Cost-effectiveness of first-line immunotherapies for advanced non-small cell lung cancer

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Abstract

Background: Researchers have not simultaneously compared the costeffectiveness of six immunotherapies with chemotherapy for advanced non-small cell lung cancer. This study evaluated the cost-effectiveness across different programmed death-ligand 1 (PD-L1) levels.

Methods: A Markov model with lifetime horizon was created for seven regimens: pembrolizumab plus chemotherapy (pembro-chemo), nivolumab plus ipilimumab (nivo-ipi), nivolumab, ipilimumab plus chemotherapy (nivo-ipi-chemo), atezolizumab plus chemotherapy (atezo-chemo), atezolizumab, bevacizumab plus chemotherapy (atezo-beva-chemo), single-agent pembrolizumab, and chemotherapy alone. Input parameters were derived from trial data, a network metaanalysis, and other literature. We conducted the analysis from the perspective of US health care sector.

Results: For all patients without considering PD-L1 expression, the incremental cost-effectiveness ratio (ICER) of pembro-chemo versus chemotherapy was \$183,299 per quality-adjusted life year (QALY). The preferred regimens based on ICERs differed by PD-L1 levels. For patients with PD-L1 \geq 50%, pembrolizumab versus chemotherapy and pembro-chemo versus pembrolizumab resulted in ICERs of \$96,189 and \$198,913 per QALY, respectively. The other strategies were dominated. For patients with PD-L1 of 1%–49%, the ICER of pembro-chemo comparing to chemotherapy was \$218,159 per QALY. The other regimens were dominated by pembro-chemo. For patients with PD-L1 <1%, nivo-ipi versus chemotherapy and nivo-ipi-chemo versus nivo-ipi resulted in ICERs of \$161,277 and \$881,975 per QALY, and the other regimens were dominated strategies. At the willingness-to-pay threshold of \$150,000 per QALY, pembrolizumab had 87% and pembro-chemo had 1% probabilities being cost-effective in patients with PD-L1 ≥50% and 1%–49%, respectively. Nivo-ipi had a 34% probability being costeffective in patients with PD-L1 <1%.

Conclusions: The PD-L1 level should be incorporated into treatment decisionmaking. Our findings suggest that first-line pembrolizumab, pembro-chemo, and

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nivo-ipi are the preferred strategies for patients with PD-L1 \geq 50%, 1%–49%, and <1%, respectively.

KEYWORDS

atezolizumab, cost-effectiveness, immunotherapy, lung cancer, nivolumab, pembrolizumab

1 | **INTRODUCTION**

Lung cancer is the leading cause of cancer death in the world. $¹$ About half of non-small cell lung cancer</sup> (NSCLC) patients are diagnosed in advanced stage. $²$ $²$ $²$ </sup> Platinum-doublet chemotherapy was historically the standard first-line treatment for patients with advanced NSCLC whose tumors lack of actionable gene alterations. Immunotherapy has changed the landscape of treatments for these patients.^{[3](#page-11-2)}

In patients with advanced NSCLC and programmed death-ligand 1 (PD-L1) expression levels ≥50% and 1%– 49%, first-line monotherapy with immune checkpoint inhibitor is an effective treatment.⁴⁻⁶ Immunotherapy in combination with chemotherapy, $7-11$ an anti-angiogenesis drug,¹² or another type of immunotherapy^{[13,14](#page-11-6)} can be applied to all patients regardless of PD-L1 expression levels. Immunotherapy combinations recommended by the National Comprehensive Cancer Network include¹⁵: pembrolizumab, a programmed death-1 (PD-1) antibody, plus chemotherapy; nivolumab, a PD-1 antibody, plus ipilimumab which blocks cytotoxic T-lymphocyte antigen 4 (CTLA-4); nivolumab and ipilimumab plus chemotherapy; atezolizumab, a PD-L1 antibody, plus chemotherapy; and atezolizumab and chemotherapy plus bevacizumab, which is an anti-angiogenesis agent. Although all these immunotherapies provide survival benefits for patients with advanced NSCLC, prices tagged on these treatments result in financial pressure on health care system.

