

Associations With Definitive Outcomes and Clinical Benefit of Cancer Drugs at the Time of Marketing Approval and in the Postmarketing Period

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ABSTRACT

Background: Most anticancer drugs are approved by regulatory agencies based on surrogate measures. This article explores the variables associated with overall survival (OS), quality of life (QoL), and substantial clinical benefit among anticancer drugs at the time of approval and in the postmarketing period. **Methods:** Anticancer drugs approved by the FDA between January 2006 and December 2015 and with postmarketing follow-up until April 2019 were identified. We evaluated trial-level data supporting approval and any updated OS and/or QoL data. We applied the ESMO-Magnitude of Clinical Benefit Scale (ESMO-MCBS) and the ASCO Value Framework (ASCO-VF) to initial and follow-up studies. **Results:** We found that 58 drugs were approved for 96 indications based on 96 trials. At registration, approval was based on improved OS in 39 trials (41%) and improved QoL in 16 of 45 indications (36%). Postmarketing data showed an improvement in OS for 28 of 59 trials (47%) and in QoL for 22 of 48 indications (46%). At the time of approval, 25 of 94 (27%) and 26 of 80 scorable trials (33%) met substantial benefit thresholds using the ESMO-MCBS and ASCO-VF, respectively. In the postmarketing period, 37 of 69 (54%) and 35 of 65 (54%) trials met the substantial benefit thresholds. Drugs with companion diagnostics and immune checkpoint inhibitors were associated significantly with substantial clinical benefit. **Conclusions:** Compared with the time of approval, more anticancer drugs showed improved OS and QoL and met the ESMO-MCBS or ASCO-VF thresholds for substantial benefit over the course of postmarketing time. However, only approximately half of the trials met the threshold for substantial benefit. Companion diagnostic drugs and immunotherapy seemed to be associated with greater clinical benefit.

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Background

The FDA defines clinical benefit as an improvement in either the duration or the quality of life (QoL).¹ FDA criteria allow cancer drugs to be approved based on surrogate measures that will reasonably predict definitive outcomes, such as overall survival (OS) or QoL. Most intermediate endpoints have not been validated as surrogates for definitive outcomes yet are used as primary endpoints in trials supporting drug approval.^{2,3} This practice can limit the understanding of the clinical benefit of new drugs.^{4,5}

Recent systematic reviews have indicated that many surrogate endpoints used for drug approvals do not translate into improvements in OS⁶ or QoL.^{7,8} In addition, recent findings have revealed that fewer than half of cancer drug indications approved by the FDA^{2,3} and the European Medicines Agency⁹ have shown improved OS or QoL in the postmarketing period. Similarly, only a proportion of studies supporting drug approval have shown substantial clinical benefit using the ESMO-Magnitude of Clinical Benefit Scale (ESMO-MCBS) or the ASCO Value Framework (ASCO-VF) at the time of drug approval.¹⁰⁻¹² There are limited data on whether the magnitude of clinical benefit changes between the time of regulatory approval and the postmarketing period. In this article, we quantify the proportion of studies meeting thresholds for substantial

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clinical benefit both at the time of approval and in the postmarketing period and explore associations with improved OS, QoL, and clinical benefit over time.

Methods

Data Sources

We examined data from pivotal trials supporting FDA approval in adult solid tumors between January 1, 2006, and December 31, 2015. These dates were selected to allow at least 3 years of postmarketing follow-up for all drugs. Details of data sources have been described previously.¹³

Data Extraction, Search Strategies, and Data Analysis

Two authors (A. Bujosa, A. Tibau) extracted data using pre-designed electronic forms. For each indication, the review^{14–17} and approval (accelerated vs regular)¹⁸ pathways and the number of trials supporting the application were identified. When >1 pivotal study supported a single indication, a hierarchical selection strategy preferring more definitive endpoints (typically OS) to QoL was used. Then, the ClinicalTrials.gov identification number was collected from the reports of registration trials. To determine changes in the postmarketing period, PubMed was searched first. Second, search results were cross-referenced with ClinicalTrials.gov, and if no follow-up trials were identified, then Google Scholar was searched.

In the postmarketing period, for regular approvals, updates of pivotal trials were analyzed as follow-up studies. For accelerated approvals, we assessed the status of conversion to full approval.¹⁸ If conversion to regular approval was granted, then only the confirmatory trial was analyzed as a follow-up study.

For each included trial, we extracted information on trial characteristics, primary efficacy endpoints (OS vs intermediate endpoints), toxicity, and QoL outcomes. We also collected data on whether a companion diagnostic test was available as defined by the FDA.¹⁹ For trials performed in the palliative setting, we collected data on the line of therapy. For postmarketing trials, we collected the median time of follow-up, the most rigorous endpoint that was statistically significant, and updated information about efficacy, QoL, and toxicity when available. For accelerated approvals converted to regular approvals, we considered the period between accelerated approval and regular approval as the median time between accelerated approval and conversion to full approval.

