

REVIEW ARTICLE

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Cancer vaccines: the next immunotherapy frontier

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After several decades, therapeutic cancer vaccines now show signs of efficacy and potential to help patients resistant to other standard-of-care immunotherapies, but they have yet to realize their full potential and expand the oncologic armamentarium. Here, we classify cancer vaccines by what is known of the included antigens, which tumors express those antigens and where the antigens colocalize with antigen-presenting cells, thus delineating predefined vaccines (shared or personalized) and anonymous vaccines (ex vivo or in situ). To expedite clinical development, we highlight the need for accurate immune monitoring of early trials to acknowledge failures and advance the most promising vaccines.

accines aiming to prevent infectious diseases are among the greatest medical advances of the 20th century, but the concepts underlying vaccination extend beyond prevention. Therapeutic vaccines designed to treat infections have moved into late-stage clinical trials with promising results¹, made possible by a burgeoning understanding of fundamental immunology that has enabled more potent vaccine formulation. Treating established malignancy with vaccines traces back to William Coley's injection of tumors with killed *Streptococcus* and *Serratia* in the 1910s² and Lloyd Old's similar approach with Bacillus Calmette–Guérin (BCG) in the 1950s³.

Despite some recent examples of vaccines that induced systemic regression of large tumors^{4,5} and prolonged survival⁶, small clinical trial sizes, marginal survival benefits and resource-intense approaches have held the field back from greater success and stirred well-justified skepticism. This is akin to the history of existing successful cancer immunotherapies, which have sparked new hope for patients with solid and hematologic malignancies despite repeated setbacks. For instance, numerous monoclonal antibody trials failed to show reproducible efficacy for nearly 20 years before the eventual success of rituximab in 1997 (ref. 7); anti-programmed cell death protein 1 (PD-1) antibody data lacked clinical efficacy for years before the first nivolumab data were published8; and many years of ineffective chimeric antigen receptor T cell (CAR T cell) clinical data prefaced their eventual success9. We propose that cancer vaccines are analogously poised for eventual success, given that they may currently show limited clinical progress but display clear rationale and compelling preclinical data for further development. Here we review this evidence and extrapolate a straightforward trajectory to the near future in which vaccines are likely to become standard anti-cancer therapies.

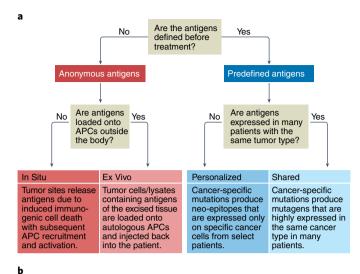
The success of other immunotherapies has drawn focus away from cancer vaccines, despite their distinct benefits. Although CAR T cells can be effective for cancers with identifiable tumor-specific surface antigens, vaccines have the potential to additionally target the broader set of intracellular antigens. Whereas checkpoint blockade can treat subsets of 'inflamed' cancers, infiltrated by previously primed tumor-reactive T cells, cancer vaccines have the potential

to newly prime tumor-reactive T cells. Concurrent progress in easier-to-use therapies has also diminished vaccine enthusiasm. For example, when the sipuleucel-T vaccine was approved with a small survival benefit, enzalutamide (an oral therapy) demonstrated greater survival benefit in higher-risk patients¹⁰. Similarly, the glycoprotein 100 (gp100) vaccine given with inpatient high-dose interleukin (IL)-2 demonstrated improved survival the same year that ipilimumab (an outpatient therapy) was approved, demonstrating a more significant survival benefit that was not enhanced by co-administration with the gp100 vaccine¹¹. Along the same lines, an idiotype vaccine trial demonstrating progression-free survival (PFS) benefit in combination with an aggressive chemotherapy regimen was supplanted by a gentler, more effective chemotherapy regimen^{12,13}.

The history of cancer vaccines has been the subject of excellent reviews¹⁴, most of which have focused on the physical structure of the antigen being introduced: whole tumor, tumor cells, protein, peptides (long or short), RNA or DNA (directly or virally); and the adjuvants with which antigen is introduced: carrier protein, cells (for example, dendritic cells (DCs)), proteins (for example, CD40 ligand (CD40L)) or chemicals (for example, oil-water emulsions and Toll-like receptor (TLR) agonists). Here, we classify current cancer vaccines differently, based on (1) what is known of a tumor's specific immunogenic antigen, (2) which patients' tumors express those antigens and (3) how the antigens become colocalized with professional antigen-presenting cells (APCs). Vaccines can incorporate either predefined (known) or anonymous (unknown) antigens (Fig. 1a). The former includes either predefined shared antigens (expressed in many patient tumors) or predefined personalized antigens (exclusively determined for each patient). Anonymous antigen vaccines can be colocalized with APCs either ex vivo (in a laboratory) or in situ (at the tumor site; Fig. 1a).

We consider two types of tumor-specific antigens (TSAs), including viral antigens and neo-epitopes resulting from non-synonymous somatic mutations, and two types of tumor-associated antigens (TAAs), including tissue-specific antigens and development-specific antigens (Table 1). All the vaccines discussed might mobilize T cell responses against both TSAs and TAAs, except for predefined

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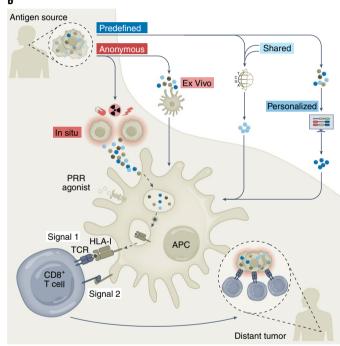


Fig. 1 | Cancer vaccine types. a, Schema of four vaccine types. Predefined vaccines require identification of antigens either by tumor biopsy and computational analysis (personalized) or pooled features across tumor type (shared). Anonymous antigen vaccines can colocalize antigens with APCs in the laboratory (ex vivo) or directly, at the tumor site (in situ). **b**, Categorization of four vaccine types by what is known of the TAA (predefined versus anonymous), which patients tumors express those TAAs (shared versus personalized) and how APCs encounter and load TAAs (ex vivo versus in situ).

personalized antigen vaccines, which generally use TSAs. In this latter case, it is possible that hotspot mutations in cancer-related genes could be present in the tumors of different patients sharing human leukocyte antigen (HLA) molecules¹⁵.

The uptake of tumor antigens by APCs is a critical event¹⁶ (Fig. 1b). A majority of TAAs are intracellular and thereby difficult to target with humoral responses or derived therapies such as monoclonal antibodies, CAR T cells or bispecific T cell engagers. Although intracellular TAAs can be detected by TAA-specific T cells through HLA molecules on tumor cells, deficits in tumoral

costimulatory molecules generally yield T cell anergy or exhaustion. Therefore, APCs, particularly DCs, are essential for anti-tumor T cell priming. The cDC1 (type 1 conventional DC) subset (or Batf3-dependent CD103+XCR1+CD141+Clec9A+ DCs) is specifically capable of cross-presentation: taking up exogenous antigens and presenting them on HLA-I to CD8+ T cells^{4,17,18}. Therefore, by activating tumor antigen-loaded DCs, cancer vaccines may induce immune responses against a large array of intracellular antigens. From this perspective, the different vaccine types differ merely by methods of colocalizing tumor antigens with cross-presenting DCs (Fig. 1b).

Predefined antigens

Predefined antigens can be further classified by the frequency of expression across patient cohorts. Shared antigens are those expressed in a sufficient proportion of patients such that vaccinologists can target these patient groups (frequently within patient subsets of tumor types) using standard testing. Shared antigen vaccines can thus target both TSAs and TAAs. As examples, the neo-epitope TSA epidermal growth factor receptor variant III (EGFRvIII) is expressed in ~25% of EGFR-overexpressing glioblastomas (GBMs)¹⁹ and the viral TSA human papilloma virus E6 and E7 proteins (HPV E6 and E7) are expressed in ~60% of oropharyngeal cancers and nearly all cervical cancers²⁰, whereas the TAA Wilms' tumor protein (WT1) is overexpressed in most acute myeloid leukemias (AMLs), breast cancers and Wilms' tumors²¹. Shared antigen vaccines are distinguished from personalized antigen vaccines in that the former can be assessed with standard testing such as cytology, immunohistochemistry and flow cytometry. Predefined, shared antigen vaccines have been the primary focus of preclinical and clinical research since the 1990s and have provided foundational lessons.