Many analyses found that monotherapy with pembrolizumab, as compared to chemotherapy, is a cost-effective regimen for PD-L1-positive NSCLC.¹⁶⁻¹⁸ Studies have also investigated the cost-effectiveness of pembrolizumab plus chemotherapy[,19–22](#page-11-9) and nivolumab plus ipilimumab with or without chemotherapy, $^{23-27}$ comparing to platinumdoublet chemotherapy. However, the results are still inconclusive: Some studies found pembrolizumab plus chemotherapy,^{19,22} and nivolumab plus ipilimumab,^{[24](#page-11-11)} to be cost-effective; whereas the others did not. $20,21,23,25-27$ Literature estimating the incremental cost-effectiveness ratio (ICER) of atezolizumab plus chemotherapy with or without bevacizumab versus chemotherapy alone has failed to prove the atezolizumab combinations to be cost-effective. $28-30$ More importantly, none of these

investigations accounts for three PD-L1 expression levels (<1%, 1–49%, and≥50%) which are commonly used in practice. Besides, researchers have not simultaneously compared the cost-effectiveness of these immunotherapies. Based on a network meta-analysis of these first-line therapies, 31 we conducted a cost-effectiveness analysis evaluating all these immunotherapies across three PD-L1 expression levels.

2 | **METHODS**

2.1 | **Model overview**

We created a Markov model to simulate treatment-naïve advanced NSCLC patients who were treated with one of the seven first-line therapies^{[1](#page-11-0)}: pembrolizumab plus chemotherapy (pembro-chemo), 2 2 nivolumab plus ipilimumab $(nivo-ipi)$,^{[3](#page-11-2)} nivolumab and ipilimumab plus chemotherapy (nivo-ipi-chemo),⁴ atezolizumab plus chemotherapy (atezo-chemo) , atezolizumab and bevacizumab plus chemotherapy (atezo-beva-chemo),⁶ single-agent pem-brolizumab, and^{[7](#page-11-4)} chemotherapy alone (see Figure [S1\)](#page-12-1). Because the proportion of deaths attributable to other comorbidities in patients with metastatic NSCLC is mini- mal^{32} we assumed no background mortality and all simulated patients entered the model in a progression-free state and transited to progressive disease before death. We chose a model cycle length of 6weeks because ipilimumab was administered every 6 weeks, $13,14$ whereas other regimens were administered every 3 weeks.^{5,7-12}

In accordance with clinical practice, paclitaxel plus carboplatin and pemetrexed plus carboplatin were selected as the baseline chemotherapy regimens for patient with squamous NSCLC and non-squamous NSCLC, respectively.[15](#page-11-7) Each immunotherapy regimen was allowed to be administered for a maximum of 2 years or up to disease progression. We selected combination chemotherapy according to each trial design. More specifically, platinum-doublet chemotherapy was administered for 6 weeks in nivo-ipi-chemo combination 14 and 12 weeks in pembro-chemo, 7.8 atezo-chemo, $9-11$ and atezo-bevachemo groups. 12 12 12 We considered maintenance therapy with pemetrexed in pembro-chemo,^{[7](#page-11-4)} atezo-chemo,^{[11](#page-11-18)}

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and chemotherapy groups.^{[15](#page-11-7)} Similarly, maintenance therapy with bevacizumab was continued up to disease progression in atezo-beva-chemo group.[12](#page-11-5) We modeled the subsequent therapies according to each trial data and standardized the event probabilities based on the chemotherapy group in CheckMate 227 trial. 13 13 13 Because of a lack of such information in the IMpower150 trial, 12 patients in atezo-beva-chemo group were assumed to experience the same subsequent therapies as those in atezo-chemo group. Docetaxel was used as the second-line chemotherapy for patients progressed after platinum-doublet chemotherapy.^{[15](#page-11-7)} We selected nivolumab as the second-line immunotherapy because it was most popularly used in the trials. Likewise, erlotinib was selected as the second-line targeted therapy.