A drug was considered to have shown an OS benefit if a statistically significant benefit was observed with experimental therapy.³ A drug was considered to have shown a QoL benefit if a statistically significant difference was reported between the drug and the experimental arm among randomized controlled trials and between baseline and after treatment of single-arm trials. QoL data needed

to be based on a global score, a subscale, or a specific item from a validated patient-reported outcome (PRO) instrument.³

Data Scoring

We used the ASCO-VF Net Health Benefit Score version 2.0²⁰ and the ESMO-MCBS version 1.1²¹ to quantify the magnitude of clinical benefit. Despite differences in how efficacy, toxicity, and QoL are weighed (the ASCO-VF is linear and the ESMO-MCBS is categorical), both frameworks aim to measure the magnitude of the benefit of novel therapies. ESMO-MCBS and ASCO-VF grades were applied independently by 2 authors (either A. Bujosa and J.C. Tapia, or A. Bujosa and C. Moltó, respectively). The discrepancies were resolved by a fourth author (A. Tibau). In the postmarketing period, for drugs with updated efficacy and QoL data, grades and/or scores were recalculated because updated efficacy or QoL data can change scores. For trials in which updated data reported only 1 domain of efficacy or QoL, grades and/or scores were adjusted, retaining initial data that were not updated. Substantial clinical benefit was defined as follows: for the ASCO-VF, a threshold score of ≥ 45 ,²² and for the ESMO-MCBS, a grade of A or B for trials of curative intent and 4 or 5 for those of palliative intent.²¹

Statistical Analysis

Data were reported descriptively as proportions, medians, and ranges. In the noncurative setting, we explored whether characteristics of trials and applications were associated with OS, QoL, and clinically significant benefit thresholds. Associations were evaluated using univariable logistic regression at 3 timepoints: (1) at the time of approval, (2) after maximum postmarketing time, and (3) at any point in the life cycle of the drug. Regression results were reported as odds ratios and their respective 95% confidence intervals. Multivariable models included variables that were statistically significant in univariable analysis, with variable selection ensuring adequate fitting of the model. To reduce the chance of overfitting, multivariable analysis was performed exclusively using data at any point in the life cycle of the drug. Such analyses were not planned in the curative setting because of the small number of studies supporting such indications. Trends over time were assessed using the chi-square test for trends. All analyses were conducted using SPSS Statistics, version 21 (IBM Corp). Statistical tests were 2-sided, and statistical significance was defined as a 2-tailed $P < .05$.

Results

Between January 1, 2006, and December 31, 2015, 58 drugs were approved for 96 solid tumor indications based on 96 trials. Characteristics of included applications and trials supporting drug approval at the time of market authorization

Table 1. Characteristics of Applications and Trials Supporting Drug Approval

Characteristics	n (%)
Application characteristics	
Indications available	96 (100)
Priority review designation	
Yes	72 (75)
No	24 (25)
Breakthrough therapy designation ^a	
Yes	9/50 (18)
No	41/50 (82)
Orphan drug designation	
Yes	44 (46)
No	52 (54)
Type of approval	
Regular	74 (77)
Accelerated	22 (23)
Type of marketing authorization	
Initial	45 (47)
Supplemental	51 (53)
Number of trials supporting approval indication	
Multiple	13 (14)
Single	83 (86)
Trial characteristics	
Studies available	96 (100)
Study design	
Randomized controlled trial	82 (85)
Single-arm trial	14 (15)
Phase of study	
I-II	18 (19)
III	78 (81)
Blinding	
Open-label	59 (62)
Double-blind	37 (38)

(continued)

are shown in Table 1. Of these indications, 74 (77%) were granted regular approval and 22 (23%) were granted accelerated approval. Fourteen approvals (15%) were supported by single-arm studies. For 88 indications (92%), treatment intent was noncurative.

In the postmarketing period, most accelerated approval indications were converted to regular approval. Conversion from accelerated to regular approval was supported by 20 trials. One indication was pending regular approval (nivolumab and ipilimumab for advanced melanoma), and 1 indication was withdrawn (bevacizumab for advanced breast cancer). Consequently, the analysis comprised 96 trials: 74 trials supporting regular approval, 20

Table 1. Characteristics of Applications and Trials Supporting Drug Approval (cont.)

Characteristics	n (%)
Trial characteristics (cont.)	
Intent of treatment	
Curative	8 (8)
Noncurative	88 (92)
Line of treatment ^b	
First line	34/88 (39)
Later lines	54/88 (61)
Type of solid tumor	
Lung, breast, colorectal, prostate	43 (45)
Others	53 (55)
Experimental drug type	
Chemotherapy	16 (17)
Hormonal therapy	3 (3)
Target therapy	66 (68)
Immunotherapy	11 (12)
Companion diagnostic ^c	
Yes	21 (22)
No	75 (78)
Basis of decision	
Subgroup analysis	7 (7)
Entire study population	89 (93)
Crossover ^d	
Yes	26/82 (31)
No	53/82 (65)
Unknown	3/82 (4)

^aBreakthrough therapy designation came into effect in July 2012.

