subjected to HLA-A2 stabilization assays on T2 cells as described in M&M. None HLA-A2 binding peptides (B7) or the Melan-A modified

HLA-A2 epitope served as negative and positive control respectively.* denotes
 immunogenic peptides.

3

Figure S5. A, Length distribution of the region separating the N- and C-terminal
segment of a cis-spliced peptide on the protein level (in amino acids). B-F, Length
distribution of N- and C-terminal segments of *cis*-spliced peptides, shown for 8-12
mers (in amino acids).

- Figure S6. Flow cytometry gating strategy. A, Cells were gated based on size (FSC-A/SSC-A), doublets and dead cells were excluded, and this strategy was used for all samples. The DMSO-treated negative control. B, was used to set the TNFZ⁺/CD8⁺
 gate after CD3⁺/CD8⁺ gating. An example of a peptide-specific CD8⁺ T cell response is shown (C).
- 14

Figure S7. Pearson r value correlation score of b and y ions in spectra from 28 eluted *cis*-spliced peptides from LM-MEL-44 cell line compared with their synthetic versions. This analysis approved the authenticity of 27 sequences and disapproved one sequence.

19

Figure S8. Comparison of MS2 spectra and iRT value of 28 *cis*-spliced peptides
versus their corresponding synthetic version.

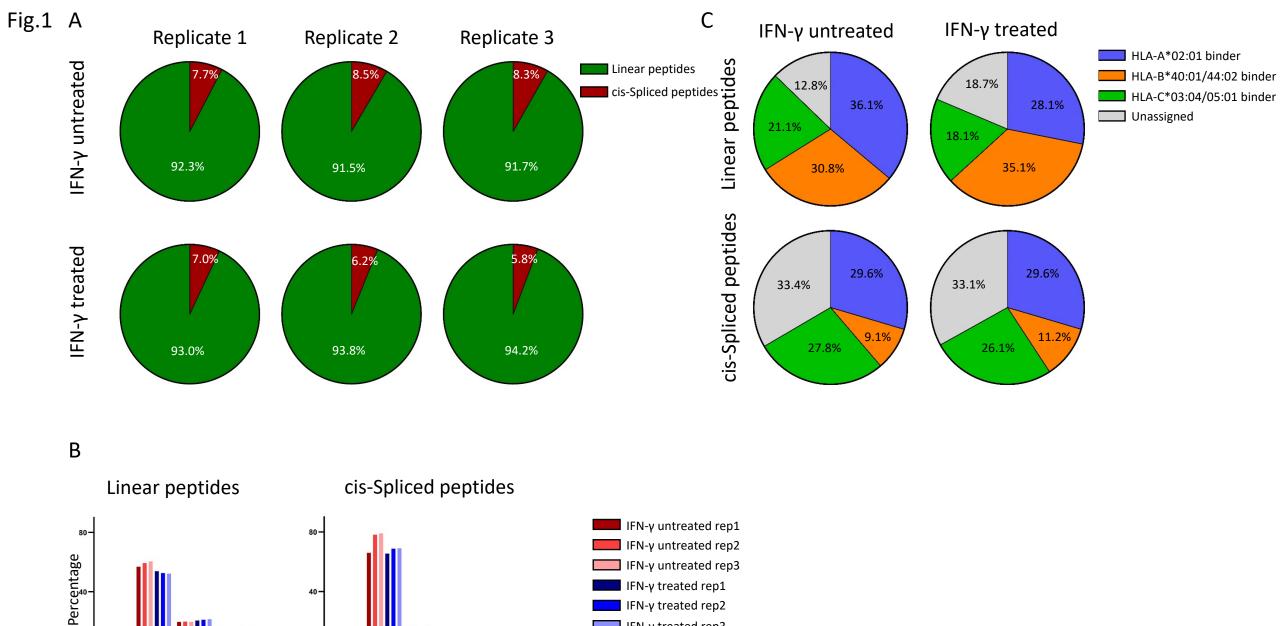
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Figure S9. Comparison of predicted vs real retention time of linear and *cis*-spliced peptides by using GPTime tool (55). There was not a difference between linear and spliced peptide in this analysis in any of datasets.

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1 Supplementary Tables:

- 2 **Table S1.** Identified Linear and *cis*-spliced peptides. Sheet 1; all 8-12 mer identified
- 3 peptides and their presence in other cell lines or reported before (note that in spliced
- 4 peptides, L stands for both leucine and isoleucine.). Sheet2; Shared peptides between
- 5 six LM-MEL-44 samples. Sheet 3. List of LM-MEL-44 peptides presented in each
- 6 condition. Sheet 4-13 raw export of PEAKS X software for each dataset.
- 7 Table S2. Binding prediction for identified linear and *cis*-spliced peptides from LM-
- 8 MEL-44 cell line
- 9 Table S3. Predicted mutated peptides based on LM-MEL-44 sequencing data
- 10 **Table S4.** Melanoma associated antigens derived linear and *cis*-spliced peptides
- 11 **Table S5.** Selected linear peptides used for immunogenicity assay
- 12 **Table S6:** Presence of immunogenic linear and spliced sample across different cell
- 13 lines
- 14