2.2 | **Survival estimates**

Because the CheckMate 227 trial has the longest follow-up period and includes both squamous and nonsquamous patients, 13 we calibrated the progression-free survival (PFS) and overall survival (OS) to the chemotherapy group and simulated the survival of patients undergoing six different regimens by using the respective hazard ratios of immunotherapies versus chemotherapy from a network meta-analysis 31 and the KEYNOTE-042 study.^{[5](#page-11-14)} There was a lack of PFS and OS curves for patients with PD-L1 of $1\% - 49\%$ in the CheckMate 227 trial,^{[13](#page-11-6)} we calibrated the PFS and OS to the chemotherapy group of KEYNOTE-189 trial.^{[7](#page-11-4)} Hazard ratios of immunotherapies versus chemotherapy 5.31 were then used to simulate the survival of patients with PD-L1 of 1%–49% who underwent immunotherapy regimens. A webbased software (WebPlotDigitizer; [https://automeris.io/](https://automeris.io/WebPlotDigitizer/) [WebPlotDigitizer/](https://automeris.io/WebPlotDigitizer/)) was applied to extract the data points of PFS and OS curves from the chemotherapy groups. The transitional probability of progression-free state to progressive disease at each model cycle was directly derived from the PFS curve in the trial, and was timedependent. We calibrated the transitional probability of progressive disease to death at each model cycle to fit the OS curve. Based on the transitional probabilities at the end of follow-up periods, we extrapolated the PFS and OS to lifetime. The modeled PFS and OS curves within the follow-up periods were compared with the trial results.

The transitional probability at each model cycle of the chemotherapy group was converted to that of each immunotherapy. First, we used the formula, $r = \lfloor -\ln \rfloor$ $(1-p)$], to transform probability (*p*) to rate (*r*) at each model cycle. Second, the rate was multiplied by the hazard ratio of immunotherapy versus chemotherapy deriving from the network meta-analysis 31 and KEYNOTE-042 study. 5 Finally, we used the formula, $p = 1 - e^{-r}$, to convert the new rate to the transitional probability of each immunotherapy. As such, we were able to simulate the PFS and OS curves of patients receiving six different immunotherapies.

2.3 | **Cost and utility inputs**

We considered administration cost, drug costs, costs for best supportive care, and management of adverse events. All these costs were based on the payments by the Centers for Medicare & Medicaid Services.^{19,33-37} We estimated the drug dosages using a body surface area of 1.84 m^2 , a body weight of 70kg, and a glomerular filtration rate of 73 ml/min (i.e., a 65-year-old man with a serum creatinine of 1 mg/ml). We accounted the waste of drugs while calculating costs of intravenous agents (see Table [S1\)](#page-12-1). Adverse events considered in the model were those of any grade and we weighted the costs by event rates adjusted in the network meta-analysis and KEYNOTE-042 study. $5,31$ Using medical care inflation rates, all costs were made equivalent to 2021 US dollars.

A utility value of 0.79 for patients in the progressionfree state who received chemotherapy alone was obtained from prior research. 38 A utility ratio denoted the utility value of each immunotherapy divided by the value of its chemotherapy group. $39-44$ We multiplied 0.79 by the ratio to derive the adjusted utility value of each immunotherapy. Notably, European Quality of Life Five-Dimension data were not evaluated in the IMpower trials. $9-11$ We alternatively used a mapping approach⁴⁵ by converting the European Organization for Research and Treatment of Cancer Quality of Life-Core 30 Questionnaire data 42 to the utility values of patients in atezo-chemo and atezobeva-chemo groups.⁴³ Patients in the progressive disease of seven treatment strategies shared the same utility value of 0.72.[38](#page-12-3)

