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Chronological Trends in Progression-free, Overall and Post-progression Survival in First-line Therapy for Advanced Non-small-cell Lung Cancer

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1	Chronological Trends in Progression-free, Overall and Post-progression
2	Survival in First-line Therapy for Advanced Non-small-cell Lung Cancer
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ABSTRACT

27	BACKGROUND: There is a debate about the merits of progression-free survival
28	(PFS) versus overall survival (OS) as primary end points in non-small-cell lung
29	cancer (NSCLC). It has been postulated that post-progression therapy may influence
30	OS in both arms. To investigate this issue, we analyzed chronological trends in PFS
31	and OS in advanced NSCLC using restricted mean survival times (RMSTs).
32	METHODS: We digitized survival curves from first-line phase III trials published
33	between 1998 and 2015 in 13 leading journals to compute RMSTs for PFS and OS at
34	three truncation landmarks (5, 12, and 18 months).
35	RESULTS: Among the 161 trials identified, RMSTs could be computed for both
36	endpoints in 102, 97 and 82 trials for the 5, 12 and 18 months truncation landmarks,
37	respectively. Post-progression survival (PPS) in the control arm, quantified as mean
38	OS minus mean PFS truncated at 18 months, was on average 3.3 months between
39	1998 and 2003, 4.4 months between 2004 and 2009, and 5.4 months between 2010
40	and 2015. This increase was due to increasing RMST for OS over time, with no
41	increase in RMST for PFS. The average within-trial difference in RMSTs between
42	experimental and control arm was close to 0 for OS and less than 1 month for PFS.
43	CONCLUSIONS: There is a progressive increase in PPS in NSCLC trials, likely from
44	salvage therapy. These results question both PFS and OS as sensitive end points in
45	first-line trials, but suggest that the outlook for patients is improving regardless of
46	within-trial gains.

47

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INTRODUCTION

49 There has been significant progress in the treatment of non-small cell lung cancer (NSCLC) from the identification and targeting of key molecular alterations-such as 50 epidermal growth factor receptor (EGFR) activating mutations, and ALK-EML4 and 51 ROS1 alterations ¹⁻⁵—as well as from the use of immunotherapy.⁶⁻⁹ In parallel to 52 these advances, there has been a debate about the adequacy of overall survival 53 (OS) versus tumor-based end points --such as progression-free survival (PFS)--as 54 the most suitable and reliable primary end points for phase III trials in various tumor 55 types, including NSCLC.¹⁰ One of the issues raised in this debate is the possibility 56 57 that OS may be considerably influenced by treatments administered after disease progression, and cross-over treatments in particular, which may dilute the treatment 58 effect.^{10, 11} Corroborating this concern, Hotta et al¹² and Hayashi et al¹³ have shown 59 60 that both median OS and post-progression survival (PPS) have increased along the years, with absent or less pronounced simultaneous increases in median PFS in first-61 62 line trials in advanced NSCLC. However, assessment of the relationship between trends in PFS and OS over time are best made using mean survival times rather than 63 the medians, which do not have additive properties.¹⁴ In order to assess that 64 relationship, and in the attempt to quantify the magnitude of increase in PPS over the 65 years, we investigated trends in OS and PFS results during 18 years of clinical 66 research in NSCLC by using restricted mean survival times (RMSTs). 67

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MATERIAL AND METHODS

- 70 Search strategy
- 71 We used PubMed, the medical subject headings 'lung neoplasms' and 'drug therapy',
- and the filter option 'randomized controlled trials' to search for clinical trials on

73 systemic anticancer therapies published between January 1, 1998, and December 74 31, 2015 in 13 leading journals in the field of clinical oncology or lung cancer specifically (Annals of Oncology, British Journal of Cancer, Cancer, Chest, Clinical 75 76 Cancer Research, European Journal of Cancer, Journal of Clinical Oncology, Journal 77 of the National Cancer Institute, Journal of Thoracic Oncology, Lancet Oncology, Lung Cancer, The Lancet and The New England Journal of Medicine). We only 78 79 included phase III trials whose main results had been published in the study period. 80 We only included first-line treatment trials or those testing a maintenance strategy 81 after the first line. We excluded trials on supportive therapy alone, papers reporting combined analyses of two or more separate trials already included in the study. 82 randomized phase II trials, and companion studies on correlative biology or 83 prognostic factors. Finally, we excluded randomized trials for which no phase was 84 explicitly stated if they had fewer than 100 evaluable patients per arm. With a cut-off 85 date of June 2016, we tried to obtain published OS results in later publications for the 86 87 trials that fell within the study period and for which OS results were immature when 88 the main paper was published.

