

## Optimizing Collection of Adverse Event Data in Cancer Clinical Trials Supporting Supplemental Indications

Lee D. Kaiser, Allen S. Melemed, Alaknanda J. Preston, Hilary A. Chaudri Ross, Donna Niedzwiecki, Gwendolyn A. Fyfe, Jacqueline M. Gough, William D. Bushnell, Cynthia L. Stephens, M. Kelsey Mace, Jeffrey S. Abrams, and Richard L. Schilsky

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### ABSTRACT

#### Purpose

Although much is known about the safety of an anticancer agent at the time of initial marketing approval, sponsors customarily collect comprehensive safety data for studies that support supplemental indications. This adds significant cost and complexity to the study but may not provide useful new information. The main purpose of this analysis was to assess the amount of safety and concomitant medication data collected to determine a more optimal approach in the collection of these data when used in support of supplemental applications.

#### Methods

Following a prospectively developed statistical analysis plan, we reanalyzed safety data from eight previously completed prospective randomized trials.

#### Results

A total of 107,884 adverse events and 136,608 concomitant medication records were reviewed for the analysis. Of these, four grade 1 to 2 and nine grade 3 and higher events were identified as drug effects that were not included in the previously established safety profiles and could potentially have been missed using subsampling. These events were frequently detected in subsamples of 400 patients or larger. Furthermore, none of the concomitant medication records contributed to labeling changes for the supplemental indications.

#### Conclusion

Our study found that applying the optimized methodologic approach, described herein, has a high probability of detecting new drug safety signals. Focusing data collection on signals that cause physicians to modify or discontinue treatment ensures that safety issues of the highest concern for patients and regulators are captured and has significant potential to relieve strain on the clinical trials system.

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From Genentech, South San Francisco, CA; Eli Lilly, Indianapolis, IN; GlaxoSmithKline, Philadelphia, PA; Novartis Pharma AG, Basel, Switzerland; Cancer and Leukemia Group B, Statistical Center, Duke University Medical Center, Durham, NC; American Society of Clinical Oncology, Alexandria, VA; National Cancer Institute, Bethesda, MD; and Cancer and Leukemia Group B, University of Chicago, Chicago, IL.

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Corresponding author: Richard L. Schilsky, MD, University of Chicago Biological Division, 5841 South Maryland Ave, MC 2115, Chicago, IL 60637-1463; e-mail: [rschilsk@medicinebsd.uchicago.edu](mailto:rschilsk@medicinebsd.uchicago.edu).

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### INTRODUCTION

For marketing approval, the US Food and Drug Administration (FDA) requires commercial firms to submit data from adequate, well-controlled studies that demonstrate the safety and effectiveness of investigational agents in their intended use populations.<sup>1,2</sup> The initial approval of an oncologic agent from a New Drug Application (NDA) or a Biologic License Application (BLA) is based on the results from trials that include approximately 1,000 patients in the aggregate. Approval in a supplemental indication often occurs years after the initial approval, usually after extensive postmarketing evaluations have been conducted in a larger, more general population.

Though considerably more is known about the safety profile of a drug at the time of a supplemental

application, sponsors collect extensive safety data, similar to that collected for initial marketing approval. Recent studies indicate that documenting and validating extensive adverse event (AE) data places a substantial burden on the clinical trials infrastructure, especially at the site level.<sup>3,4</sup> Similar considerations apply to the collection of data on concomitant medications, where large quantities of data continue to be collected in support of supplemental applications, but are seldom used to change drug labeling. Therefore, it is important to understand the type and extent of clinical data necessary to inform regulatory decisions that lead to changes in drug labeling and to clinical decisions regarding dose modification or discontinuation of treatment.

These considerations have prompted calls for development of specific data collection standards,

particularly for supplemental NDAs/BLAs.<sup>5-7</sup> Collecting targeted data necessary to inform regulatory and clinical decisions may enhance physician participation in clinical trials and enable more rapid completion of studies. This may result in allowing faster delivery of new drugs to patients, reducing the cost of clinical trials and enhancing data quality.

To address these issues, a working group was formed to provide a forum for the FDA, the National Cancer Institute, academic investigators, and industry to develop AE data collection standards for supplemental NDAs/BLAs in oncology indications. Representatives from the Cancer and Leukemia Group B, Eli Lilly, Genentech, GlaxoSmithKline, and Novartis Pharma AG volunteered to re-evaluate safety data from previously completed clinical trials. The main purpose of this analysis was to determine whether subsets of an AE database used for a supplemental application could adequately identify the new safety signals that would be learned from complete AE collection.

## METHODS

A statistical analysis plan (SAP) was prospectively developed and approved by the project stakeholders. The analyses evaluated subsampling methods and their likelihood of missing clinically important AEs or over-representing events, relative to the information known from the established safety profile of the agent. Further, the SAP assessed the extent of data collection and cleaning effort saved through subsampling.

In all subsampling methods evaluated, serious AEs and events leading to drug discontinuation or dose modification, referred to here as “serious+” AEs, were collected in all patients. The SAP focused on the subsampling of grade 3 and higher events, referred to as grade 3+ AEs, and of grade 1 to 2 AEs, both groups distinct from the category of serious+ events.