2.4 | **Base-case analysis**

This analysis was conducted from the perspective of US health care sector and we selected a willingness-topay (WTP) threshold of \$150,000 per quality-adjusted life year $(QALY).⁴⁶$ We estimated ICERs in terms of incremental costs divided by incremental life years and QALYs, and used an annual rate of 3% to discount future costs and life years. A lifetime horizon and halfcycle correction were applied. We considered different

PD-L1 expression levels: all patients; patients with PD-L1 <1%; patients with PD-L1 of 1% -49%; and patients with PD-L1 ≥50%. Strategies were rank-ordered by cost in each group. Strongly dominated strategies were the ones that had higher costs and fewer QALYs than alternative strategies. Weakly dominated strategies were the ones that were less efficient in terms of incremental costs per QALY as compared with alternative strategies. ICERs were calculated against the next costliest and undominated strategy. Amua software version 0.3.0 was used to perform the analyses.

2.5 | **Sensitivity analyses**

Our base-case analysis modeled the PFS and OS of patients undergoing immunotherapies by using the hazard ratios in the network meta-analysis 31 and KEYNOTE-042 study.^{[5](#page-11-14)} Sensitivity analyses using the lower and upper bonds of the 95% confidence intervals of hazard ratios were conducted. Additionally, we performed one-way deterministic analysis of each group by varying the other parameters within clinically plausible ranges (Table [1](#page-4-0) and Table [S2\)](#page-12-1). Probabilistic analyses using Monte Carlo simulation with 1000 iterations were done to address the effect of parameter uncertainty. To test the robustness of our results, we compared the basecase results with results using trial outcomes of immunotherapy combinations. $7,13$

3 | **RESULTS**

3.1 | **Base-case results**

The modeled PFS and OS curves of chemotherapy group within the follow-up periods were quite similar to those in the trials (see Figure [S2](#page-12-1)), indicating our model was well calibrated. The results of base-case analysis and the incremental cost-effectiveness planes are presented in Table [2](#page-6-0) and Figure [1](#page-7-0). For all patients without considering PD-L1 expression, the ICERs of pembro-chemo versus chemotherapy were \$141,790 per life year and \$183,299 per QALY. The preferred regimens based on ICERs differed by PD-L1 expression levels. For patients with PD-L1 ≥50%, pembrolizumab versus chemotherapy and pembro-chemo versus pembrolizumab resulted in ICERs of \$96,189 and \$198,913 per QALY, respectively. The other strategies were dominated. Comparing to chemotherapy, the ICERs of pembro-chemo were \$168,878 per life year and \$218,159 per QALY for patients with PD-L1 of 1%–49%. The other four regimens were dominated by pembro-chemo. For

patient with PD-L1 <1%, nivo-ipi versus chemotherapy resulted in ICERs of \$122,691 per life year and \$161,277 per QALY, and the ICERs of nivo-ipi-chemo versus nivoipi were \$567,261 per life year and \$881,975 per QALY. The other regimens were dominated strategies.

3.2 | **Sensitivity analyses**

Given the lower and upper bonds of the 95% confidence intervals of hazard ratios, monotherapy with pembrolizumab remained the cost-effective strategy for patients with PD-L1 \geq 50% (Table [3](#page-8-0)). Nivo-ipi and pembro-chemo continued to be the preferred regimens for patients with PD-L1 <1% and all patients, respectively. One-way deterministic sensitivity analyses (Figure [2](#page-9-0)) show that irrespective of PD-L1 expression levels, costs of immunotherapies and utility values of immunotherapies were the major determinants of ICER values. Nivo-ipi would become cost-effective for patients with PD-L1 <1% if its cost was decreased to \$37,241 (Figure [2B\)](#page-9-0). Varying costs of pemetrexed between 80% and 120% of the baseline value also greatly changed the ICER results for all patients, patients with PD-L1 of 1%–49%, and patients with PD-L1 \geq 50%.

