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Bladder Cancer



Surrogate Endpoints as Predictors of Overall Survival in Metastatic Urothelial Cancer: A Trial-level Analysis

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Article info

Article history: Accepted November 4, 2022

Associate Editor: Guillaume Ploussard

Keywords: Surrogate endpoints Bladder cancer Clinical trials

Abstract

Background: Surrogate endpoints (SEs), such as progression-free survival (PFS) and objective response rate (ORR), are frequently used in clinical trials. The relationship between SEs and overall survival (OS) has not been well described in metastatic urothelial cancer (MUC).

Objective: We evaluated trial-level data to assess the relationship between SEs and OS. We hypothesize a moderate surrogacy relationship between both PFS and ORR with OS.

Design, setting, and participants: We systematically reviewed phase 2/3 trials in MUC with two or more treatment arms, and report PFS and/or ORR, and OS.

Outcome measurements and statistical analysis: Linear regression was performed, and the coefficient of determination (R²) and surrogate threshold effect (STE) estimate were determined between PFS/ORR and OS.

Results and limitations: Of 3791 search results, 59 trials and 62 comparisons met the inclusion criteria. Of the 53 trials that reported PFS, 31 (58%) reported proportional hazard regression for PFS and OS. Linear regression across trials demonstrated an R^2 of 0.60 between hazard ratio (HR) for PFS (HR^{PFS}) and HR for OS (HR^{OS}), and an STE of 0.41. Linear regression of Δ PFS (median PFS in months of the treatment arm – that of the control arm) and Δ OS demonstrated an R^2 of 0.12 and an STE of 14.1 mo. Thirty trials reported ORRs. Linear regression for ORR^{ratio} and HR^{OS} among all trials found an R^2 of 0.08; an STE of 95% was not reached at any value and Δ ORR and HR^{OS} similarly demonstrated a poor correlation with an R^2 value of 0.03.

Conclusions: PFS provides only a moderate level of surrogacy for OS; An HR^{PFS} of \leq 0.41 provides 95% confidence of OS improvement. ORR is weakly correlated with OS and should be de-emphasized in MUC clinical trials. When PFS is discussed, proportional hazard regression should be reported.

Patient summary: We examined the relationship between surrogate endpoints, common outcomes in clinical trials, with survival in urothelial cancer trials. Progression-free survival is moderately correlated, while objective response rate

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had a poor correlation with survival and should be de-emphasized as a primary endpoint.

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1. Introduction

The selection of proper endpoints for clinical trials is imperative to the accurate interpretation of trial results, and to achieving the goal of novel therapies to prolong and/or improve the quality of patients' lives [1,2]. In oncology trials, overall survival (OS) is the gold-standard clinical endpoint. Surrogate endpoints (SEs), conversely, are measurable outcomes that are not intrinsically beneficial for patients, but are known or thought to predict a meaningful clinical benefit outcome, such as OS [3–5]. SEs are utilized because they shorten clinical trial times, and often sample size, resulting in decreased cost and quicker regulatory review with possible expedited access of novel therapies to patients [4,6–8].

Recently, SE utilization in therapy approval has increased, often without demonstrating an OS benefit [3,9–12]. This trend is in response to a 1992 policy shift by the Food and Drug Administration (FDA) allowing for the approval of certain therapies based on a demonstration of an SE benefit in a single phase 2 trial, rather than the prior requirement to demonstrate an OS benefit in phase 3 trials [3,5,13]. Careful attention to this trend is warranted as the relationship between SEs and OS may not be established fully in the context of each malignancy type, and thus an unverified assumption about clinical benefit undergirds a significant proportion of novel therapeutics [4,14].

Urothelial cancer (UC) is a frequent and aggressive malignancy, with 83 730 new cases and an estimated number of 17 200 deaths in 2021 [15]. Although the relationship between SEs and OS has been explored in multiple other malignancies evaluating trial-level data, metastatic UC (mUC) trials have not been examined. As the relationship between SEs and OS can also be a function of the biology of the specific cancer, as well as the class of therapy being evaluated (among several other potential confounders), endpoint surrogacy must be evaluated within each cancer therapy setting [3,16,17]; our analysis is focused on mUC. To address this gap in knowledge, we reviewed clinical trials in mUC to explore the relationship between commonly used surrogates: progression-free survival (PFS) and objective response rate (ORR), with OS. We hypothesize a moderate surrogacy relationship (\mathbb{R}^2 of ~0.5–0.7 [18]) between PFS and ORR with OS.

