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REVIEW

Therapeutic cancer vaccines revamping: technology advancements and pitfalls

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Cancer vaccines (CVs) represent a long-sought therapeutic and prophylactic immunotherapy strategy to obtain antigen (Ag)-specific T-cell responses and potentially achieve long-term clinical benefit. However, historically, most CV clinical trials have resulted in disappointing outcomes, despite promising signs of immunogenicity across most formulations. In the past decade, technological advances regarding vaccine delivery platforms, tools for immunogenomic profiling, and Ag/epitope selection have occurred. Consequently, the ability of CVs to induce tumor-specific and, in some cases, remarkable clinical responses have been observed in early-phase clinical trials. It is notable that the record-breaking speed of vaccine development in response to the coronavirus disease-2019 pandemic mainly relied on manufacturing infrastructures and technological platforms already developed for CVs. In turn, research, clinical data, and infrastructures put in place for the severe acute respiratory syndrome coronavirus 2 pandemic can further speed CV development processes. This review outlines the main technological advancements as well as major issues to tackle in the development of CVs. Possible applications for unmet clinical needs will be described, putting into perspective the future of cancer vaccinology.

Key words: cancer, vaccines, immunotherapies

INTRODUCTION

Cancer immunotherapies (CIs) represent one of the most promising fields in oncology.¹ They aim to enhance immune system recognition of tumor cells, possibly leading to disease control or survival benefit.

CIs include cell therapies, antibodies, cytokines, oncolytic viruses (OVs), and cancer vaccines (CVs).^{2,3} Historically, early CI attempts had exploited the use of systemic cytokines, which were associated with unfavorable toxicity profiles, limiting their clinical applications.⁴ Over the years, growing knowledge in molecular biology, genomics, and cancer immunology has prompted the discovery of novel targets and therapeutic approaches.^{2,5,6} Notable examples are chimeric antigen receptor T (CART) cells and immune

checkpoint blockade (ICB). Both strategies provided clinical benefits in different malignancies,⁷⁻¹⁰ leading to their approval by regulatory agencies as well as to the 2018 Nobel Prize in Medicine.^{7,11-14} Regardless, different CIs are burdened by various escape mechanisms, including antigen (Ag)/human leukocyte antigen (HLA) loss, metastatic seeding of immunological sanctuaries, and unpredictable all-or-none or dissociated responses.¹⁵⁻¹⁷

CVs have also been tested with the aim of unleashing cancer-specific responses and establishing long-term immunological memory. However, results have been relatively disappointing, with most formulations failing to show clinical benefit and only one CV, Sipuleucel-T (Provenge), being approved by the Food and Drug Administration (FDA) in 2010.¹⁸⁻²⁰

In the past year, the record-breaking speed of vaccine development in response to the coronavirus disease (COVID-19) pandemic relied on manufacturing infrastructure and platforms previously built for CVs.²¹ New vaccine delivery systems, such as gene-based platforms, have been introduced for the first time into large-scale vaccination

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campaigns. Their favorable safety, immunogenicity, and efficacy profiles have been highlighted by the record-time approval of BNT162b2 and mRNA-1273, the first two FDA-approved vaccines against COVID-19.²²⁻²⁷

This work will focus on the major unresolved issues in cancer vaccinology, providing insights concerning technological improvements of different platforms, addressing open areas for clinical translation.

BIOLOGICAL AND CLINICAL ISSUES TO TACKLE

CV platforms are classically divided into four types: viral/bacterial, gene, peptide, and cell based, as depicted in Figure 1.

Most CV clinical trials so far have utilized cellular-, viral-, or peptide-based platforms, thanks to pre-existing knowledge regarding safety, immunogenicity, and manufacture.^{18,28} Until late 2014, 451 CV clinical trials had been conducted, with gene-based formulations representing <5%.^{29,30} Remarkably, the ratio of phase III : II CV clinical trials was as low as 1:21, highlighting a tight bottleneck in drug development processes.³⁰ In addition, most phase III trials ultimately failed to demonstrate efficacy data.²⁹ For example, the MAGE-A3 as Adjuvant Non-Small Cell Lung Cancer ImmunoTherapy trial failed to show increased disease-free survival in patients with surgically resected non-small-cell lung cancer (NSCLC) receiving a recombinant anti-MAGE-A3 protein vaccine compared to placebo.³¹ Similarly, the TeloVac trial did not show improved overall survival (OS) in locally advanced/metastatic pancreatic cancer patients by adding GV1001, a peptide-based vaccine against telomerase, compared to standard-of-care chemotherapy.³² Altogether, these results possibly originated from non-optimized vaccination strategies, non-ideal Ag selection, or greatly unexplored combinatorial strategies.

Nonetheless, despite numerous other CVs failing to prove efficacy in phase III trials, the entire field never came to a halt.³³ Indeed, strong evidence originating from virtually all trials across different platforms supported favorable toxicity profiles and immunogenicity.³⁰ These were the two foundational pillars on which cancer vaccinology resumed, envisioning novel platforms and trial designs to eventually attain positive efficacy results.^{29,34} After widespread disenchantments, a rejuvenation of the entire field has been witnessed, driven by key aspects warranting optimization to meet expectations.³⁵

Antigen choice

There are two classes of Ags to target: tumor-associated antigens (TAAs) and tumor-specific antigens. The former are non-mutated proteins, being either overexpressed (i.e. human epidermal growth factor receptor 2, or telomerase), part of tissue differentiation (i.e. tyrosinase, Melan-A), or cancer germline (i.e. MAGEs, NY-ESO), and not necessarily tumor specific. In contrast, the latter, comprising oncoviral Ags and neoantigens (NeoAg), are tumor specific, as shown in Figure 2. NeoAg arise from nonsynonymous mutations, which can be functionally relevant. Indeed, 'driver' mutations confer cell-

growth advantages and are clonally selected, as opposed to 'passenger' mutations, which do not affect the replication rate, and hence are less susceptible to clonal selection.^{36,37} Past CV trials preferentially targeted TAAs over NeoAg since the latter were harder to identify.³³ However, since TAAs are non-mutated proteins, immune responses tap into T-cell repertoires that are subject to central/peripheral tolerance.²²

In contrast, phase I/II clinical trials have shown that immune responses against NeoAg are not subjected to central or peripheral tolerance, alongside favorable toxicity profiles.³⁸⁻⁴¹ In the past years, faster and cheaper availability of next-generation sequencing technology and more refined bioinformatic prediction tools enabled clinical testing of personalized CVs targeting tumor-specific NeoAg, yielding promising early clinical data.⁴²

Tumor heterogeneity

Tumors are not single biological entities, as they evolve under diverse intrinsic and extrinsic pressures mainly imposed by treatment, immunity, metabolism, and the tumor microenvironment (TME).^{43,44} Importantly, tumors with a high degree of intratumor heterogeneity (ITH) have been linked to worse prognosis.⁴⁵⁻⁵⁰ Genetic and/or non-genetic mechanisms feed different types of ITH: spatial, temporal, immunological, and behavioral ITH.⁴³ As a major determinant of therapy resistance, ITH should be a fundamental aspect to consider to better guide therapeutic strategies.^{44,51} Theoretically, one approach to reduce ITH would be to conduct CV trials in patients with low-tumor burden and in frontline settings.⁵² Similarly to immune checkpoint blockers (ICBs), CVs may elicit more robust immune responses in treatment-naïve patients.^{53,54} Moreover, a bolder and promising proposal is to use CVs for immunoprevention of cancer, particularly in individuals with preneoplastic lesions.^{55,56}