IFN-γ treated rep3

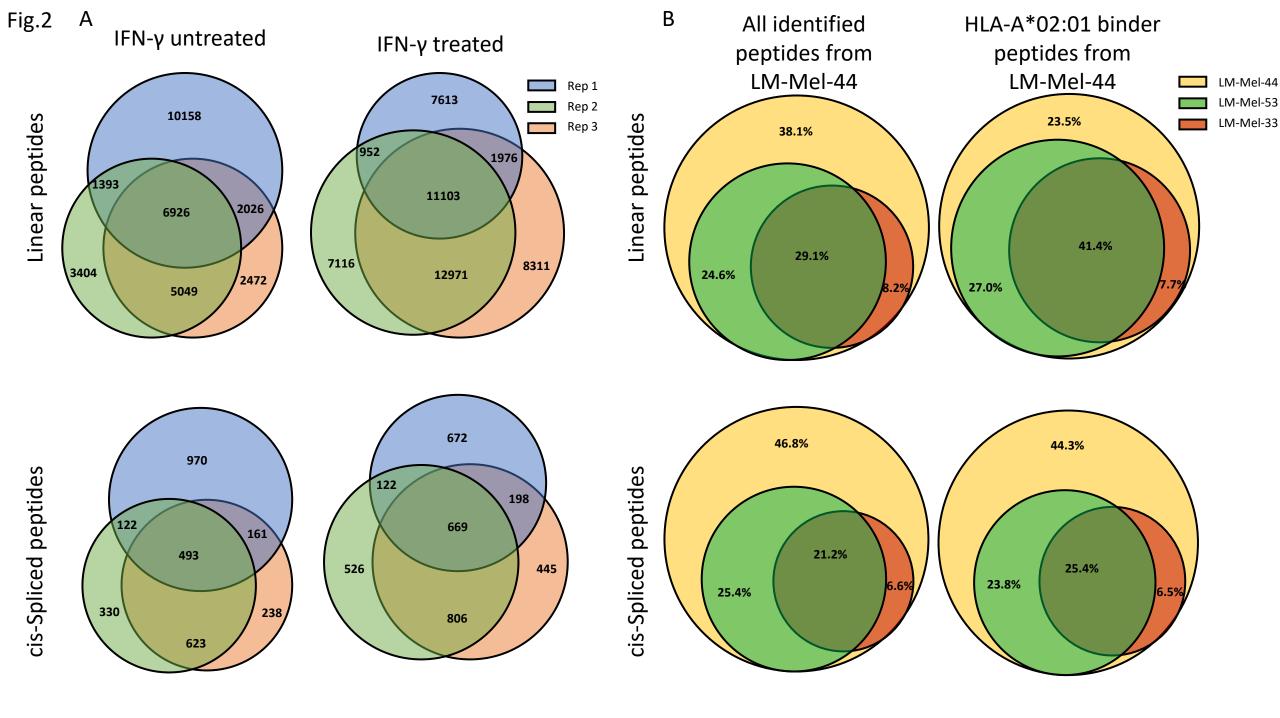
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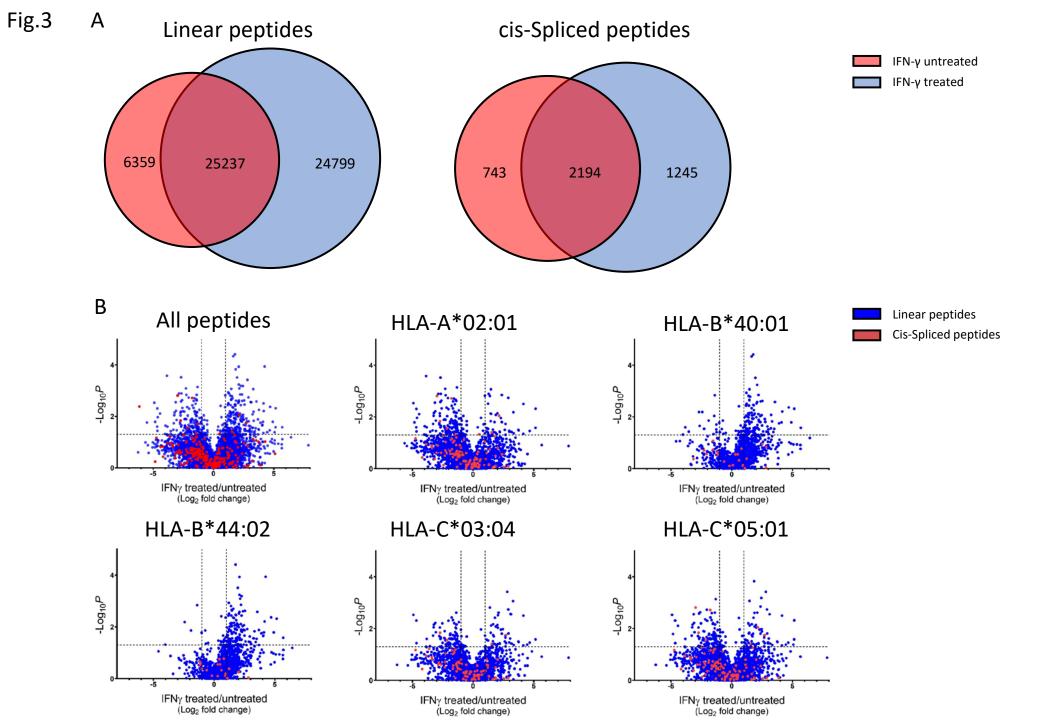
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