Cost-effectiveness acceptability curves of all patients show that pembro-chemo had a 9% probability being cost-effective at the WTP threshold of \$150,000 per QALY (Figure [3\)](#page-10-0). The probability for nivo-ipi became 34% in patients with PD-L1 <1%. For patients with PD-L1 of 1%–49%, pembro-chemo had a 1% probability being costeffective at this WTP threshold. The probability was 87% when it applied to pembrolizumab in patients with PD-L1 $\geq 50\%$.

The OS curves, costs, and QALYs of base-case results and results using trial outcomes of immunotherapy combinations appeared to be similar in all patients, patients with PD-L1 <1%, and patients with PD-L1 \geq 50% (see Figure [S3](#page-12-1) and Table [S3](#page-12-1)). However, the survival benefit and QALY gained of the base case were higher than those using trial outcomes of immunotherapy combinations in patients with PD-L1 of 1%–49%, leading to a lower ICER value.

4 | **DISCUSSION**

This cost-effectiveness analysis (CEA) provides a good opportunity for clinicians to consider efficacy, safety, patients' preferences, and costs when selecting the firstline immunotherapies. Although CEAs have been performed for individual immunotherapy regimen, $16-30$

TABLE 1 Model p[a](#page-5-0)rameters^a

TABLE 1 (Continued)

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Abbreviations: BSC, best supportive care; EORTC, European Organization for Research and Treatment of Cancer; EQ-5D, European Quality of Life Five-Dimension; HR, hazard ratio; PD-L1, programmed-death ligand 1; PFS, progression-free survival; OS, overall survival; USD, US dollars. ^aParameter values for adverse events are shown in Table [S2.](#page-12-1)

TABLE 2 Base-case results

Note: Strongly dominated strategies are the ones that have higher costs and fewer QALYs than alternative strategies. Weakly dominated strategies are the ones that are less efficient in terms of incremental costs per QALY as compared with alternative strategies.

Abbreviations: ICER, incremental cost-effectiveness ratio; PD-L1, programmed death-ligand 1; QALY, quality-adjusted life year; USD, US dollars. ^aSurvival of chemotherapy group based on the KEYNOTE-189 trial.

to the best of our knowledge, there has been no study comparing the cost-effectiveness across six guidelinerecommended regimens. We stratified patients by PD-L1 expression levels (<1%, 1%–49%, and \geq 50%), which are commonly used in clinical practice. In addition, we well calibrated the PFS and OS curves and weighted the hazard ratios from a network meta-analysis for transitional probabilities, 31 our simulation model could accurately estimate the effectiveness. Based on the trial data, we also explicitly modeled the health utility values, adverse

events, and subsequent treatments. The results showed that for patients with PD-L1 \geq 50%, monotherapy with pembrolizumab was more likely to be cost-effective as compared to other regimens; whereas for patients with PD-L1 of 1%–49% and <1%, pembro-chemo and nivo-ipi were the preferred immunotherapy strategies, respectively. This study may help thoracic oncologists move toward value-based practice while treating patients with advanced NSCLC whose tumors lack of actionable gene alterations.

FIGURE 1 Incremental cost-effectiveness planes for (A) all patients; (B) patients with PD-L1 <1%; (C) patients with PD-L1 of 1%–49%; and (D) patients with PD-L1 ≥50%. Line-connected blue dots represent the most efficient strategies. Red dots are dominated strategies. PD-L1, programmed death-ligand 1; QALY, quality-adjusted life year; USD, US dollars.