Personalized antigens are unique to the vaccinated patient. Personalized antigen vaccines have developed alongside the modern era of high-throughput gene sequencing and generally consist of TSA neo-epitopes that, in contrast to the shared TSA EGFRVIII or Kirsten rat sarcoma virus (KRAS)^{G12D}, are not sufficiently common to target a large group of patients. This approach allows the immune system to target tumors lacking known shared antigens but also places a burden on the vaccinologist to iteratively determine the optimally immunogenic epitopes. Immunogenic epitopes must bind with sufficient avidity to both the peptide groove of an HLA molecule and to the complementarity-determining regions of a reactive T cell receptor (TCR). Peptide-HLA (and, to a lesser degree, TCR) avidities can be modeled and estimated in silico for an individual patient's tumor mutanome, although these algorithms are still improving. Such approaches also pose a logistical burden of biopsying tumors for exome and RNA sequencing or for proteomic analysis of peptides actually presented by patient HLA class I molecules²². These techniques also require time and resources inherent in vaccine design and subsequent personalized neo-epitope pool production. The same tumoral genomic, transcriptomic and proteomic steps are required for shared antigen vaccine approaches by employing public datasets (for example, the Cancer Genome Atlas) compiled from prior patients' biopsies (Fig. 1b).

Predefined shared antigen vaccines. Shared antigen vaccines can be used as 'off-the-shelf' therapies, which are less resource intense and time consuming than personalized vaccines. Here we highlight a selection of optimal shared antigens ranked by their cumulative clinical and immunologic data in early trials²³ with substantial immunologic or clinical achievements (Table 2).

TSAs are uniquely found in tumor cells and often drive oncogenesis; one such subtype is viral antigens. Epstein–Barr virus encodes multiple antigens including latent membrane proteins (LMP1 and LMP2), which can be expressed in nasopharyngeal carcinoma, natural killer (NK)–T cell lymphoma and other tumors²⁴. Preclinical LMP1

Table 1 | TSAs and TAAs classified into four groups with examples

TSA		TAA				
Viral	Mutated self	Development specific	Tissue specific			
LMP1, LMP2	EGFRvIII	WT1	HER2/Neu			
HPV E6/E7	KRAS ^{G12C}	MAGE-A3	MUC1			
	BRAF ^{V600E}	NY-ESO-1	gp100			
BRAFV600E, v-raf murine sarcoma viral oncogene homolog B1 V600E mutation; MUC1, mucin 1.						

vaccine studies²⁵ and successful adoptive T cell-transfer clinical studies²⁶ have inspired clinical vaccine trials. Nonetheless, autologous DCs expressing LMP1 and LMP2 did not elicit antigen-specific T cells in patients with nasopharyngeal carcinoma²⁷. More recently, a modified vaccinia Ankara (MVA) virus expressing an Epstein-Barr nuclear antigen (EBNA)-LMP2 fusion protein showed boosting of CD4+ and CD8+ T cell responses²⁸, prompting a larger follow-up study (NCT01800071). Similarly, HPV E6 and E7 are viral TSAs that sequester tumor protein 53 (p53) and Rb proteins, promoting proliferation and tumorigenesis in squamous epithelia. Synthetic long peptide (SLP) vaccine (ISA101) elicited T cell responses and tumor regressions in a majority of patients with vulvar intraepithelial neoplasia²⁹, prompting a study combining ISA101 with anti-PD-1 therapy that demonstrated clinical responses higher than those from either therapy alone, even in programmed cell death ligand 1 (PD-L1)⁻ tumors³⁰. Both E6/E7-plasmid (VGX-3100)³¹ and E6/E7/ Fms-like tyrosine kinase 3 ligand (Flt3L)-plasmid (GX-188E) vaccines³² induced T cell responses associated with clinical efficacy, and a randomized phase II trial using an E6/E7/IL-2 MVA vector vaccine induced superior efficacy in high-grade cervical intraepithelial neoplasia³³. LCMVi vectors expressing E7 have also demonstrated potent induction of E7-specific T cells. These studies suggest that, with optimal (for example, viral) antigens, therapeutic vaccination can induce clinical remission in low-burden tumors and that DC mobilization might improve this.

Overexpressed mutant self proteins are another subclass of TSAs. EGFRvIII is a constitutively active, somatically mutated EGFR variant, commonly expressed in GBM and non-small cell lung cancer (NSCLC). Promising early results in anti-EGFRvIII CAR T cell-treated patients with GBM provide validation of this target³⁴. A phase II trial of an EGFRvIII 14-mer peptide vaccine (Rindopepimut) given with granulocyte-monocyte colonystimulating factor (GM-CSF) and temozolomide elicited humoral immune responses³⁵, although a phase III trial failed to show clinical benefit despite significant humoral responses³⁶. A randomized phase II trial of its combination with bevacizumab demonstrated greater humoral responses and an overall survival (OS) benefit as a secondary, underpowered endpoint³⁷. These data suggest that anti-tumor humoral responses may be insufficient and that vaccine success may depend on choosing optimal combination therapies.

By comparison, TAAs are not exclusively but preferentially found in tumor tissue and may constitute abnormally expressed or overexpressed proteins. This broad class can be divided into development-specific (that is, oncofetal, cancer-testis), tissue type-specific or tumor-enriched proteins.

WT1 is a development-specific transcription factor that contributes to oncogenesis²³. Initial trials of short (nine-mer) WT1 peptide vaccines yielded immune and clinical responses³⁸, followed by vaccination with an altered 'heteroclitic' WT1 peptide with greater HLA affinity (Galinpepimut-S) that induced T cell responses in a majority of patients with AML³⁹ and prompted an ongoing phase III trial (NCT04229979). Increasing vaccine-site DCs using GM-CSF⁴⁰ or

by injecting ex vivo peptide-loading DCs⁴¹ yielded greater immune efficacy, suggesting that antigen–DC colocalization may be important for enhancing clinical efficacy.

New York-esophageal cancer 1 (NY-ESO-1) is a cancer-testis antigen with restricted expression in embryonic, gonadal and cancer cells and has poorly understood function. It is highly expressed in synovial sarcomas and heterogeneously expressed in melanoma, ovarian and esophageal cancers⁴². Remarkably, despite patients' frequent spontaneous anti-NY-ESO-1 immune responses, more than 20 vaccine trials have ended overall unsuccessfully, as reviewed elsewhere⁴². Failure may be attributable both to suboptimal vaccine design and heterogeneous tumoral antigen expression as suggested by the impressive efficacy of targeting in synovial sarcoma, a rare tumor with homogeneous antigen expression⁴³. Seeking to improve the immunogenicity over protein-based vaccines, long peptide vaccination has been tested, yielding frequent CD4+ T cell responses but only rare CD8+ T cell responses. Attempts to increase DC antigen presentation and CD8+ T cell responses by co-administration of NY-ESO-1 with a TLR9 agonist still elicited only rare CD8+ cell responses⁴⁴. Impressively, a protein conjugate of a DC-targeting (anti-DEC-205) monoclonal antibody conjugated to NY-ESO-1 (CDX-1401) combined with TLR agonists induced CD8+ T cell responses in most patients alongside tumor regression⁴⁵, highlighting the need for sufficient DCs to benefit from this approach. Indeed, a randomized study of CDX-1401 with or without DC-mobilizing recombinant Flt3L46 demonstrated approximately threefold increases (86% versus 29%) in CD8+ cell responses with Flt3L. Although the study was not powered for clinical recurrence differences, it strongly suggests that effective CD8+ cell priming requires potent DC mobilization, antigen loading and activation.

Melanoma-associated antigen 3 (MAGE-A3) is a cancer-testis antigen with anti-apoptotic function preferentially expressed in melanoma, NSCLC and myeloma. The TLR4-agonist-adjuvant (AS02B) MAGE-A3 protein vaccine induced humoral anti-tumor responses but no apparent clinical benefit in a small randomized study⁴⁷; however, a randomized phase II trial adding a TLR9 agonist (AS15) to the same vaccine showed greater humoral and CD4+ T cell responses with greater clinical responses and prolonged survival⁴⁸. Surprisingly, large follow-up trials randomizing more than 6,000 patients did not show clinical benefit^{49,50}. One explanation for this failure may be that MAGE-A3 is heterogeneously expressed⁵¹; thus, targeting single, heterogeneous antigens likely promotes antigen escape. To address this point, a multivalent MAGE-A3-CEA-HER2-p53 vaccine (Tedopi) improved survival in subset analysis of a randomized study of patients with NSCLC, although prospective validation is needed⁵². Similarly, a multivalent melanoma vaccine that includes MAGE-A3, melan A, gp100 and tyrosinase (seviprotimut-L) yielded improved outcomes for a subset of younger patients in a large randomized trial⁵³. Most recently, an early-phase trial of prime-boost adenovirus (ChAdOx1)/MVA vaccine targeting MAGE-A3 and NY-ESO-1 for patients with lung cancer was initiated in collaboration with the Ludwig Institute in early 2022 (NCT04908111).