Importantly, gene-based vaccines have the potential to better target ITH compared to the other platforms by eliciting Ag-specific immune responses against different epitopes.^{57,58} This could be achieved by inserting sequences encoding for different NeoAg within each vaccination shot.⁵⁷⁻⁵⁹ In addition, gene-based platforms potentially allow for indefinite rounds of vaccinations, following tumor evolution over time.⁶⁰ In this setting, the emergence of immunodominance, whereby immune responses preferentially focus on a fraction of the possible epitopes of an unknown protein, could probably blunt the effect of chasing ITH by inserting multiple sequences for diverse NeoAg, and the eventual emergence of such phenomenon shall be precisely assessed.^{61,62}

Immunomodulation: from 'cold' to 'hot' TME

A major hurdle undermining therapeutic CV efficacy is immune-evasive mechanisms, particularly in solid tumors.⁶³ Recognized mechanisms are T-cell exhaustion in inflamed tumors, lack of T-cell infiltration in immune-excluded tumors, and defective Ag presentation processes in immune desert tumors.⁶⁴ Recently, novel technologies to unravel TME complexity and heterogeneity have been

developed, such as mass cytometry and single-cell ‘omics’ (i.e. epigenomics, transcriptomics, metabolomics, proteomics).^{65,66} However, in this context, spatial localization of a given cell within the TME is often lost during sample preparation and sequencing procedure.⁶⁷ Thus, development of novel systems-based approaches of simultaneous single-cell analyses combined with spatial micro-architectural information remains a primary technological challenge.^{68–70} Potential strategies to heat up the TME and improve antitumor immunity are summarized in Figure 3.^{71–74}

Of note, interactions between tumor cells and their TME can destroy normal tissue homeostasis and shift the TME toward the metastasis-promoting state. In addition, metastatic tumors growing in different organs may consist of significantly different immune infiltrates as compared with the primary tumor site, triggering differential responses to immunotherapies.⁷⁵ For example, the comparison of the immune infiltrates of patient-matched primary versus metastatic breast cancers (BCs) evidenced a higher content of tumor-associated macrophages (TAMs) in metastatic sites, suggesting TAMs as a potential therapeutic target for metastatic BCs.⁷⁶

In addition, many studies have focused on how tumor metabolism imposes an immunosuppressive TME status.⁷⁷ Recognized TME metabolic derangements are, for example, low pH, hypoxia, aerobic glycolysis, fatty acid biosynthesis, accumulation of lactate and kynurenines as well as deprivation of glucose, glutamine, and tryptophan.⁷⁸ Targeting such metabolic alterations has been explored in preclinical models, while human translation studies have mainly investigated the role of indoleamine-2,3-dioxygenase (IDO) inhibition.⁷⁹ IDO is a rate-limiting enzyme upregulated in response to interferon-γ that catabolizes tryptophan, blunting T-cell responses.⁸⁰ IDO inhibitors have shown limited efficacy when utilized as single agents, thereby numerous clinical trials are ongoing investigating combinations with ICBs or CVs.^{81,82}

Another key determinant of cancer-immune interactions is the concomitant use of drugs with intrinsic TME modulator (TMEm) functions.⁸³ One example is cyclin-dependent kinase inhibitors, which have been linked with improved Ag-presenting processes and pro-inflammatory cytokine secretion, ultimately favoring immune escape via programmed death-ligand 1 upregulation.⁸⁴ In order to fully uncover immunological aftermaths of diverse drugs, their TMEm functions need to be tested and validated in disease-specific preclinical models.⁸⁵ For example, the CD73–adenosine axis has recently been recognized as a key druggable immunomodulatory pathway activated in glioblastoma and pancreatic ductal adenocarcinoma murine models, paving the way for clinical testing (i.e. ARC-8, NCT04104672).⁸⁶

Ultimately, recent studies suggest that the gut microbiome plays a critical role in modulating immune responses, also affecting response to ICB therapies. For example, commensal *Prevotella heparinolytica* has been shown to promote interleukin-17 (IL-17)-producing cells, accelerating

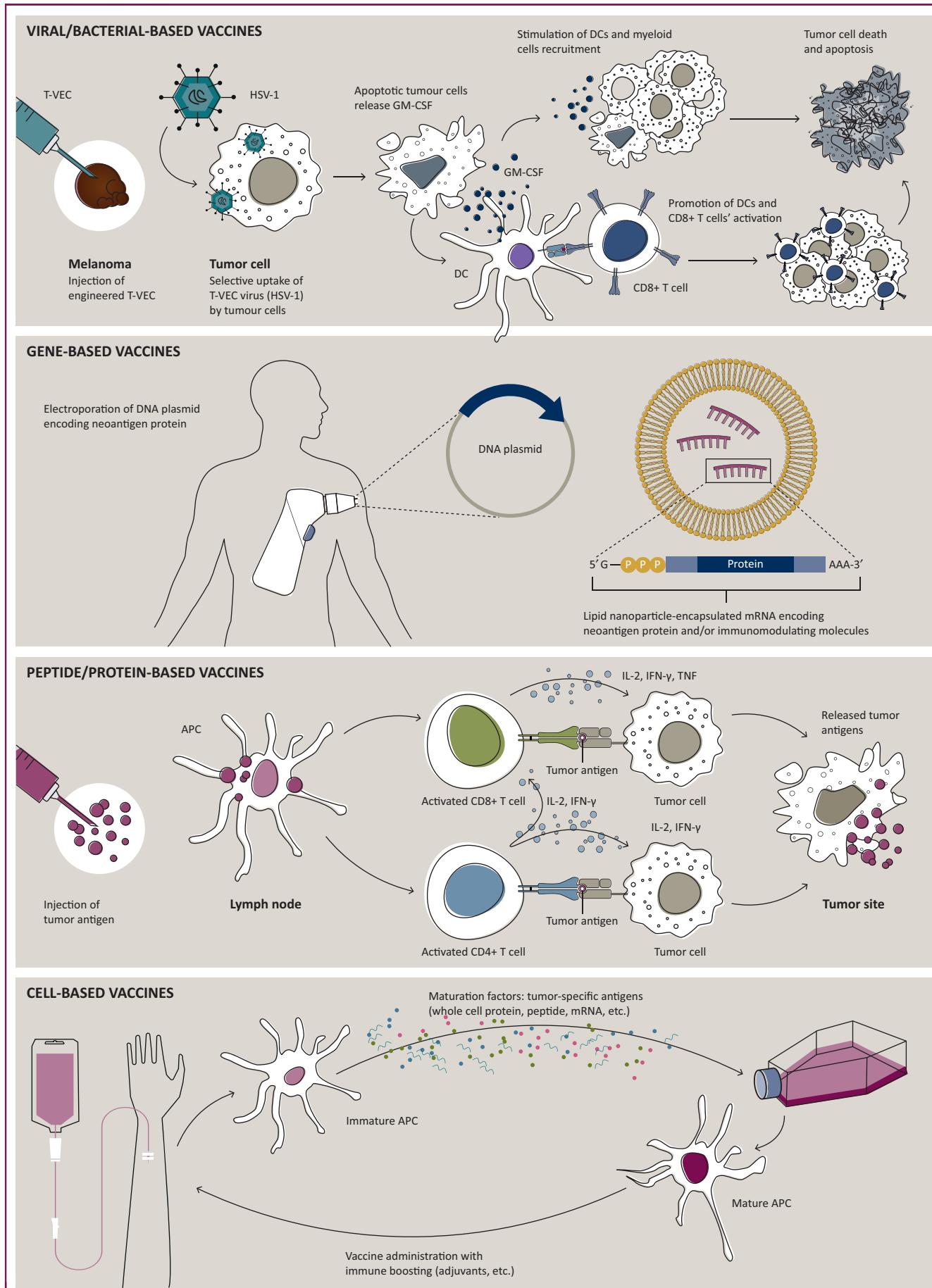
myeloma progression in a preclinical model.⁸⁸ Moreover, gut colonization with *Firmicutes* and *Faecalibacterium* genus was associated with improved clinical response rates and colitis in ICB-treated melanoma patients.⁸⁹ Similarly, the microbiota composition was shown to influence antitumor efficacy of NeoAg CVs.⁹⁰ In the field of pharmacobiotics, *Bifidobacterium longum* supplementation on anti-programmed cell death protein 1 (PD-1) therapy was recently suggested to curb tumor growth in a BC murine model.⁹¹ Importantly, the impact of the microbiome needs to be assessed across various tumor subtypes, as its effects are likely to differ.