^bTrials with curative intent were not considered.

^cClassification of a drug as having a companion diagnostic test was determined by the FDA.¹⁹

^dOnly 82 randomized controlled trials were considered.

postmarketing trials supporting conversion to regular approval, 1 trial supporting the FDA withdrawal of the breast cancer indication for bevacizumab, and 1 trial supporting accelerated approval and pending conversion to regular approval.

OS and QoL Data

Table 2 summarizes the results for OS, QoL, and intermediate endpoints for all included studies. With a median postmarketing period of 3.3 years (minimum 9.2 months, maximum 8.8 years), 70 trials (73%) reported updated data on efficacy (n=59; 61%) and/or QoL (n=48; 50%). For 26 trials (27%), no updated data on efficacy or QoL were available.

At the time of marketing, approval was based on OS in 39 trials (41%). Among the 59 trials providing updated efficacy data in the postmarketing setting, 28 (47%) showed

Table 2. OS, QoL, and Clinical Benefit for Trials Included in Original FDA Report and in Postmarketing Period

Original FDA Report	n	Updated Report	n
Effect on efficacy		Effect on efficacy	
Confirmed	96	Updated	59
OS benefit ^a	39 (41%)	OS benefit ^a	28 (47%)
Surrogate endpoint	57 (59%)	Different from initial report	11
PFS	35	Same as initial report	17
DFS	1	Surrogate endpoint	31 (53%)
ORR	20	Different from initial report	8
Biochemical	1	Same as initial report	23
Unknown	0	Unknown	37
Effect on QoL		Effect on QoL	
Confirmed	45	Updated	48
Benefit ^b	16 (36%)	Benefit ^b	22 (46%)
No benefit	29 (64%)	No benefit	26 (54%)
Unknown	51	Unknown	48
ASCO-VF clinical benefit		ASCO-VF clinical benefit	
Evaluable	80	Evaluable	65
High benefit ^c	26 (33%)	High benefit ^c	35 (54%)
Low benefit ^d	54 (67%)	Low benefit ^d	30 (46%)
Not evaluable	16	Not evaluable	31
ESMO-MCBS clinical benefit		ESMO-MCBS clinical benefit	
Evaluable	94	Evaluable	69
High benefit ^e	25 (27%)	High benefit ^e	37 (54%)
Low benefit ^f	69 (73%)	Low benefit ^f	32 (46%)
Not evaluable	2	Not evaluable	27

Abbreviations: ASCO-VF, ASCO Value Framework; DFS, disease-free survival; ESMO-MCBS, ESMO-Magnitude of Clinical Benefit Scale; ORR, overall response rate; OS, overall survival; PFS, progression-free survival; QoL, quality of life.

^aA drug was considered to have shown an OS benefit if a statistically significant benefit was observed with experimental therapy.

^bA drug was considered to have shown a QoL benefit if a statistically significant difference was reported between the drug and experimental arm among randomized controlled trials and between baseline and after treatment in single-arm trials.

^cHigh clinical benefit for ASCO-VF was considered a threshold score of ≥ 45 (continuous variable).

^dLow clinical benefit for ASCO-VF was considered a score of < 44 points.

^eHigh clinical benefit for ESMO-MCBS was considered a grade of A or B for trials of curative intent and a grade of 4 or 5 for those of palliative intent.

^fLow clinical benefit for ESMO-MCBS was considered a grade of C for trials of curative intent and grade 1 to 3 for those of palliative intent.

improvement in OS, including 11 (19%) that showed OS improvement for the first time in the postmarketing period and 17 (29%) in which OS benefit reported previously was confirmed. In total, significantly improved OS was observed in 50 of 96 indications (52%), no improvement was observed in 31 indications (32%), and for 15 indications (16%), the effect on OS remains unknown.

Only 45 of 96 (47%) initial indications reported QoL data. Of these, 16 indications (36%) showed a statistically significant improvement in at least 1 PRO at the time of market approval. In the postmarketing period, among the 48 trials (50%) reporting updated QoL data, an improvement in QoL was observed for 22 (46%): 11 drugs

(23%) showed improvement in QoL for the first time, and in 11 trials (23%) a QoL benefit reported previously was confirmed. Overall, a significant improvement in QoL was observed for 27 of 96 indications (28%), and there was no improvement for 36 indications (36%). For 33 indications (34%), QoL was not assessed or reported formally. Notably, 16 indications (17%) showed an improvement in both OS and QoL.

Measures of Substantial Clinical Benefit

Table 2 shows the ASCO-VF and the ESMO-MCBS scores at the time of approval and in the postmarketing period. ASCO-VF scores were applied to 80 of 96 initial trials

(83%). Of the trials for which ASCO-VF could not be applied, 14 were single-arm or the primary endpoint was not suitable for assessment. Only 26 trials (33%) evaluable by the ASCO-VF met the threshold for substantial clinical benefit at the time of marketing approval. In the postmarketing period, 65 trials (68%) provided updated information and were evaluable using the ASCO-VF. Of these, 35 trials (54%) met the ASCO-VF scores for substantial clinical benefit including 17 (26%) that did not initially meet the threshold for substantial benefit but were upgraded to show substantial clinical benefit based on postmarketing data. Four trials (6%) that showed substantial benefit at the time of approval were downgraded because of a lack of substantial benefit based on postmarketing data.