2. Patients and methods

2.1. Database search

Search strings for PubMed and EMBASE (Elsevier) with the assistance of an information specialist used controlled vocabulary and free text terms for (1) UC, (2) advanced or metastatic stage, and (3) clinical trials with two or more arms. Databases were searched in August 2021. Search results were deduplicated in EndNoteX9 [19] and exported to Excel for title, abstract, and full-text reviews. Studies were included if these investigated mUC, had multiple arms, were randomized clinical trials, were not surgical or radiation trials, and reported one SE and OS. Meeting abstracts, nonrandomized clinical trials, prospective cohort, reviews, and retrospective studies were excluded. Studies that included both upper-tract UC and bladder cancer were included in the analysis, but studies that investigated only patients with upper tract tumors were excluded. Trials that did not report both OS, and PFS and/or ORR were excluded.

2.2. Selection strategy

Search results underwent a two-pass review for inclusion: a focused review of publication titles and abstracts was performed for initial screening. A secondary review of the text of articles and data abstraction was then carried out.

2.3. Data abstraction

Pertinent data were extracted from each manuscript. These included the first author, publication year, participant number, percentage (%) of male participants, crossover allowance in the study design, intervention/drug type, median follow-up, OS, PFS, and ORR for each arm, and hazard ratio (HR) for OS (HR^{OS}) and PFS (HR^{PFS}).

2.4. Data analysis

Median values and interquartile ranges (IQRs) for the number of patients, publication year, percent male participants, Δ PFS in months (median PFS in months of the treatment arm minus that of the control arm), HR^{PFS}, ORR^{ratio} (calculated as ORR^{treatment}/ORR^{control}), Δ ORR (median ORR [%] of the treatment arm minus that of the control arm), HR^{OS}, and Δ OS (median OS [mo] of the treatment arm minus that of the control arm) were determined. Prespecified subgroups were described separately, including trials without crossover, trials with an immune checkpoint inhibitor (ICI) agent as a treatment-arm intervention, non-ICI trials, and trials with follow-up of longer than 24 mo.

The relationship between PFS and OS was evaluated in the following ways: linear regression between HRPFS and HROS, and R² was computed. Linear regression between differences in median PFS (Δ PFS, in months) and ΔOS was also performed. We similarly evaluated the relationship between ORR and OS in two different ways: ORR^{ratio} and ΔOS , and ΔORR (ORR treatment – ORR $^{control})$ and ΔOS were correlated by linear regression, and R² was computed. Additionally, the surrogate threshold effect (STE), the observed surrogate value that provides 95% confidence of an expected OS benefit, was calculated as follows: (1) linear regression is performed, (2) 95% predicted confidence interval (CI) bands are computed and graphed, and (3) if the dependent variable was HR^{OS}, then the STE was calculated by identifying the value at which the upper 95% predicted CI intercepts with the Y axis at Y = 1. When the dependent variable was ΔOS , then the STE was calculated by identifying the value at which lower 95% predicted CI intercepts the X axis (Y = 0) [17,20]. All analyses were performed using SPSS version 22.0 (IBM Corp., Armonk, NY, USA).

3. Results

3.1. Data collection

From the original search of two databases, 996 PubMed and 2795 Embase results were retrieved. After deduplication and manual screening, 3735 were excluded as those did not meet the criteria (Fig. 1); 59 trials and 62 comparisons were included in the analysis (Supplementary Table 1).