TECHNOLOGY ADVANCEMENTS AND PITFALLS

Platform-related improvements

Substantial technological improvements have affected mainly gene- and viral-based platforms. Gene-based vaccines have historically lagged behind, mainly due to scarce safety data, large-scale manufacturing experience, reduced immunogenicity of early formulations, their instability, and poor uptake/specifity.⁹² However, their use has blossomed in recent years, mainly due to three major areas of technological advancements: structure optimization, novel delivery systems, and refined epitope prediction tools.^{93–96} Messenger RNA (mRNA) production has been standardized, with simpler manufacture processes obviating the need for cell culture or viral vector production.⁹⁷ Additionally, mRNA-based platforms in the pipeline allow for quick sequence adaptations in response to emerging resistance mutations.⁹² Lastly, another advantage of gene-based platforms is that they do not need exogenous, immunogenic cargos, potentially allowing for indefinite dosing/booster shots.⁹² Concerning RNA-structural optimization, recent technological advances aim at avoiding detrimental immune activation as well as increasing safety, biodistribution, and immunogenicity profiles.⁹⁸ Major breakthroughs have been sequence optimization, allowing for enhanced transcription and *in vivo* stability, Good Manufacturing Practice grade purification systems to avoid toxic leftovers, and the insertion of modified nucleotides with higher translation capacity and lower immunogenicity [via Toll-like receptor 7 (TLR7) avoidance], such as N1-methyl-pseudouridine (1mΨ).⁹⁸ Such modifications may expand the clinical indications of RNA-based vaccines: for example, a non-inflammatory, m1Ψ-based, vaccine structure design recently showed disease protection in a preclinical model of experimental autoimmune encephalitis.⁹⁹

In addition, mRNA sequences can be utilized not only to encode for tumor-specific Ags, but also immunomodulators (i.e. cytokines, ligands), monoclonal/bispecific antibodies, small interfering RNA, CART constructs, or combinations.⁹³ Indeed, several phase I/II trials are currently testing such approaches.⁹³ For example, mRNA-2752, a lipid nanoparticle (LNP) loaded with OX40 ligand (OX40L, also known as tumor necrosis factor superfamily, member 4 ligand), IL-23, and IL-36γ, is being tested against several malignancies



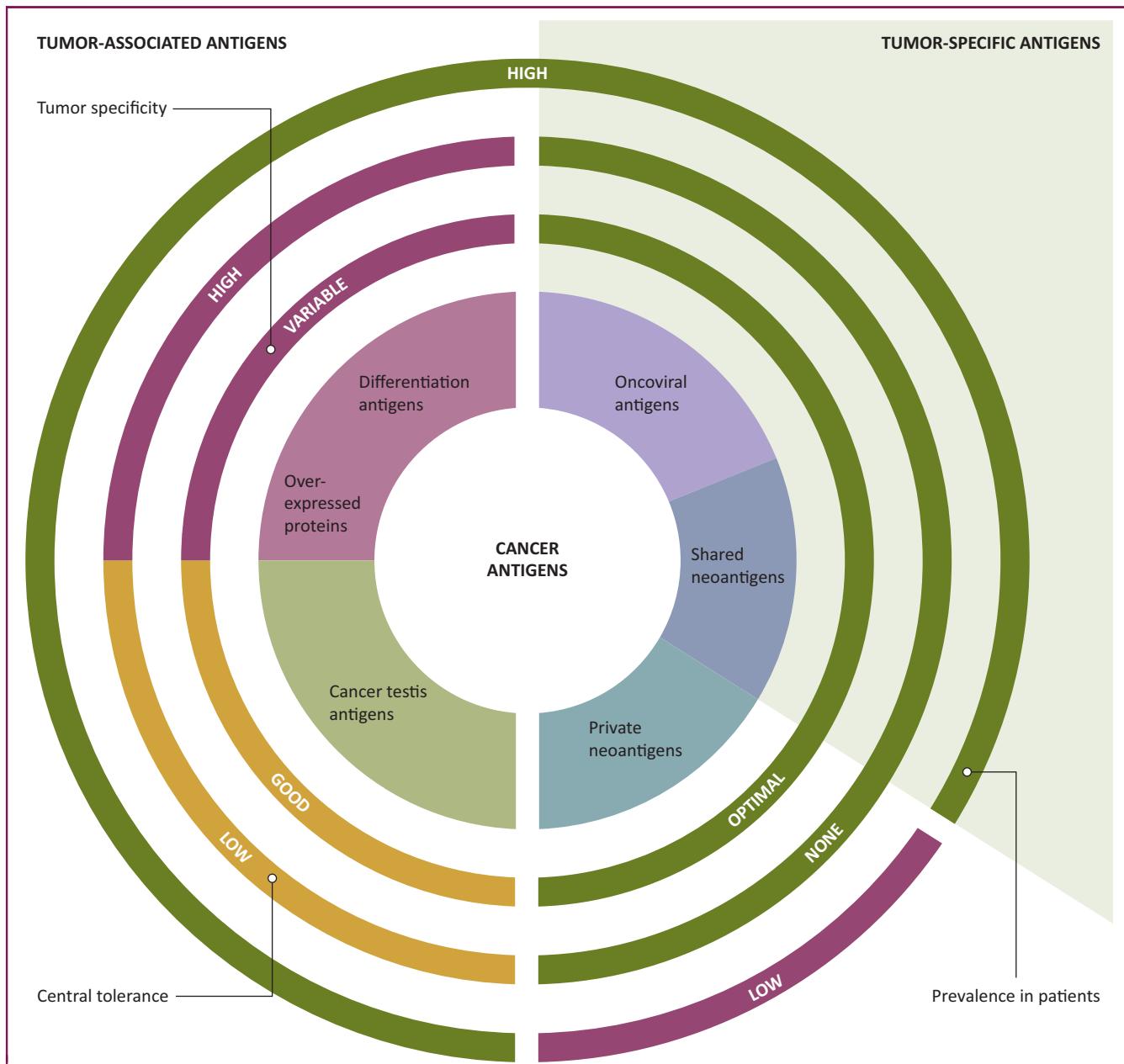


Figure 2. Targets for tumor vaccines fall into two general classes: tumor-associated antigens (TAAs) and tumor-specific antigens (TSAs).