The ESMO-MCBS scores could be applied to 94 of 96 initial trials (98%). Only 25 trials (27%) met the ESMO-MCBS threshold for substantial clinical benefit at the time of marketing approval. In the postmarketing period, 69 trials provided updated information and were scorable for the ESMO-MCBS. Of these, 37 (54%) met the threshold for substantial clinical benefit. Updated results led to a change in the ESMO-MCBS substantial clinical benefit threshold in 18 trials (26%). Of these, 17 trials (25%) that did not initially meet the threshold for substantial benefit were upgraded to show substantial clinical benefit based on postmarketing data. One trial (1%) that showed substantial benefit at the time of approval was downgraded because of a lack of substantial benefit based on postmarketing data.

Overall, based on both initial and updated data, among the 96 indications approved by the FDA, 39 trials (41%) met the criteria for substantial benefit using the ASCO-VF and 42 (44%) met the threshold using the ESMO-MCBS.

Over time, there has been an increase in the number of trials meeting the ASCO-VF threshold at any time (11% for drugs approved in 2006 vs 56% for drugs approved in 2015; $P_{\text{trend}}=.038$). There were no significant changes over time in OS or QoL or in the ESMO-MCBS scores. An OS benefit was observed among 60% of drugs approved in 2006 and 55% approved in 2015 ($P_{\text{trend}}=.78$). A QoL benefit was observed in 17% of drugs approved in 2006 and 54% approved in 2015 ($P_{\text{trend}}=.17$), and for the ESMO-MCBS, 40% of drugs met the substantial clinical benefit threshold in 2006 and 47% in 2015 ($P_{\text{trend}}=.65$).

Associations With OS, QoL, and Clinical Benefit

Associations with OS, QoL, and magnitude of clinical benefit as measured using the ASCO-VF and ESMO-MCBS at the time of market authorization are shown in Table 3 and those in the postmarketing period are shown in Table 4.

At the time of market approval, there were statistically significant associations between improved OS and regular

approval, nonorphan drug designation, sample size, more common tumors compared with others, and absence of crossover interference. Factors associated with OS in the postmarketing period differed, with immunotherapy, companion diagnostic drugs, and approvals based on subgroup analysis showing a survival advantage.

For QoL, there were no significant associations at initial approval. Improved QoL in the postmarketing period was associated with sample size, immunotherapy, and open-label studies.

At the time of market authorization, initial indications and those reporting QoL benefit were more likely to show substantial clinical benefit as determined by the ASCO-VF. In the postmarketing period, substantial clinical benefit as measured by the ASCO-VF was associated with accelerated approvals, drugs granted breakthrough therapy designation, indications for later lines of therapy, indications supported by phase I–II or single-arm trials, and indications with a lower sample size. Drugs initially approved with evidence of improved QoL were associated with substantial clinical benefit both at the time of approval and in the postmarketing period.

For the ESMO-MCBS, at the time of market authorization, drugs with a companion diagnostic test and those with OS benefit or QoL improvement were associated with substantial clinical benefit. Postapproval, only trials of drugs with companion diagnostics were associated with substantial clinical benefit.

Associations with OS, QoL, or substantial clinical benefit at any time are shown in supplemental eTable 1 (available with this article at JNCCN.org). In multivariable analyses, drugs with companion diagnostic tests and immunotherapy were associated with improved OS, QoL, and substantial clinical benefit.

Discussion

In the current analysis, we found that at the time of market approval, among 96 cancer drug indications approved by the FDA between 2006 and 2015, two-thirds of trials supporting FDA-approved anticancer drugs failed to meet the thresholds of substantial clinical benefit established by the ASCO-VF and ESMO-MCBS. With 3.3 years of postmarketing experience, approximately half of the trials showed substantial clinical benefit, thereby increasing the number of trials meeting ASCO-VF and ESMO-MCBS thresholds. Our analysis also showed an increase in the number of trials meeting the ASCO-VF threshold for clinical benefit over time.

There are limited data regarding the impact of postmarketing experience on the magnitude of clinical benefit for FDA-approved anticancer drugs as measured by validated frameworks. Previous data have focused on the availability of data on OS and QoL at the time of drug approval by the FDA from 2011 to 2017³ and by the

Table 3. Predictors of Benefit in Noncurative Setting at Time of Marketing Approval

	OS Benefit ^a		QoL Benefit ^b		ASCO-VF Clinical Benefit ^c		ESMO-MCBS Clinical Benefit ^d	
	OR (95% CI)	P Value ^e	OR (95% CI)	P Value ^e	OR (95% CI)	P Value ^e	OR (95% CI)	P Value ^e
Regular approval (vs accelerated approval)	21.38 (2.71–168.8)	.004	0.30 (0.05–1.89)	.20	5.05 (0.60–42.41)	.14	1.78 (0.46–6.86)	.40
Orphan drug designation (vs not)	0.39 (0.16–0.95)	.04	1.60 (0.40–6.36)	.50	0.99 (0.37–2.65)	.98	1.41 (0.51–3.90)	.51
Priority review designation (vs not)	1.96 (0.71–5.40)	.19	3.00 (0.66–13.66)	.16	3.61 (0.94–13.82)	.06	—	—
Breakthrough therapy designation	0.29 (0.05–1.56)	.15	—	—	3.00 (3.68–24.50)	.30	1.61 (0.33–7.78)	.55
Initial approval (vs supplemental)	0.70 (0.30–1.63)	.41	2.92 (0.77–11.07)	.12	3.26 (1.17–9.08)	.02	1.93 (0.68–5.49)	.22
Multiple trials supporting approval (vs 1 trial)	0.31 (0.06–1.54)	.15	4.85 (0.46–51.66)	.19	2.18 (0.29–16.51)	.45	2.76 (0.69–11.01)	.15
Sample size per 100 patients	1.70 (1.36–2.12)	<.001	0.98 (0.82–1.18)	.86	0.91 (0.77–1.06)	.23	1.04 (0.90–1.20)	.56
Lung, breast, colorectal, and prostate cancer (vs others)	2.40 (1.04–5.88)	.04	3.18 (0.82–12.34)	.09	0.77 (0.29–2.07)	.61	0.71 (0.26–1.97)	.51
Immunotherapy (vs standard and target therapy)	1.12 (0.28–4.47)	.88	—	—	1.64 (0.34–8.00)	.54	3.36 (0.80–14.04)	.09
Companion diagnostic (vs none)	0.32 (0.09–1.07)	.06	8.00 (0.80–80.41)	.08	3.00 (0.81–11.08)	.09	4.22 (1.36–13.07)	.01
Single-arm (vs randomized) ^f	—	—	7.00 (0.70–70.04)	.09	—	—	0.61 (0.12–3.02)	.54
Phase I–II (vs phase III) ^f	—	—	9.54 (0.99–92.17)	.05	1.42 (0.22–9.14)	.71	0.78 (0.20–3.08)	.72
Approval based on subgroup analysis (vs not)	0.53 (0.10–2.87)	.46	—	—	2.18 (0.29–16.51)	.45	0.57 (0.06–5.08)	.62
Open-label (vs double-blind)	0.78 (0.33–1.85)	.57	3.85 (0.98–15.12)	.05	1.09 (0.41–2.89)	.86	2.21 (0.72–6.82)	.17
Crossover (vs not)	0.16 (0.05–0.49)	.001	1.03 (0.26–4.11)	.97	2.29 (0.82–6.40)	.11	1.44 (0.47–4.40)	.52
Later lines (vs first-line)	1.06 (0.44–2.53)	.90	1.86 (0.51–6.84)	.35	2.07 (0.73–5.86)	.17	1.52 (0.51–4.47)	.45
OS (vs intermediate endpoints)	—	—	0.54 (0.15–1.98)	.35	0.61 (0.23–1.63)	.32	2.95 (1.03–8.46)	.04
QoL benefit	0.54 (0.15–1.98)	.35	—	—	7.44 (1.44–38.41)	.02	29.33 (3.04–282.90)	.003

Bold indicates statistically significant P value.

Abbreviations: ASCO-VF, ASCO Value Framework; ESMO-MCBS, ESMO-Magnitude of Clinical Benefit Scale; OR, odds ratio; OS, overall survival; QoL, quality of life.

^aA drug was considered to have shown an OS benefit if a statistically significant benefit was observed with experimental therapy.

^bA drug was considered to have shown a QoL benefit if a statistically significant difference was reported between the drug and experimental arm among randomized controlled trials and between baseline and after treatment in single-arm trials.

^cHigh clinical benefit for ASCO-VF was considered a threshold score of ≥ 45 .

^dHigh clinical benefit for ESMO-MCBS was considered a grade of A or B for trials of curative intent and a grade of 4 or 5 for those of palliative intent.

^eBased on univariable logistic regression. All P values are 2-sided.

^fStatistical analysis not feasible (no single-arm trials or phase I–II studies at the time of market approval showing OS benefit. Single-arm trials not scorable with the ASCO-VF).

European Medicines Agency from 2009 to 2013.⁹ Taken together, these studies found that less than half of the anti-cancer drugs showed an OS benefit or a QoL improvement. These results are consistent with our present work, which covers a longer period. Between 2006 and 2015, the FDA approved most cancer drugs without evidence of OS (60%) or improved QoL (83%). Even after a median of 3.3 years, only 52% of indications were supported by an improvement in OS and 28% showed a statistically significant improvement in QoL.