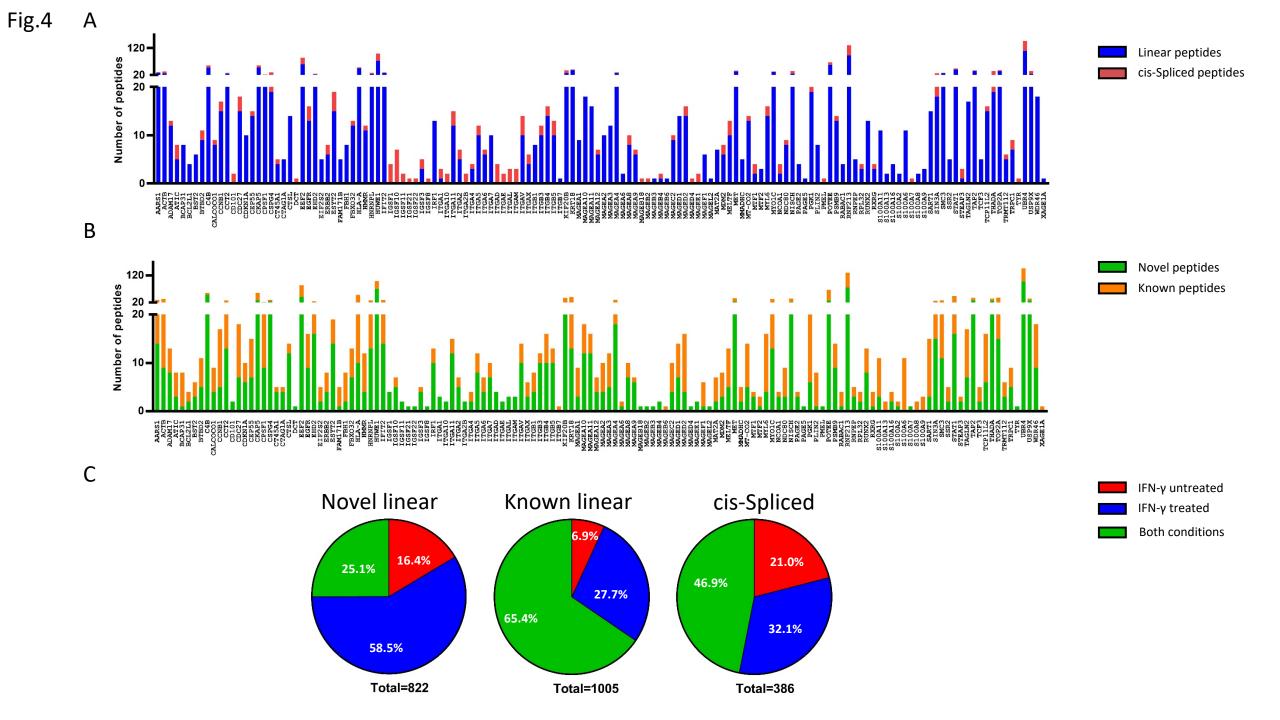
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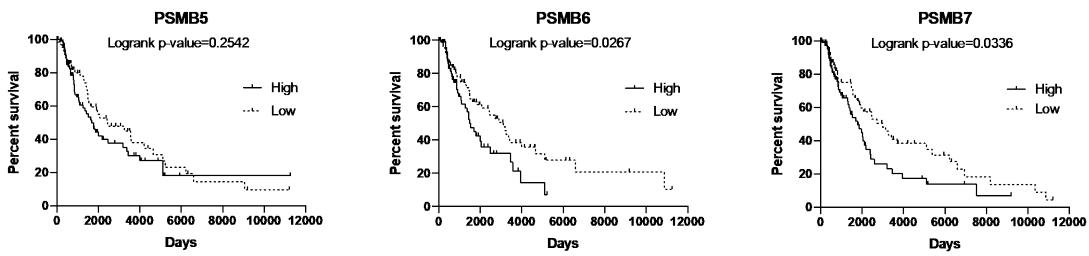
Number of amino acids