89

90 Data collection and definitions

For each selected trial, we retrieved the main paper reporting the efficacy results and abstracted the general characteristics of the trial and relevant data on OS and PFS, time to tumor progression (TTP) or time to treatment failure (TTF). Despite their slightly different meanings, we treated PFS, TTP and TTF together due to their frequently overlapping definitions by investigators.¹⁵ When not explicitly stated, we considered the primary end point as the metric used for sample-size calculation or the end point first cited in the 'Methods' or 'Results' section of papers. We defined

98 trials with molecular selection of patients as those for which such selection was an99 inclusion criterion.

100

101 Statistical analysis

102 The (unrestricted) mean survival (PFS or OS) of patients under a certain treatment 103 can be computed as the area under the Kaplan-Meier survival curve corresponding to that treatment when the last patient under observation suffers the event of interest. 104 105 When the last patient is censored, the (unrestricted) mean survival cannot be 106 computed. In that case, the most frequently employed alternative is to compute the RMST, which is the mean survival in the time interval between time 0 to a truncation 107 108 landmark, t. For the comparison of the RMST in two arms of a given trial, t is usually 109 chosen as the shortest time for which survival data are available for both arms. Since 110 our goal was to estimate PPS on the basis of (restricted) mean PFS and OS for a large number of trials, we defined various arbitrary truncation landmarks to be used 111 112 across trials. For each trial, we identified the published Kaplan-Meier curves for PFS 113 (or TTP/TTF when this was the case) and OS, and digitized such curves using CurveSnap.¹⁶ We used the same density of points (10/month) for all curves, thus 114 ensuring the same precision. Each curve was digitized in triplicate, once by each 115 116 different individual, and one of the authors (JR) selected manually the digitization that 117 appeared to better represent the curve shape. Using the digitized curves, we 118 computed RMSTs automatically, using software code created for the study purpose. 119 We chose three truncation landmarks (5, 12 and 18 months) based on the number of 120 curves that would provide sufficient information until such landmarks. We computed 121 RMST from the available PFS and OS curves from each trial and the average of 122 these RMSTs for each year of publication. The RMSTs thus computed indicate the

123 average (progression-free or overall) survival of patients in the control arm over the 124 period comprised by t. For the description of chronological trends, we used the control arm in each trial for simplicity, under the assumption that improvements 125 126 obtained from clinical trials are reflected in the evolution of the control arms of future trials. However, to provide a more complete view of chronological trends, we also 127 performed some analyses using the experimental arms of each trial. This was 128 straightforward in two-arm trials; for trials with more than two arms, we took the 129 130 average RMST (for PFS and OS) of the experimental arms. We quantified the 131 magnitude of mean PFS and OS gain as the difference in RMSTs between the 132 control and experimental arms. For the illustrative analysis involving median PFS and OS times, we used the same set of trials for which RMSTs could be computed for 133 t=12 months, the landmark closer to the expected median OS in contemporary first-134 line trials. In order to account for the potential influence of cross-over on OS, we 135 136 abstracted data from each trial about the presence of such cross-over in the control 137 and one experimental arm. We then conducted sensitivity analyses of trends in PFS 138 and OS over time according to the use of cross-over.

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RESULTS

141 General characteristics of the phase III trials

The search yielded 161 phase III trials that were eligible for analysis. There were 144 trials testing a first-line therapy, and 17 in which the randomized intervention was maintenance or treatment extension after first line. A total of 73,850 patients were randomized to 353 treatment arms, with a median of 173 patients per arm. The yearly mean number of patients per trial increased until 2009, when it started to plateau or even decrease (Figure 1). This decrease was in part due to 11 trials with molecularly-

selected patients, all of which published after 2006: the median number of patients
per arm in these trials was 115, compared with 181 in trials with no molecular
selection. However, the decrease after 2009 may also have been due to increasing
use of PFS as primary end point, as this usually requires fewer patients (Figure 2).