Human epidermal growth factor receptor 2 (HER2/Neu) is an EGFR family member kinase overexpressed in ~30% of breast cancers and smaller proportions of gastrointestinal and ovarian tumors that can be targeted by anti-HER2 monoclonal antibody. A single-epitope, HLA-I-restricted nine-mer peptide vaccine (nelipepimut-S) that induced transient CD8+ T cell responses failed to show clinical benefit⁵⁴, and, similarly, a single-epitope HLA-II-restricted 15-mer peptide (AE37) induced CD4+ T cell responses but had no clinical benefit⁵⁵. By contrast, a multi-epitope, combination HLA-I- and HLA-II-binding HER2 peptide vaccine induced durable (>1 year) CD8+ T cell responses in patients⁵⁶, suggesting that optimal immune responses occur with priming of both CD4+ and CD8+ T cells and that targeting multiple antigenic

Target	Cancer	Phase	Reference	Method	Outcome
Viral, TSA					
LMP1, LMP2	Nasopharyngeal carcinoma	II	27	Adenovirus-transduced autologous DCs	1/12 PR, 2/12 with SD
		lb	NCT01800071	MVA-EBNA1-LMP2	Primary outcome: ELISPOT quantification against EBNA1/LMP2
HPV E6/E7	Vulvar/anal squamous carcinoma	IV	NCT03051516	Prophylactic Gardasil	Primary outcome: time to recurrence of HSIL
	Cervical cancer	III	NCT03284866	HPV vaccination in HIV+/HPV+ patients	Primary outcome: occurrence of HSIL or cervical cancer
	Vulvar intraepithelial neoplasia	II	29	Twelve HPV16 E6/E7 synthetic long peptides (ISA101)	Clinical regression in 15/19 patients, 9/19 complete regression
	HPV ⁺ tumor or pre-malignant lesion	I	NCT02821494	TLR-2 agonist-conjugated synthetic long peptides (Hespecta)	Primary outcome: vaccine-induced biological response
	CIN	llb	31	E6/E7 synthetic plasmids (VGX-3100) delivered by in vivo electroporation	Histopathological regression in 53/107 vaccinated versus 11/36 individuals in the placebo group. T cell responses were associated with concomitant regression and viral clearance.
		II	33	MVA-E6/E7-IL-2 (tipapkinogen sovacivec)	Complete resolution in 17/31 vaccinated patients at 6-month follow-up
Mutant self, 1	TSA				
EGFRvIII	GBM	II	35	Temozolomide + Rindopepimut	65 patients, antibody response increased with treatment duration, associated with increased median PFS (9.2 months) and OS (21.8 months) compared to historical control.
		III	36	Temozolomide + Rindopepimut	745 patients, antibody responses but no increased PFS or OS in treatment group
		II	37	${\sf Rindopepimut} {\color{blue}\pm} {\sf Bevacizumab}$	16/36 patients had high antibody titers correlated with prolonged survival.
Development	specific, TAA				
WT1	AML	I	39	Galinpepimut-S	9/14 patients mounted immune response associated with 5-year survival.
		Ш	NCT04229979	Galinpepimut-S	Primary outcome: OS
		II	40	GM-CSF+ WT1 peptide + KLH	10/19 patients had SD, 1/19 had CR after initial progression.
		1/11	41	DCs electroporated with WT1 mRNA	Prevented or delayed relapse in 13/30 patients after chemotherapy
MAGE-A3	NSCLC	II	47	Recombinant MAGE-A3+ TLR4 agonist	MAGE-specific antibodies were highly induced in vaccine group; no clinical benefit.
		Ш	50	AS15	No increase in disease-free survival
		I/II	NCT04908111	Prime ChAdOx1-MAGE-A3-NY- ESO-1+booster with MVA- MAGE-A3	Primary outcome: safety and tolerability
	Melanoma	II	48	Recombinant MAGE-A3+ TLR9 agonist (AS15)	Three CRs and one PR correlated with increase antibodies and CD4+ T cells.
NY-ESO-1	Ovarian cancer	I	148	ESO157-ESO170 peptide + IFA	Anti-tumor T cells in 13/16 patients associated with 19-month PFS.
	Melanoma	I	149	DC pulsed with NY-ESO-1 long peptide and loaded with NK cell activator	7/8 patients with antigen-specific peripheral CD4 ⁺ T cells
Tissue specif	ic, TAA				
HER2/Neu (<i>ERBB2</i>)	Breast cancer	II	55	AE37 ± GM-CSF	298 patients, increased peptide-specific T cell response, increased DFS for patients with TNB
		IIb	150	Nelipepimut-S+trastuzumab	Hazard ratio for vaccinated patients with TNBC:controls was 0.26.
		II	NCT03632941	Alphavirus-like replicon particles expressing HER2 RNA (VRP-HER2)	Primary outcome: number of TILs and HER2-specific antibodies

Table 2 | Selected predefined shared antigen cancer vaccine trials and outcomes (continued)

Target	Cancer	Phase	Reference	Method	Outcome	
Viral, TSA						
gp100	Melanoma	I	151	WT or modified gp100-pulsed DC + KLH	7/15 patients responded to WT versus 2/12 patients responding to modified peptide-DC vaccination.	
		I	152	DCs loaded with melan A and gp100	4/25 patients with SD, 3/25 patients with partial response	
		Ш	59,60	gp100 peptide vaccine + IL-2	Improved median OS (17.8 months) versus IL-2 only (11.1 months)	
		III	11	lpilimumab + gp100	No improvement over ipilimumab monotherapy	
PAP Prost	Prostate cancer	III	6	GM-CSF-stimulated monocytes pulsed with PAP antigen (sipuleucel-T)	Three-year survival probability for treatment group was 31.7% compared to 23.0% in placebo group.	
		II	153	Sensitizing RT given before sipuleucel-T treatment	Sensitizing RT 1 week before sipuleucel-T did not affect immune parameters measuring response	
		I	154	Repeat booster injection with DNA encoding PAP	6/16 patients remained metastasis free at 2 years; median PSA doubling time increased 1.6-fold.	
		II	NCT03600350	DNA encoding PAP+ anti-PD-1	Primary outcome: PSA decrease	
Tumor enrich	ed, TAA					
p53	SCLC	II	64	Adenovirus-infected DCs injected with WT p53	One PR, 7 with SD	
	Epithelial ovarian cancer	I	65	p53MVA + gemcitabine	6/11 patients had CD8+ T cell responses; immune reactivity correlated with PFS.	
	Solid tumors	I	155	p53MVA + pembrolizumab	3/11 patients with SD, 2/3 patients with increased frequency of p53-reactive CD8+ T cells	
	Colorectal cancer	1/11	67	Ten overlapping p53 synthetic long peptides	p53-specific T cells induced in 9/10 patients, reactivity persisted in 6/9 patients for 6 months. No clinical results.	
IDO	Melanoma	I/II	71	IDO and PD-L1 peptide vaccine + nivolumab	80% ORR and 42% CR versus 41% ORR and 12% CR for historical control receiving anti-PD-1 therapy	

HIV, human immunodeficiency virus; KRAS G12C mutation; CIN, cervical intraepithelial neoplasia; KLH, keyhole limpet hemocyanin; SCLC, small cell lung cancer; PR, partial response; SD, stable disease; HSIL, high-grade squamous intraepithelial lesions; DFS, disease-free survival; TNBC, triple-negative breast cancer; RT, radiotherapy; PSA, prostate-specific antigen; IFA, incomplete Freund's adjuvant; ERBB2, proto-oncogene that encodes HER2/Neu.

epitopes is preferable. These lessons may be applicable in earlierphase HER2 vaccines using pulsed DCs and alphavirus vectors showing promising preliminary immune and clinical results⁵⁷.

gp100 is enriched in melanosomes and melanoma, and its target validity was demonstrated when gp100-redirecting T cell therapy induced survival prolongation⁵⁸. Early trials of a heteroclitic gp100 peptide vaccine with high-dose IL-2 induced tumor-reactive T cells in most patients and a 42% overall response rate (ORR), much higher than that with IL-2 alone⁵⁹. Following this result, a phase III trial of IL-2 with or without vaccine increased ORR (16% versus 6%) and survival benefit (18 versus 11 months)⁶⁰, although enthusiasm was tempered by high-grade IL-2-associated toxicity and deaths. Moreover, a randomized trial failed to show benefit of the gp100 vaccine alone or with ipilimumab¹¹. As the ORR of gp100 peptide vaccine monotherapy is <2%, these data suggest that even proven antigen targets require potent T cell priming, such as that provided by IL-2.