TAAs are self-antigens that are either preferentially or abnormally expressed in tumor cells but may be expressed at some level in normal cells, as well. T cells that bind with high affinity to TAAs are typically deleted from the immune repertoire by central and peripheral tolerance mechanisms. TSAs, comprising oncoviral antigens and neoantigens, are tumor specific. Consequently, they are generally highly immunogenic, due to lack of central tolerance. TSAs associated to oncogenic viruses have been identified in virus-induced cancers such as human papillomavirus (HPV)-associated cervical cancer, hepatitis B virus-associated hepatocellular carcinoma, and human herpesvirus 8-associated Kaposi sarcoma. Tumor neoantigens are products of somatic mutations acquired during carcinogenesis. Neoantigens (NeoAgs) encoded by oncogenic driver mutations may be prevalent across patients and tumor types, so they are referred to as shared NeoAgs. However, the majority of NeoAgs are unique to individual patients' tumors (private NeoAgs). To date, through integration of tumor sequencing with the prediction of major histocompatibility complex (MHC)-binding epitopes, it is possible to tailor tumor NeoAg selection on the single patient level.²⁷ Tumor specificity 'optimal' (antigen present only in cancer cells), 'good' (antigen preferentially expressed in cancer cells), or 'variable' (antigen overexpressed/shared with healthy tissues). Central tolerance 'high' (antigen physiologically expressed in healthy tissues), 'low' (central tolerance present but antigens restricted to immune-privileged sites), or 'none' (no evidence of immunological tolerance).^{18,22}

in combination with durvalumab, demonstrating an acceptable safety profile, pro-inflammatory cytokine release, together with some cases of tumor shrinkage (NCT03739931).¹⁰⁰

In parallel, improvements have recently been made also in the field of viral vector vaccines,¹⁰¹ which typically utilize either live or non-replicating vectors.¹⁰² Major innovations include the introduction of different viral vectors, such as

Figure 1. Main vaccine formulations developed for cancer therapy.

Four types of vaccine platforms have been developed for therapeutic purposes: viral/bacterial-based, gene-based, peptide-based, and cell-based vaccines.²⁷ Examples of each different strategies are depicted. APC, antigen-presenting cell; DC, dendritic cell; HSV-1, herpes simplex virus 1; IFN- γ , interferon- γ ; IL-2, interleukin-2; mRNA, messenger RNA; TNF, tumor necrosis factor; T-VEC, talimogene laherparevec.

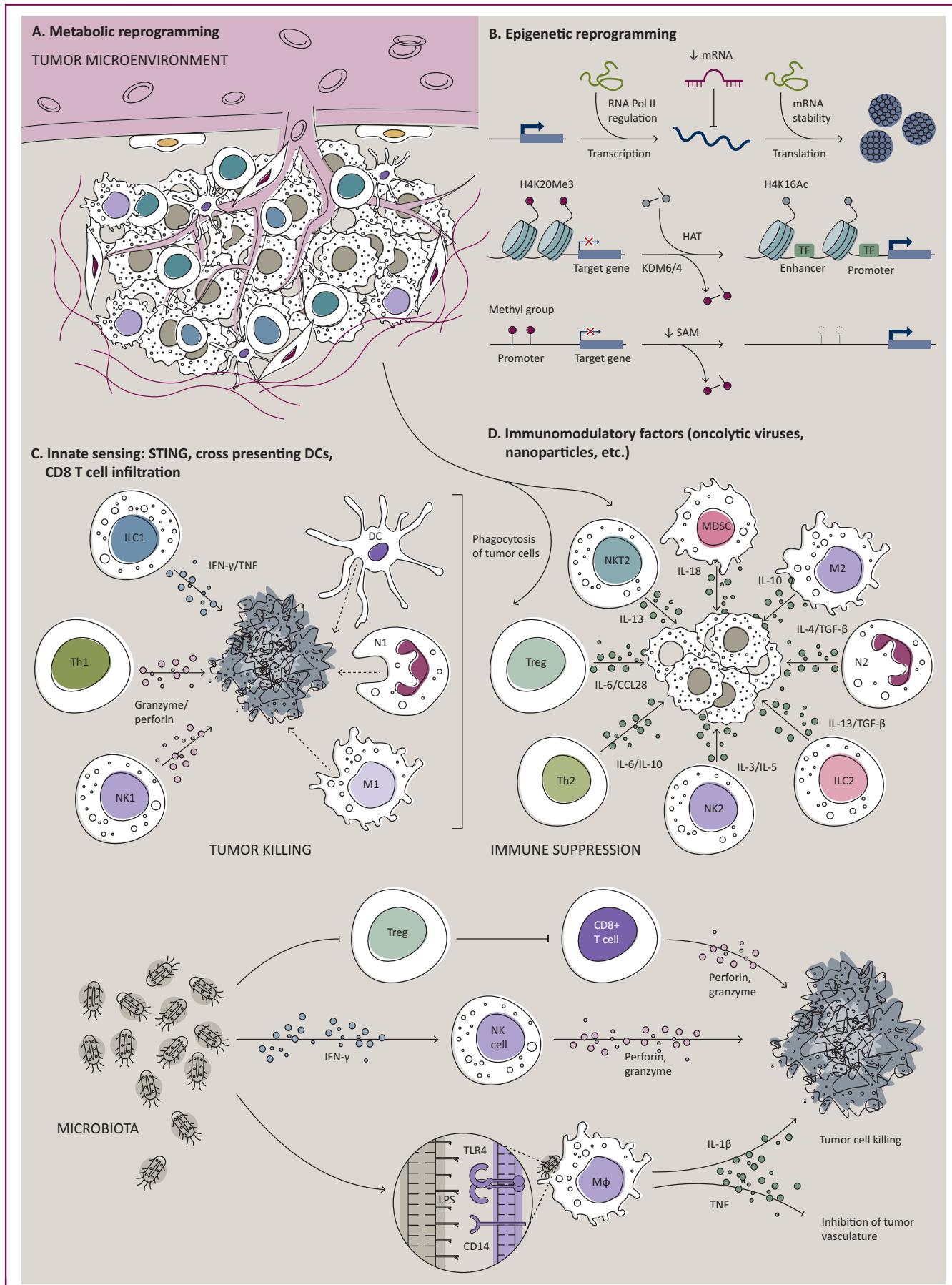


Figure 3. Potential strategies to heat up the TME.