Eight completed phase III clinical trials were selected for individual reanalysis (Table 1).<sup>8-15</sup> These industry-sponsored and publicly funded trials investigated chemotherapy, biologic, and hormonal treatments in the metastatic and adjuvant treatment settings across multiple tumor types. In each case, the investigational agent had been studied in other phase III clinical trials and an established safety profile existed that served as the standard for the reanalysis. Treatment regimens differed substantially between the initial registration trial and the reanalyzed studies in four of the eight trials.

In each candidate trial, cutoffs for AE signal detection were set to capture the smallest changes in AE frequency that oncologists might consider clinically relevant; therefore, drug effects were defined as those grade 3+ events with a  $\geq 2\%$  difference in incidence between the treatment and control arms and as those grade 1 to 2 events with a  $\geq 5\%$  difference.

We identified AE signals from previous trials that lead to the initial NDA/BLA approval and other studies conducted before the conduct of the candidate trial (ie, AEs from labeling, safety databases, and published literature).<sup>16-23</sup> To this list, we added serious+ events that occurred in  $\geq 2\%$  excess from the candidate trial to establish the base known safety profile for the grade 3+ event subsampling analysis. For the assessment of the grade 1 to 2 subsamples, the base known safety profile was defined as above with the addition of grade 3+ events in  $\geq 2\%$  excess in the candidate trial.

AEs identified as drug effects in the candidate trial that were not listed as part of the base known safety profile were defined as events that could potentially be missed under the subsampling analysis. Noise events were defined as drug effects identified in subsamples that were not identified as drug effects in the candidate trial’s full safety database.

Random and systematic sampling methods were applied to each candidate trial. Subsampling simulations on candidate trial data used 1,000 independent replications targeting 200, 300, 400, 500, and 600 patients, equally divided between the treatment arms, selected randomly by patient and ran-

domly by treatment center. For each sample size and random subsampling method, we tabulated both the rate of event detection of potentially missed events and the mean number of noise events across the replications.

The systematic subsampling methods selected the target numbers of patients from the biggest centers and the first patients enrolled. From each subsample, we calculated the incidence differences of those AEs identified as drug effects, thus determining the missed signals and the noise AEs.

For each of the candidate studies, we determined the number of distinct AEs in the database for serious+ events, grade 1 to 2 events not serious+, and grade 3+ events not serious+. The mean number of AEs per patient was reported for each category.

We also determined the number of database records and fields needed to store concomitant medication data and whether the results were noted in subsequent FDA-approved labels.

## RESULTS

Toxicity records from the candidate trials included 17,184 patients. The metastatic disease trials ranged in patient safety population size from 580 to 1,669 patients, whereas the adjuvant disease trials ranged from 1,264 to 7,963 patients (Table 1).

In the eight studies, 43 grade 3+ events were detected as drug effects (Table 2); however, 34 of these events were previously identified as part of their corresponding base known safety profile. The subsampling analysis focused on detection of the remaining nine events that could potentially be missed. Because so few AEs could be missed, known events from several trials representing varying full trial incidence differences were selected for subsampling analysis. This allowed us to observe AE detection trends as the incidence differences increased beyond the 2% cutoff rate.

Likewise, there were 24 grade 1 to 2 AEs identified as drug effects in the four relevant studies, with 20 of them represented in the corresponding base known safety profile (Table 2). The subsampling analysis focused on detection of the remaining four events that could potentially be missed, along with known grade 1 to 2 events illustrating trends across varying incidence rates.

Subsampling examples are presented and discussed in detail to illustrate overarching trends in the data across the metastatic and adjuvant studies. Reanalysis results of the adjuvant trials are reported in the Appendix (online only).

Rates of detection of grade 3+ events for the metastatic trials ranged from 62% to 94% for the 200-patient subsamples and from 61% to 100% for the 600-patient subsamples when using the random-by-patient selection method (Table 3). For the grade 1 to 2 events, rates of detection ranged from 76% to 99.5% for the 200-patient subsamples and from 99.5% to 100% for the 600-patient subsamples (Table 3). The chance of detecting these events increased with increasing subsample size. The rates of detection for the centers-at-random subsamples were consistent with, although slightly lower than, those using the random-by-patient method.

Further, the chance of event detection was larger the greater the AE rate excess in the full study. For example, “leukopenia,” with a 6.7% excess in the full AVF2107g trial, was detected in 92% of the 400 random-by-patient subsets, whereas “weight decreased,” with a 2.1% excess in the full AVAIL (Avastin in Lung) study, was detected in 66% of the corresponding 400-patient subsets. Across the metastatic studies, all grade 3+ AEs analyzed that had at least 3% excess in the full study were detected in at least 75% of the