Prostatic acid phosphatase (PAP) is expressed on prostate epithelia and increases proportionately with cancer progression but is also expressed in other tissues⁶¹. After several smaller trials, a phase III

trial of sipuleucel-T, an autologous GM-CSF-stimulated monocyte mixture pulsed with PAP, demonstrated a 4-month survival benefit versus unpulsed APC vaccination. This promising Food and Drug Administration-approved proof of principle has had minimal clinical impact likely due to lack of clear immune or objective responses, expense and impracticalities of personalized therapy and concurrent development of easier, more effective alternatives. Addressing these shortcomings, an off-the-shelf DNA PAP vaccine has demonstrated PAP-specific T cells in a greater proportion of patients and demonstrated objective responses by positron emission tomography imaging. and is now being tested in combination with PD-1 blockade (NCT03600350). The prolonged survival demonstrated by vaccines can be obfuscated by the obstacles of vaccinating against single, imperfectly specific antigens and the benefits of off-the-shelf over personalized therapies.

p53 is altered in half of cancers and frequently lost in tumors but also deleteriously mutated and overexpressed. Given the complexity of targeting personalized mutations^{63,64}, small trials of wild-type (WT) p53 have included viral vector-encoded⁶⁵, DC-based⁶⁶ and long peptide pool vaccines⁶⁷ and combination with checkpoint

inhibition⁶⁸, demonstrating anti-p53 T cell responses in most patients yet few clinical remissions. Conversely, a study in patients with colorectal cancer vaccinated with mutant p53 demonstrated greater T cell responses to mutant peptides versus the corresponding WT peptides, further suggesting the tolerogenicity of self peptides⁶⁹. Another frequently enriched TAA, indoleamine 2,3-dioxygenase 1 (IDO), has been targeted by small-molecule inhibitors and used as a peptide vaccine⁷⁰. These studies provided rationale for a trial combining IDO and/or PD-L1 vaccination with PD-1 blockade, showing peptide-specific T cells and a 42% complete response (CR), significantly higher than anti-PD-1 therapy alone⁷¹. In sum, these data suggest that inducing T cells against self proteins, even those overexpressed in tumors, requires an elevated immune response for greatest efficacy.

Predefined shared vaccines targeting well-characterized tumor antigens present a method for widespread administration constrained by heterogeneous expression, insufficient immunogenicity or suboptimal partner therapies. The more promising approaches attempt to address these shortcomings (for example, Tedopi, seviprotimut-L, MELITAC).

Predefined personalized antigen vaccines. Unlike shared antigens that exist in many individuals, personalized antigens are unique to one patient and are most commonly neo-epitope TSAs (Fig. 1a). Targeting personalized antigens allows for exquisite specificity and unleashes T cells that circumvent thymic negative selection and, in combination with checkpoint blockade, mounts widespread T cell reactivity in responding patients72. Advances in next-generation sequencing and incorporation of additional immune-stimulating factors (for example, DC recruitment and activation, myeloid suppression, CD4+ cell help) render the entire production effort of this approach more feasible and effective. As such, designing personalized antigen vaccines includes variations of DNA and RNA extraction from tumor and germline tissue for exome and RNA sequencing as well as HLA typing (Fig. 1b). Somatic mutations are selected that are present in the tumor and absent in the germline, have low 'false discovery rate' and cause non-synonymous protein changes. Potentially immunogenic neo-epitopes are selected from among somatic mutations by in silico prediction of their binding to that patients' HLA alleles using approaches similar to the NetMHC algorithm⁷³. Highly expressed neo-epitopes are prioritized by assessment of tumoral RNA-sequencing data, from which generally up to 20 neo-epitopes are selected and good manufacturing practice (GMP)-grade neo-epitope peptides, RNA or viral vectors are produced. Neo-epitope vaccines can be given with adjuvants to optimize APC uptake (for example, liposomes) or APC activation (for example, pattern-recognition receptor (PRR) agonists) to aid their immunogenicity. While these approaches are time consuming and resource intense, increased sequencing bandwidth and new algorithms including machine learning algorithms for epitope prediction make these therapies continually more promising. Here, we highlight several approaches (Table 3).

An early personalized vaccine using a synthetic RNA vaccine encoding ten neo-epitope candidate targets elicited mostly CD4⁺ and some CD8⁺ neo-epitope-specific T cell responses and anecdotal objective responses in patients with metastatic melanoma⁷². These poly-specific responses could be enhanced by PD-1 blockade or abrogated by tumor cell HLA class I presentation loss and likely contributed to a significant reduction in longitudinal metastatic events. Similarly, an academic trial delivering 13–20 long peptides of predicted neo-epitopes (NEO-PV-01) induced more CD4⁺ than CD8⁺ cell responses specific for mutated peptide⁷⁴. A larger study combining neo-epitope vaccine with anti-PD-1 in 60 patients with melanoma, NSCLC and bladder cancer also noted neoantigen-specific T cell responses and clinical responses possibly higher than those expected with anti-PD-1 therapy alone⁷⁵.

To confirm that predicted neopeptides are present in tumoral HLA, a small study used peptide elution and mass spectrometry, followed by vaccination with neopeptide-pulsed autologous IL-12-producing DCs, demonstrating induction of polyclonal, antigen-specific T cell responses⁷⁶. Other small studies accomplished vaccine-site DC activation by incorporating neoantigens with poly-inosinic-polycytidylic acid, poly-L-lysine and carboxymethylcellulose (poly-ICLC) (NeoVax), leading to diverse T cell repertoires^{77,78}. An mRNA vaccine study (CONSORT) using a new neo-epitope-selection platform that prioritized tumor-infiltrating lymphocyte (TIL)-reactive candidates found mutation-specific T cells including those against a common mutation, KRASG12D (ref. 79). To facilitate delivery of neo-epitope RNA vaccines, packaging approaches using liposomes have also entered phase II trials (NCT03815058, NCT04267237), with promising preliminary immune and clinical response data. To minimize the time to therapy of personalized vaccines, GAPVAC-101 combines nonmutated 'shared' antigen vaccination followed by personalized neoepitope vaccination for patients with GBM. This strategy induced both central memory CD8+ T cell and type 1 helper T (TH1) cell responses with survival results possibly superior to those of historical controls⁸⁰. Another recent study demonstrated that a preclinical lung cancer neo-epitope vaccine could potentiate checkpoint blockade therapy by improving CD8+ T cell responses to subdominant antigens and preventing their differentiation toward dysfunctional CCR6+TCF1+ T_c17-like cells⁸¹. Other ongoing phase I studies are using recombinant heat-killed yeast to express neoepitopes (YE-NEO-001, NCT03552718), engineered RNA constructs expressing patient mutanomes (IVAC mutanome, NCT02035956)⁷² or APC-targeted delivery of RNA via lipoprotein complex (Lipo-MERIT, NCT02410733). More recently, a primeboost vaccine with adenovirus expressing neo-epitopes followed by a self-amplifying mRNA encoding the same antigens (GO-004 and GO-005) demonstrated neoantigen-specific CD8+ T cells in a minority of patients (NCT03639714, NCT03953235; Table 3)82.

Another tumor-specific mutation, although not oncogenic per se, is the unique immunoglobulin or TCR idiotype that arises from locus gene rearrangements and somatic hypermutation, which are generally maintained in transformed cells and the resulting myelomas, lymphomas or leukemias. Progressing from preclinical studies, tumor-specific idiotypes of patients with lymphoma have been tested as vaccines⁸³. The Favrille and Genitope phase III trials vaccinated rituximab- or chemotherapy-treated patients with lymphoma with idiotype linked to KLH administered with GM-CSF, with neither study yielding clinical benefit compared to placebo. A separate phase III trial (NCI-Biovest) using the same vaccine strategy demonstrated significant disease-free survival benefit when administered to patients in complete remission after chemotherapy, but frequent patient dropout before vaccination confounded the result's significance. Nevertheless, the equivocal results of idiotype vaccination are likely faults of implementation rather than concept, as anti-idiotype antibody therapy is effective84. Although GM-CSF has been shown to mobilize some APC subsets, other approaches, such as Flt3L, have been shown to be significantly more effective in priming adaptive immune responses85.

Predefined personalized antigen vaccines exploit the most specific tumor mutagens identified with the best computational methods available. Challenges remain to reduce the amount of required resources to produce personalized vaccines for each individual, to avoid immune escape of heterogeneous tumors and to mount effective anti-tumor CD8+ T cell immunity.