adenoviruses (Ad) (i.e. non-human primate, NHP), parvoviruses (i.e. adeno-associated viruses), and poxviruses [i.e. Modified Vaccinia Ankara (MVA)].¹⁰³ Such platforms allow for remarkable versatility, carrying the genetic information for Ag expression, and induce potent T-cell responses.^{104,105} A major limitation is the high prevalence of pre-existing immunity against the vector itself, possibly reducing overall efficacy by limiting multiple vaccinations.¹⁰² To overcome this, prime/boost approaches based on two different viruses immunologically non-cross-reacting ('heterologous prime/boost') have shown promising results in humans.¹⁰⁶⁻¹⁰⁸ Alternatively, use of serotypes with low prevalence is also advised.¹⁰⁹ Moreover, complex manufacturing pipelines based on cell-culture systems and the possibility of residual viral replication also remain open areas of research and technological development.^{102,110}

Moreover, viral-based approaches also pertain OVs.⁷² Historically, they have been used as *in situ* vaccination agents to elicit immune responses against multiple, unpredicted epitopes, given their natural ability to replicate within cancer cells.⁷² Notably, the only OV being granted regulatory approval has been talimogene laherparepvec.¹¹¹ Subsequently, efforts have been made to arm OVs with immunomodulating agents, to couple them with immune-stimulating agents and/or to elicit Ag-specific responses.^{112,115,116} Remarkable responses and tumor immune infiltration have been recently documented with herpes simplex virus 1 G207 in pediatric high-grade gliomas.¹¹³ Moreover, the use of a genetically modified Maraba virus (MR1) has been validated in preclinical models to boost immune responses when administered after Ad-based vaccination, posing the rationale to test Ad:MR1 prime-boost combinations in humans (NCT02285816 and NCT02879760).¹¹⁴ Ultimately, strategies aiming at eliciting Ag-specific responses via OVs exploit virion coating with peptides of interest, exploiting either electrostatic forces (i.e. negatively charged virions and positively charged polylysine peptides) or membrane anchoring.^{72,112}

Novel delivery vehicles

Innovative compounds have been introduced in clinical trials, especially for RNA-based platforms, such as protamine combined, lipoplexes (LPX), or lipid nanoparticles

(LNPs).^{58,117,118} Among them, LNPs stand out as a major nanomedicine advancement, as witnessed by their implementation in the development of COVID-19 vaccines. In particular, BNT162b2 and mRNA-1273 exploit LNPs as vectors for spike protein-encoding mRNAs and are currently being administered in worldwide vaccination campaigns.^{23,24} For the first time, such gene-based vaccines have been linked with remarkable safety profiles in the general population, as well as in special subgroups such as cancer patients, pregnant women, and the elderly.^{26,119,120} Remarkably, antibody persistence was also detected up to 6 months after the completion of the second vaccination boost.^{25,161} Briefly, LNPs protect RNA sequence from degradation and allow for stringent spatial-temporal control. In addition, their lipid/moiety composition could be further modified to promote cell-/organ-specific targeting and adjuvant properties, further expanding the potential use of gene-based vaccines.^{97,121}

Bioinformatics and novel antigen prediction tools

NeoAgs may be exploited not only to indirectly estimate the likelihood of response to ICBs in certain tumors, but also to design personalized therapeutic CVs.^{122,123} To do so, standardized bioinformatic tools able to identify and prioritize possible tumor-specific mutations have been developed.¹²³ However, not all mutations result in neoepitopes that are recognized by the immune system, owing to HLA restriction/immunodominance.^{59,62} Therefore, HLA typing is also required to foresee potentially immunogenic epitopes.⁴² HLA class I-binding epitopes are predicted through algorithms and computational approaches trained on peptide-binding affinity data.^{42,126} Such algorithms have also been tested on mass spectrometry (MS) data of peptides presented on specific mono-allelic HLA-expressing cell lines to increase accuracy.^{123-125,127,128} Besides MS, methods for high-throughput detection of mutation-associated epitopes, such as mass cytometry and T-cell receptor clonotyping, are also being successfully implemented.⁴² Additionally, recent advances in big data analysis and artificial intelligence are contributing to improve neoepitope prediction.¹²⁹⁻¹³² In particular, deep learning approaches have been applied to large HLA peptide and genomic datasets from various human tumors (e.g. NetMHCpan, NetMHCIpan) to create a computational model of Ag presentation.¹²⁹ Moreover,

(A) Targeting cellular metabolism and certain metabolites within the TME to reduce immunosuppressive regulatory T cells (Tregs), myeloid-derived suppressor cells (MDSCs), tumor-associated macrophages (TAMs), or to generate metabolically fit T cells with better mitochondrial activity to protect against the tumor. Image captions: °, immune cell; ^, stroma cell; *, cancer cell. (B) Targeting epigenetic modulators to either promote immunogenicity of tumor cells or to re-educate TAMs, MDSCs, or Tregs for the support of T-cell effector functions.⁷¹ (C) Induced activation of the innate immune sensing system with stimulator of STING agonists or boosting cross-presenting DCs to promote tumor Ag-specific T-cell trafficking or function within the TME. (D) Creating an inflamed TME via OVs or nanoparticle delivery of key immunomodulatory factors.^{71,72} In this regard, OVs deserve a special mention, as they are capable of tumor-specific replication, which can provide a therapeutic opportunity.⁷² Briefly, OVs are naturally occurring or genetically engineered viral species, able to selectively kill cancer cells without damaging healthy tissue.⁷² Their mechanism of action is multimodal, as the injection of OVs in primary/accessible tumors induces immunogenic cell death of tumor cells, promoting the build-up of an inflamed TME.⁷¹ In fact, OVs support natural killer (NK) cell and T-cell immune responses, ultimately improving the lysis of OV-infected cancer cells. Moreover, the activation of antiviral innate immunity, such as type I IFNs and IFN-stimulated genes, promotes the release of damage- and pathogen-associated molecular patterns, the exposure of viral/tumor Ag, as well as the polarization of TAMs towards antitumor M1 phenotype within the TME.^{73,74} The consequent OV-mediated upregulation of immune checkpoints (i.e. programmed death-ligand 1 and programmed death-ligand 2, PD-L1 and PD-L2, respectively) provides a rationale for combination immunotherapy of OVs plus ICB. CCL28, chemokine (C-C motif) ligand 28; DC, dendritic cell; HAT, histone acetyltransferase; IFN, interferon; IL, interleukin; ILC1/2, innate lymphoid cells 1/2; KDM, histone lysine demethylase; lncRNA, long non-coding RNA; LPS, lipopolysaccharides; M1, classically activated macrophages; M2, alternatively activated macrophages; MDSC, myeloid-derived suppressor cell; miRNA, microRNA; N1, antitumorigenic neutrophil; N2, pro-tumorigenic neutrophil; NK, natural killer; OV, oncolytic virus; RNA Pol II, RNA polymerase II; SAM, S-adenosyl methionine; STING, stimulator of interferon genes; TAM, tumor-associated macrophage; TF, transcription factor; TGF-β, transforming growth factor-β; Th, T helper cell; TLR, Toll-like receptor; TNF, tumor necrosis factor; Treg, regulatory T cell.