Table 1. Study Characteristics

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Candidate Study Profile				Source of Known Safety Profile			
Study	Patient Population	Study Treatment	Safety Analysis Population	Precursor Studies	Primary Precursor Study Population	Precursor Study Treatment	Safety Analysis Population
AVAiL <sup>8</sup>	First-line nonsquamous NSCLC	Arm 1: cisplatin/gemcitabine Arm 2: cisplatin/gemcitabine + bevacizumab	656	AVF2107g <sup>9</sup>	First-line mCRC	Arm 1: irinotecan/FU/LV (bolus-IFL) + placebo Arm 2: bolus IFL + bevacizumab	813
				ECOG 3200 <sup>16</sup>	Second-line mCRC	FOLFOX4; FOLFOX4 + bevacizumab	585
AVF2107g <sup>9*</sup>	First-line mCRC	Arm 1: irinotecan/FU/LV (bolus IFL) + placebo Arm 2: bolus IFL + bevacizumab	788	AVF2119g <sup>17</sup>	mBC	Arm 1: capecitabine Arm 2: capecitabine + bevacizumab	462
ECOG 4599 <sup>10</sup>	First-line nonsquamous NSCLC	Arm 1: paclitaxel/carboplatin Arm 2: paclitaxel/carboplatin + bevacizumab	878	AVF2107g <sup>4</sup>	First-line mCRC	Arm 1: irinotecan/FU/LV (bolus IFL) + placebo Arm 2: bolus IFL + bevacizumab	813
				ECOG 3200 <sup>16</sup>	Second-line mCRC	FOLFOX4; FOLFOX4 + bevacizumab	585
EGF30001 <sup>11</sup>	First-line mBC	Arm 1: paclitaxel + placebo Arm 2: paclitaxel + lapatinib	580	EGF100151 <sup>18</sup>	Refractory advanced or mBC	Arm 1: capecitabine Arm 2: capecitabine + lapatinib	408
JMDB <sup>12</sup>	First-line NSCLC	Arm 1: cisplatin plus pemetrexed Arm 2: cisplatin plus gemcitabine	1,669	JMCH <sup>19</sup>	MPM	Arm 1: cisplatin plus pemetrexed Arm 2: cisplatin	331
IBCSG BIG 1-98 <sup>13</sup>	PMP women with HR+ EBC	Arm 1: letrozole Arm 2: tamoxifen; double-blind using double-dummy technique	7,963	NCIC MA-17 (PI 11/2004) <sup>20</sup>	Extended Adjuvant	Letrozole 2.5 mg orally daily for 5 years Placebo orally daily for 5 years; double-blind using double-dummy technique	5,136
CALGB 89803 <sup>14</sup>	Patients with resected adenocarcinoma of the colon	Arm 1: LV + FU Arm 2: irinotecan + LV + FU	1,264	Cunningham et al, <sup>21</sup> 1998	mCRC	Irinotecan v best supportive care (FU failures)	279
				Rougier et al, <sup>22</sup> 1998	mCRC	Irinotecan v FU	267
HERA <sup>15</sup>	HER2+ adj breast cancer	Arm 1: observation Arm 2: trastuzumab	3,386	H0648g <sup>23</sup>	First-line mBC	Trastuzumab + CT v CT alone; CT was either (1) anthracycline + cyclophosphamide or (2) paclitaxel + cyclophosphamide	469

Abbreviations: AVAiL, Avastin in Lung; NSCLC, non-small-cell lung cancer; ECOG, Eastern Cooperative Oncology Group; mCRC, metastatic colorectal cancer; FU, fluorouracil; LV, leucovorin; IFL, irinotecan plus fluorouracil and leucovorin; FOLFOX4, infusional fluorouracil, leucovorin, and oxaliplatin; mBC, metastatic breast cancer; MPM, malignant pleural mesothelioma; IBCSG, International Breast Cancer Study Group; BIG, Breast International Group; PMP, postmenopausal; HR, hormone receptor; EBC, early breast cancer; NCIC, National Cancer Institute of Canada; PI, package insert (US); CALGB, Cancer and Leukemia Group B; HERA, HERceptin Adjuvant; adj, adjuvant; CT, chemotherapy.

\*AVF2107g was a three-arm trial. A third arm with treatment of FU/LV plus recombinant humanized monoclonal antibody vascular endothelial growth factor was omitted from this analysis.

simulations with subsamples of 400 patients, regardless of the random selection method used. The two grade 1 to 2 events from the AVAiL trial had full-trial incidence rate differences of 6.4% and 15.4%. Both events were likely to be detected with random subsampling of 400 patients (Table 3).

With the systematic subsampling methods for the metastatic trials, the observed AE rate difference varied around the full study value and generally converged to the full study value with larger subsample size (Table 4). Similar to the trend observed with random sampling methods, the grade 3+ events with full trial rate differences close to the cutoff rate of 2% were sometimes missed with subsampling. However, the chance of detecting events increased as the full study event rate difference increased above 2%. Events with full-study incidence excess of 3% or greater were detected in 88% of the sub-

samples. As with the random subsampling methods, AE detection was more likely in the larger subsamples and as full-study event rate differences increased beyond the 2% cutoff rate. For both grade 3+ and grade 1 to 2 events using the systematic subsampling methods, AE rate differences were similar to the full study rates with subsamples of 400 patients or more.