Pembro-chemo, nivo-ipi-chemo, atezo-beva-chemo, and atezo-chemo shared similar profiles of health utility and safety. However, anti-PD-L1 combinations (atezo-beva-chemo and atezo-chemo) were dominated by anti-PD-1 combinations (pembro-chemo and nivoipi-chemo). This finding is consistent with previous CEA results which failed to prove atezolizumab com-binations to be cost-effective.^{[28–30](#page-11-13)} A dominated strategy of anti-PD-L1 combination was mainly explained by its less favorable OS as compared to an anti-PD-1 combination. Exhibiting an unfavorable OS of anti-PD-L1 combinations could be attributable to the fact that anti-PD-L1 only inhibits PD-L1, whereas anti-PD-1 inhibits the binding of PD-1 to both PD-L1 and PD-L2, which in turn blocks the immune escape more comprehensively. 47 Among anti-PD-1 combinations, nivo-ipi was more likely to be cost-effective for patients with PD-L1 <1%, and pembro-chemo was the preferred regimen for patients with PD-L1 \geq 1%. These findings were corroborated by an observation that PD-L1 expression levels might not be a reliable biomarker in judging the effectiveness of immunotherapy combinations including anti-CTLA-4 therapy.^{[48](#page-12-13)}

As expected, tornado diagram reveals that the cost and utility value of each immunotherapy were the major determinants of ICER. In this figure, we also recognized that cost of pemetrexed is a major determinant of pembro-chemo cost-effectiveness. Maintenance ther-apy of pemetrexed was administered in pembro-chemo,^{[7](#page-11-4)} atezo-chemo, 11 and their chemotherapy groups. However, it was not applied to nivo-ipi-chemo and nivo-ipi, $13,14$ and was optional for their chemotherapy groups. A superior survival benefit of pembro-chemo as compared to nivo-ipi or nivo-ipi-chemo might result from the effect of pemetrexed maintenance. If we did not consider the cost of pemetrexed maintenance in each group, pembro-chemo would be a cost-effective strategy for all patients and patients with PD-L1 \geq 50% (see Table [S4\)](#page-12-1).

We acknowledge that the WTP threshold of \$150,000 per QALY might be a low estimate given the increase in healthcare spending. If we used a threshold of \$200,000 per QALY (the "three times gross domestic product per capita cost-effectiveness threshold" proposed by the World Health Organization),⁴⁹ pembro-chemo would become cost-effective for patients with PD-L1 ≥50%. Nivo-ipi would be a cost-effective strategy for patients with PD-L1 **8846 WII FY-Cancer Medicine Constraine Accord Property ANG ET AL.**

Note: Strongly dominated strategies are the ones that have higher costs and fewer QALYs than alternative strategies. Weakly dominated strategies are the ones that are less efficient in terms of incremental costs per QALY as compared with alternative strategies.

Abbreviations: CI, confidence interval; ICER, incremental cost-effectiveness ratio; PD-L1, programmed death-ligand 1; QALY, quality-adjusted life year; USD, US dollars.

^aSurvival of chemotherapy group based on the KEYNOTE-189 trial.

<1%. Nivo-ipi-chemo and atezo-chemo, however, would remain not cost-effective regardless of PD-L1 levels and should be discouraged.

Our target population were NSCLC patients whose tumors lack of actionable gene alterations. Most of these patients were current or former smokers who might be eligible for low-dose chest tomography (LDCT) screening in the early beginning of the disease. From the perspective of US health care sector, the ICERs for immunotherapy combinations were much higher than those estimated for LDCT screening. $50,51$ Although the comparison groups were different, our results emphasize a potential need for the shift to detecting early-stage lung cancer among highrisk smokers.

FIGURE 2 Tornado diagrams for (A) pembro-chemo versus chemotherapy of all patients; (B) nivo-ipi versus chemotherapy of patients with PD-L1 <1%; (C) pembro-chemo versus chemotherapy of patients with PD-L1 of 1%–49%; and (D) pembro-chemo versus pembrolizumab of patients with PD-L1 ≥50%. The dash lines represent the base-case ICERs. BSC, best supportive care; ICER, incremental cost-effectiveness ratio; IO, immunotherapy; PD, progressive disease; PD-L1, programmed-death ligand 1; QALY, quality-adjusted life year; USD, US dollars.