Constitutive proteasome genes – top quartile of CD3 expressing samples removed



Immunoproteasome genes – top quartile of CD3 expressing samples removed

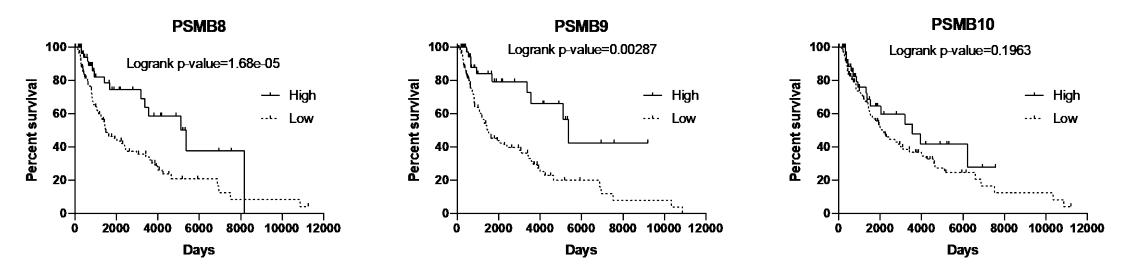


Fig.5

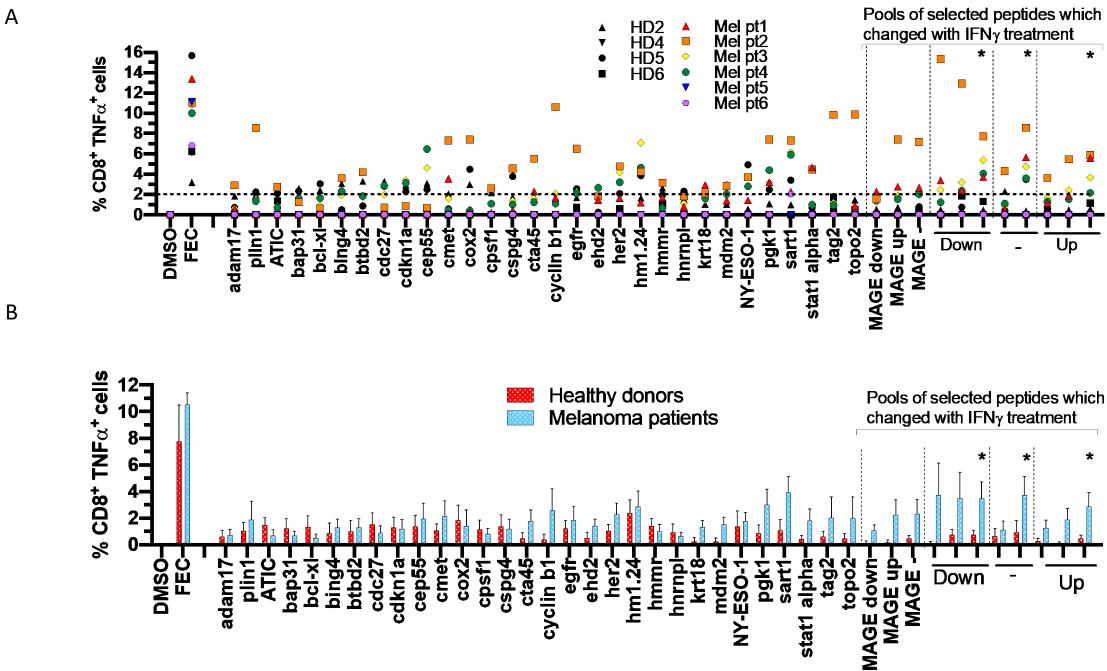
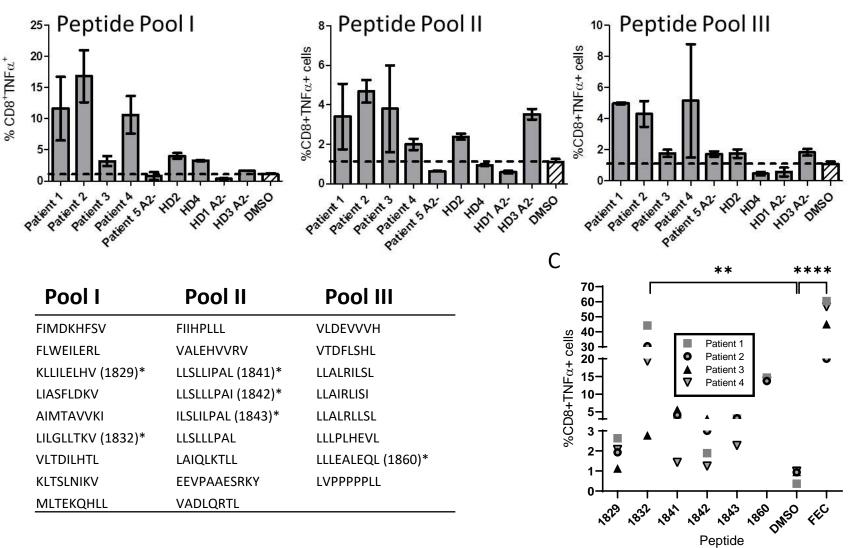


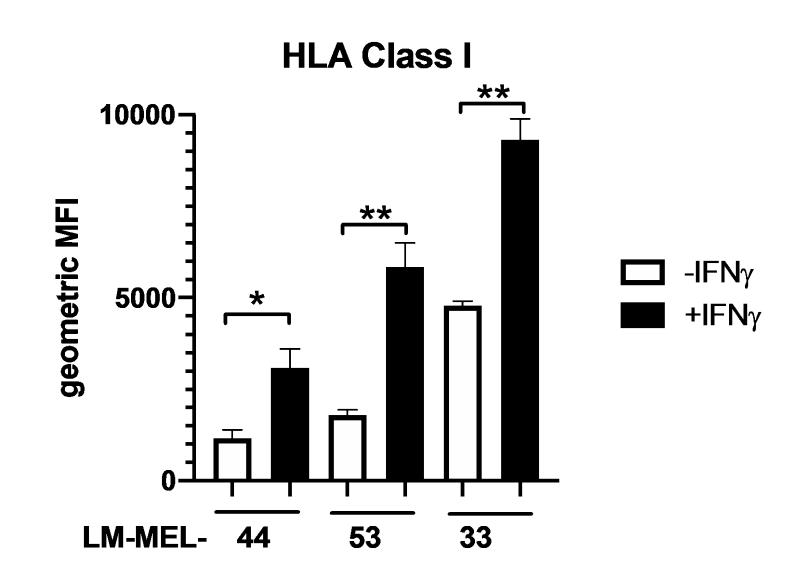
Fig.6

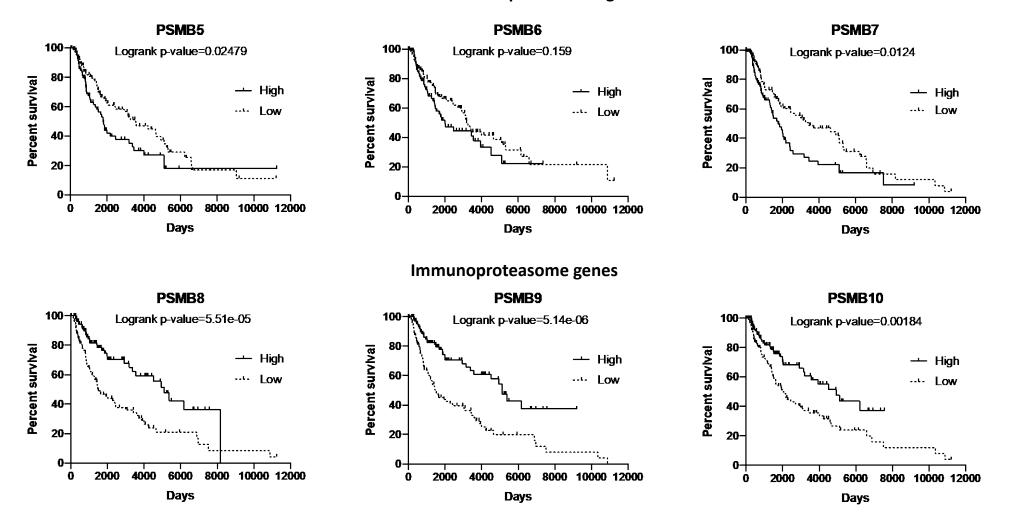
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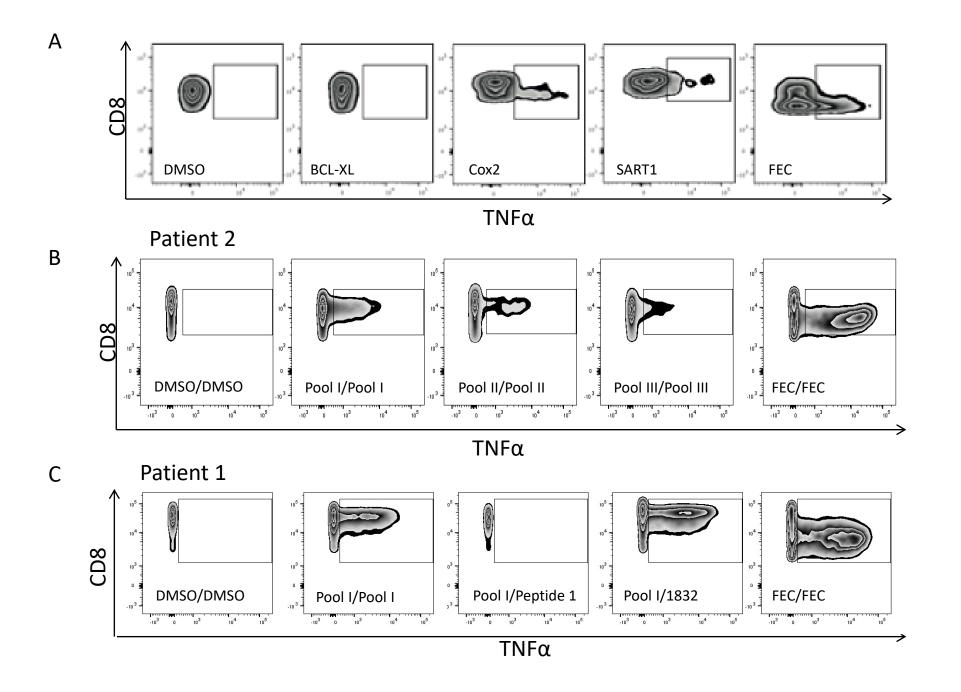
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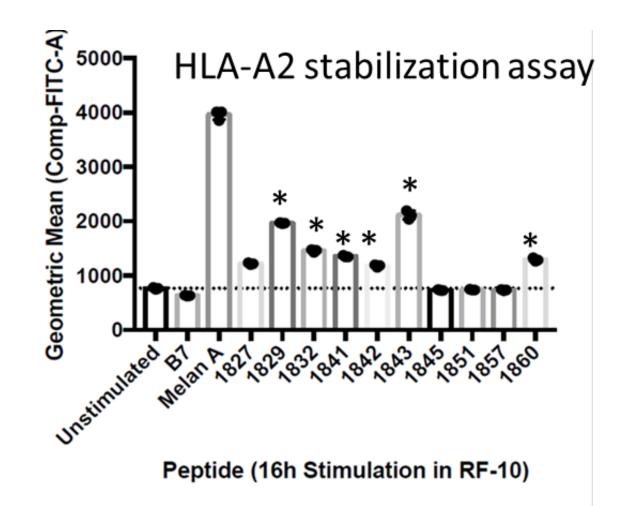
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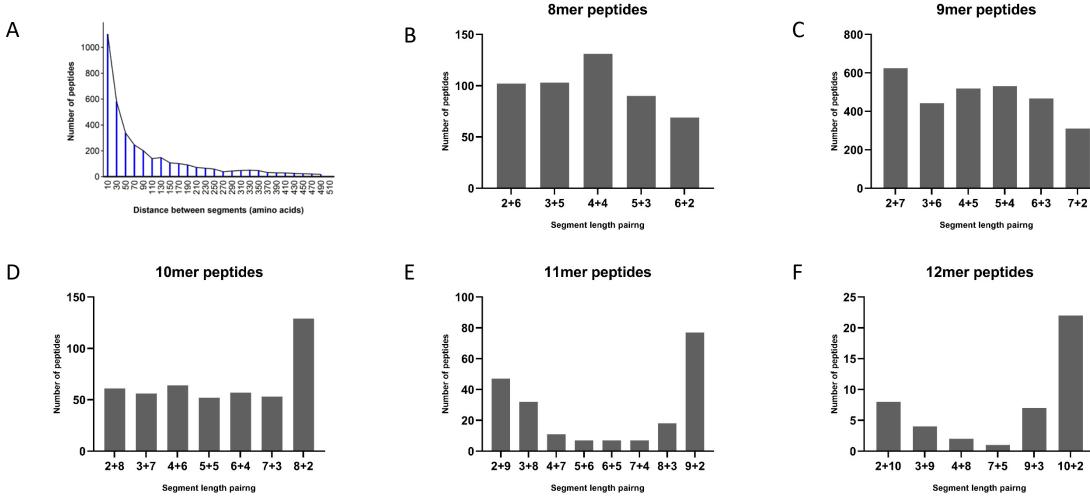