Regarding noise event detection among subsamples of the metastatic disease trials, fewer were detected for simulations with larger subsample sizes. For example, an average of 13.2 noise events were detected in the random-by-patient subsamples of 200 patients for AVF2107g (Table 5). For simulations of the 400 random-by-patient subsamples in that trial, the average number of noise events decreased to 4.9. This trend was observed across metastatic studies in grade 3+ AE subsets selected by either random method. The number of grade

**Table 2.** AEs Detected as Drug Effects in the Analysis of All Patients in the Candidate Studies

Trial	Grade 3+ Events Detected in $\geq 2\%$ Incidence Difference
AVAIL	<i>Weight decreased</i> Proteinuria* Nausea* Vomiting* Asthenia* Peripheral sensory neuropathy* Neutropenia*† Epistaxis† Hypertension*†
AVF2107g	<i>Abdominal pain</i> Leukopenia Hypertension* Pain† Deep thrombophlebitis*† Constipation† Diarrhea†
ECOG 4599	<i>Febrile neutropenia</i> <i>Infection without neutropenia</i> Hyponatremia Proteinuria* Neutrophils* Fatigue* Headache* Hypertension*
EGF30001	<i>Leukopenia</i> Nausea Febrile neutropenia† Neutropenia† Diarrhea*† Hypokalemia* Rash†
JMDB	Anorexia* Nausea*
BIG 1-98 CALGB 89803	No events identified in excess of 2% <i>Thrombosis/embolism</i> Hemoglobin*† Leukocytes*† Neutrophils/granulocytes*† Platelets*† Fatigue*† Alopecia* Febrile neutropenia* Infection*
HERA	Ejection fraction decreased†

Trial	Grade 1 to 2 Events Detected in $\geq 5\%$ Incidence Difference
AVAIL	Epistaxis*† Fatigue* Headache* Hypertension*† Neutropenia*† Stomatitis*
BIG 1-98 CALGB 89803	<i>Hypercholesterolemia</i> <i>Sweating (diaphoresis)</i> <i>Constipation</i> Hemoglobin*† Leukocytes (total WBC)*† Neutrophils/granulocytes*† Fatigue (lethargy/malaise/asthenia)*† Alopecia* Diarrhea (without colostomy)*† Nausea*† Vomiting*†

(continued in next column)

3+ noise events fluctuated across trials for the systematic subsets of size 200, but was consistently low with subsets of 400 patients, ranging between zero to three noise events. Similar trends were observed for the grade 1 to 2 events.

**Table 2.** AEs Detected as Drug Effects in the Analysis of All Patients in the Candidate Studies (continued)

Trial	Grade 3+ Events Detected in $\geq 2\%$ Incidence Difference
HERA	<i>Fatigue</i> Headache* Nasopharyngitis* Nausea* Chills* Diarrhea* Pyrexia*

NOTE. Adverse events in *italics* could be missed under AE subsampling. Trial JMDB was a head-to-head study. Drug signals were determined where the gemtared arm had a 2% excess of incidence over the gemcitabine arm. For trial CALGB 89803, serious AEs and AEs leading to dose modifications were not identified as such in the case report forms. The determination of known events from this study was based only on a 2% excess of AEs leading to drug discontinuation or death. For study ECOG 4599, serious AEs and AEs leading to drug discontinuation or dose modifications were not identified as such in the case report forms. Therefore, there was no separate determination of known events from this study.

Abbreviations: AE, adverse event; AVAIL, Avastin in Lung; ECOG, Eastern Cooperative Oncology Group; BIG, Breast International Group; CALGB, Cancer and Leukemia Group B; HERA, HERceptin Adjuvant.

\*Known from previous trials.

†Identified as known in candidate trial from analysis of AEs to be collected in all patients (see Methods).

Adjuvant studies Cancer and Leukemia Group B 89803 and HERA (HERceptin Adjuvant) were subsampled for grade 3+ and 1 to 2 AEs, whereas trial Breast International Group 1-98 was subsampled only for grade 1 to 2 events because no missable grade 3+ events were identified (Table 2). Under the random sampling methods, the rates of AE detection increased as subset size increased (Appendix Table A3, online only). Events with high incidence rate differences in the full trial analyses were detected in higher frequencies than those close to their associated cutoff (2% for grade 3+ and 5% for grade 1 to 2). These trends were also observed in the systematic patient subsets selected from largest centers and by enrollment order, regardless of the adjuvant trial analyzed (Appendix Table A4, online only). Noise event detection patterns for grade 3+ and 1 to 2 AE subsamples from the adjuvant disease trials mirrored those from the metastatic trials (Appendix Table A5, online only).

The overall number of AEs contained in the safety databases for seven of the trials was 107,884 (Table 6). Of these AEs, 19,621 were serious+. There were 72,801 grade 1 to 2 events not classified as serious+, ranging from an average of 2.3 to 12.0 per patient. Further, grade 1 to 2 events were from 4.2 to 9.6 times as numerous as the serious+ events in the metastatic trials and from 2.2 to 14.4 times as numerous in the adjuvant trials.