large-scale cancer proteomic data-sharing efforts such as the Clinical Proteomic Tumor Analysis Consortium, the Tumor Neoantigen Selection Alliance, and the HLA Ligand Atlas of healthy human tissues will facilitate the enumeration of targetable tumor NeoAg.^{133,134}

Several obstacles currently make the design of therapies targeting NeoAg difficult. For example, among the vast number of putative NeoAgs, only a small fraction is ultimately validated, efficiently presented or shown to be immunogenic.¹³⁵ In fact, prediction tools are more specific for major histocompatibility complex-I (MHC-I) compared to MHC-II molecules, possibly due to a longer sequence and open ends of the latter.⁴² Also, additional evidence suggests that many tumor-specific epitopes may arise from non-translated sequences, for which most *in silico* tools have not yet been optimized.¹³⁶ Lastly, further studies to improve understanding of the factors that can affect NeoAg expression, presentation, and immunogenicity are necessary.⁴²

GETTING CANCER VACCINES TO THE CLINIC

Gene-based CVs

Clinical results regarding nucleoside-based CVs have been heterogeneous, due to the large number of phase I/II trials enrolling a limited number of patients, diverse primary endpoints, and fast-emerging technological advancements.⁹²

In general, gene-based vaccines comprise ~22% of vaccines in preclinical development (37/166) and ~37% of those in clinical development (10/27). Importantly, two of them received FDA licensing for COVID-19.^{137,138} In this context, two landmark clinical trials targeting TAAs and NeoAgs provided first evidence of efficacy as therapeutic approaches for cancer.^{40,135} Indeed, in the phase I Lipo-MERIT trial (NCT02410733), 89 advanced, ICB-treated melanoma patients received mRNA-based CV against up to four TAAs.¹³⁹ Remarkably, Th1-skewed, polyclonal T-cell responses following vaccination were observed, along with synergy with anti-PD-1 in ICB-experienced patients, ultimately resulting in durable response rates (35% in the combination group). Notably, the RNA was optimized to achieve highest expression in immature dendritic cells⁹⁶ and the liposomal delivery system elicited TLR-7-mediated type I interferon responses, easing T-cell expansion.¹⁴⁰ The phase I Individualized Cancer Immunotherapies (IVAC) MUTANOME trial (NCT02035956), testing an RNA-based platform targeting 2 TAAs and up to 10 NeoAgs in 13 advanced melanoma patients, showed the emergence of T-cell responses in vaccinated patients, with a reduction in the cumulative rate of metastatic events.⁴⁰ Of note, polyclonal T-cell responses were detected in all patients in both CD4 and CD8 compartments, and evidence of synergy with ICB.⁴⁰

Altogether, these trials provided evidence about heavily pre-treated, high-tumor burden, patient populations, highlighting the potential of gene-based platforms and their synergism with traditional immunotherapies.

Viral vector CVs

Several viral vectors have been evaluated in CV clinical studies.¹⁴¹ For example, a gorilla adenovirus (GAd)-derived, NeoAg-based CV was recently shown to synergize with ICB in preclinical tumor models, leading up to disease eradication.^{142,143} Importantly, viral vectors can be armed with multiple Ags of interest, such as prostate specific antigen/Mucin-1/brachyury in metastatic castration-resistant prostate cancer patients (NCT03481816), or with regulated immunomodulator expression, such as gene switches for IL-12 delivery in a preclinical model of glioma.^{144,145} In addition, two NHP Ad vectors are in clinical development for the delivery of NeoAg CVs: chimpanzee (ChAd68) and GAd20. Preliminary results in patients with advanced tumors have demonstrated robust and consistent induction of CD8 T cells against multiple NeoAgs upon vaccination with ChAd68 (Granite, NCT03639714, NCT03953235).

The above-mentioned induction of anti-vector immunity has been overcome by heterologous prime/boost. Such trials elicited higher immune responses than repeated vaccination with an individual viral vector.¹⁴⁶ Both self-amplifying RNA and MVA technologies are currently being used to boost NHP Ad vectors in clinical trials (NCT03639714). In this regard, the NHP/MVA prime/boost regimen with two vectors (GAd20 and MVA) is currently evaluated with a NeoAg-based vaccine for high microsatellite instable (MSI-H) tumors (NCT04041310). Instead, the Nous-209 vaccine is based on concomitant administration of four viral vectors encoding for 209 shared NeoAg peptides among patients with MSI-H tumors.¹⁴⁶

Adenovirus-vectored vaccines are also being tested to elicit responses in the central nervous system. In this context, a phase I, dose-escalation study was conducted with DNX-2401 (Delta-24-RGD) in 37 patients with recurrent high-grade glioma, resulting in 20% survival at >3 years.¹⁴⁷ Overall, the entire field of viral-based CV is advancing thanks to the exploitation of novel viral species and innovative strategies with other vaccination approaches, prompting their application in the oncologic setting.

Peptide-based CVs

Historically, most peptide-based CVs tested so far in the clinic showed variable signs of immunogenicity and clinical activity.¹⁴⁸ Two major improvements in this field have been the introduction of novel adjuvants as well as the use of synthetic long peptides (SLPs).¹⁴⁹⁻¹⁵¹ As opposed to short peptides, SLPs do not directly bind to major histocompatibility complex (MHC) class I molecules; indeed they require Ag-presenting processing for presentation to cytotoxic T lymphocytes with proper immune-stimulatory co-receptors.¹⁵² Moreover, SLPs also allow for multi-epitope targeting, as shown for TAS0314, a peptide containing four TAAs from Squamous Cell Carcinoma Antigen Recognized By T-Cells (SART)2 and SART3 proteins, in a preclinical model of SART2₉₃₋₁₀₁-expressing melanoma.¹⁵³ Other formulations of this approach are currently undergoing evaluation.¹⁵⁴

In addition, peptide-based CV formulations can also target patient-specific NeoAg. In this scenario, one of the most advanced CV products is represented by NeoVax, comprising up to 20 different SLPs with the immunostimulatory adjuvant poly-ICLC (a synthetic double-stranded RNA viral mimic that acts as a TLR3 agonist).³⁸ Clinical trials in advanced melanoma and glioblastoma have both demonstrated the emergence of polyfunctional, specific, Th1-skewed responses post-vaccination (NCT01970358 and NCT02287428).^{38,155} In the melanoma trial, four patients out of six had no recurrence up to 25 months after vaccination, while the two relapsing patients showed complete tumor regression after ICB therapy.³⁸ These studies highlighted the potential of such peptide-based CV formulations, which are currently being tested also in combination with other immunotherapies (NCT02950766 and NCT03929029).⁴² Moreover, another promising trial is represented by the phase Ib NT-002, assessing a personalized NeoAg CV, NEO-PV-01, targeting up to 20 NeoAgs predicted by bioinformatic analysis, as a first-line therapy for advanced non-squamous NSCLC with carboplatin, pemetrexed, and pembrolizumab (NCT03380871).¹⁵⁶⁻¹⁵⁸ The authors reported Ag-specific and durable (up to 1 year) immune responses, with ~55% of vaccine peptides eliciting measurable immune responses. Remarkably, overall response rates in the intention-to-treat and the vaccination populations were 37% and 57%, respectively.¹⁵⁷

Overall, concerning peptide-based CV formulations, research in the field of adjuvants as well as in the discovery of ideal antigenic targets is still needed to further improve immunogenicity and, ultimately, clinical efficacy.