153 The number of arms per trial was two in 137 cases, three in 17, and four in seven trials (three of which with a factorial 2 x 2 design). Nineteen trials had a placebo-, 154 155 observation- or best supportive care-alone arm. Three trials had two co-primary end points. In trials with a single primary end point, this was OS in 103 (64% of the total) 156 157 trials; PFS (N=26), TTP (N=1) or TTF (N=1) in 28 (17.4%) cases (henceforward called PFS); response rate or clinical benefit rate in 16 (10.0%); quality of life or 158 159 toxicity in 10 trials (6.2%); and PFS without grade 4 toxicity in one (0.6%). Over the 160 18 years spanned by the study, the use of PFS as primary end point progressively increased, with an accompanying decrease in the use of response or clinical benefit 161 162 rates (Figure 2).

163

164 Time trends in mean and median OS and PFS times

For t=5 months, computation of RMSTs was possible for 145 trials in the case of OS, 165 166 113 trials in the case of PFS, and 102 trials for both of these end points. For t=12 months, the RMST could be computed in 140 trials for OS and 107 trials for PFS; 167 computation of both RMSTs for the same trial was possible in 97 trials. Finally, for 168 169 *t*=18 months, the corresponding numbers of trials for which the RMSTs could be 170 computed were 122 for OS, 89 for PFS, and 82 for both end points. Table 1 shows a 171 descriptive comparison between trials for which RMSTs could or could not be computed for PFS and OS truncated at 18 months. Trials for which RMSTs could be 172

173 computed were larger and published more recently, whereas the distribution of 174 primary end points was similar. The trials for which RMSTs could be computed were also less likely to report gain in OS and more likely to report gain in PFS, but this may 175 176 be related to the fact that these trials were published more recently (and hence used PFS as primary end point more frequently). Table 2 shows the number of trials for 177 178 each 2-year period of interest for which both of these means could be computed. 179 180 Figure 3 displays the evolution over time of PFS and OS in control arms, considering 181 the yearly average RMSTs with the 5, 12 and 18 months truncation landmarks; for 182 illustration, the average median times for PFS and OS are also shown. Not surprisingly because of the short truncation landmark, there is little separation in the 183 184 curves that depict the yearly average mean PFS and OS for *t*=5 months (Panel A). Such separation only becomes evident with the truncation landmarks of 12 (Panel B) 185 186 and 18 (Panel C) months. Moreover, a chronological trend for an increase in mean 187 OS with no accompanying increase in mean PFS becomes apparent with t=12

188 months, and more pronounced with *t*=18 months. When median times are

considered, a trend for increasing yearly average median OS with no accompanying

190 increase in PFS is also evident (Panel D). In this case, however, the degree of

191 separation may be misleading, because it does not directly indicate PPS.

192

Table 3 shows average RMSTs for PFS and OS in control arms for each 6-year period spanned by the study, and according to the truncation landmarks of 5, 12 and 18 months. If the difference between RMSTs for OS and PFS over 18 months is used to quantify PPS, the average duration of PPS was 8.9-5.6=3.3 months in trials published between 1998 and 2003, 10.0-5.6=4.4 months in those published between

2004 and 2009, and 11.4-6.0=5.4 months in those published between 2010 and 2015(see also Figure 3, Panel C).

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201 Magnitude of mean PFS and OS gains over time

202 Considering the trials for which RMSTs for both PFS and OS could be computed, the average difference in RMSTs between experimental and control arms per 6-year 203 204 period and overall can be seen in Table 4. On average across trials, and regardless 205 of period or truncation landmark, there was essentially no gain in mean OS, whereas the average gain in mean PFS was always less than 1 month. For t=5 months, the 206 207 differences in RMSTs between experimental and control arms within trials ranged 208 from a loss of 1 month to a gain of 2 months for PFS, and from a loss of 0.4 month to 209 a gain of 1.2 months for OS. For *t*=12 months, these differences ranged from a loss of 1.8 months to a gain of 3.3 months for PFS, and from a loss of 1.2 months to a 210 211 gain of 1.9 months for OS. For t=18 months, these differences ranged from a loss of 1.9 months to a gain of 5.1 months for PFS, and from a loss of 1.6 months to a 212 213 maximum gain of 2.7 months for OS. When only trials with a significant gain in OS 214 are considered among those with sufficient data for analysis with *t*=18 months, the 215 average gain in OS was 1.2 month; in contrast, this average was 0 among trials with no significant gain in OS. 216