Anonymous antigens ex vivo or in situ

Instead of being classified by their antigen identity, anonymous antigens can be classified by their method and location of APC loading. Anonymous antigen ex vivo vaccines are derived from

Platform	Cancer	Phase	Reference	Method	Outcome
NEO-PV-01	Melanoma	lb	74,75	20 personalized epitopes + ipilimumab + nivolumab	Antigen-specific T cell response elicited; memory-like T cells seen with MPR noted in 14/19 patients; epitope spreading observed.
NeoVax	GBM	lb	77	20 personalized epitopes + poly-ICLC	Intracranial neoantigen-specific T cells also found in circulation, memory phenotypes.
	Melanoma	I	78	20 personalized epitopes + poly-ICLC	Neo-epitope-specific T cell reactivity, TCR diversity including non-vaccine neoantigens, memory phenotypes, tumor infiltration, epitope spreading
CONSORT	GI cancer	1/11	79	mRNA encoding 20 personalized TIL-reactive neo-epitopes	3/4 patients exhibited neo-epitope-specific T cells but no ORR.
RO7198457	Melanoma	II	NCT03815058	RNA encoding neo-epitopes in a liposomal complex ± pembrolizumab	Primary outcome: PFS
	NSCLC	П	NCT04267237	RNA encoding neo-epitopes in a liposomal complex ± atezolizumab	Primary outcome: DFS
GAPVAC-101	GBM	I	80	Shared antigen + neo-epitope dual vaccine + poly-ICLC and GM-CSF	12/13 patients had CD8+ cell responses to unmutated peptide; 11/13 patients had CD4+ cell induction and $T_{\rm H}1$ phenotypes against mutated peptide.
YE-NEO-001	Solid tumors	I	NCT03552718	Personalized recombinant heat-killed yeast expressing multiple neo-epitopes	Primary outcome: TEAEs
IVAC mutanome	Melanoma	I	72	Poly-neo-epitopic-coding RNA vaccine	Immune response against vaccine antigens detected in 13/13 patients; 60% of 125 selected neo-epitopes elicited a T cell response.
Lipo-MERIT	Melanoma	I	NCT02410733	Naked RNA and RNA-lipoplex delivered systemically	Primary outcome: adverse events
GRT-C901/2	Glandular and epithelial cancers	1/11	82	Prime-boost self-amplifying mRNA lipoplex ± nivolimumab/ipilimumab	Four patients in GO-004 showed neoantigen-specific CD8+ T cells; 1/3 patients in GO-005 showed mutation-specific CD8+ T cells.
Anti-idiotype	Lymphoma	III	156-159	Tumor-specific idiotype fused to KLH+GM-CSF	No significant differences in treatment groups compared to control.

excised tumor cells that are lysed and delivered to autologous APCs (Fig. 1b). Anonymous antigen in situ vaccines rely on endogenous APCs that are induced to uptake antigen at or near the tumor site, potentially following therapy-induced immunogenic cell death. Contrary to predefined antigen vaccines, anonymous antigen vaccines may include a larger number of antigens and even new antigen types, such as peptide fusion epitopes⁸⁶ and post-transcriptionally produced epitopes⁸⁷, which are technically difficult to identify and not included in most neo-epitope pipelines.

Anonymous antigen vaccines ex vivo, APC colocalized. Ex vivo antigen isolation may require extraction of tumor cells (excisional biopsy), processing raw tissue into a more antigenic form and colocalization with APCs. Injected tumor cells may be taken up and their antigens may be presented by APCs, or the tumor cells themselves may present their antigens to T cells. The defining feature of this approach is the ex vivo isolation of antigens and colocalization with APCs (Fig. 1b and Table 4).

HSPs such as gp96, HSP70 and HSP110 have been shown to chaperone neo-epitopes for APC uptake and cross-presentation without being immunogenic themselves, and preclinical tumor-derived HSP vaccines induced anti-tumor immune responses, providing evidence for clinical development⁸⁸. Large randomized trials demonstrated that vaccination with autologous tumor-derived

peptide–gp96 complexes (HSPPC-96) failed to improve survival for patients with melanoma⁸⁹ or renal cell carcinoma⁹⁰. A subsequent study of patients with GBM receiving HSPPC-96 showed that tumoral PD-L1 expression negatively correlated with survival⁹¹, prompting a follow-up study combining HSPPC-96 with anti-PD-1 antibody (NCT03018288).

Allogeneic tumor cell-based vaccines are derived from tumor biopsies subsequently transformed into immortalized cell lines and consequently enriched for commonly mutated TAAs (for example, p53, KRAS, EGFR). Several early trials of engineered allogeneic tumor cell vaccines supported the benefit of anonymous antigen vaccines, although larger randomized trials (for example, Canvaxin, Melacine, prostate GVAX, Lucanix) have been generally unimpressive⁹². Immunodominance of alloantigens could be a problem in this case.

Despite numerous trials showing promising tumoral immune infiltration 93 , autologous tumor cells transfected to express GM-CSF (personalized GVAX) infused in patients after hematopoietic stem cell transplantation did not provide survival benefit in patients with AML 94 . Autologous tumor cells transfected to express GM-CSF and with anti-furin shRNA to prevent transforming growth factor (TGF)- β production (gemogenovatucel-T) demonstrated promising single-arm trial efficacy in Ewing's sarcoma 95 . In a randomized phase IIb trial for patients with ovarian carcinoma, the

Table 4 And	nymous ex vivo en	gineered	d cancer vaccine	trials and outcomes	
Platform	Cancer	Phase	Reference	Method	Outcome
HSP					
HSP	Melanoma	III	89	gp96 complexed to autologous tumor antigen (HSPPC-96 or vitespen)	Subset of M1a/b stratified patients showed improved DFS after 10+ vaccinations.
	Renal cell carcinoma	III	90	HSPPC-96	No differences in RFS between treatment versus control arms. $ \\$
	GBM	II	91	HSPPC-96	$\label{eq:high-PD-L1} High PD-L1 patients, mOS of 18.0 months versus \\ Iow PD-L1 patients, mOS of 44.7 months$
		II	NCT03018288	Temozolomide + pembrolizumab + HSPPC-96	Primary outcome: 1-year OS
		II	160	HSPPC-96 post-resection	37/42 patients alive at 6 months; 12/41 alive at 12 months; lymphodepleted patients demonstrate decreased OS.
		Ш	NCT01814813	Bevacizumab + HSPPC-96	Primary outcome: 5-year OS
Allogeneic tum	or based				
GVAX	Melanoma	II	161	Allogeneic irradiated melanoma line recombinantly expressing GM-CSF	Active circulating monocyte counts were higher after injections.
	Pancreatic cancer	II	NCT02004262	Allogeneic pancreatic tumor cells secreting GM-CSF	No significant difference in mOS between treatment and control groups
		III	162	Allogeneic pancreatic cancer GM-CSF-secreting cells	Patients in trial arm died more than in control arm, terminated early.
Allogeneic tumor cells	Melanoma	II	163	Allogeneic melanoma cell lysate with detoxified Freund's adjuvant (Melacine)	Patients expressing HLA-A2 and HLA-Cw3 had 17% greater 10-year OS over observation group.
Autologous tun	nor based				
Engineered autologous tumor cells	AML/MDS	II	94	Autologous tumor cells transfected to express GM-CSF (GVAX) following allo-HSCT transplant	63% OS in GVAX arm versus 59% OS in placebo arm ($P = 0.86$)
	Ewing's sarcoma	I	95	Ex vivo transfection of DNA encoding GM-CSF and anti-furin shRNA into tumor cells and re-injection (Vigil)	11/15 patients survived for 1 year, 17.2-month improvement in survival of treated patients.
		Ш	NCT03495921	$Vigil \pm temozolomide \pm irinotecan$	Primary outcome: 5-year PFS
	Ovarian cancer	IIb	96	Vigil in post-chemotherapy patients	RFS and OS in BRCA-WT patients
		II	164	Vigil	Mean RFS increased from 481 to 826 d from time of procurement
	Solid tumors	I	165	Vigil	93% survival at 1 year, ELISPOT test positive in 12/12 patients tested after two cycles
BCG	Colorectal cancer	III	97	Autologous cells with BCG	Four-year RFS: 88% for vaccinated versus 74% for unvaccinated
Autologous tumor-pulsed DCs	Glioma	I	98	Either autologous tumor lysate- or synthetic peptide-pulsed DCs	Median survival of 34 months for lysate– DC-treated patients versus 15 months for peptide–DC-treated patients
	GBM	III	16,166	DCs pulsed with autologous tumor cell (DCVax-L)	108/331 patients alive at 30 months post-surgery. mOS was 23.1 months for vaccinated patients compared to 15–17 months for standard-of-care patients
		II	NCT03435952	DCs + autologous tumor lysate culture + GM-CSF (AV-GBM-1)	Primary outcome: 3-year OS
		II	NCT03400917	Surgery + chemoradiation + AV-GBM-1	Primary outcome: 3-year OS
	Ovarian carcinoma	II	NCT02033616	DCs + autologous tumor lysate	Primary outcome: 5-year OS
	NHL	1/11	100	Ex vivo, heat-shocked, UV-C-treated whole-tumor lymphomas co-cultured with DCs	3/18 objective radiographic CR and 3/18 PR
Autologous DCs versus autologous tumor cells	Melanoma	II	99		DC vaccine median survival of 43.4 months versus tumor cell vaccine median survival of 20.5 months

AML/MDS, AML/myelodysplastic syndrome; HSCT, hematopoietic stem cell transplantation; NHL, non-Hodgkin's lymphoma; HSPPC-96, HSP peptide complex 96; shRNA, short hairpin RNA; mOS, mean OS.

gemogenovatucel-T cohort, despite worse performance status and greater macroscopic residual disease, still demonstrated a trend toward improved recurrence-free survival (RFS) (hazard ratio of 0.69, P=0.078) and longer RFS and OS among patients with BRCA-WT disease (hazard ratio of 0.51, P=0.020), suggesting the need for a dedicated study of this cohort 6. A phase III trial of BCG admixed with tumor cells (OncoVAX) elicited cutaneous hypersensitivity indurations and non-significantly improved RFS and OS (P=0.330) despite promising results in stage II colorectal cancer 7. These studies prove that anticipating clinical efficacy in large trials from immune responses in small trials is not always straightforward.