Biotech and industrial perspectives

A key aspect of CV development efforts is the capacity of making early and objective treatment choices in order to select ideal candidates, a specific platform, eventual combinatorial agents, and vaccination schedules.¹⁵⁹

For RNA-based CVs, different aspects still need to be thoroughly assessed to boost their efficacy. One is their design, as LNP:mRNA mass ratio can be adjusted (from 10:1 to 30:1), implying, for example, a significant amount of LNP for multi-Ag candidates in a given dose.^{42,98} Moreover, differences in safety and immunogenicity profiles between non-replicating mRNA and self-amplifying mRNA vaccine sequences are largely unknown, and may have implications to improve sequence optimizations upon iterative development schemes.⁹⁷ In addition, early-phase clinical trials need to precisely capture the inflammatory components of the different mRNA vaccine formulations, given that several intracellular immune sensors are activated by RNA, in order to optimize the benefit (immunogenicity, efficacy) while reducing the risk (safety) profiles.¹⁶⁰ In this regard, safety and tolerability may limit multi-Ag approaches, and here preclinical studies will be crucial for development. Lastly, limited data exist on repeated administrations of mRNA vaccines in humans.¹⁵⁹ As the entire field accrues more data from human studies and current

COVID-19 vaccination programs, potential long-term safety and immunogenicity issues will need to be accurately collected and critically discussed.^{118,138}

Considering biotech and industrial implications, viral-based CVs face different issues. Importantly, manufacturing pipelines are more complex and require laborious cell-culture methods imposing complex purification and microbiological constraints.¹⁶² Moreover, replication-defective viruses need thorough (pre-)clinical validation regarding their replication capacity and the absence of systemic disease manifestations in frail sub-populations, such as immunocompromised individuals.¹⁶³ In addition, vaccine-related disease enhancement has been described in some preclinical models for severe acute respiratory syndrome coronavirus or respiratory syncytial virus vaccines and must be always considered.^{164,165} Moreover, punctual reports concerning toxicities as novel viruses are introduced in clinical practice must be thoroughly monitored by regulatory agencies.¹⁶⁶

Key aspects to consider in the development of a vaccination strategy, given a certain kind of mutation obtained from sequencing studies, are summarized in Figure 4. For example, tumor mutational burden (TMB)-high tumors should benefit more from multiple, personalized rounds of vaccinations against different predicted neo-epitopes, possibly in combination with ICBs or TME-altering drugs.⁹² Instead, off-the-shelf vaccination strategies should be envisioned in TMB-low tumors both prophylactically, against viral-associated epitopes or mutations conferring resistance to chronic concomitant therapies, or therapeutically, against known driver mutations. In general, these considerations must be continuously updated and re-evaluated considering the fast-changing technologic advances and data procurement.

FUTURE PERSPECTIVES

Since most CV clinical trials are small scale, data originating from them will need to be standardized in order to allow comparability and build large-scale reference datasets regarding immunogenicity, biomarkers, and efficacy readouts.¹⁸ In this way, patient stratification could identify subgroups potentially gaining benefit from CV programs.¹⁶⁷ In parallel, attempts to translate predictive biomarkers identified from ongoing research in ICB-treated patients may also help identifying patients most likely to respond to CVs. For example, a recent meta-analysis of transcriptomic and clinical data from >1000 ICB-treated patients across various malignancies identified clonal TMB, C-X-C Motif Chemokine Ligand (CXCL) 9/CXCL13 expression, Cyclin D1 amplification, and TNF Receptor Associated Factor 2 loss being predictive of ICB response.¹⁶⁸

Another concern is to match vaccination strategies with tumor biology/genetics. In fact, CVs can either be utilized as ready-to-use, off-the-shelf drugs, or as personalized products based on sequencing data.^{18,169} Cancer biology and data originating from large longitudinal sequencing studies in multiple malignancies must instruct different vaccination strategies in different clinical settings.¹⁶⁸ For example,

PLATFORM	Personalized (NeoAg)	Shared (NeoAg/TAA)	
MUTATION CLASSIFICATION	Nonsynonymous mut	Driver mut/TAA	Resistance mut/oncoviral
VACCINATION STRATEGY	Therapeutic (established disease)	Therapeutic (precursor stages)	Prophylactic (adjuvant, precursor stages)
TARGET SELECTION	Patient-specific NGS		Reference datasets
INTRA-/INTER TUMOR HETEROGENIETY	High		Low
#TARGETS	#mutations	One or few mutations	#mutations
COMBINATION THERAPY	Immunotherapies, TME-altering drugs	Immunotherapies, TME-altering drugs	Small molecules, endocrine therapy, others
BEST PREDICTED APPLICATION	TMB-high tumors	TMB-low tumors	
SCALABILITY/COST	Low/high	High/low	High/medium ^a -low <small>^adue to concomitant treatment</small>

Figure 4. Proposed antigen (Ag)-based cancer vaccination strategies.

Different mutations/biological dependencies may instruct various vaccination strategies and combinatorial agents. #, multiple; NeoAg, neoantigens; NGS, next-generation sequencing; TAA, tumor-associated antigens; TMB, tumor mutation burden; TME, tumor microenvironment.

vaccination strategies relying on products tailored on sequencing data should be most suited for patients carrying biomarkers predicting positive response to ICBs.¹⁶⁸ Conversely, tumors showing high oncogene addiction are characterized by driver mutations, which fall in specific loci and harbor few recurrent genetic alterations.¹⁸ Theoretically, these tumors could benefit from vaccination strategies aimed at targeting such recurrent driver mutations, possibly in the (neo)adjuvant setting, by means of ready-to-use, off-the-shelf CV products released on histologic information. In this regard, in 2019 Moderna & Merck opened a phase I clinical trial with the aim of targeting the four most common KRAS alterations in NSCLC, pancreatic, and CRC patients by means of an mRNA-based vaccine with or without pembrolizumab (NCT03948763). Importantly, the use of off-the-shelf CV products can also be applied in the prophylactic setting in patients under chronic treatment with targeted or endocrine therapies, to avoid recurrent mutations causing loss of response, as well as in patients with genetic cancer syndromes (i.e. familial adenomatous polyposis, Lynch syndrome).¹⁷⁰⁻¹⁷² Moreover, driver mutations, and their therapy-resistance mutation, may not be the solely targets in oncogene-driven tumors. In fact, oncogenic pathways often co-operate with other mutant proteins to promote disease progression.^{173,174} For example, KRAS exploits mutant TP53 in fostering disease growth in a pre-clinical model of pancreatic ductal adenocarcinoma.⁸⁷

The choice of combinatorial agents must consider tumor biology and TME-specific derangements, as previously discussed, together with the clinical setting in which these are introduced. This is because any combinatorial drug comes at the cost of possible added side-effects, and the toxicity/benefit ratio varies from patient to patient and from early to advanced settings. For example, in early stages, combinatorial regimens should aim at increasing CV

immunogenicity and foster the formation and persistence memory T-cell subsets. In the metastatic setting, instead, combinatorial drugs should achieve disease control in the short to medium term, allowing CVs to stimulate T-cell-specific immunity and/or re-invigorate ICB-driven responses.