217

218 The potential influence of cross-over

Cross-over was a feature of trial design or recommended by protocol in only six of the 161 trials overall. All these trials had two arms and had the first-line therapy as their main focus; in three of six cases, cross-over was recommended for both trial arms, whereas in the other three cross-over was from the control to the experimental

223 arm (N=2) or vice-versa. When reported (N=4), the percentage of patients from the 224 control arm crossing-over to the same or similar agent as the experimental arm ranged from 70.0% to 94.6%. For the remaining 155 trials, any post-progression 225 226 therapy was mentioned in 94 trials, 81 of which providing the percentages of patients receiving such therapy. The median percentage of post-progression therapy was 227 228 42% in both control and experimental arms, with a clear increase in this percentage over time (data not shown). Of the 94 trials in which post-progression therapy was 229 230 mentioned, cross-over could be characterized in 36 cases by looking at the 231 percentages of patients receiving the same or a similar agent as first-line therapy in 232 the post-progression setting. The median percentage of patients crossing-over was 18.5% in the control arms and 19.1% in the experimental arms. Of the total of 42 233 trials with cross-over (whether or not by design), 10 reported a significant gain in OS 234 235 (23.8%); among 119 trials without cross-over (or no mention thereof), a significant 236 gain in OS was reported in 27 (22.7%).

237

238 We assessed the evolution over time of yearly average RMST for PFS and OS in 239 control arms, considering the same 82 trials with sufficient data for the 18-month truncation landmark, according to the presence of cross-over. We observed similar 240 241 trends for an increasing average OS and stable average PFS both in trials with no 242 reported cross-over (N=55) and in those with cross-over (whether or not by design; N=27; data not shown). Among trials with cross-over, average PFS and OS according 243 244 to period were 5.7 months and 9.4 months for 1998 to 2003 (PPS=3.7 months); 5.3 months and 10.9 months for 2004 to 2009 (PPS=5.6 months); and 5.9 months and 245 246 12.6 months for 2010 to 2015 (PPS=6.7 months). Corresponding averages for trials 247 with no cross-over were 5.8 months and 9.0 months for 1998 to 2003 (PPS=3,2

months); 5.6 months and for 9.8 months 2004 to 2009 (PPS=4.2 months); and 6.1
months and 10.6 months for 2010 to 2015 (PPS=4.5 months).

250

251 Finally, we investigated trends in the average difference in RMSTs (with the 18-month truncation landmark) between experimental and control arms within trials according 252 to the presence of cross-over. For trials with cross-over (N=27), the average 253 difference in RMSTs for PFS and OS were 0.3 month and 0.3 month for 1998 to 254 255 2003; 1.0 month and 0.4 month for 2004 to 2009; and 1.5 month and 0 month for 2010 to 2015. Corresponding differences for trials with no cross-over were 0.5 month 256 257 and 0 month for 1998 to 2003; 0.5 month and 0.2 month for 2004 to 2009; and 0.5 month and 0.2 month for 2010 to 2015. When the overall 18-year period is 258 considered, the average difference in RMSTs for PFS and OS were 1.1 month and 259 260 0.2 month, respectively, for trials with cross-over, and 0.5 month and 0.2 month, respectively, for those without cross-over. 261 262

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DISCUSSION

Our results disclose a progressive increase in mean OS with no obvious increase in 264 mean PFS following first-line therapy for advanced NSCLC over the years. Although 265 less appropriate from a methodological point of view, the same findings hold true 266 when these chronological trends are assessed using medians. Moreover, the 267 comparison of gains in mean PFS and OS times within trials show no substantial gain 268 269 on average. Therefore, our results collectively suggest that the outlook for patients 270 has clearly improved over the 18-year period of analysis, but not necessarily due to 271 improvements within trials. Rather, our data suggest that the increase in OS over

time is more likely due to post-progression therapy than to the treatments testedwithin the trials.