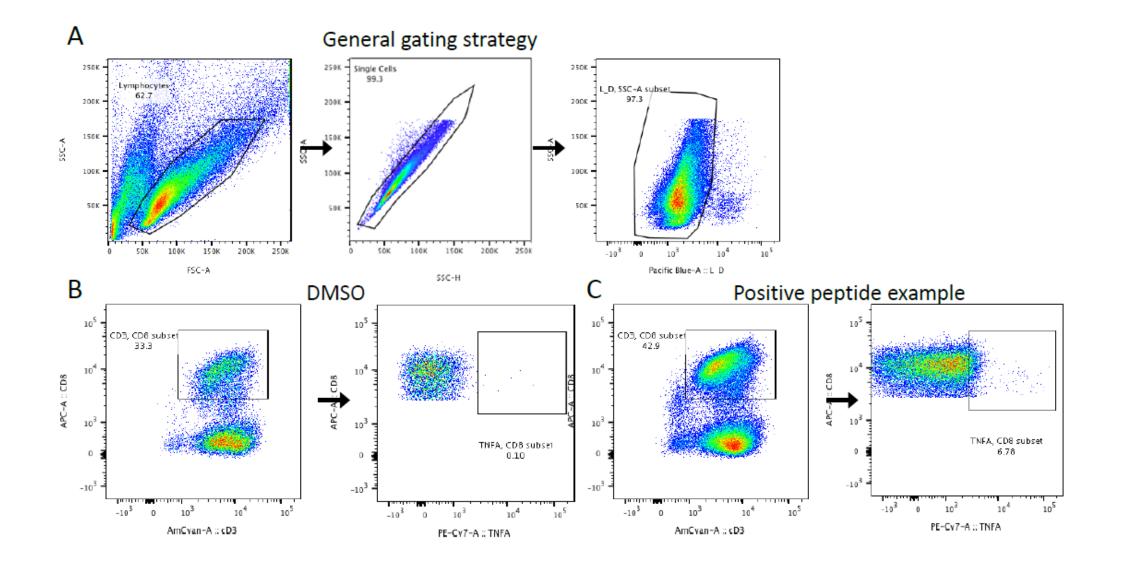


Constitutive proteasome genes

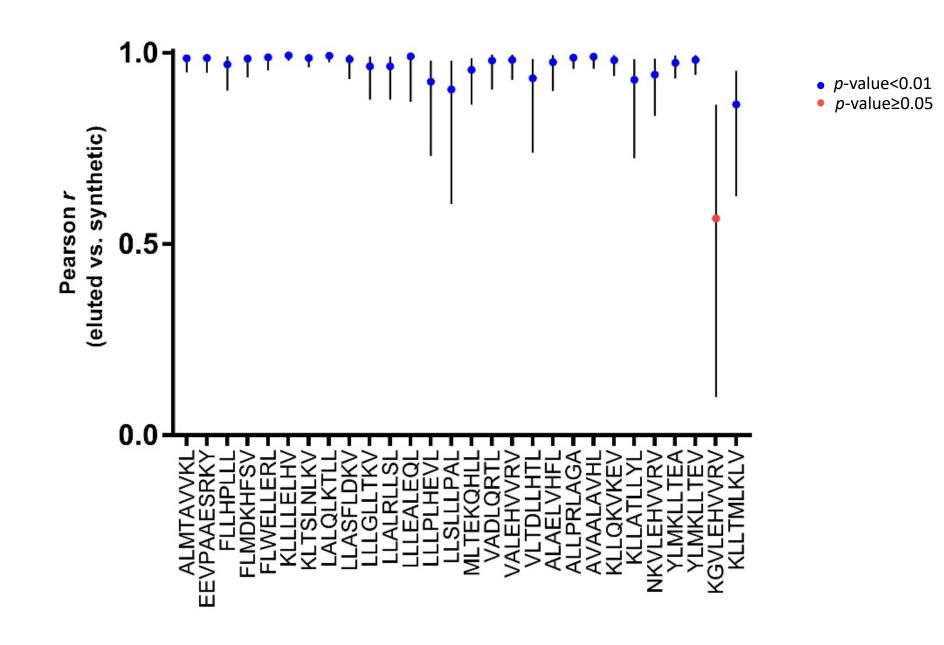




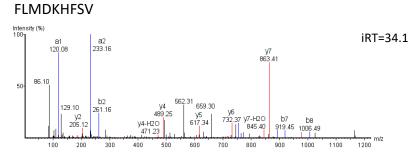


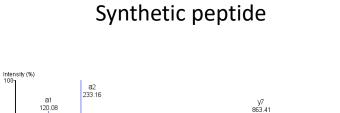




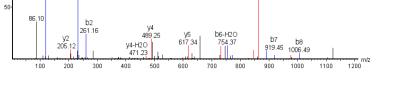


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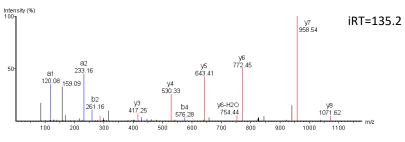


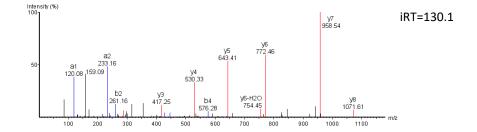
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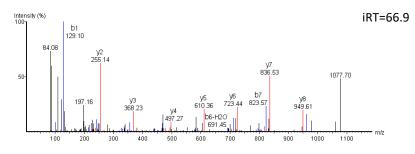
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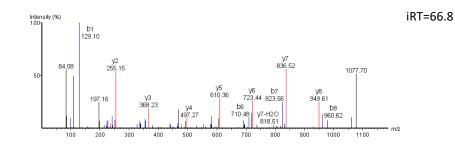
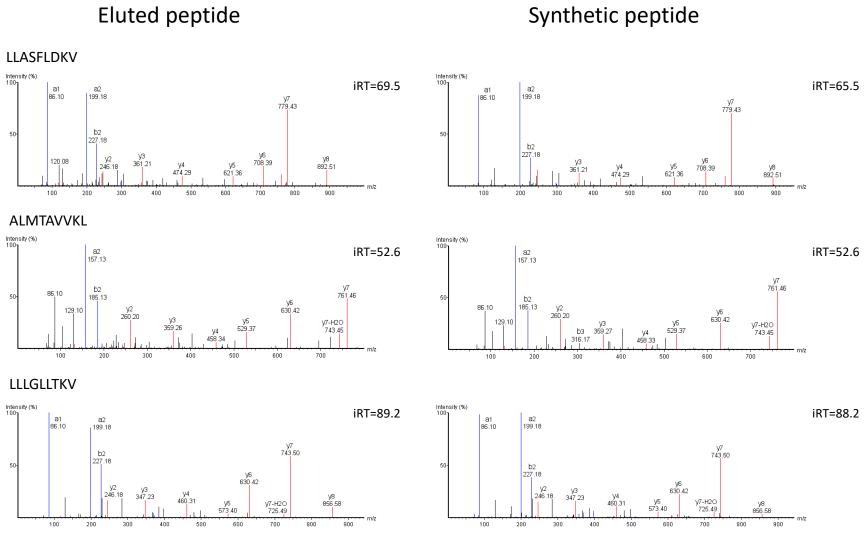
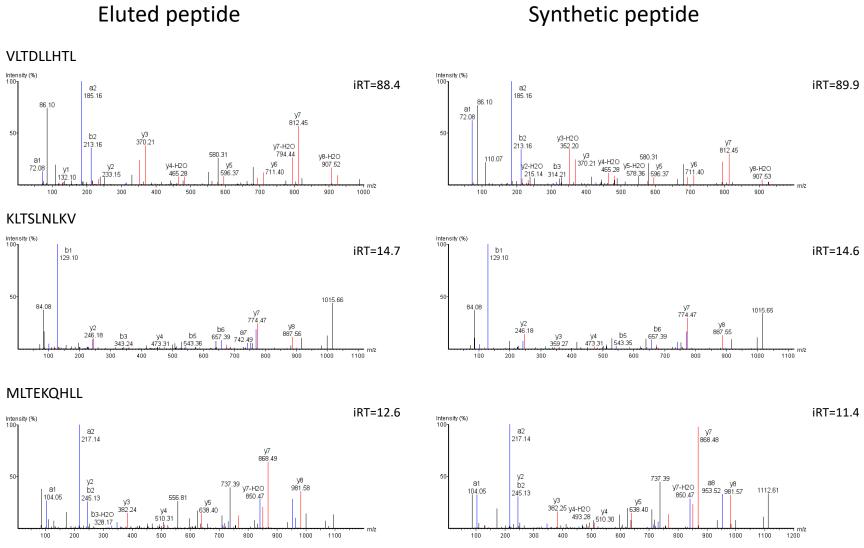