3.2. Trial description

The median trial sample size was 135 (IQR 85, 389), year of publication was 2016 (2007, 2020), HR^{PFS} was 0.86 (0.71, 1.03), ΔPFS was 0.2 (-1.55, 1.35) mo, ORR^{ratio} was 1.07 (0.76, 1.40), ΔORR was 3.0% (-10.0, 11.2%), HR^{OS} was 0.90 (0.80, 1.08), and ΔOS was 0.60 (-1.20, 2.58) mo. The median follow-up was 23.5 (14.9, 41.2) mo. Ten of 62 (16%) trials included crossover of the control arm to the treatment

arm in the protocol, and 13 (21%) were evaluating immune checkpoint inhibition interventions (Table 1). Descriptive statistics of subgroups are shown in Table 1.

3.3. Correlation between SEs and OS

Of the 53 trials that reported PFS, 31 (58%) performed and reported proportional hazard regression for PFS and OS. Linear regression of all trials demonstrated an R^2 of 0.60 between HR^{PFS} and HR^{OS}, and the STE was calculated and found to be 0.41 (Fig. 2). Trials that did not allow crossover, ICI and non-ICI trials, trials with follow-up of >24 mo, and first-line and non–first-line trials were evaluated separately (Table 2).

Linear regression between Δ PFS and Δ OS demonstrated an R² of 0.12 and an STE of 14.1 mo (Fig. 2). Subgroups were analyzed with respect to Δ PFS and Δ OS (Table 2).

Linear regression for ORR^{ratio} and HR^{OS} including all trials demonstrated an R^2 of 0.08, and an STE of 95% was not



Fig. 1 – Systematic clinical trial review schema. OS = overall survival; SE = surrogate endpoint; UCC = urothelial carcinoma.