The average number of concomitant medications reported per patient ranged from 14 to 27 in the metastatic trials and from four to seven in the adjuvant trials (Appendix Table A6, online only). Of the 136,608 concomitant medication records included in the summary tabulations for these studies, none contributed to labeling changes for the supplemental indications.

## DISCUSSION

The collection of all AEs in all patients in a study designed to support a supplemental NDA/BLA has the potential to identify new drug safety



**Table 3.** Probability of Detecting AEs Under Random Subsampling Methods for Metastatic Disease Studies

Study, AE, Active Arm Rate Excess in Full Study	Sampling Method	Subsample Size (total No. of patients)				
		200 (%)	300 (%)	400 (%)	500 (%)	600 (%)
<b>Grade 3+ events</b>						
JMDB, anorexia*†, 2.1%	Random by patient	62.4	61	63.3	60.4	61
	Random by center‡	50.6	49.9	52.7	56.7	56.4
AVAIL, <i>weight decreased</i> , 2.1%	Random by patient	63	65	66	68	<b>79</b>
	Random by center‡	51	54	52	59	65
ECOG 4599, <i>infection without neutropenia</i> , 2.4%	Random by patient	63	67	68	72	<b>75</b>
	Random by center‡	57	60	63	68	70
EGF30001, <i>leukopenia</i> , 2.4%	Random by patient	68	70	<b>79</b>	<b>86</b>	NA
	Random by center‡	58	61	66	<b>79</b>	NA
EGF30001, <i>nausea</i> , 2.4%	Random by patient	66	68	73	<b>84</b>	NA
	Random by center‡	54	57	64	71	NA
ECOG 4599, <i>proteinuria</i> ,* 3.0%	Random by patient	<b>87</b>	<b>91</b>	<b>94</b>	<b>96</b>	<b>98</b>
	Random by center‡	<b>78</b>	<b>85</b>	<b>90</b>	<b>93</b>	<b>98</b>
AVF2107g, <i>abdominal pain</i> , 3.4%	Random by patient	72	<b>77</b>	<b>80</b>	<b>85</b>	<b>92</b>
	Random by center‡	65	72	<b>75</b>	<b>80</b>	<b>90</b>
JMDB, <i>nausea</i> ,*† 3.5%	Random by patient	72.9	74.5	<b>78.1</b>	<b>79.7</b>	<b>82</b>
	Random by center‡	68.7	69.6	<b>75.5</b>	<b>77.2</b>	<b>80.5</b>
AVAIL, <i>epistaxis</i> ,† 4.3%	Random by patient	<b>94</b>	<b>98</b>	<b>99.4</b>	<b>100</b>	<b>100</b>
	Random by center‡	<b>91</b>	<b>97</b>	<b>99.6</b>	<b>100</b>	<b>100</b>
AVF2107g, <i>leukopenia</i> , 6.7%	Random by patient	<b>79</b>	<b>88</b>	<b>92</b>	<b>97</b>	<b>99.4</b>
	Random by center‡	<b>77</b>	<b>85</b>	<b>90</b>	<b>96</b>	<b>98</b>
<b>Grade 1 to 2 events</b>						
AVAIL, <i>stomatitis</i> ,* 6.4%	Random by patient	<b>76</b>	<b>76</b>	<b>88</b>	<b>92</b>	<b>99.5</b>
	Random by center‡	67	70	<b>78</b>	<b>87</b>	<b>97</b>
AVAIL, <i>headache</i> ,* 15.4%	Random by patient	<b>99.5</b>	<b>100</b>	<b>100</b>	<b>100</b>	<b>100</b>
	Random by center‡	<b>98</b>	<b>99.9</b>	<b>100</b>	<b>100</b>	<b>100</b>

NOTE. AEs in *italics* could be missed under patient subsampling. The other events are known events but are included here because the magnitude of the active arm rate excess versus the control arm illustrates the properties of AE subsampling. Results from the two missable events from ECOG 4599—hyponatremia with 2.4% excess and febrile neutropenia with 2.6% excess—were omitted because the subsampling results were similar to those for infection without neutropenia, which had a rate excess of 2.4%. Grade 3+ events are detected in a simulation when they appear in 2% excess over the control arm; grade 1 to 2 events are detected when they appear in 5% excess over the control arm. Rates of detection in **bold** are  $\geq 75\%$ .

Abbreviations: AE, adverse event; AVAIL, Avastin in Lung; ECOG, Eastern Cooperative Oncology Group; NA, not applicable.

\*Known from previous trials.

†Identified as known in candidate trial from analysis of AEs to be collected in all patients (see Methods).

‡Sample sizes are approximate. The number of centers selected at random was determined to achieve an average number of patients at or above the target level.

signals (Table 2). Weighing the number and clinical significance of these signals against the effort required to collect them leads us to recommend that, although AEs should be collected comprehensively for the initial NDA/BLA to establish the drug's basic safety profile, toxicity data collection for subsequent supplemental trials should be limited to serious+ AEs in all patients and grade 3+ AEs in a subset of patients. The asymmetric collection of AEs (ie, only in patients on the investigational arm) should be avoided, as there is then no concurrent control for the accurate assessment of safety signals.

For the collection of grade 3+ events in the metastatic trials, a 400-patient subsample selected at random provided adequate probability, averaging 85%, of detecting events that would be notable in the full study (ie, those with an active to control rate excess of  $\geq 3\%$ ). For AEs with 2% to 3% excess in the full study, there is an approximate 30% chance of missing the signal with a subset of 400 patients. Importantly, AEs close to the data cutoff are hard to detect, regardless of sample size. For example, even in a trial of 3,000 patients, there is a 50% chance of missing an event that has a true 2% excess frequency at a cutoff of 2%. Also, with a 400-patient subsample, the number of noise events is acceptably low, generally in the range of three events or fewer.

For larger metastatic trials and for adjuvant trials, the subsample size should be larger than 400, but it need not be proportionately so;

our analysis suggests that subsample sizes from 400 to 800 patients should be sufficient. Based on our results, two approaches were formulated to allow the prospective determination of subsample sizes (Appendix: Sample Size Rationale, online only).<sup>24</sup> Subsampling may not be worthwhile in studies that have fewer than 600 patients total, given the effort required to set up the process.

In the adjuvant setting, the benefit/risk profile of a drug is different than in the metastatic setting. Patients and physicians are less willing to tolerate risk. Grade 1 to 2 events may play a larger role in establishing the safety profile of the drug, causing one to question whether it is wise to omit collection of grade 1 to 2 events in this setting. It is important to note that all events meeting the serious+ criteria would still be collected. Therefore, clinically important grade 1 to 2 events—ones that cause a physician to modify or discontinue dosing—would be collected. Using this data collection strategy would have saved the collection of 72,801 grade 1 to 2 AEs across six of our trials, averaging 4.7 AEs per patient, while still not missing any clinically significant events (Table 6).

A notable feature of our reanalysis is that the indication and control-arm medications used in the candidate study differed from the studies used to define the drug's known safety profile. Despite

**Table 4.** AE Incidence Differences Under Systematic Subsampling Methods for Metastatic Disease Studies

Study, AE, Active Arm Rate Excess in Full Study	Sampling Method	Subsample Size (total No. of patients)				
		200 (%)	300 (%)	400 (%)	500 (%)	600 (%)
<b>Grade 3+ events</b>						
JMDB, anorexia,*† 2.1%	Biggest centers‡	0.7	1.0	1.1	<b>2.5</b>	<b>2.3</b>
	First patients enrolled	1.6	1.6	<b>2.1</b>	<b>2.4</b>	<b>2.0</b>
AVAiL, <i>weight decreased</i> , 2.1%	Biggest center‡	<b>2.2</b>	<b>3.2</b>	<b>2.9</b>	<b>2.3</b>	<b>2.4</b>
	First patients enrolled	0.1	0.7	1.6	<b>2.3</b>	<b>2.3</b>
ECOG 4599 <i>infection without neutropenia</i> , 2.4%	Biggest centers‡	<b>3.5</b>	<b>3.1</b>	<b>2.3</b>	<b>3.4</b>	<b>3.0</b>
	First patients enrolled	<b>2.9</b>	1.4	1.5	<b>2.4</b>	<b>2.4</b>
EGF30001, <i>leukopenia</i> , 2.4%	Biggest centers‡	<b>4.7</b>	<b>4.2</b>	<b>4.5</b>	<b>3.6</b>	NA
	First patients enrolled	<b>3.9</b>	<b>3.3</b>	<b>3.0</b>	<b>2.8</b>	NA
EGF30001, <i>nausea</i> , 2.4%	Biggest centers‡	<b>2.1</b>	1.0	1.0	1.2	NA
	First patients enrolled	<b>3.0</b>	<b>2.6</b>	1.4	<b>2.0</b>	NA
ECOG 4599, <i>proteinuria</i> ,* 3.0%	Biggest centers‡	<b>2.8</b>	<b>3.9</b>	<b>4.4</b>	<b>3.9</b>	<b>3.7</b>
	First patients enrolled	<b>2.0</b>	<b>2.0</b>	<b>4.0</b>	<b>3.6</b>	<b>3.4</b>
AVF2107g, <i>abdominal pain</i> , 3.4%	Biggest centers‡	<b>2.3</b>	<b>3.3</b>	<b>3.5</b>	<b>2.7</b>	1.5
	First patients enrolled	<b>4.6</b>	<b>3.2</b>	<b>3.9</b>	<b>4.3</b>	<b>4.9</b>
JMDB, <i>nausea</i> ,*† 3.5%	Biggest centers‡	1.9	1.9	<b>2.0</b>	1.2	1.1
	First patients enrolled	0.8	<b>2.4</b>	<b>2.8</b>	<b>2.1</b>	<b>2.4</b>
AVAiL, <i>epistaxis</i> ,† 4.3%	Biggest centers‡	<b>4.2</b>	<b>3.9</b>	<b>2.9</b>	<b>4.7</b>	<b>4.7</b>
	First patients enrolled	<b>5.1</b>	<b>5.4</b>	<b>5.6</b>	<b>4.7</b>	<b>4.7</b>
AVF2107g, <i>leukopenia</i> , 6.7%	Biggest centers‡	<b>7.9</b>	<b>10.6</b>	<b>9.6</b>	<b>7.3</b>	<b>6.4</b>
	First patients enrolled	<b>2.4</b>	<b>4.8</b>	<b>7.1</b>	<b>7.3</b>	<b>6.2</b>
<b>Grade 1 to 2 events</b>						
AVAiL, <i>stomatitis</i> ,* 6.4%	Biggest centers‡	<b>4.3</b>	<b>7</b>	<b>7.2</b>	<b>7.1</b>	<b>6.7</b>
	First patients enrolled	<b>10.3</b>	<b>6.8</b>	<b>6.1</b>	<b>6.2</b>	<b>7.0</b>
AVAiL, <i>headache</i> ,* 15.4%	Biggest centers‡	<b>8.5</b>	<b>9.7</b>	<b>12.6</b>	<b>13.5</b>	<b>14.9</b>
	First patients enrolled	<b>18.9</b>	<b>19.3</b>	<b>18.9</b>	<b>17.7</b>	<b>16.0</b>

NOTE. AEs in *italics* could be missed under patient subsampling. The other events are known events but are included here because the magnitude of the active arm rate excess versus the control arm illustrates the properties of the subsampling. Results from the two missable events from ECOG 4599—hyponatremia with 2.4% excess and febrile neutropenia with 2.6% excess—were omitted because the subsampling results were similar to those for infection without neutropenia, which had a rate excess of 2.4%. Incidence differences in **bold** are  $\geq 2$  for grade 3+ AEs and  $\geq 5$  for grade 1 to 2 AEs.

Abbreviations: AE, adverse event; AVAiL, Avastin in Lung; ECOG, Eastern Cooperative Oncology Group; NA, not applicable.

\*Known from previous trials.

†Identified as known in candidate trial from analysis of AEs to be collected in all patients (see Methods).

‡Sample sizes are approximate. Enough centers were selected to meet or exceed the target subsample size.

these differences, there were few AEs that would be missed by subsampling. Therefore, our recommendations should apply broadly across supplemental applications except for the first submission after an accelerated approval (or full approval in smaller disease populations) or where the patient population to be studied in the supplemental indication is substantially different in clinical characteristics as to be at substantially higher risk of AEs than were seen in the trials we reanalyzed.

The systematic subsampling methods revealed no consistent bias in the estimates of full-trial AE rate differences in the trials we analyzed. However, random subsampling methods would ensure the absence of bias in general. Sampling centers at random provides the best balance of statistical legitimacy and operational feasibility, for both the site and the sponsor. Limiting sites to one data collection system reduces confusion and potential impact on data quality. A random selection of sites, although unbiased, may not adequately represent the study population. Therefore, we recommend stratification of the sample based on relevant site characteristics. In order to ensure enough patients are included in the subsample, the number of sites selected should be overestimated and ongoing enrollment should be monitored.

The comprehensive collection of concomitant medications is resource intensive and within a supplemental application contributes little to defining the safety profile of a drug. Therefore, although full data collection should continue for clinical trials supporting an initial indication, we recommend that for trials designed to support supplemental applications, collection of concomitant medications should be limited to specific targeted collections based on the known safety and pharmacologic profile of the investigational agent, medications that exhibit anticancer properties, and ones that meet a specific objective of the trial (eg, health economics or costing). Concomitant medications should continue to be reported in the narrative section of serious AE forms.

In conclusion, doctors want to recognize drug safety issues that lead them to change or discontinue a patient's treatment. Collection of large quantities of data that do not inform regulatory or clinical practice decisions taxes resources that could be used to improve the collection of more relevant data and thus risks obfuscating important safety signals. For phase III trials supporting supplemental applications, an optimized AE and concomitant medication collection strategy can identify clinically significant safety information and preserve resources otherwise spent collecting uninformative information. Once

**Table 5.** Number of Noise Events Detected Under Subsampling for Metastatic Disease Studies

Study and Sampling Method	No. of Noise Events				
	200 Patients	300 Patients	400 Patients	500 Patients	600 Patients
<b>Grade 3+ events</b>					
AVAL					
Random by patient*	9	4.3	<b>2.4</b>	<b>1.2</b>	<b>0.3</b>
Random by center*†	5.4	<b>2.8</b>	<b>1.5</b>	<b>0.7</b>	<b>0.2</b>
Biggest centers†	5	<b>0</b>	<b>0</b>	<b>0</b>	<b>0</b>
First patients enrolled	16	9	<b>2</b>	<b>0</b>	<b>0</b>
AVF2107g					
Random by patient*	13.2	7.6	4.9	3.3	2.3
Random by center*†	8.8	5.1	3.6	<b>2.5</b>	<b>1.6</b>
Biggest centers†	13	5	<b>1</b>	<b>1</b>	<b>1</b>
First patients enrolled	8	<b>3</b>	<b>2</b>	<b>2</b>	<b>0</b>
ECOG 4599					
Random by patient*	9.9	5.8	3.9	<b>2.6</b>	<b>1.6</b>
Random by center*†	6.7	4.3	<b>2.8</b>	<b>2</b>	<b>1.2</b>
Biggest centers†	<b>3</b>	<b>2</b>	<b>1</b>	<b>2</b>	<b>2</b>
First patients enrolled	5	4	<b>1</b>	<b>2</b>	<b>1</b>
EGF30001					
Random by patient*	12	7	4	<b>2</b>	NA
Random by center*†	8	5	<b>3</b>	<b>1</b>	NA
Biggest centers†	6	4	<b>1</b>	<b>1</b>	NA
First patients enrolled	4	4	<b>3</b>	<b>0</b>	NA
JMDB					
Random by patient*	<b>0.448</b>	<b>0.39</b>	<b>0.422</b>	<b>0.528</b>	<b>0.139</b>
Random by center*†	<b>0.534</b>	<b>0.387</b>	<b>0.449</b>	<b>0.373</b>	<b>0.17</b>
Biggest centers†	<b>1</b>	<b>2</b>	<b>1</b>	<b>1</b>	<b>1</b>
First patients enrolled	<b>1</b>	<b>2</b>	<b>3</b>	<b>3</b>	<b>2</b>
<b>Grade 1 to 2 events</b>					
AVAL					
Random by patient*	5	<b>1.8</b>	<b>1</b>	<b>0.2</b>	<b>0</b>
Random by center*†	3.9	<b>1.9</b>	<b>0.8</b>	<b>0.3</b>	<b>0</b>
Biggest centers†	<b>1</b>	<b>0</b>	<b>1</b>	<b>0</b>	<b>0</b>
First patients enrolled	7	<b>1</b>	<b>1</b>	<b>0</b>	<b>0</b>

NOTE. Noise event quantities in **bold** are  $\leq 3$ .

Abbreviations: AVAL, Avastin in Lung; ECOG, Eastern Cooperative Oncology Group; NA, not applicable.

\*Noise events for random sampling methods are reported as mean numbers determined from 1,000 simulations.

†Sample sizes are approximate due to analysis structure for sampling by center methods.

several applications that use this methodology have been reviewed by the FDA, it will be important to determine the benefit of subsampling itself and assess whether collection of only serious+ events may be sufficient.

Although this project focused on collection of AE and concomitant medication data, steps could be taken in other areas to further simplify study conduct. For example, significant resources were expended to perform an independent radiologic review of progression events in the Eastern Cooperative Oncology Group 2100 trial that only served to validate the original trial results.<sup>25</sup>

For clinical trials intended to support supplemental NDAs/BLAs, symmetric collection of events, regardless of grade, that are serious or lead to dose modification/discontinuation or death should occur in all patients. Grade 1 to 2 events and complete concomitant medication records need not be collected. Grade 3+ events should be collected in a subsample of the full trial. This optimized data collection strategy

**Table 6.** Number of AEs

Study (safety population analyzed)	Distinct No. of AEs (average No. of AEs per patient)					
	Grade 1 to 2 AEs Not Serious+		Grade 3+ AEs Not Serious+		SAEs and AEs Leading to Dose Discontinuation/Change Serious+	
	No.	Avg	No.	Avg	No.	Avg
<b>Metastatic studies</b>						
AVF2107g (n = 788)	NA		1,297	1.6	1,187	1.5
AVAL (n = 656)	6,245	9.5	1,030	1.6	849	1.3
EGF30001 (n = 580)	6,943	12.0	377	0.6	725	1.2
JMDB (n = 1,669)	10,514	6.3	835	0.5	2,504	1.5
<b>Adjuvant studies</b>						
BIG 1-98 (n = 7,963)	28,098	3.5	9,612	1.2	12,845	1.6
CALGB 89803 (n = 1,264)	13,300	10.5	2,150	1.7	976	0.8
HERA (n = 3,386)	7,701	2.3	161	0.05	535	0.2
<b>Total</b>	<b>72,801</b>	<b>4.7</b>	<b>15,462</b>	<b>0.9</b>	<b>19,621</b>	<b>1.2</b>

NOTE. SAEs were not identified in study Eastern Cooperative Oncology Group 4599.

Abbreviations: AEs, adverse events; SAEs, serious adverse events; NA, grade 1 to 2 adverse events were not analyzed for trial; AVAL, Avastin in Lung; BIG, Breast International Group; CALGB, Cancer and Leukemia Group B; HERA, HERceptin Adjuvant; Avg, average.

leads to a high probability of capturing events that matter most to patients and their physicians.

#### AUTHORS' DISCLOSURES OF POTENTIAL CONFLICTS OF INTEREST

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#### AUTHOR CONTRIBUTIONS

**Conception and design:** Lee D. Kaiser, Allen S. Melemed, Gwendolyn A. Fyfe, Jacqueline M. Gough, Jeffrey S. Abrams, Richard L. Schilsky **Administrative support:** Allen S. Melemed, Cynthia L. Stephens, M. Kelsey Mace **Collection and assembly of data:** Lee D. Kaiser, Allen S. Melemed, Alaknanda J. Preston, Hilary A. Chaudri Ross, Donna Niedzwiecki, