The development of anti-programmed death 1 (PD1) antibodies has rapidly changed standard oncology clinical practice however only a fraction of patients benefit from these treatments and some tumor types remain unresponsive. Importantly then, biomarker development for the appropriate selection of patients and to inform novel therapeutic development is essential in the field of cancer immunotherapy. Ott et al. recently reported on the analysis of KEYNOTE-028, which was a non-randomized, phase 1b basket trial that enrolled 475 patients with advanced programmed death ligand 1 (PD-L1) positive solid tumors of multiple histologies, and treated with pembrolizumab 10 mg/kg every 2 weeks for up to 2 years (1). The primary end point was objective response rate with secondary endpoints surrounding safety and other survival analyses. The study reported a range of response rates across tumor types from 0% in pancreatic cancer up to 33% in small-cell lung cancer, investigating over 20 cancer types in total. Beyond clinical outcomes, Ott et al. examined relationships between T cell-inflamed gene expression profile (GEP), PD-L1 expression, and tumor mutational burden (TMB) as well as antitumor activity in relationship to outcomes and between biomarkers. Correlations were observed between markers of T cell-inflamed tumors, both GEP or PD-L1 immunohistochemistry, and response to pembrolizumab as well as an independent correlation between TMB and response, suggesting that multiple mechanisms may facilitate response to checkpoint immunotherapy.

These biomarker observations made in KEYNOTE-028 build on years of basic and translational immunology research which are of urgent relevance again as the field considers optimal patient selection and perhaps next generation approaches for cancer immunotherapy. Seminal associations of overall survival and CD8 T cell infiltration, in diseases such as ovarian cancer (2), date to the early 2000s and suggested an important but unclear role for the immune response in advanced cancer. Subsequent analyses from tumor biopsies of patients with melanoma treated in cancer vaccine clinical trials suggested two broad tumor microenvironmental phenotypes (3). In tumors from patients that appeared to benefit, there was an association with the presence of infiltrating T cells. Early use of RNA micro-arrays further defined these tumor microenvironments as being associated with the presence of type I/II interferon (IFN) associated gene transcripts as well as chemokines related to T cell recruitment (4). This phenotype was described as the T cell-inflamed tumor microenvironment and set the stage as a precursor model to that described by Ayers et al. for pembrolizumab (5) and subsequently used by Ott et al. in KEYNOTE-028. This T cell-inflamed GEP is an 18-gene signature that was derived from cluster analysis of pan-cancer treatment response across several KEYNOTE trials (5), including IFNγ responsive genes related to chemokine expression, antigen presentation, and adaptive immune resistance. Given these characteristics, the association of PD-L1 and...
the T cell-inflamed GEP should come as little surprise given the known role for IFNγ in regulating the induction of PD-L1 in multiple cell populations. In contrast, non-T cell-inflamed tumors lack IFNγ associated gene expression, with T cells being either absent or very infrequent within or around the tumor. Defects in both T cell priming and migration of T cells may lead to this phenotype (6) and these tumors are not responsive to checkpoint inhibition (1,5).

Concurrent with Ott et al., Cristescu et al. performed an analysis of TMB and T cell-inflamed GEP across four KEYNOTE trials (KEYNOTE-001, -006, -012, -028) where whole exome sequencing or immune gene expression were available (7). T cell-inflamed GEP score had a significant correlation with best overall response, as did TMB. Correlation of TMB and GEP was low or absent across the investigated patient cohorts, reinforcing that TMB and GEP quantify different aspects of tumor biology and clinical response to checkpoint inhibition. Cristescu et al. then analyzed GEPhi/TMBhi tumors in combination with TMBlo, to assess if the biomarkers were more sensitive in combination. GEPhi plus TMBhi had highest response rate while GEPlo plus TMBhi had the lowest. Additionally, other reported mutational signatures such as predicted neoantigens, smoking status, APOBEC-driven mutations, UV light exposure, DNA transversions, homologous recombination deficiency and MSI demonstrated no meaningful improvement over TMB alone (7). Multiple studies have now demonstrated that neither TMB nor neoantigen load correlate with tumor-immune cell infiltration (or T cell-inflamed GEP) (8,9) and the absolute number of predicted or known tumor antigens has been found to be comparable between T cell inflamed and non-T cell-inflamed tumors (10). Taken together, these studies by Ott et al. and others demonstrate the orthogonal relationship between measures of tumor antigenicity and tumor infiltration in predicting response to PD1 immunotherapy across tumor types.

The relationship of TMB and IFNγ GEP is illustrated in Figure 1, with responders to checkpoint inhibition generally having either, or both, antigens and tumor infiltration present, with non-responders demonstrating low antigen burden and/or immune infiltration. This model integrating TMB and IFNγ GEP as primary biomarkers has the potential to improve the design or interpretation of novel immunotherapy clinical trials. For example, in a single arm phase II trial it might be the case that an improved response rate relative to historical controls is observed for the combination of a PD1 antibody with a second agent. If tumors from the responding patients were profiled as GEPhi/TMBlo (quadrant B) at baseline however, it would be difficult to interpret the improved response rate relative to PD1 antibody alone. This would be especially the case for combination approaches involving a second agent without substantive monotherapy activity. This consideration might be seen as timely given the recent failure of ECHO301/KEYNOTE-252, where any incremental benefit from epacadostat had not been established on a translational level (11). If profiling of tumors via TMB and GEP had demonstrated responding patients perhaps from quadrant A to B (GEPlo/TMBhi to GEPhi/TMBlo) or D to B (GEPhi/TMBhi to GEPhi/TMBlo) perhaps a better rationale, beyond substantive monotherapy activity. This consideration might be seen as timely given the recent failure of ECHO301/KEYNOTE-252, where any incremental benefit from epacadostat had not been established on a translational level (11). If profiling of tumors via TMB and GEP had demonstrated responding patients perhaps from quadrant A to B (GEPlo/TMBhi to GEPhi/TMBlo) or D to B (GEPhi/TMBhi to GEPhi/TMBlo) perhaps a better rationale, beyond substantive monotherapy activity.

This model of GEP/TMB can also be used to integrate rational selection into clinical trial designs. To date, many immunotherapy drugs advanced in clinical trials of PD1 refractory patients have built on PD1 antibody as a backbone and combined with a second agent, usually an IFN associated gene target. Most of these trials have also pursued patient enrollment in a biological unselected fashion and, rather unsurprisingly, have had unimpressive results (6). An alternative approach might be to place the drug target into the quadrants of Figure 1 and design patient 

![](https://dx.doi.org/10.21037/cco.2019.12.16)

**Figure 1** Relationship between TMB and IFNγ GEP. Six individual patient tumors plotted along the TMB/IFNγ axis (simulated patient data). Quadrant B contains GEPhi/TMBlo tumors that respond well to checkpoint inhibition. Quadrant C contains GEPlo/TMBhi tumors that do not respond to checkpoint inhibition. Intermediate TMB or GEP tumors would plot in quadrants labeled A or D. TMB, tumor mutational burden; GEP, gene expression profile.
Two examples of success supporting this approach can be found in the development of the LAG3 antibody relatlimab and the TIM3 antibody TSR-022. Ascierio \textit{et al.} have reported an intriguing response rate in patients with melanoma, progressed on PD1, with the combination of nivolumab with relatlimab. These responses are isolated only to those patients with tumors harboring high levels if LAG3 expression by immunohistochemistry (12). Similarly, Davar \textit{et al.} described a population of responding patients with NSCLC, progressed on prior PD1 antibody but that retained PD-L1 expression, who responded to the combination of the PD1 antibody dostarlimab and TSR-022 (13). As LAG3 and TIM3 are IFN responsive genes, the patient harboring these tumors would have been characterized into quadrants A or B of Figure 1 highlighting the potential utility of this sort of selection mechanism. Profiling patient tumors into quadrant D (GEP\textsubscript{lo}/TMB\textsubscript{lo}) identifies the very high need patient population of immunotherapy non-responders and could emphasize a biological population to target with antigen-specific approaches such as cellular therapies or T cell re-directing therapies and perhaps innate immune stimulators such as agonists of Toll-like receptor or STING agonists. Examples to highlight demonstrating conceptual success using this model might be intra-pleural administration of mesothelin specific chimeric antigen receptor T cells in mesothelioma (14) and the bispecific T cell-redirecting molecule tebentafusp in uveal melanoma (15). Both of these tumor types generally exist in quadrant D (GEP\textsubscript{lo}/TMB\textsubscript{lo}) (10) of Figure 1 however these immunotherapy approaches appear to engender treatment benefit for patients with these tumors.

Immunotherapy has rapidly come forward as an essential element in the treatment of advanced cancer however a major gap remains surrounding patient selection and biomarker integration into clinical practice. The work by Ott \textit{et al.} in KEYNOTE-028 lay important groundwork toward the rational integration of PD-L1, TMB and T cell-inflamed GEP in standard treatment as well as next generation immuno-oncology clinical trials. KEYNOTE-028 identifies that many tumor types have the potential to respond to PD1 immunotherapy but that multi-dimensional biomarker analysis will be needed to optimize patient level benefit. Using these biomarkers to predict response is an important goal however one wonders whether the use of these markers to note which patients are very unlikely to respond might be an at least as important a goal. Comprehensive analysis of PD-L1, TMB and T cell-inflamed GEP should be a priority in all immunotherapy trials moving forward. This would facilitate the identification of therapeutic approaches in tumors that are low for these biomarkers and nominate new biomarkers of relevance for tumors demonstrated as biomarker high but that do not respond to anti-PD-1 immunotherapy.

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\textbf{Footnote}

\textbf{Conflicts of Interest:} JJ Luke declares Data and Safety Monitoring Board: TTC Oncology; Scientific Advisory Board: 7 Hills, Actym, Alphamab Oncology, Array, BeneVir, Mavu, Tempest; Consultancy: Aduro, Astellas, AstraZeneca, Bayer, Bristol-Myers Squibb, Castle, CheckMate, Compugen, EMD Serono, IDEAYA, Immunocore, Janssen, Jounce, Leap, Merck, Mersana, NewLink, Novartis, ReflexXion, Spring Bank, Syndex, Tempest, Vividion, WntRx; Research Support: (all to institution for clinical trials unless noted) AbbVie, Array (Scientific Research Agreement; SRA), Boston Biomedical, Bristol-Myers Squibb, Celldex, CheckMate (SRA), Compugen, Corvus, EMD Serono, Evelo (SRA), Delcath, Five Prime, FLX Bio, Genentech, Immunocore, Incyte, Leap, MedImmune, Macrogenics, Novartis, Pharmacyscics, Palleon (SRA), Merck, Tesaro, Xencor; Travel: Array, AstraZeneca, Bayer, BeneVir, Bristol-Myers Squibb, Castle, CheckMate, EMD Serono, IDEAYA, Immunocore, Janssen, Jounce, Merck, Mersana, NewLink, Novartis, ReflexXion; Patents: (both provisional) Serial #15/612,657. M Jameson-Lee has no conflicts of interest to declare.

\textbf{Ethical Statement:} The authors are accountable for all aspects of the work in ensuring that questions related to the accuracy or integrity of any part of the work are appropriately investigated and resolved.

\textbf{References}