Autologous tumor lysate-based approaches may be preferable to shared antigens, as suggested by a study comparing parallel cohorts of autologous GBM tumor lysate-pulsed DCs versus GBM shared antigen-pulsed DCs98. This analysis found a correlation between decreased regulatory T cell (Treg) ratios and OS, including median survivals of 34 months versus 15 months favoring the autologous approach (DCVax-L), prompting an ongoing phase III trial (NCT00045968). To assess whether autologous tumor cell-based vaccines are as effective as autologous tumor lysate-pulsed DCs, a randomized phase II trial comparing the two demonstrated median survivals of 43 versus 21 months, favoring DC vaccination (P=0.19) in patients with melanoma⁹⁹, prompting follow-up studies in GBM (NCT03400917) and ovarian carcinoma (NCT02033616). Another inspiring DC vaccine using heat-shocked, autologous lymphoma-pulsed DCs demonstrated an increase in tumor-specific T cells, which correlated with the systemic tumor regressions seen in six of the 18 treated patients¹⁰⁰. More recently, in a pilot study of 25 patients with ovarian cancer, autologous DCs with oxidized autologous tumor cell lysate were pulsed either as monotherapy or with anti-vascular endothelial growth factor A (VEGF) monoclonal antibody and chemotherapy, inducing anti-neo-epitope and anti-tumor T cell responses associated with prolonged survival¹⁰¹. In sum, these data suggest that autologous tumors are better sources of antigens and that DCs are more effective antigen presenters than lymphoma cells themselves. Overall, anonymous antigen ex vivo vaccines are promising for their greater potential to present the full spectrum of tumor antigens as compared to predefined antigen vaccines and their demonstrable efficacy in inducing systemic tumor regressions¹⁰⁰. Still, these are limited by the resource commitment of creating personalized, GMP-compliant products for each patient, which has slowed their development.

Anonymous antigen vaccines in situ, APC colocalized. Anonymous antigen in situ vaccines are conceptually similar to ex vivo vaccines and bypass developing custom, GMP-compliant therapies for each patient. Although there are many types of in situ vaccines, their effective use should induce APC recruitment and tumor antigen loading and activation such that the APC can effectively cross-prime tumor-reactive T cells. In situ vaccination combines the immunologic benefits of presenting the full spectrum of tumor antigens with the practicality of off-the-shelf approaches. Numerous types of intratumorally administered agents including viruses, PRR agonists and other immune stimulants may be effective in situ vaccines if they can induce a systemic anti-tumor immune response or a vaccinal effect. Major advances across these therapy types (Table 5) have been largely driven by an increased understanding of the APC presenting tumor antigens.

Dendritic cells. Given that tumors both exclude and inactivate DCs¹⁰², studies have attempted to replenish them intratumorally by direct administration, intending their subsequent uptake and presentation of tumor antigens. Autologous DCs, matured and activated ex vivo, have been injected in this manner, increasing intratumoral cytokine levels (for example, IL-12p40, IL-8, tumor necrosis factor (TNF)) that correlate with stable disease and prolonged survival¹⁰³.

Alternatively, immature DCs with increased phagocytic capacity have been injected alongside rituximab and GM-CSF following low-dose radiotherapy 104 . Frequent T cell responses and regressions at local and distant tumors correlated with the magnitude of effector responses, demonstrating the critical role of rigorous immune monitoring. A similar trial using IFN- α -activated DCs and rituximab but omitting radiotherapy induced lymphoma-specific CD4+ and CD8+ T cell responses and regressions at untreated tumors 105 . These two separate trials highlight the potential of endogenous colocalization of APCs and antigen to induce systemic tumor regressions. Additionally, immature, adenoviral-infected DCs expressing CCL21 were intratumorally injected in patients with NSCLC and induced tumor-infiltrating and circulating CD8+ T cells, with an upregulation in tumoral PD-L1 expression, correlating with systemic responses 106 .

Flt3L. Flt3L is the primary hematopoietic progenitor growth and differentiation factor responsible for mobilizing DCs, particularly the cross-presenting subset cDC1. Thus, Flt3L administration may be a more practical approach to replenish intratumoral DCs instead of their direct injection. Indeed, localized radiotherapy with Flt3L injection led to abscopal responses in nine of 29 treated patients with NSCLC¹⁰⁵. A phase I study in which Flt3L- and herpes simplex virus 1 (HSV1)-thymidine kinase (TK)-expressing adenoviral vectors were injected into GBM tumor cavities following resection demonstrated immune cell infiltration and prolonged survival compared to contemporary controls¹⁰⁷. Patients with low-grade B cell lymphoma treated in a phase I-II trial with intratumoral Flt3L, poly-ICLC and low-dose radiotherapy showed initial results of memory CD8+ T cell recruitment to untreated tumor sites associated with systemic tumor regression, with some lasting months to years4. A follow-up trial combines in situ vaccination with PD-1 blockade for patients with lymphoma, breast or head-neck cancer (NCT03789097). Although progress with Flt3L has been impeded by daily administration and limitation of available clinical reagents, several easier-to-use Flt3L formulations are entering the clinic (for example, NCT04747470). These data highlight the potential of DC recruitment in situ to elicit tumor-reactive T cell responses and persistent systemic remissions.

TLR agonists. TLRs are single-pass transmembrane PRR family receptors expressed on numerous leukocyte subsets such as myeloid cells and DCs that recognize structurally conserved pathogen-associated molecular patterns. Ten human and 13 murine TLRs have been identified, each with distinct pathogen-associated molecular pattern recognition. Synthetic TLR agonists have been developed to activate several human TLRs with promise to initiate anti-tumor immune responses.

TLR9 is an endosomal receptor highly expressed in many murine DC subsets, primarily in human B cells and plasmacytoid DCs, but not in cross-presenting cDC1 cells. Most TLR9 agonists are hypomethylated CpG-enriched oligonucleotides, classified as either CpG-A, CpG-B or CpG-C, which induce activation and proinflammatory cytokines (for example, type I IFN) in plasmacytoid DCs, B cells or both. Despite significant IFN induction and clinical enhancement of pathogen vaccines, TLR9 agonists are poor inducers of de novo human CD8+T cell responses compared to other PRR agonists¹⁰⁸. Despite promising early results¹⁰⁹, a large phase III trial reported a 9% ORR with the CpG-B tilsotolimod plus ipilimumab, similar to ipilimumab alone (NCT02644967, NCT03445533); studies for other tumor types are ongoing (NCT03865082). A trial in which a virus-like particle containing a CpG-A (CMP-001) was injected into patients with anti-PD-1-refractory melanoma demonstrated systemic regression as monotherapy and a 28% ORR with pembrolizumab (NCT02680184)¹¹⁰. Similarly, a CpG-C (SD-101) combined with pembrolizumab in a small study demonstrated a 78% ORR in anti-PD-1-naive patients but only a 15% ORR in