Of note, growing evidence suggests a higher benefit of ICB therapies in circulating tumor DNA (ctDNA)-positive patients in several malignancies, with a favorable prognostic role of ctDNA seroconversion rates.^{175,176} Consolidated data concerning eventual prognostic/predictive roles of this biomarker could possibly instruct for the use of ctDNA seroconversion rate as a primary endpoint of (neo)adjuvant CV clinical trials, alongside long-term survival data (i.e. progression-free survival, OS) supporting eventual regulatory approvals.

Finally, in order to build positive momentum in the cancer vaccination field, four aspects should be strengthened: research and technology, clinical scenario, trial comparability, and global preparedness (Figure 5).

CONCLUSIONS

Suboptimal clinical trial designs, the use of CVs as single agents, sometimes with weak Ags, as well as the enrolment of advanced, heavily pre-treated patients, have been just some of the reasons that led to poor clinical trial results so far.¹⁷⁷ Nonetheless, enormous progress has been made in both oncology and vaccinology.²⁷⁻²⁹

Firstly, unprecedented in-depth, running, characterization of cancer genetics, including genetic determinants of therapy resistance, and the introduction of novel immunotherapies or TME-altering drug to combine CVs with in future clinical trials have broadened the spectrum of both TAA or NeoAg targets.¹⁷⁸ Moreover, bioinformatic prediction tools are becoming more refined with the

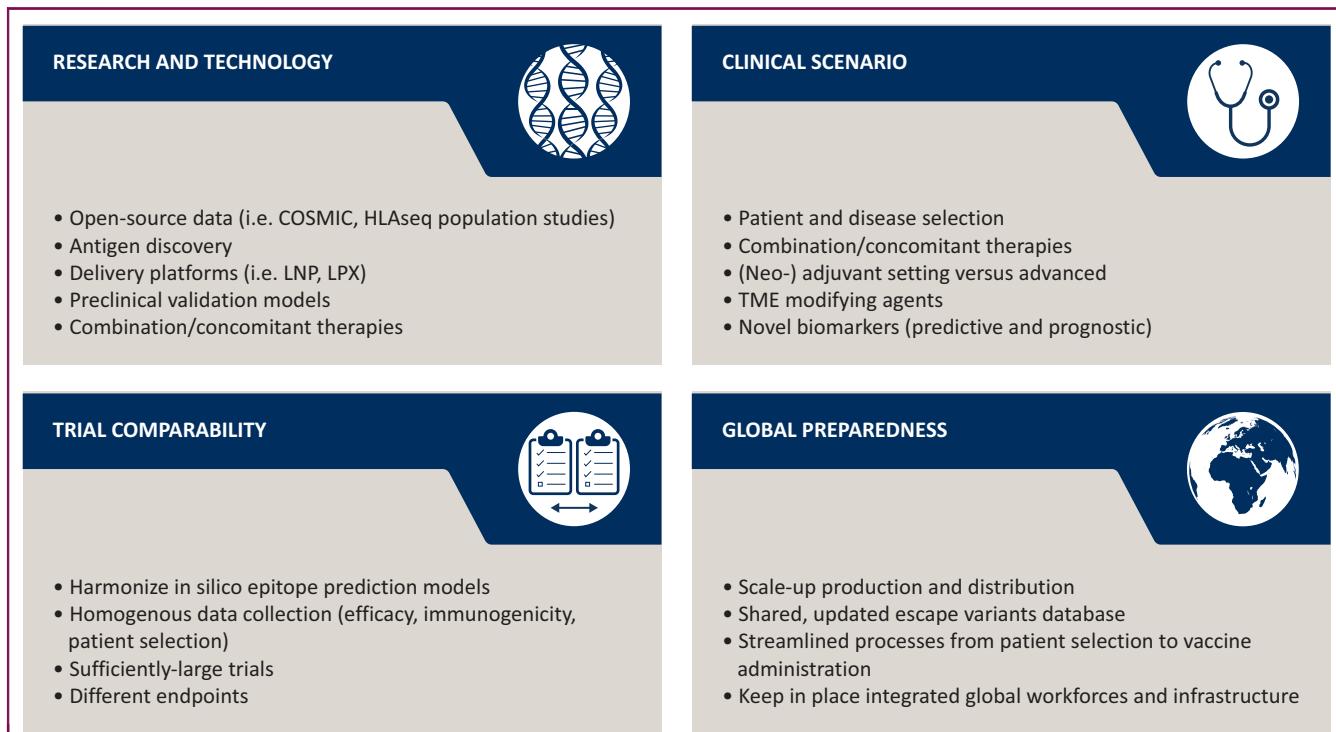


Figure 5. Key issues to boost applicability and improve clinical efficacy of future cancer vaccine programs.

Main areas of development for cancer vaccinology are the rapid introduction of technological advancements, the identification of clear populations that could benefit from CV programs, efforts to allow for comparability of different clinical trials, and the establishment of a global workforce able to sustain possible demand and supply chain. COSMIC, Catalogue of Somatic Mutations In Cancer; LNP, lipid nanoparticle; LPX, lipoplexes; TME, tumor microenvironment.

growing availability of tumor mutations alongside HLA sequencing population libraries (i.e. IPD-IMGT/HLA database).¹⁷⁹⁻¹⁸¹ Secondly, technological advances in the vaccinology field are occurring, especially regarding formulations (gene, viral, peptide based) and delivery systems, contributing to the time-record introduction of effective vaccines in the COVID-19 pandemic.²¹ In this scenario, research and innovation efforts to address COVID-19 provided large-scale evidence about the favorable safety and immunogenicity profiles of these vaccine platform technologies and point to the need to accompany CVs with interventions at the level of the suppressive TME. This momentum could, in turn, speed up the development of CVs employing novel technologies, which are showing promising, although immature, signs of efficacy in early phase I trials.^{42,98}

Importantly, the choice of ideal endpoints to allow for a hypothetical regulatory approval of such agents remains a matter of debate, as whether safety profiles should be considered according to a platform-based approach or to the single vaccine product. For these reasons, testing as per classical phase I-III schedule is still to be addressed.

Overall, there is rising optimism that technological advancements, data accumulating from worldwide vaccination campaigns, strengthened production processes and, importantly, clinical results from ongoing phase II/III trials will clarify the ultimate role of CVs in cancer treatment in the ensuing years.

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