Several limitations must be acknowledged in our study. First, because of a lack of survival curves for patients with PD-L1 of 1%–49% in the CheckMate 227 trial,^{[13](#page-11-6)} we used the PFS and OS curves of KEYNOTE-189 chemotherapy group for modeling.^{[7](#page-11-4)} The hazard ratios of pembro-chemo versus chemotherapy in the network meta-analysis 31 were lower than those in the KEYNOTE-189 trial, 7 leading to a lower ICER estimate. Nevertheless, our results still indicated that pembrochemo was not a cost-effective strategy in patients with PD-L1 of 1%–49%. We also acknowledged the limitation that we assumed constant hazard ratios, which is often incorrect. However, these hazard ratios, derived from network meta-analysis, 31 represent the best evidence while comparing multiple immunotherapy regimens. Furthermore, the modeled and observed survival curves were similar, indicating that our assumption/ model is still appropriate. Second, we only compared the cost-effectiveness of six guideline-recommended immunotherapies. Atezolizumab and cemiplimab-rwlc monotherapies were also recommended as the frontline immunotherapy for patients with PD-L1 \geq 50%,^{[15](#page-11-7)} but we did not simultaneously compare their costeffectiveness. Besides, the hazard ratios of pembrolizumab versus chemotherapy and the adverse event

rates were directly derived from the KEYNOTE-042 study^{[5](#page-11-14)} without cross-trial adjustment. Investigations using meta-analysis across immunotherapy monotherapy and immunotherapy combinations merit future research. Third, based on the CheckMate 227 trial, 13 we assumed 28.0% of tumors was squamous in histology when simulated patients entered the model. Atezobeva-chemo should not be administered to patients with squamous NSCLC.^{[15](#page-11-7)} However, we assigned paclitaxel plus carboplatin as the chemotherapy regimen for both squamous and non-squamous NSCLC in this group of patients, the validity of our results would not be threatened. Fourth, we applied a fixed utility value for each immunotherapy, which might not capture the decrements of quality of life resulting from aging or co-morbidities. Nevertheless, patients with advanced NSCLC usually experience a short life expectancy, the QALYs of patients should not be overestimated too much.

In conclusion, from the perspective of US health care sector, pembrolizumab, pembro-chemo, and nivo-ipi are the preferred first-line regimens for patients with PD-L1 ≥50%, 1%–49%, and <1%, respectively. Atezo-beva-chemo and atezo-chemo are unlikely to be cost-effective regardless of PD-L1 expression levels.

FIGURE 3 Acceptability curves for (A) all patients; (B) patients with PD-L1 <1%; (C) patients with PD-L1 of 1%–49%; and (D) patients with PD-L1 ≥50%. PD-L1, programmed-death ligand 1; QALY, quality-adjusted life year; USD, US dollars.

AUTHOR CONTRIBUTIONS

Szu-Chun Yang: Conceptualization, collection and assembly of data, formal analysis, funding acquisition, project administration, visualization, writing–original draft, writing–review/editing. **Huang-Tz Ou:** Collection and assembly of data, data curation, writing–review/editing. **Wu-Chou Su:** Conceptualization, resources, writing– review/editing. **Shi-Yi Wang:** Conceptualization, methodology, supervision, writing–review/editing.

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CONFLICT OF INTEREST

Dr. Yang reports grants from the Ministry of Science and Technology and National Cheng Kung University Hospital during the conduct of the study. No other disclosures were reported.

DATA AVAILABILITY STATEMENT

The data that support the findings of this study are available from the corresponding author upon reasonable request.

ETHICS APPROVAL STATEMENT

The study was exempt from gaining individual consent, and no ethical approval was required for the study, as it involved the analysis of previously published data.

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SUPPORTING INFORMATION

Additional supporting information can be found online in the Supporting Information section at the end of this article.

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