When we evaluated associations with clinical benefit, we found that factors associated with OS and QoL benefit or substantial clinical benefit differed at the time of approval and in the postmarketing period. Unsurprisingly, trials with an OS benefit at marketing authorization were more likely to be granted regular approval, more commonly evaluated drugs in common cancers, and had a larger magnitude of effect. In contrast, clinical benefit in the postmarketing period was associated with immunotherapy, a treatment for which responses and durability of response

Table 4. Predictors of Benefit in the Noncurative Setting in Postmarketing Period

	OS Benefit ^a		QoL Benefit ^b		ASCO-VF Clinical Benefit ^c		ESMO-MCBS Clinical Benefit ^d	
	OR (95% CI)	P Value ^e	OR (95% CI)	P Value ^e	OR (95% CI)	P Value ^e	OR (95% CI)	P Value ^e
Accelerated approval (vs regular approval)	0.52 (0.11–2.36)	.39	3.33 (0.81–13.66)	.09	5.00 (1.49–16.77)	.009	2.20 (0.67–7.22)	.19
Orphan drug designation (vs not)	2.41 (0.51–11.37)	.27	3.66 (0.88–15.19)	.07	1.87 (0.61–5.77)	.27	1.01 (0.32–3.18)	.98
Priority review designation (vs not)	1.00 (0.18–5.70)	.99	2.15 (0.40–11.69)	.37	2.14 (0.52–8.80)	.29	0.46 (0.13–1.58)	.22
Breakthrough therapy designation	3.00 (0.45–19.93)	.25	4.67 (0.72–30.12)	.11	7.50 (1.23–45.81)	.03	4.25 (0.82–22.13)	.08
Initial approval (vs supplemental)	1.27 (0.27–5.97)	.76	3.38 (0.76–14.99)	.11	2.87 (0.86–9.58)	.09	1.53 (0.48–4.90)	.47
Multiple trials supporting approval (vs 1 trial)	0.64 (0.07–5.98)	.70	1.67 (0.26–10.64)	.59	2.57 (0.56–11.72)	.22	2.73 (0.63–11.81)	.18
Sample size per 100 patients	0.85 (0.64–1.13)	.26	0.73 (0.56–0.97)	.03	0.81 (0.67–0.99)	.04	0.90 (0.75–1.07)	.24
Lung, breast, colorectal, and prostate cancer (vs others)	1.09 (0.24–4.94)	.91	0.40 (0.10–1.63)	.20	1.53 (0.50–4.68)	.46	1.53 (0.49–4.81)	.47
Immunotherapy (vs standard and target therapy)	8.20 (1.29–52.16)	.03	9.14 (1.39–60.17)	.02	2.57 (0.56–11.72)	.22	3.50 (0.76–16.12)	.11
Companion diagnostic (vs none)	11.67 (2.01–67.81)	.006	3.90 (0.94–16.25)	.06	4.71 (1.37–16.17)	.01	4.75 (1.37–16.44)	.01
Single-arm (vs randomized) ^c	1.30 (0.22–7.53)	.77	4.29 (0.86–21.48)	.08	31.20 (3.48–279.30)	.002	3.03 (0.78–11.83)	.11
Phase I-II (vs phase III)	1.80 (0.37–8.79)	.47	3.89 (0.89–17.06)	.07	12.33 (2.76–55.05)	.001	2.85 (0.80–10.12)	.10
Approval based on subgroup analysis (vs not)	12.60 (1.68–94.53)	.01	2.30 (0.33–15.93)	.40	1.54 (0.23–10.13)	.65	3.31 (0.59–18.40)	.17
Open-label (vs double-blind)	4.41 (0.50–39.04)	.18	8.89 (1.02–77.32)	.04	3.17 (0.88–11.31)	.07	3.64 (0.91–14.51)	.06
Crossover (vs not)	0.16 (0.05–0.49)	.001	5.25 (0.80–34.50)	.08	1.54 (0.35–6.73)	.57	0.93 (0.20–4.29)	.92
Later lines (vs first-line)	1.06 (0.44–2.53)	.90	4.50 (0.84–23.98)	.07	8.00 (1.62–39.44)	.01	0.82 (0.26–2.61)	.75
OS (vs intermediate endpoints)	—	—	3.00 (0.68–13.29)	.15	0.38 (0.11–1.28)	.12	0.65 (0.19–2.16)	.48
QoL benefit (vs not)	0.54 (0.15–1.98)	.35	—	—	5.83 (1.12–30.40)	.03	1.50 (0.21–10.81)	.67

Bold indicates statistically significant P value.

Abbreviations: ASCO-VF, ASCO Value Framework; ESMO-MCBS, ESMO-Magnitude of Clinical Benefit Scale; OR, odds ratio; OS, overall survival; QoL, quality of life.

^aA drug was considered to have shown an OS benefit if a statistically significant benefit was observed with experimental therapy.

^bA drug was considered to have shown a QoL benefit if a statistically significant difference was reported between the drug and experimental arm among randomized controlled trials and between baseline and after treatment in single-arm trials.

^cHigh clinical benefit for ASCO-VF was considered a threshold score of ≥45.

^dHigh clinical benefit for ESMO-MCBS was considered a grade of A or B for trials of curative intent and a grade of 4 or 5 for those of palliative intent.

^eBased on univariable logistic regression. All P values are 2-sided.

can appear later in follow-up.²³ In addition, some variables such as drugs with companion diagnostics seemed to show a benefit in certain scenarios. Of concern was our finding that open-label studies were more likely to show improved QoL. This raises concern about ascertainment bias.²⁴

A possible explanation for the variability in associations of study and approval characteristics with OS, QoL, and magnitude of clinical benefit is that the ASCO-VF and ESMO-MCBS evaluate benefit as composite outcomes

weighting efficacy, toxicity, and QoL rather than assessing these outcomes in isolation. Another explanation is that in our study a drug was considered to have shown an OS benefit if a statistically significant benefit was observed with experimental therapy. Statistical significance can be observed with small effect sizes, which may not meet the thresholds for substantial clinical benefit, a concept better addressed with the ASCO-VF and ESMO-MCBS, in which efficacy outcomes are measured in terms of relative and absolute benefits.

The increased use of surrogate endpoints as the basis for approval is associated with uncertainty about the definitive benefit of drugs. This ambiguity makes postmarketing data very valuable.²⁵ Although the accelerated approval pathway requires the completion of postmarketing clinical trials to confirm that a drug provides clinical benefit as predicted by the surrogate endpoint, regular approvals do not require further assessment to confirm effectiveness and safety after marketing authorization. Unfortunately, in the postapproval period, only two-thirds of pivotal trials provided updated data on efficacy, which may reflect a lack of positive studies (publication bias) or studies that were underpowered to show statistically significant improvement in OS.

Our data support possible improvement in the approval process for anticancer drugs. First, when surrogate endpoints are used, and especially for accelerated drug approvals, postmarketing studies with both OS and QoL outcomes should be mandated.²⁶ Second, greater efforts need to be made to develop and validate meaningful surrogate endpoints for OS and QoL. Third, PROs and other patient-centered measures should be prioritized at early stages of drug development. In pivotal trials, missing data²⁷ should be minimized and journal editors should encourage the publication of such data.²⁸ Finally, trials should be designed with sufficient statistical power for an analysis of changes in OS and/or QoL.

This study has limitations. First, the duration of postmarketing approval was relatively short. A longer period of postmarketing time may have resulted in a higher proportion of indications showing improved OS and QoL, especially with immune checkpoint inhibitors. Second, PRO data are often missing from FDA cancer-drug labels and are frequently not included in primary publications of pivotal trials. Third, PROs are often exploratory, which makes their interpretation difficult. Fourth, results obtained from analysis with frameworks that rely largely on randomized trials should be treated with caution because the score applied to experimental therapy is highly dependent

on the quality of the control arm. Finally, we excluded drugs for hematologic malignancies, thereby limiting the generalizability to solid tumor drug approval.

Conclusions

In patients with solid tumors, an increasing number of approved drugs showed improved OS and QoL and met the ASCO-VF or ESMO-MCBS threshold for substantial benefit over the course of postmarketing time compared with the time of approval. However, fewer than half of the trials supporting FDA approval showed an OS benefit or a QoL improvement, and just more than half of the trials showed substantial clinical benefit. With an increasing number of drug approvals being based on single-arm trials and surrogate endpoints,²⁹ robust postmarketing trials are becoming increasingly important.³⁰ Regulators and professional societies should prioritize the collection of outcome data throughout the postmarketing life cycle of drugs and be prepared to update indications or treatment recommendations on the basis of all available data.

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Associations With Definitive Outcomes and Clinical Benefit of Cancer Drugs at the Time of Marketing Approval and in the Postmarketing Period

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eTable 1: Predictors of Benefit in the Noncurative Setting

eTable 1. Predictors of Benefit in the Noncurative Setting

Variable	Univariable Analysis							
	OS Benefit ^a		QoL Benefit ^b		ASCO-VF Clinical Benefit ^c		ESMO-MCBS Clinical Benefit ^d	
	OR (95% CI)	P Value ^e	OR (95% CI)	P Value ^e	OR (95% CI)	P Value ^e	OR (95% CI)	P Value ^e
Regular approval (vs accelerated approval)	4.00 (1.29–12.38)	.016	0.46 (0.15–1.44)	.18	0.64 (0.23–1.83)	.40	0.56 (0.20–1.53)	.26
Orphan drug designation (vs not)	0.55 (0.23–1.30)	.17	1.86 (0.65–5.29)	.25	1.27 (0.53–3.02)	.59	1.30 (0.55–3.10)	.55
Priority review designation (vs not)	1.00 (0.18–5.70)	.99	2.86 (0.87–9.46)	.08	2.92 (0.99–8.57)	.05	2.02 (0.70–5.82)	.19
Breakthrough therapy designation	0.85 (0.20–3.71)	.83	0.85 (0.20–3.71)	.83	3.00 (0.37–24.50)	.305	15.38 (1.73–136.67)	.01
Initial approval (vs supplemental)	0.79 (0.34–1.84)	.58	2.71 (0.94–7.81)	.06	5.39 (2.11–13.78)	<.001	2.11 (0.87–5.08)	.09
Multiple trials supporting approval (vs 1 trial)	0.36 (0.09–1.48)	.16	3.52 (0.63–19.84)	.15	2.23 (0.52–9.59)	.28	4.32 (1.03–18.08)	.04
Sample size per 100 patients	1.47 (1.22–1.76)	<.001	1.50 (0.54–4.17)	.44	0.88 (0.77–0.99)	.04	0.98 (0.86–1.11)	.74
Lung, breast, colorectal, and prostate cancer (vs others)	2.46 (1.04–5.85)	.04	7.27 (0.79–66.60)	.008	0.95 (0.40–2.25)	.91	1.58 (0.66–3.77)	.30
Immunotherapy (vs standard and target therapy)	7.55 (0.88–64.27)	.06	4.98 (1.36–18.23)	.001	4.12 (0.80–21.26)	.090	6.61 (1.28–34.06)	.02
Companion diagnostic (vs none)	1.21 (0.43–3.44)	.72	6.53 (1.25–34.03)	.02	6.74 (1.76–25.74)	.005	22.67 (4.74–108.42)	<.001
Single-arm (vs randomized)	0.13 (0.03–0.63)	.01	5.88 (1.42–24.36)	.01	9.94 (1.18–83.54)	.03	2.03 (0.62–6.67)	.24
Phase I–II (vs phase III)	0.17 (0.04–0.67)	.01	0.58 (0.10–3.44)	.55	7.33 (1.51–35.58)	.01	2.31 (0.77–6.97)	.14
Approval based on subgroup analysis (vs not)	2.50 (0.46–13.65)	.29	4.75 (1.52–14.85)	.007	2.16 (0.37–12.51)	.39	2.22 (0.46–10.62)	.32
Open-label (vs double-blind)	1.12 (0.47–2.65)	.80	4.41 (1.20–16.14)	.02	1.58 (0.65–3.79)	.31	3.37 (1.30–8.80)	.01
Crossover (vs not)	0.25 (0.09–0.71)	.01	2.11 (0.70–6.35)	.18	2.10 (0.87–5.06)	.09	1.42 (0.52–3.90)	.49
Later lines (vs first-line)	0.83 (0.35–1.99)	.68	2.04 (0.72–5.77)	.18	2.25 (0.84–6.04)	.11	1.06 (0.44–2.57)	.90
OS (vs intermediate endpoints)	—	—	2.19 (0.70–6.85)	.18	4.54 (1.70–12.11)	.003	1.35 (0.57–3.23)	.49
QoL (vs not)	0.59 (0.17–2.06)	.41	—	—	34.00 (3.61–320.10)	.002	40.00 (5.82–274.76)	<.001
Variable	Multivariable Analysis							
	OS Benefit ^a		QoL Benefit ^b		ASCO-VF Clinical Benefit ^c		ESMO-MCBS Clinical Benefit ^d	
	OR (95% CI)	P Value ^f	OR (95% CI)	P Value ^f	OR (95% CI)	P Value ^f	OR (95% CI)	P Value ^f
Companion diagnostic (vs none)	4.66 (1.13–19.25)	.033	5.94 (1.56–22.56)	.009	7.78 (2.00–30.29)	.003	30.84 (46.21–153.14)	<.001
Immunotherapy (vs standard and target therapy)	28.52 (2.65–306.62)	.006	9.85 (1.02–95.04)	.04	5.45 (1.02–29.05)	.04	12.35 (2.20–68.71)	.004
Sample size per 100 patients	1.70 (1.34–2.16)	<.001	—	—	—	—	—	—

Bold indicates statistically significant *P* value.

Abbreviations: ASCO-VF, ASCO Value Framework; ESMO-MCBS, ESMO-Magnitude of Clinical Benefit Scale; OR, odds ratio; OS, overall survival; QoL, quality of life. ^aA drug was considered to have shown an OS benefit if a statistically significant benefit was observed with experimental therapy.

^bA drug was considered to have shown a QoL benefit if a statistically significant difference was reported between the drug and experimental arm among randomized controlled trials and between baseline and after treatment in single-arm trials.

^cHigh clinical benefit for ASCO-VF was considered a threshold score of ≥ 45 .

^dHigh clinical benefit for ESMO-MCBS was considered a grade of A or B for trials of curative intent and a grade of 4 or 5 for those of palliative intent.

^eBased on univariable logistic regression. All *P* values are 2-sided.

^fMultivariable models were adjusted for variables with *P* values $< .05$ in the univariable model and showing benefit for at least 2 benefit outcomes: sample size (continuous), companion diagnostic (yes vs no), immunotherapy (yes vs no), and type of trial (single-arm vs randomized).