Platform	Cancer	Phase	Reference	Method	Outcome
TVEC	Melanoma	III	125,167	HSV1-derived virus producing GM-CSF (TVEC) + pembrolizumab	50/295 patients in TVEC arm achieved CR versus 1/141 in the GM-CSF arm.
		II	168	TVEC + ipilimumab	38/98 ORR in combination group versus 18/100 ORR in ipilimumab-alone group
		III	NCT02263508	Pembrolizumab + TVEC	Primary outcomes: 2-year PFS, 5-year O
Vaccinia virus	Hepatocellular carcinoma	IIb	169	Best supportive care ± vaccinia virus expressing GM-CSF (PexaVec)	mOS was 4.2 months for vaccine group and 4.4 months for unvaccinated group.
Adenovirus	GBM	1	170	Selectively replication-competent adenovirus in Rb/p16-defective cells (DNX-2401)	18/25 patients with tumor reductions, $5/25$ with PFS ≤ 3 years
	Retinoblastoma	1	171	Integrin-binding adenovirus expressing hyaluronidase selectively replicative in Rb-defective cells (VCN-01)	1/2 patients had intravitreal tumor regression
Parvovirus H1	GBM	I	172	WT rat parvovirus (H-1PV)	Improved PFS and OS compared to historical controls, although underpowered
	Pancreatic cancer	I/II	NCT02653313	H-1PV	Primary outcomes: safety and tolerability, humoral response, pharmacokinetics, shedding of viral genomes
Coxsackievirus	Bladder cancer	I	173	Intravesical coxsackievirus A21±mitomycin C (CAVATAK)	One histological CR, immunogenic cell death noted in vaccinated patient tumors, increased IFN-γ-induced genes
Reovirus	Glioma	II	174	WT reovirus (pelareorep)	10/18 patients with SD, 1/10 PR
	Solid tumors	1	175	Pelareorep + radiotherapy	14/14 patients with objective SD or PR
Allogeneic DCs	Renal cell carcinoma	I/II	NCT01525017	Allogeneic DCs stimulated by recruiting and activating factors	No adverse events, vaccinated patients' median OS extended from ~15 months to 42.5 months.
Autologous DCs	Solid tumors	I	103	Autologous DCs activated with GM-CSF, BCG and IFN-γ (DCVax-Direct)	SD and induction of IL-8 and IL-12 was associated with greater survival.
	Lymphoma	II	104	i.t. co-injection of low-dose rituximab, GM-CSF and autologous immature DCs following radiation	7/13 patients showed increased T cell response correlated with clinical responses in local and distal tumors.
		I	105	Rituximab + unloaded DCs activated with IFN- α and GM-CSF (IFN-DCs)	OR in 4/8 patients, 3/8 CRs
	NSCLC	I	106	Adenoviral-transduced DCs expressing CCL21 (Ad-CCL21-DCs)	4/16 patients with SD, median survival of 3.9 months
Flt3L	NSCLC	II	176	Checkpoint blockade + localized RT and Flt3L	Abscopal effect noted in 5/9 patients. Partial response and PFS achieved in 5/7 patients previously treated with checkpoint inhibitor.
	GBM	I	107	Flt3L and HSV1-TK adenoviral vectors injected into tumor cavity following resection, followed by valacyclovir infusion	Increased tumor infiltration of inflammatory cells in preliminary analysis
	Lymphoma	1/11	4, NCT01976585	i.t. Flt3L + low-dose radiotherapy + poly-ICLC	8/11 patients with tumor regressions, 3/11 with abscopal response
	Lymphoma, breast or head/ neck cancer	1/11	NCT03789097	anti-PD-1 + Flt3L + radiation + poly-ICLC	Primary outcome: DLT
Live bacteria	Solid tumors	I	177	Salmonella expressing Escherichia coli cytosine deaminase + 5-FU	No objective tumor regression; 2/3 patients had tumor-localized bacterial growth.
		I	128	Attenuated C. novyi-NT	5/7 patients with SD
		1	NCT03435952	anti-PD-1+i.t. <i>C. novyi</i> -NT+doxycycline	Primary outcome: MTD
	Prostate cancer	I	178	Non-virulent live bacteria injected intravenously	Stable disease was noted at doses eliciting immune responses.

Table 5 | Anonymous in situ loaded cancer vaccine trials and outcomes (continued)

Platform	Cancer	Phase	Reference	Method	Outcome
TLR9 agonist	Melanoma	III	NCT03445533	Tilsotolimod (IMO-2125) + ipilimumab	ORR of 8.8% for combination versus 8.6% for ipilimumab
		1/11	109	IMO-2125 + ipilimumab	ORR of 22% compared to ipilimumab alone
		1/11	NCT02644967	IMO-2125 + ipilimumab + nivolumab	Primary outcomes: safety and objective responses
		1	NCT02680184	i.t. virus-like particle containing CpG-A (CMP-001) + pembrolizumab	Primary outcome: dose escalation
		lb/II	111	Synthetic class C CpG-ODN (SD-101) + pembrolizumab	ORR of 78% for PD-1-naive patients, 15% for PD-1-experienced patients
	Solid tumors	II	NCT03865082	IMO-2125 + nivolumab + ipilimumab	Primary outcome: ORR
	Lymphoma	1/11	5	Low-dose RT + 24-mer ODN (PF-3512676)	ORR of 27% and one patient with complete clinical response, three PRs, eight with stable disease
		1/11	112	SD-101 + low-dose irradiation	ORR of 27.5% with 6/29 demonstrating responses at distant tumors
		1/11	179	Radiotherapy + SD-101	Median tumor size reductions in treated (68%) and distant (24%) lesions
TLR3 agonist	Solid tumors	Ш	NCT01984892	Poly-ICLC	Terminated early due to low enrollment
		1	118	Nanoplexed poly-I:C (BO-112)	3/13 patients with PR and 10/13 with SD
		1/11	NCT02643303	Tremelimumab + durvalumab + poly-ICLC	Primary outcomes: 4-month PFS, safety, ORR, PFS and OS at 15 months
	Lymphoma	1/11	NCT03789097	Radiotherapy, Flt3L, poly-ICLC + pembrolizumab	Primary outcomes: DLT, ORR
TLR4 agonist	Pancreatic cancer	I	120	Immature DCs + TLR4-binding component of inactivated <i>S. pyogenes</i> (OK-432)	2/9 patients survived at 5 years.
	Merkel cell carcinoma	I	121	Glucopyranosyl in stable emulsion (G100)	2/3 patients were recurrence free after 19 months and one CR.
	Lymphoma	II	122	G100 + pembrolizumab	Improved tumor shrinkage, PR, trend to improved PFS with combination
	Pancreatic adenocarcinoma	1/11	NCT00795977	OK-432/Picibanil + i.t. DC injection	Primary outcome: MTD, DLT. Results not published.
	or HNSCC	I	NCT01149902	Cyclophosphamide, docetaxel, OK-432 and autologous immature DCs	Primary outcome: safety. Results not published.

HNSCC, head and neck squamous cell carcinoma; Rb/p16, retinoblastoma/p16 protein; IFN, interferon; i.t., intratumoral; CCL21, C-C motif chemokine ligand 21; 5-FU, 5-fluorouracil; DLT, dose-limiting toxicity; MTD, maximum tolerable dose; NT, non-toxic lacking alpha-toxin; ODN, oligodeoxynucleotide.

anti-PD-1-experienced patients¹¹¹. SD-101 was also studied with radiotherapy for low-grade lymphoma, leading to systemic tumor regression in six of 29 patients¹¹². Prior studies of the CpG-B PF-3512676 (ref. ⁵) reflect similar results, possibly facilitated by high tumoral TLR9 expression. Overall, these data demonstrate that, while TLR9 agonists can induce intratumoral inflammation, that alone may be insufficient. If tumor antigen presentation to CD8+T cells is critical, these antigens may need to be cross-presented by cDC1 cells, which do not strongly express TLR9.

TLR3 is primarily expressed on DCs, particularly cDC1 cells, and recognizes double-stranded RNA. It is the only described MyD88-independent TLR and signals via TIR domain-containing adaptor-inducing IFN- β (TRIF) to activate downstream nuclear factor (NF)- κB and IFN regulatory factor 3 (IRF3), among other pathways. The widely studied TLR3 agonist poly-ICLC (Hiltonol) is a synthetic complex of poly-inosinic-polycytidylic acid, poly-Llysine and carboxymethylcellulose that activates distinct APC subsets via TLR3 and the RIG-I-like receptor (RLR) MDA-5 (ref. 113). Anecdotal reports of T cell activation, tumoral infiltration, local tumor regressions and prolonged survival after intratumoral

poly-ICLC treatment have been described for patients with liver cancer¹¹⁴ and head and neck cancer¹¹⁵. Combining intratumoral poly-ICLC injection with radiotherapy and tumor lysate-pulsed DCs induced type I IFN expression, tumor-specific T cells and stable disease in a majority of patients as well as remarkable prostate cancer abscopal tumor regressions¹¹⁶. As noted, durable abscopal tumor regressions were observed in patients with lymphoma treated with an in situ vaccine composed of Flt3L, radiotherapy and poly-ICLC⁴, prompting a follow-up study combining this approach with pembrolizumab for patients with lymphoma, breast cancer or head and neck squamous cell carcinoma (NCT03789097). Newer poly-I:C formulations are immunologically distinct from poly-ICLC; rintatolimod (poly-I:C12U) activates TLR3 but uniquely avoids MDA-5 induction of TNF-dependent cytochrome c oxidase subunit II (COX2), IDO, IL-10 and T_{ree} cell recruitment¹¹⁷. Additionally, intratumoral BO-112 (a nanoplexed poly-I:C) induced preclinical anti-tumor CD8+ T cell responses and, in combination with PD-1 blockade in anti-PD-1-refractory melanoma and patients with renal cancer, induced intratumoral CD8+ T cell infiltration and systemic tumor regression118.

TLR4 is a MyD88-semi-dependent PRR that binds to bacterial lipids (for example, lipopolysaccharide) to activate inflammatory responses, linking innate and adaptive immunity. Preclinical studies showed that a TLR4-binding component of inactivated Streptococcus pyogenes (OK-432) activated DCs, and intratumoral OK-432 administration has induced local recruitment of lymphocytes in patients with gastric cancer¹¹⁹ and increased APC levels in patients with pancreatic cancer¹²⁰. A newer TLR4 agonist (G100), which contains the synthetic lipid A analog glucopyranosyl lipid A, administered intratumorally induced T cell infiltration and expression of immune-related genes correlating with clinical responses that lasted for years in a minority of patients with Merkel cell carcinoma¹²¹. In 26 patients with lymphoma receiving intratumoral G100, systemic regressions were observed in a significant minority of patients treated with G100 alone and a majority of patients when combined with pembrolizumab¹²².