Table 1	l –	Descriptive	analysis	of trial	comparisons	of mUC
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Trial comparisons (%) $62 (100)$ $50 (81)$ $13 (21)$ $49 (79)$ $17 (27)$ N $135 (85, 389)$ $121 (85, 370)$ $686 (176, 732)$ $110 (82, 237)$ $263 (110, 643)$ % Male $76 (74, 80)$ $76 (74, 81)$ $75 (75, 77)$ $77 (73, 81)$ $75 (74, 82)$ Year of publication $2016 (2007, 2020)$ $2014 (2005, 2018)$ $2020 (2019, 2020)$ $2013 (2005, 2017)$ $2013 (2005, 2020)$ HR ^{PFS} $0.86 (0.71, 1.03)$ $0.85 (0.70, 1.06)$ $0.80, 0.64, 0.97)$ $0.87 (0.73, 1.07)$ $0.87 (0.75, 1.00)$ $\Delta PES (mo)$ $0.20 (-155, 1.35)$ $-0.00 (-180, 1.35)$ $0.60 (-190, 1.90)$ $0.20 (-153, 1.30)$ $-0.90 (-3.03, 1.23)$		All trials	No crossover	ICI	Non-ICI	Longer follow-up
N 135 (85, 389) 121 (85, 370) 686 (176, 732) 110 (82, 237) 263 (110, 643) % Male 76 (74, 80) 76 (74, 81) 75 (75,77) 77 (73, 81) 75 (74, 82) Year of publication 2016 (2007, 2020) 2014 (2005, 2018) 2020 (2019, 2020) 2013 (2005, 2017) 2013 (2005, 2020) HR ^{PFS} 0.86 (0.71, 1.03) 0.85 (0.70, 1.06) 0.80, 0.64, 0.97) 0.87 (0.73, 1.07) 0.87 (0.75, 1.00) APES (mo) 0.20 (-155, 1.35) -0.01 (-180, 1.35) 0.60 (-190, 1.90) 0.20 (-153, 1.30) -0.90 (-3.03, 1.23)	Trial comparisons (%)	62 (100)	50 (81)	13 (21)	49 (79)	17 (27)
% Male 76 (74, 80) 76 (74, 81) 75 (75,77) 77 (73, 81) 75 (74, 82) Year of publication 2016 (2007, 2020) 2014 (2005, 2018) 2020 (2019, 2020) 2013 (2005, 2017) 2013 (2005, 2020) HR ^{PFS} 0.86 (0.71, 1.03) 0.85 (0.70, 1.06) 0.80, 0.64, 0.97) 0.87 (0.73, 1.07) 0.87 (0.75, 1.00) APES (mo) 0.20 (-1 55, 1.35) -0.10 (-1 80, 1.35) 0.60 (-1 90, 1.90) 0.20 (-1 53, 1.30) -0.90 (-3.03, 1.23)	Ν	135 (85, 389)	121 (85, 370)	686 (176, 732)	110 (82, 237)	263 (110, 643)
Year of publication 2016 (2007, 2020) 2014 (2005, 2018) 2020 (2019, 2020) 2013 (2005, 2017) 2013 (2005, 2020) HR ^{PFS} 0.86 (0.71, 1.03) 0.85 (0.70, 1.06) 0.80, 0.64, 0.97) 0.87 (0.73, 1.07) 0.87 (0.75, 1.00) APES (mo) 0.20 (-1 55, 1.35) -0.10 (-1 80, 1.35) 0.60 (-1 90, 1.90) 0.20 (-1 53, 1.30) -0.90 (-3.03, 1.23)	% Male	76 (74, 80)	76 (74, 81)	75 (75,77)	77 (73, 81)	75 (74, 82)
HR ^{PFS} 0.86 (0.71, 1.03) 0.85 (0.70, 1.06) 0.80, 0.64, 0.97) 0.87 (0.73, 1.07) 0.87 (0.75, 1.00) APES (mo) 0.20 (-155, 1.35) -0.10 (-180, 1.35) 0.60 (-1.90, 1.90) 0.20 (-153, 1.30) -0.90 (-3.03, 1.23)	Year of publication	2016 (2007, 2020)	2014 (2005, 2018)	2020 (2019, 2020)	2013 (2005, 2017)	2013 (2005, 2020)
$\Delta PFS (m_0)$ 0.20 (-1.55, 1.35) -0.10 (-1.80, 1.35) 0.60 (-1.90, 1.90) 0.20 (-1.53, 1.30) -0.90 (-3.03, 1.23)	HR ^{PFS}	0.86 (0.71, 1.03)	0.85 (0.70, 1.06)	0.80, 0.64, 0.97)	0.87 (0.73, 1.07)	0.87 (0.75, 1.00)
	ΔPFS (mo)	0.20 (-1.55, 1.35)	-0.10 (-1.80, 1.35)	0.60 (-1.90, 1.90)	0.20 (-1.53, 1.30)	-0.90 (-3.03, 1.23)
ORR ^{ratio} 1.07 (0.76, 1.40) 1.04 (0.77, 1.35) 1.07 (0.70, 1.83) 1.05 (0.77, 1.35) 0.74 (0.67, 1.22)	ORR ^{ratio}	1.07 (0.76, 1.40)	1.04 (0.77, 1.35)	1.07 (0.70, 1.83)	1.05 (0.77, 1.35)	0.74 (0.67, 1.22)
ΔORR (%) 3.0% (-10.0, 11.2%) 2.5% (-10.5, 11.6%) 3.0% (-13.8, 9.9%) 2.6% (-8.8, 13.5%) -9.3% (-16.5, 9.5%)	ΔORR (%)	3.0% (-10.0, 11.2%)	2.5% (-10.5, 11.6%)	3.0% (-13.8, 9.9%)	2.6% (-8.8, 13.5%)	-9.3% (-16.5, 9.5%)
HR ⁰⁵ 0.90 (0.80, 1.08) 0.89 (0.80, 1.08) 0.86 (0.73, 0.94) 0.94 (0.83, 1.14) 0.87 (0.75, 0.94)	HR ^{os}	0.90 (0.80, 1.08)	0.89 (0.80, 1.08)	0.86 (0.73, 0.94)	0.94 (0.83, 1.14)	0.87 (0.75, 0.94)
ΔOS (mo) 0.60 (-1.20, 2.58) 0.55 (-1.23, 2.35) 2.60 (0.85, 3.15) 0.20 (-1.30, 1.90) 1.10 (-1.10, 2.50)	$\Delta OS (mo)$	0.60 (-1.20, 2.58)	0.55 (-1.23, 2.35)	2.60 (0.85, 3.15)	0.20 (-1.30, 1.90)	1.10 (-1.10, 2.50)

HR = hazard ratio; ICI = immune checkpoint inhibitor; mUC = metastatic urothelial cancer; ORR = objective response rate; OS = overall survival; PFS = progression-free survival.

Longer follow-up indicates trials with follow-up of 224 mo



Fig. 2 – Linear regression analysis between (A) HR^{PFS} and HR^{OS}, (B) Δ PFS and Δ OS, (C) ORR^{ratio} and HR^{OS}, and (D) Δ ORR and HR^{OS} among all trial comparisons. Longer follow-up indicates trials with follow-up of \geq 24 mo. HR = hazard ratio; IO = immunotherapy; ORR = objective response rate; OS = overall survival; PFS = progression-free survival; STE = surrogate threshold effect.

reached at any value (Fig. 2) or in any subgroup (Table 2). Linear regression for $\triangle ORR$ and HR^{OS} demonstrated a poor correlation with an R² value of 0.03, and an STE of 95% was not reached (Fig. 2). Similarly, a subgroup analysis of $\triangle ORR$ and HR^{OS} revealed low R² values, and no STE was found for any subgroup (Table 2).

4. Discussion

We report a systematic trial-level analysis of the relationship between candidate SEs and OS in MUC. Among available comparisons, there was a moderate correlation between HR^{PFS} and HR^{OR} , but a weak correlation between ΔPFS and ΔOS , and ΔORR or ORR^{ratio} with HR^{OS} . Despite a moderately strong R², an STE of 0.41 is computed for HR^{PFS}, while an STE for ORR was not reached. Taken together, our findings indicate that PFS is a moderately good surrogate for OS and an observed HR^{PFS} of \leq 0.41 provides 95% confidence of an improvement in OS. An ORR, conversely, represents a poor surrogate for OS.

SEs are increasingly used in lieu of OS as primary endpoints in studies of novel cancer therapies [4,9]. Chen et al. [4] reported that since 1996, the rate of FDA drug approval based on SEs alone has increased dramatically, with <30% ultimately reporting requisite postmarket OS or quality of life data [21]. This trend is a response to FDA policy shifts implemented in the 1990s in the form of an accelerated approval tract intended for therapies to urgently life-

PFS	Ν	R ² HR ^{PFS}	STE HR ^{PFS}	Ν	$R^2 \Delta PFS$	STE \triangle PFS (mo)	
All trials	31	0.60	0.41	53	0.12	14.10	
No crossover	27	0.65	0.44	45	0.13	15.42	
ICI	6	<0.01	NR	11	0.07	NR	
Non-ICI	24	0.63	0.33	41	0.15	16.10	
Longer follow-up	9	0.76	0.59	14	0.21	9.94	
First line	16	0.48	0.24	28	0.02	NR	
Non-first line	15	0.74	0.34	22	0.41	4.67	
ORR with OS	Ν	R ² ORR ^{ratio}	STE ORR ^{ratio}	Ν	R ² ∆ORR	STE \triangle ORR (% difference)	
ORR with OS All trials	N 30	R ² ORR ^{ratio} 0.08	STE ORR^{ratio} NR	N 30	R²∆ORR 0.03	STE AORR (% difference)	
ORR with OS All trials No crossover	N 30 25	R²ORR^{ratio} 0.08 0.05	STE ORR ^{ratio} NR NR	N 30 25	R²ΔORR 0.03 0.02	STE AORR (% difference) NR NR	
ORR with OS All trials No crossover ICI	N 30 25 10	R²ORR ^{ratio} 0.08 0.05 0.17	STE ORR ^{ratio} NR NR NR	N 30 25 10	R²AORR 0.03 0.02 0.07	STE AORR (% difference) NR NR NR	
ORR with OS All trials No crossover ICI Non-ICI	N 30 25 10 19	R²ORR ^{ratio} 0.08 0.05 0.17 0.16	STE ORR ^{ratio} NR NR NR NR	N 30 25 10 19	R²AORR 0.03 0.02 0.07 0.09	STE ΔORR (% difference) NR NR NR NR	
ORR with OS All trials No crossover ICI Non–ICI Longer follow-up ³	N 30 25 10 19 11	R ² ORR ^{ratio} 0.08 0.05 0.17 0.16 0.17	STE ORR ^{ratio} NR NR NR NR NR	N 30 25 10 19 11	R²AORR 0.03 0.02 0.07 0.09 0.30	STE ΔORR (% difference) NR NR NR NR NR NR	
ORR with OS All trials No crossover ICI Non–ICI Longer follow-up ^a First line	N 30 25 10 19 11 31	R ² ORR ^{ratio} 0.08 0.05 0.17 0.16 0.17 <0.01	STE ORR ^{ratio} NR NR NR NR NR NR NR	N 30 25 10 19 11 29	R²AORR 0.03 0.02 0.07 0.09 0.30 <0.01	STE ΔORR (% difference) NR NR NR NR NR NR NR	
ORR with OS All trials No crossover ICI Non-ICI Longer follow-up ³ First line Non-first line	N 30 25 10 19 11 31 18	R ² ORR ^{ratio} 0.08 0.05 0.17 0.16 0.17 <0.01	STE ORR ^{ratio} NR NR NR NR NR NR NR NR	N 30 25 10 19 11 29 20	R²AORR 0.03 0.02 0.07 0.09 0.30 <0.01 0.24	STE AORR (% difference) NR NR NR NR NR NR NR NR NR	