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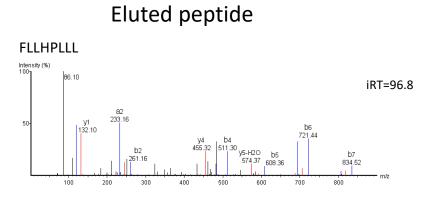


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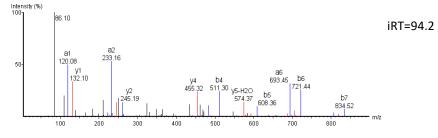
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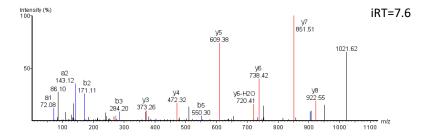
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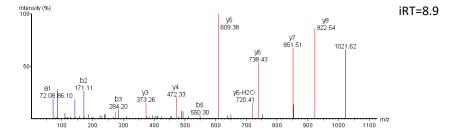


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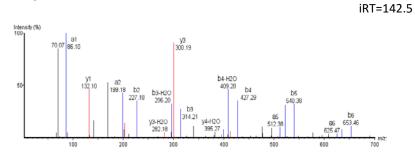


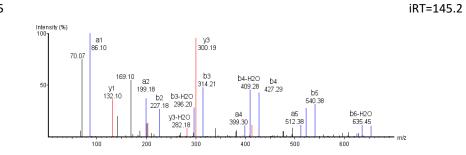
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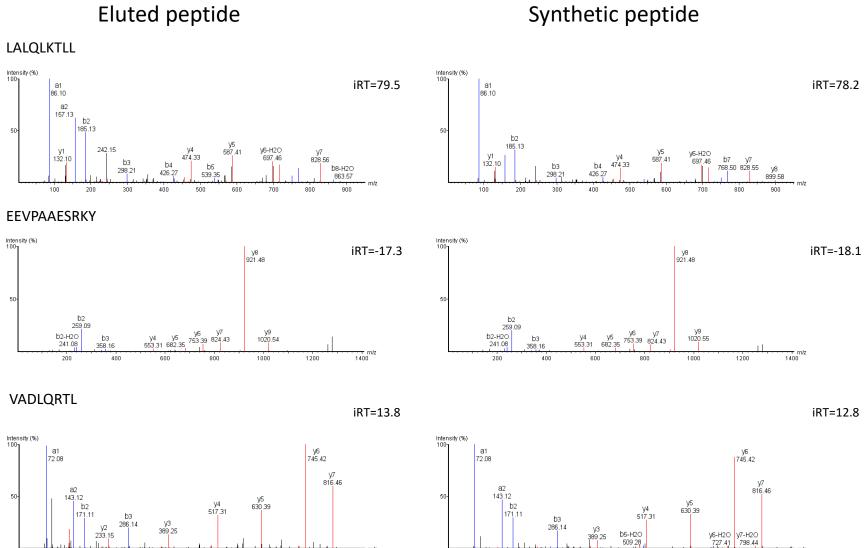


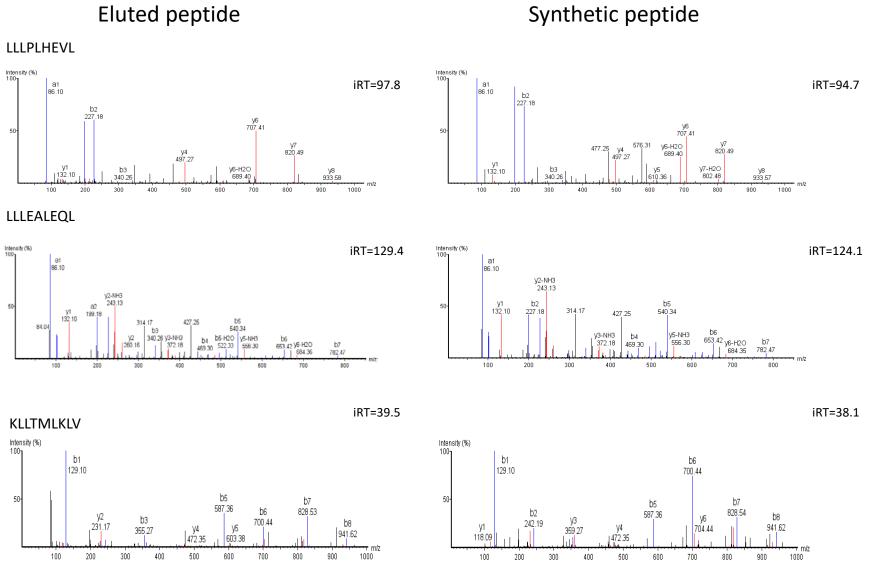


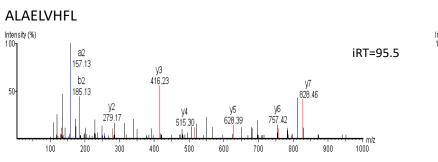
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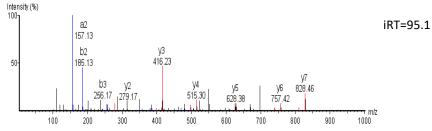




