

binding to different HLA isotypes takes place in the endoplasmic reticulum and is restricted by the expression of allele-specific amino acid consensus motifs [5–9]. In this light, tumor cells process and present their own peptides for CTL recognition, while APCs and inflammatory cells uptake and process antigens released by tumor tissues in the blood stream and lymphatic drainage. This is a result of spontaneous death, hypoxia, radiotherapy, specific treatments or immune-related killing [10] in a process known as cross priming. These APCs then present the epitope peptides to T cells together with secondary co-accessory molecule-mediated messages that, in turn, trigger T- and B-cell clone proliferation. Consequently, this may be responsible for both maintenance of the antitumor immune response and also for the occurrence of irAEs when the immune response is redirected to self-antigens [9].

Existing & supposed biomarkers predictive of response to immunological checkpoint inhibitors

At present, the most relevant research fields concerning clinical and immune-biological elements predictive of response to PD-1/PDL1 blockade and autoimmunity are mainly focused on PDL-1 expression, as well as inflammatory infiltrate in tumor tissue, histology, gender, tumor mutation burden as a source of antigens, peripheral blood cytokine profiling and intra-tumor expression of specific immune-cell subsets. When considering the research of potential mechanisms for acquired immune resistance, researchers are evaluating T-cell exhaustion and co-existing additional immune checkpoints, along with mAb-related depletion of T cells due to anti-PD-1 mAbs being the most active CTL clones [11]. Considering their critical role in conditioning T-cell immune-priming and CTL-mediated tumor cell killing, it is reasonable to believe that differences in class I and II HLA haplotype could have an important role in conditioning either outcome and/or irAEs in patients receiving PD-1/PDL-1 blocking mAbs. There is clear evidence that tumor cells that acquire a homozygosity status for class I HLA by deleting one of the two parental allele genes become partially invisible. Therefore, they become refractory to PD-1 rescued immune effectors since they present a much lower number of epitopes available for CTL recognition [12]. Class I HLA upregulation induced by exposure to either gamma-interferon, cytotoxic drugs or ionizing radiation was able to enhance tumor cell susceptibility to specific CTL clones, which supports this hypothesis [13,14].

In this context, the study of CTL epitope peptide binding to HLA molecules has been considered a critical point for the development of vaccine strategies and anti-cancer active-specific immunotherapy over the last 30 years. Allele-specific amino acid consensus motifs have been largely described in the literature and categorized by Parker *et al.* and Rammensee *et al.* They created network algorithms able to identify the presence of epitope sequences and their potential binding affinity for each specific HLA allele, just by scanning the primary structure of known viral and tumor-derived protein antigens [15,16]. Both algorithms have allowed the identification of many HLA allele-specific immunogenic peptides. These have been tested in preclinical models including class I specific peptide vaccines from various TAAs including the carcino-embryonic antigen, human telomerase reverse transcriptase, prostate-specific antigen, parathyroid hormone-related peptide, thymidylate synthase poly-epitope peptide, EGFR, gp170, melan-A and many others [16].

Mechanisms at the basis of HLA haplotypes involvement in the prediction of response

The literature suggests that each protein antigen present in its primary structure includes one or more amino acidic sequences (epitopes) potentially able to bind different class I/II HLA isotypes. It is clear that both the number of epitopes and their relative binding affinity is completely different for each different HLA allele [17]. It is consequential that patients with different HLA profiles also have a completely different family of epitopes, which are available for immune-cell recognition and CTL-mediated killing, even in the presence of the same antigens. Therefore, we can speculate that different outcomes and frequency of irAEs in patients subjected to the same immune-checkpoint blockade, are largely influenced by a pre-existing immune competence and reactivity strongly related to the different amount of high affinity epitope peptides bound to class I/II HLA molecules. This could be dramatically different on the basis of the divergent HLA haplotype. We believe that different HLA haplotypes may influence the amount of efficient CTL precursors available for a direct antitumor response, long-term memory and continuous immune response maintenance, which are able to affect patients' survival. A different HLA haplotype is also correlated to a divergent susceptibility to autoimmunity, as demonstrated by the fact that specific alleles in class I and class II HLA have been already correlated to a high risk of rheumatoid arthritis and other auto-immune disorders [18]. Our group has recently shown that the survival of pretreated metastatic non-small-cell lung cancer patients receiving nivolumab was directly correlated to the occurrence of both irAEs and a treatment-related increase in extractable nuclear antigen, antinuclear antibodies and anti-smooth muscle antibodies [19]. This effect was explained as part of

an antigen cascade or antigen migration process, as recorded in other immunotherapy, chemo-immunotherapy and radio-immunotherapy models. More recently, we also found that the outcome, as well as the occurrence of irAEs of the same patients, also correlated to the expression of specific HLA allelic groups like *A*01*, *B*51*, *DRB1*03*, *DRB1*11*, etc.

Conclusion

We believe that the identification of lung cancer patients with a weak immune-reactive HLA haplotype could gain significant benefit by performing future combination studies where immune-checkpoint inhibitors are combined with anti-cancer vaccines. The latter are, in fact, able to trigger a T-cell immune response to cryptic antigens and epitopes, for which no clonal deletion or exhaustion occurs.

Additionally, the identification of hyper-immune-reactive HLA haplotypes may receive great attention in the future considering the clinical development of additional PD-1/PDL-1 immune-checkpoint blockers in combination with platinum doublets, anti-angiogenic drugs and/or radiotherapy as a front-line regimen in non-small-cell lung cancer patients. This development has been consequential to the promising results of rapid fast-track trials. Nevertheless, recent studies have found that the level of risk for immune-related deaths within the first 60 days of the treatment is very high due to massive immune-system overstimulation [20].

In summary, we believe that the correlation between treatment response to immune-checkpoint inhibitors and the occurrence of irAEs and HLA signature in cancer patients deserves further investigation in large perspective studies. Moreover, an accurate and real-world evidence-based multimodal definition of tumor immunogenicity at baseline, as well as HLA haplotype characterization, can be of help to define not only responsive patients but also patients with high risk of lethal irAEs.

Financial & competing interests disclosure

The authors have no relevant affiliations or financial involvement with any organization or entity with a financial interest in or financial conflict with the subject matter or materials discussed in the manuscript. This includes employment, consultancies, honoraria, stock ownership or options, expert testimony, grants or patents received or pending, or royalties.

No writing assistance was utilized in the production of this manuscript.

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