274

In contrast with two previous smaller reviews that analyzed PFS and OS using 275 medians,^{12, 13} we ascertained trends in both end points using the RMST, a more 276 277 appropriate measure in the attempt to investigate differences in duration of OS and PFS (*i.e.*, the duration of PPS), ¹⁴ In a previous study, Tringuart *et al*,¹⁷ computed 278 279 RMSTs for the primary end point in 54 trials in several cancer types and therapeutic 280 settings, in an attempt to compare treatment effects estimated by the hazard ratio (HR) and by differences and ratios of RMSTs. These authors pointed out that the HR 281 may overestimate the treatment effect as measured by the ratio of RMST. Several 282 other authors pointed to advantages of using RMSTs, including in settings where 283 hazards are non-proportional.^{14, 18, 19} 284

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286 The extent to which our findings and conclusions are misleading due to the use of 287 RMSTs is unknown. One of the alternatives—the use of medians—is seen by many as inadequate towards to goal of investigating PPS.¹⁴ Another alternative—the 288 computation of unrestricted means using observed data or parametric assumptions is 289 290 either not feasible or subject to the choice of models. These considerations notwithstanding, confirmation of our findings would have important implications for 291 trial design in NSCLC, especially with regard to the choice of the primary end point. 292 There is an ongoing debate about which is the most adequate primary end point in 293 294 several tumor types, including NSCLC. We have argued that OS is generally inadequate in settings for which there is salvage therapy,²⁰ which is increasingly the 295 case in NSCLC. The current results seem to confirm this contention, because there 296

297 has been essentially no gain in mean OS within trials, with a maximum gain of 2.7 298 months. On the other hand, we and others have argued in favor of PFS as primary end point,^{10, 11} but the current results also question whether PFS is a sensitive end 299 point in this setting, because no substantial gain in mean PFS within trials could be 300 301 noted on average; in this case, however, the maximum mean gain in PFS was 5.1 302 months (for *t*=18 months). Once again, the extent to which the doubts about the 303 sensitivity of PFS and OS in our analysis are due to the use of RMSTs—as opposed to conventional metrics—remains unknown. As shown in Table 1, significant gains in 304 PFS (as ascertained by conventional methods) were reported in 37% of trials, 305 306 whereas only 23% reported a significant gain in OS. 307 Interestingly, the current results show a progressive increase in OS despite 308 309 increasing use of PFS as primary end point (Figure 2) and no increased frequency of OS gain usually ascertained by the logrank test (data not shown). Moreover, the 310 progressive increase in OS reported herein confirms previous analyses based on a 311 smaller number of trials and on real-life data.^{13, 21, 22} Finally, these results are in line 312 313 with the various recent instances in which a very active agent (as judged by 314 improvements in response rate or PFS) did not lead to improved OS, most likely because of cross-over after disease progression.^{3, 4, 23} 315 316 Our study is subject to several limitations, the chief of which is the inability to 317

compute RMSTs for all eligible trials. Several authors have called for more extended
publication of results from phase III trials using RMSTs and other measures of
treatment effect that may complement the HR.^{14, 17, 18} It is hoped that increased
publication of such results will allow for more complete analyses in the future. A

322 second limitation is the potential for publication bias. Our analysis was restricted to 323 articles published in selected medical journals indexed in PubMed and within a 324 limited time period. This might have led to identification of phase III trials that are 325 systematically different from trials that have not been retrieved in our search. However, we have consciously made this restriction, as the journals included in the 326 327 analysis report the vast majority of practice-influencing phase III trials. It is possible, therefore, that we have analyzed studies with gains in OS preferentially. Another 328 329 limitation of our study relates to the inability to control for several variables that may 330 confound the associations and trends observed. For example, many recent trials have included molecularly-selected patient populations with an improved prognosis; 331 the influence of these or even more subtle differences in patient profile on the current 332 results is uncertain. Such differences could possibly relate to tumor histology, 333 334 performance status, and other prognostic or predictive factors. Likewise, improved 335 trial methodology over the years may have influenced our results. Similarly, we 336 cannot ascertain the extent to which stage migration, other differences in patient 337 selection, or improvements in supportive care have influenced the apparent increase 338 in OS over time. Finally, incomplete reporting of information on cross-over and our use of aggregated data—which precludes separate analyses of results among 339 patients with and without cross-over-prevent us from reliably ascertaining the 340 341 influence of cross-over on the trends for increasing OS without an accompanying trend for increasing PFS. Nevertheless, our sensitivity analyses suggest that the 342 343 influence of cross-over is either not apparent or cannot be properly quantified, given 344 the similarity of results for (1) evolution over time of PFS and OS in control arms and 345 for (2) trends in average difference in RMSTs between experimental and control arms 346 within trials, when trials with and without cross-over are compared.