Studies of additional TLR agonists such as TLR7, TLR8 and STING have also been reviewed¹²³. Progress with a similar approach, activating APCs using agonistic anti-CD40 antibodies, has been stymied by toxicities when used as systemic therapy; thus, recent trials have begun to study intratumoral approaches (NCT02379741, NCT04059588, NCT03892525), with early clinical results showing safety of superficial intratumoral administration and PD-L1 upregulation in injected and un-injected tumors. Combining these agents for intratumoral injections could potentiate efficacy¹²⁴. The induction of systemic tumor regressions in multiple tumor types is quite promising for these in situ vaccination approaches, but one concern is that tumors might exclude and inactivate APCs that express the PRR necessary for these approaches. Thus, the greatest potential may be combination approaches that recruit the PRR-expressing APC to the tumor site concurrent with intratumoral PRR-agonist administration.

Intratumorally administered oncolytic viruses and bacteria. Whereas oncolvtic viruses' preferential replication in and cytolysis of tumor cells could yield many therapeutic mechanisms, a main focus is their potential systemic vaccinal effect after intratumoral administration. Currently, the only Food and Drug Administration-approved oncolytic virus is talimogene laherparepvec (TVEC), a modified, GM-CSF-producing HSV1 virus that has demonstrated increased survival¹²⁵ and tumor regression in non-injected lesions¹²⁶ and is undergoing neoadjuvant and combination trials with checkpoint blockade. Similarly, since the earliest vaccinations by Drs. Coley and Old, attenuated live bacteria have been used to drive systemic anti-tumor immune responses. BCG has been administered as intravesical and intratumoral therapy, inducing local and distant tumor regression¹²⁷. Similarly, attenuated *Clostridium novyi* intratumoral injections have demonstrated tumor-specific T cell induction and tumor regression¹²⁸ and are now being combined with PD-1 blockade (NCT03435952). This broad field has great potential for rational engineering of viruses with distinct immunostimulatory profiles and clinical achievements, which are reviewed elsewhere¹²⁹.

Perspectives

Although 5 decades of research have yielded many failures, vaccines are now positioned for success for several reasons. Compared to prior decades, it is now clear that (1) T cells can treat (and, in some instances, cure) patients with cancer, as seen with CAR T cells and bispecific T cell engagers; 2) patients' endogenous T cells can be primed against their own TAAs, correlating with tumor regression, as seen with checkpoint blockade; and 3) priming of endogenous T cells requires optimal antigen presentation (for example, cDC1 cells). Which types of TAAs are the most promising (predefined or anonymous), how cDC1 cross-presentation can be optimized and by which means cross-primed tumor-reactive T cells can be measured in vaccinated patients remain to be addressed. Predefined

shared antigen vaccines have dominated the field and demonstrated survival benefits, but success has been limited to tissue-specific antigens (for example, PAP, gp100). Targeting mutated TSAs (either with predefined personalized or anonymous vaccines) is appealing, but measuring resulting immune responses will be essential to their translation into the clinic. Even if using defined antigens, combinations of more than one antigen would likely offer superior efficacy. Furthermore, immune tolerance can arise from immunoediting for tumor evasion of immune cell clearance 130 . The clinical success of checkpoint blockade illustrates that blocking immunosuppressive pathways can be sufficient for reversing tolerance and allowing immune-mediated cancer rejection. Therefore, immunization strategies against TAAs must also address the TAA-specific immune tolerance present in the tumor host, notably by targeting or depleting TAA-specific $T_{\rm reg}$ cells $^{131-133}$.

Measuring pharmacodynamic effects before assessing anti-cancer efficacy is the gold standard of cancer therapy development; if ineffective kinase inhibitors were brought into efficacy trials, small-molecule chemotherapeutics would be hindered by numerous failures. Similar to pathogen vaccines, such as those against coronavirus disease 2019, that require potent humoral responses before clinical efficacy trials, immunotherapies should have similar metrics. The lack of reliably measurable cancer vaccine pharmacodynamics or 'immunodynamics' has led to insufficiently supported approaches moving to late-phase clinical trials, followed by failures that repeatedly set the field back. Effective immune monitoring will be critical to determining whether cancer vaccines accomplish their intended immunologic effects¹³⁴ and to moving only immunologically effective candidates to larger studies and appropriate patient subsets. As with pathogen vaccines, early development of cancer vaccines focused on humoral responses to assess immunologic potency, rationalized by the anti-tumor efficacy of monoclonal antibody therapy for breast cancers and lymphomas. Extrapolating findings from preclinical murine models to humans has been limited by interspecies discrepancies in murine and human immune cell subsets, such as differential TLR expression on APCs. Conversely, T cell subset phenotypes and function have significant interspecies similarity. Therefore, even though personalized antigen identification is difficult, it may be possible to identify a unified tumor-reactive T cell phenotype in murine studies that could be extrapolated to human immune monitoring. Previously, murine CD8+ T cell PD-1 expression¹³⁵ predicted that human PD-1 T cell expression can be an effective monitoring parameter in patients with cancer136.

Seminal studies suggest that anti-tumor T cell responses, more than those of B cells, are critical to vaccine anti-tumor efficacy^{17,137}. However, measuring the anti-tumor function of T cells is difficult. Most T cell immune monitoring assays have been descriptive: assessing the phenotype or clonality of broad T cell populations. There is small precedent for descriptive assessment to serve as biomarkers for therapeutic efficacy: absolute lymphocyte counts correlate with some immunotherapy clinical outcomes¹³⁸ and tumor-reactive T cells are enriched among CD8+ cells expressing activation or exhaustion markers such as PD-1, TIM-3 and LAG-3 (ref. 136). With high-throughput TCR sequencing, specific T cell clones can be tracked in the blood and importantly in the tumor¹³⁹, with the degree of clonality predicting clinical response to some immunotherapies¹⁴⁰. TCR identification can even be correlated with tumor antigen identity to a certain degree^{141,142}, although the function and reactivity of most TCR clones will be unknown.

Moving beyond T cell description to assess tumor-reactive T cell function is straightforward with predefined antigen vaccines using T cell-peptide co-cultures (for example, enzyme-linked immune absorbent spot (ELISPOT) or flow cytometric analyses), and these assays have demonstrated moderate correlations with clinical response¹⁴³ and survival¹⁴⁴. Assessment of tumor-reactive T cells

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responding to anonymous antigen vaccines is more challenging and has been performed using T cell–tumor cell co-cultures, which have been correlated with clinical response¹⁰⁴, although cryopreserved, autologous tumor is infrequently accessible. In principle, candidate neoantigens from anonymous antigen vaccines can be determined using mutation identification and identifying T cell responses to these antigens, as has been shown in patients treated with checkpoint blockade¹⁴⁵, but this may be restrictively resource intense for broad use.

Industry-academic collaborations such as the Cancer Vaccine Consortium think tank have re-established vaccines as promising optimal combination therapies for checkpoint blockade, given their capacity to prime T cells, but emphasize that our ability to measure anti-tumor T cell responses will be even more important than the ability of vaccines to induce tumor regression as monotherapy¹⁴⁶. To that end, innovative immune monitoring centers have now developed assays such as MANAFEST to unite functional T cell reactivity assays (for example, against neo-epitopes) with practical descriptive assays such TCR sequencing, allowing the latter to be surveyed serially in blood or tumor to measure anti-tumor T cell responses^{77,147}. Going forward, such assays should extend beyond neo-epitope reactivity and probe for whole-tumor cell reactivity to allow measurement of the immune response to anonymous tumor antigen vaccines. As characterization data of neo-epitope or whole-tumor-reactive T cells accumulate, it is plausible that a common signature, measurable by single-cell RNA sequencing or flow cytometry, will be able to characterize effective vaccine-induced T cells. Current insensitive and nonspecific approaches (for example, IFN-y ELISPOT) are posed to be replaced over the next 5 years with deep immune monitoring approaches to accurately characterize cancer vaccine immune responses. With such means, small trials will be able to quickly identify the most immunologically potent cancer vaccines, thereby avoiding large trials of less immunogenic vaccines. Deep immune monitoring will guide the field on a straightforward trajectory, evaluating the most promising approaches (likely neoantigen and in situ vaccines), to successful, randomized trials and ultimately commercialization. Effective vaccines are likely to be combined with other immunostimulatory approaches including adoptive T cell therapies and to be deployed in postsurgical adjuvant settings to prevent relapses.

Decades of slow progress have provided proof of principle that cancer vaccines can indeed elicit systemic tumor regression, durable remission and improvement in OS. We stand on the shoulders of pioneers who advanced our immunologic understanding and are on the precipice of using that understanding to develop rational and effective cancer vaccines, propelling the promising field of immunotherapy to a new frontier, saving resources, time and, ultimately, patients' lives.

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Additional information

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