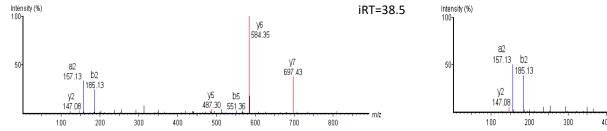


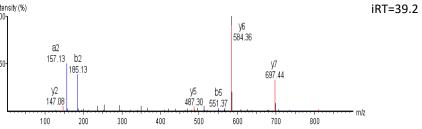
Eluted peptide

Synthetic peptide

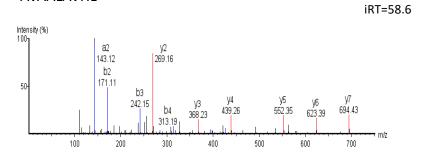


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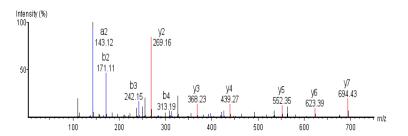


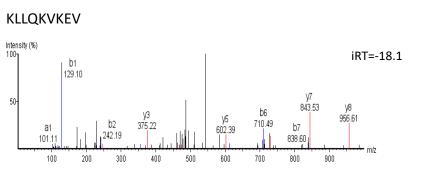


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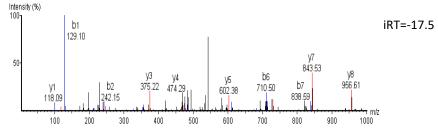
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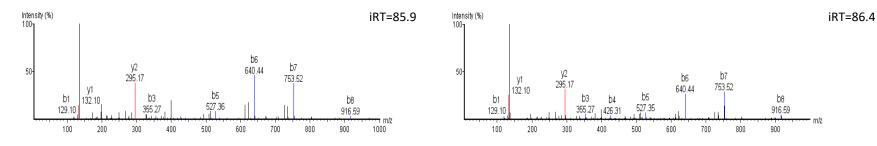


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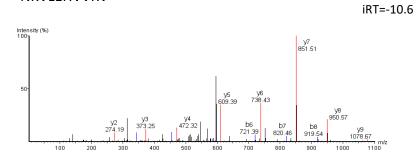
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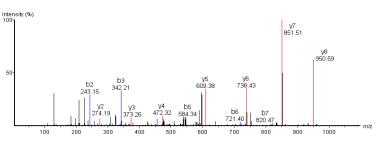


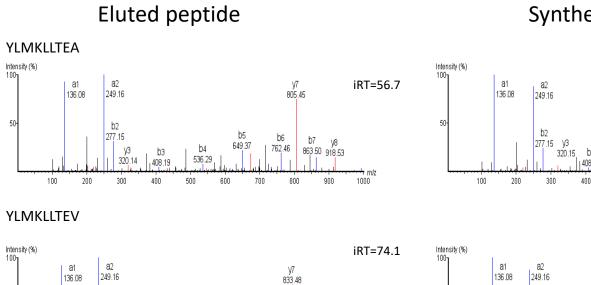


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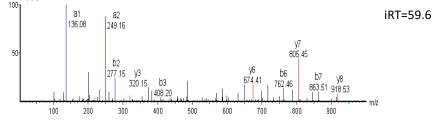


iRT=-7.4





Synthetic peptide



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800

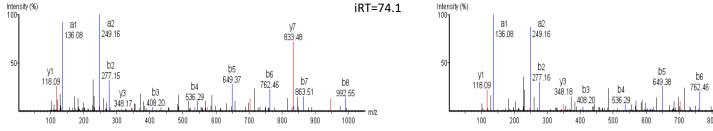
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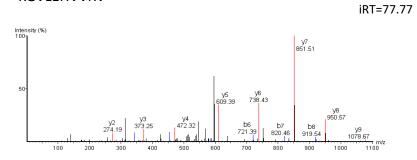
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ם כפב

1000



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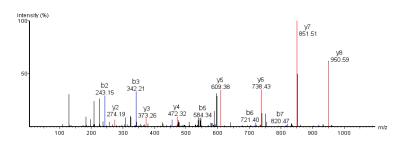
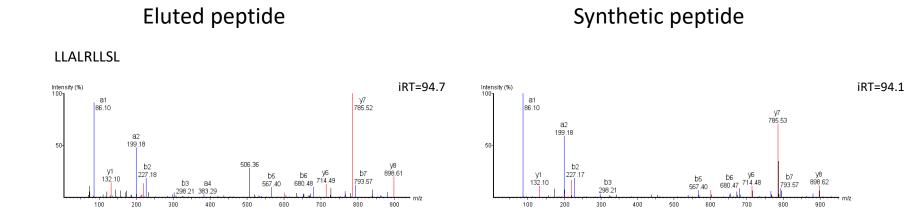
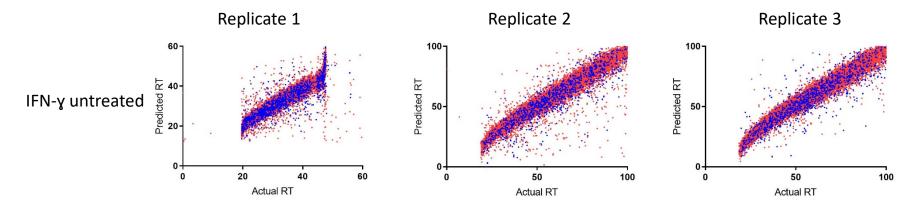


Fig.S8- continued





Linear peptidescis-Spliced peptides