Table 2 – Coefficient of determination, R², and STE for PFS and ORR with OS including all trials, as well as key subgroups

HR = hazard ratio; ICI = immune checkpoint inhibitor; NR = not reached; ORR = objective response rate; OS = overall survival; PFS = progression-free survival; STE = surrogate threshold effect.

^a Longer follow-up indicates trials with follow-up of ≥24 mo.

threatening conditions, such as acquired immunodeficiency syndrome, and later expanded to include cancers. Among several changes, the FDA accepted the use of SEs as the basis for approval of new drugs rather than OS [13]. The validity of this increasing reliance on SEs hinges on a strong correlation between SEs and OS since cancer therapies that improve only PFS or ORR, but do not extend patients' lives, are of questionable clinical benefit [1,2].

Validation attempts of SEs in other malignancies have yielded mixed results, and meta-analyses find that most tumors are characterized by a poor correlation between SEs and OS [3,14]. Nevertheless, of medicines approved on the bases of SEs alone, 61% had insufficient or no prior SE validation, and 16% occur in a setting where validations have found a poor correlation with OS [4]. mUC is an example of the former.

Given this gap in knowledge, our finding of a moderate correlation between HRPFS and HROS in MUC is a key to reliance on this endpoint in clinical trials. With an R² value of 0.60 among all trials, one can be confident that a significant proportion of the variance in OS can be explained by PFS in MUC. Importantly, an STE of 0.41 suggests that the observed HRPFS below this value provides 95% confidence of an expected HR^{OS} of <1.0. Put another way, a study reporting PFS must achieve an HR of <0.41 to provide 95% confidence of OS benefit. These findings measure favorably with validated surrogates in other malignancies. For colorectal cancer, Buyse et al. [22] found an R² of 0.55 with an STE of 0.77 for HR^{PFS}, which was sufficient to validate PFS in that context. Belin et al [18] reported a methodological systematic review of strategies for PFS surrogacy assessment and argued for an \mathbb{R}^2 of ≥ 0.6 as a threshold for validation. Earlier work specific to bladder cancer has not addressed the STE directly, but instead has evaluated PFS time points as predictors of OS. Using patient-level data from seven chemotherapy trials, Galsky et al [23] reported improved OS for those with PFS >6 and >9 mo (HR 2.49 [95% CI 1.55-3.89] and HR 2.84 [95% CI 1.81, 4.24], respectively). This corroborates our finding of a moderate correlation between PFS with OS. Our results may support the use of PFS as a surrogate for OS in MUC, although a strong PFS benefit (HR \leq 0.41) is necessary to provide 95% confidence of the predicted OS benefit.

Examining the difference in median PFS (Δ PFS) compared with ΔOS yielded weaker support for surrogacy compared with HRs. We find an R² of 0.12 and an STE of 14.1 mo, a threshold that none of the examined trials achieved. The discrepancy between surrogacy validation for HRPFS and ΔPFS highlights an important methodological issue in surrogacy validation of this type. Many SE validations in the literature performed analyses using ΔPFS and did not analyze HR^{PFS} in the analysis [3,18,24]. Indeed, guidance on SE validation from regulatory agencies is scant and quite vague regarding statistical details. The Institute for Quality and Efficiency in Health Care, for example, highlights the importance of strong correlations and STE, but does not comment on the specific parameter to consider in the regressions, that is, HR or difference of medians [25]. Additionally, HRPFS is not universally reported in trials, even when PFS is the primary endpoint. In this study, of the 53 comparisons reporting PFS, 22 (42%) did not report HR and instead presented only median PFS of each arm. The staggering difference in results between these two methods of analyzing similar data highlights the need for standardization of surrogacy validation prior to their use in drug approval. In mUC, proportional hazard regression should be performed and HR^{PFS} should be reported for trials using PFS as an SE.

The ORR performed poorly as a surrogate for OS in mUC. Regardless of the method of analysis, R^2 values were low and the STE at 95% confidence was not reached. This was reproduced within subsets of trials including trials without crossover, immunotherapy (IO) and non-IO trials, or trials with follow-up of >24 mo. Our findings suggest that ORR alone should not be used as a surrogate for OS, especially when justifying the approval of new therapies.

Several trial design tools influence the relationship between SEs and OS, and thus warranted a separate analysis. Trials with follow-up of longer than 24 mo demonstrated an improved R² of 0.76 and a more favorable STE of 0.59 for HR^{PFS}. This finding is intuitive as longer trials allow for accrual of additional mortality events and likely more completely capture differential OS, and thus may better reflect the PFS/OS relationship. Importantly, Δ PFS and ORR improved as well among trials with longer follow-up, but did not reach a threshold to make this SE a strong predictor of OS, and the STE was still not reached at 95% confidence for ORR.

Similarly, trials evaluating therapeutics in the first-line setting may have different performance of SEs from those in the non–first-line setting. Since patients evaluated for non–first-line therapeutics have failed prior therapy and are further along in the natural history of their metastatic disease, they will have shorter median survival and thus a smaller interval between capture of SEs and OS. We find that SEs tend to perform modestly better in the second-line setting. Most notably, Δ PFS demonstrated a reasonable STE of 4.67 mo in non–first-line trials, significantly better than that in the first-line space (Table 2). ORR continued to perform poorly regardless of the line of therapeutic being evaluated.

Crossover between the control and treatment arms is another factor that influences the SE/OS correlation. In lung cancer, Hashim et al [24] reported very poor correlation coefficients for ORR and PFS among 146 clinical trials examined (R = 0.18 and R = 0.25, respectively), but significantly improved correlation coefficients among trials where crossover was not allowed (R = 0.53 for ORR and R = 0.78 for PFS). This is also intuitive as control arms that cross over to receive an experimental treatment after the primary SE is captured may receive the benefits of the therapy reflected in their OS measurement, thus biasing any OS difference toward zero, while preserving a strong PFS difference. However, when trials with crossover were excluded from our data, our findings did not change significantly. Still, this highlights two important points. First, SE validation should consider a subanalysis in crossover-restricted trials to avoid underestimating SE/OS correlations. Second, the use of crossover should be avoided in trials investigating the first instance of the use of therapy in a particular disease, as this not only contaminates a subsequent OS analysis, but also potentially delays the access to more established secondline therapies to expose control-arm patients to a still unproven intervention. Conversely, trials investigating therapy advancement in a particular disease (ie, second- to firstline therapy) should ideally provide crossover to the control arm upon progression in order to reflect standard-of-care treatment [26].

SEs suffer from important limitations that might explain their poor correlation with survival. Examples include important statistical considerations such as the disproportionate impact of missing data on PFS compared with OS [27,28]. Additionally, as PFS/ORR is determined with the use of cross-sectional imaging, while OS is more obvious to capture, the inherent limitations of imaging confer added challenges on these endpoints. Target lesion identification, measurement, and classification within the Response Evaluation Criteria in Solid Tumors (RECIST) system, for example, are frequent sources of error and can thus contribute to the observed poor reproducibility and high rates of inconsistency in assessments among various trial practitioners and central reviewers [29–31]. Further, the intensity of surveillance imaging and duration of follow-up time can influence PFS/ORR. Despite continued efforts to address many of these challenges [32,33], technical and conceptual problems continue to plague SE reliance and highlight the urgent need to ideally validate SEs prior to their isolated use in clinical decision-making.

This study is limited by the number of trials that have been performed in mUC, and that present both an SE and OS, which is a relatively small sample size. Additionally, our analysis correlates SEs with OS only, and does not consider important potential relationships with health-related or overall quality of life endpoints and patient-reported outcomes. The criteria for PFS/ORR definitions, almost universally the RECIST system, have undergone several versions of modifications and represent an additional source of heterogeneity when comparing trials [32–34]. Finally, some validation strategies utilize patient-level data to estimate the relationships between surrogates and clinical endpoints [35]. Although trial-level analyses are significantly more frequent in the surrogacy literature [3,18], both strategies have a role in answering these important questions [25].

5. Conclusions

mUC trials demonstrating a significant improvement in HR^{PFS} can be expected to represent in improvement in HR^{OS} . However, there is a poor correlation of ΔPFS with ΔOS , and ΔORR or ORR^{ratio} with HR^{OS} ; thus, improvements in these surrogates alone should be interpreted with caution and should be de-emphasized in mUC trials. The large variability in the results when comparing $\Delta PFS/\Delta OS$ and HR^{PFS} and HR^{OR} highlights the need to standardize the validation of surrogacy biomarkers in MUC.

Author contributions: Fady Ghali had full access to all the data in the study and takes responsibility for the integrity of the data and the accuracy of the data analysis.

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Acquisition of data: Ghali, Jewel.
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Statistical analysis: Ghali, Etzioni, Zhao.
Obtaining funding: Montgomery, Wright.
Administrative, technical, or material support: Montgomery, Wright.
Supervision: Wright.
Other: None.

Financial disclosures: Fady Ghali certifies that all conflicts of interest, including specific financial interests and relationships and affiliations relevant to the subject matter or materials discussed in the manuscript (eg, employment/affiliation, grants or funding, consultancies, honoraria, stock ownership or options, expert testimony, royalties, or patents filed, received, or pending), are the following: Petros Grivas has done paid consulting with Aadi Bioscience, AstraZeneca, Astellas Pharma, Boston Gene, Bristol Myers Squibb, Dyania Health, EMD Serono, Exelixis, Fresenius Kabi, Foundation Medicine, Genentech/Roche, Genzyme, GlaxoSmithK-

line, Guardant Health, Gilead Sciences, Infinity Pharmaceuticals, Janssen, Lucence, Merck & Co., Mirati Therapeutics, Pfizer, PureTech, QED Therapeutics, Regeneron Pharmaceuticals, Seattle Genetics, Silverback Therapeutics, UroGen, and 4D Pharma PLC; his institution has received grants from Bavarian Nordic, Bristol Myers Squibb, Clovis Oncology, Debiopharm, EMD Serono, G1 Therapeutics, Gilead Sciences, GlaxoSmithKline, Merck & Co., Mirati Therapeutics, Pfizer, and QED Therapeutics. Evan Yu has received research funding to institution from Daiichi-Sankyo, Taiho, Dendreon, Merck, Seattle Genetics, Blue Earth, Bayer - DAROL and citDNA, and Lantheus; and consulting with honorarium (in the past 3 yr) from Jansen, Merck, Advanced Accelerator Applications, Bayer, Exelixis, Clovis, Abbvie, and Sanofi-Genzyme. Bruce Montgomery has received institutional grants from AstraZeneca, Janssen Oncology, Clovis Oncology, Astellas Pharma, and BeiGene. Jonathan Wright has received institutional grants from Merck & Co., Jannsen, BMS, Altor Biosciences, Nucleix, Pacific Edge, Veracyte, and royalties from UpToDate.

Funding/Support and role of the sponsor: This work was supported by Seattle Translational Tumor Research and MXD Championships via institutional funds.

Appendix A. Supplementary data

Supplementary data to this article can be found online at https://doi.org/10.1016/j.euros.2022.11.003.

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