347

348 Our results may not be relevant for immunotherapy trials, only two of which were represented in our sample.^{24, 25} In some of the randomized trials of antibodies against 349 the programmed death (ligand) 1 pathway, a significantly increased OS was not 350 always accompanied by an increased PFS.^{6, 9, 26} Since most immunotherapy trials 351 were published after our analysis period, our results apply essentially to 352 chemotherapy and targeted therapy. Despite these limitations, the current study is 353 354 the first to assess RMSTs in a large number of trials within one specific setting. 355 Conclusions 356 357 There is a progressive increase in PPS in NSCLC trials, but this appears to be more 358 likely a result of post-trial use of salvage therapy. These results question both PFS 359 and OS as sensitive end points in first-line trials, but suggest that the outlook for 360 361 patients is improving regardless of within-trial gains. It is hoped that population 362 enrichment and the use of targeted agents and immunotherapy with markedly 363 improved efficacy will allow for treatment effects that are larger than the ones currently observed. If so, OS will continuously improve for patients inside and outside 364 of clinical trials. 365 366 ACKNOWLEDGEMENTS 367 The authors are grateful to Cezary Komarzeniec for his help in the preparation of the 368 369 script for automated computation of restricted mean survival times, and to Kamila 370 Bemben, Kamil Buczkowski and Zofia Alchimowicz for their help in digitizing the 371 curves.

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	ACCEPTED MANUSCRIPT							
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374	REFERENCES							
375	1. Mok TS, Wu YL, Thongprasert S, et al. Gefitinib or carboplatin-paclitaxel in							
376	pulmonary adenocarcinoma. N Engl J Med 2009;361:947-957.							
377	2. Kwak EL, Bang YJ, Camidge DR, et al. Anaplastic lymphoma kinase inhibition in							
378	non-small-cell lung cancer. N Engl J Med 2010;363:1693-1703.							
379	3. Rosell R, Carcereny E, Gervais R, et al. Erlotinib versus standard chemotherapy as							
380) first-line treatment for European patients with advanced EGFR mutation-positive non-small-							
381	cell lung cancer (EURTAC): a multicentre, open-label, randomised phase 3 trial. Lancet							
382	Oncol 2012;13:239-246.							
383	4. Shaw AT, Kim DW, Nakagawa K, et al. Crizotinib versus chemotherapy in advanced							
384	ALK-positive lung cancer. N Engl J Med 2013;368:2385-2394.							
385	5. Sequist LV, Yang JC, Yamamoto N, et al. Phase III study of afatinib or cisplatin plus							
386	pemetrexed in patients with metastatic lung adenocarcinoma with EGFR mutations. J Clin							
387	Oncol 2013;31:3327-3334.							
388	6. Borghaei H, Paz-Ares L, Horn L, et al. Nivolumab versus Docetaxel in Advanced							
389	Nonsquamous Non-Small-Cell Lung Cancer. N Engl J Med 2015;373:1627-1639.							
390	7. Brahmer J, Reckamp KL, Baas P, et al. Nivolumab versus Docetaxel in Advanced							
391	Squamous-Cell Non-Small-Cell Lung Cancer. N Engl J Med 2015;373:123-135.							
392	8. Reck M, Rodriguez-Abreu D, Robinson AG, et al. Pembrolizumab versus							
393	Chemotherapy for PD-L1-Positive Non-Small-Cell Lung Cancer. N Engl J Med 2016.							
394	9. Rittmeyer A, Barlesi F, Waterkamp D, et al. Atezolizumab versus docetaxel in patients							
395	with previously treated non-small-cell lung cancer (OAK): a phase 3, open-label, multicentre							
396	randomised controlled trial. Lancet 2017;389:255-265.							

- 397 10. Soria JC, Massard C, Le Chevalier T. Should progression-free survival be the primary
 398 measure of efficacy for advanced NSCLC therapy? *Ann Oncol* 2010;21:2324-2332.
- 399 11. Saad ED, Katz A, Hoff PM, et al. Progression-free survival as surrogate and as true
- 400 end point: insights from the breast and colorectal cancer literature. Ann Oncol 2010;21:7-12.
- 401 12. Hotta K, Kiura K, Fujiwara Y, et al. Role of survival post-progression in phase III
- 402 trials of systemic chemotherapy in advanced non-small-cell lung cancer: a systematic review.
- 403 *PLoS One* 2011;6:e26646.
- 404 13. Hayashi H, Okamoto I, Morita S, et al. Postprogression survival for first-line
- 405 chemotherapy of patients with advanced non-small-cell lung cancer. Ann Oncol
- 406 2012;23:1537-1541.
- 407 14. A'Hern RP. Restricted Mean Survival Time: An Obligatory End Point for Time-to-
- 408 Event Analysis in Cancer Trials? *J Clin Oncol* 2016;34:3474-3476.
- 409 15. Saad ED, Katz A. Progression-free survival and time to progression as primary end
- 410 points in advanced breast cancer: often used, sometimes loosely defined. Ann Oncol

411 2009;20:460-464.

- 412 16. CurveSnap. Available at https://curvesnap.en.softonic.com/.
- 413 17. Trinquart L, Jacot J, Conner SC, et al. Comparison of Treatment Effects Measured by
- 414 the Hazard Ratio and by the Ratio of Restricted Mean Survival Times in Oncology
- 415 Randomized Controlled Trials. *J Clin Oncol* 2016;34:1813-1819.
- 416 18. Royston P, Parmar MK. Restricted mean survival time: an alternative to the hazard
- 417 ratio for the design and analysis of randomized trials with a time-to-event outcome. BMC
- 418 *medical research methodology* 2013;13:152.
- 419 19. Uno H, Claggett B, Tian L, et al. Moving beyond the hazard ratio in quantifying the
- 420 between-group difference in survival analysis. *J Clin Oncol* 2014;32:2380-2385.

A COEDTED MANILICODIDT

	ACCEPTED MANUSCRIPT
421	20. Saad ED, Buyse M. Statistical controversies in clinical research: end points other than
422	overall survival are vital for regulatory approval of anticancer agents. Ann Oncol
423	2016;27:373-378.
424	21. Morgensztern D, Waqar S, Subramanian J, et al. Improving survival for stage IV non-
425	small cell lung cancer: a surveillance, epidemiology, and end results survey from 1990 to
426	2005. J Thorac Oncol 2009;4:1524-1529.
427	22. Breathnach OS, Freidlin B, Conley B, et al. Twenty-two years of phase III trials for
428	patients with advanced non-small-cell lung cancer: sobering results. J Clin Oncol
429	2001;19:1734-1742.
430	23. Fukuoka M, Wu YL, Thongprasert S, et al. Biomarker analyses and final overall
431	survival results from a phase III, randomized, open-label, first-line study of gefitinib versus
432	carboplatin/paclitaxel in clinically selected patients with advanced non-small-cell lung cancer
433	in Asia (IPASS). J Clin Oncol 2011;29:2866-2874.
434	24. Alfonso S, Valdes-Zayas A, Santiesteban ER, et al. A randomized, multicenter,
435	placebo-controlled clinical trial of racotumomab-alum vaccine as switch maintenance therapy
436	in advanced non-small cell lung cancer patients. Clin Cancer Res 2014;20:3660-3671.
437	25. Giaccone G, Bazhenova LA, Nemunaitis J, et al. A phase III study of
438	belagenpumatucel-L, an allogeneic tumour cell vaccine, as maintenance therapy for non-small
439	cell lung cancer. Eur J Cancer 2015;51:2321-2329.
440	26. Herbst RS, Baas P, Kim DW, et al. Pembrolizumab versus docetaxel for previously
441	treated, PD-L1-positive, advanced non-small-cell lung cancer (KEYNOTE-010): a
442	randomised controlled trial. Lancet 2016;387:1540-1550.
443	

Characteristic	Trials with available RMSTs (N=82)	Trials without available RMSTs (N=79)		
Year or publication		R		
1998 to 2003	19 (23%)	28 (35%)		
2004 to 2009	27 (33%)	32 (41%)		
2010 to 2015	36 (44%)	19 (24%)		
Patients per arm, median (IQR)	183 (138; 304)	154 (99; 222)		
Primary end point*				
Overall survival	55 (69%)	48 (61%)		
Progression-free survival	14 (18%)	14 (18%)		
Other	11 (14%)	16 (20%)		
Reported gain in overall survival**	16 (20%)	21 (27%)		
Reported gain in progression-free survival**	33 (40%)	20 (32%)		

Table 1. Characteristics of trials with and without available RMSTs truncated at 18 months.

Percentages are rounded to integers. IQR, interquartile range; RMST, restricted mean survival time.

*Trials with co-primary endpoints not shown.**Denominator is the number of trials with information on gains, which we deemed to be present if there was a statistically significant difference in any pairwise comparison (or factor comparison in factorial trials) for PFS or OS following the trialists' definitions, regardless of which of these was the primary end point and of the number of arms in a given trial, and regardless of whether the difference favored the experimental or the control arm.

Year of publication	Number of trials	Number of trials with data for analysis				
		according to truncation time (<i>t</i>)				
		For <i>t</i> =5 months	For <i>t</i> =12 months	For <i>t</i> =18 months		
1998-99	12	6 (50%)	5 (42%)	4 (33%)		
2000-01	15	6 (40%)	4 (27%)	3 (20%)		
2002-03	20	13 (65%)	13 (65%)	12 (60%)		
2004-5	22	16 (73%)	16 (73%)	12 (55%)		
2006-07	17	9 (53%)	8 (47%)	6 (35%)		
2008-09	20	10 (50%)	10 (50%)	9 (45%)		
2010-11	19	14 (74%)	14 (74%)	13 (68%)		
2012-13	21	17 (81%)	16 (76%)	15 (71%)		
2014-15	15	11 (73%)	11 (73%)	8 (53%)		
Total	161	102 (63%)	97 (60%)	82 (51%)		

Table 2. Availability of data on mean PFS and OS for each 2-year period.

Average according to end point and truncation time						n time (<i>t</i>)
	For <i>t</i> =5 months		For <i>t</i> =12 months		For <i>t</i> =18 months	
Years of publication	(N=102)		(N=97)		(N=82)	
	PFS	OS	PFS	os	PFS	OS
1998 to 2003	3.4	4.2	5.1	7.7	5.6	8.9
2004 to 2009	3.6	4.4	5.1	8.3	5.6	10.0
2010 to 2015	3.7	4.5	5.4	9.0	6.0	11.4

 Table 3. Average RMSTs (in months) for each 6-year period of interest, control arms.

N indicates number of trials with available data.

	Average difference according to end point and truncation time (t)					
	For <i>t</i> =5 months		For <i>t</i> =12 months		For <i>t</i> =18 months	
Years of publication	(N=102)		(N=97)		(N=82)	
	PFS	OS	PFS	OS	PFS	OS
1998 to 2003	0.3	0.1	0.3	0	0.3	0.1
2004 to 2009	0.1	0	0.5	0.1	0.7	0.2
2010 to 2015	0.2	0	0.7	0.1	0.9	0.1
Overall in 18 years	0.2	0	0.5	0.1	0.7	0.2

Table 4. Average difference in RMSTs (in months) between experimental and control arms within trials.

N indicates number of trials with available data.

FIGURE LEGENDS

Figure 1. Yearly mean number of patients per arm over time.

Figure 2. Frequency of use of overall survival (dark blue), progression-free survival (light blue), response or clinical benefit rates (dark green), quality of life or toxicity (light green), and other primary end points (red) in the three 6-year periods spanned by the study.

Figure 3. Time trends in restricted mean and in median progression-free and overall survival times. Panel A, yearly average of the restricted mean survival times (RMSTs) for progression-free (PFS) and overall survival (OS) in control arms, truncated at 5 months; Panel B, yearly average of the RMSTs for PFS and OS in control arms, truncated at 12 months; Panel C, yearly average of the RMSTs for PFS and OS in control arms, truncated at 18 months; Panel D, yearly average of the median PFS and OS in control arms.





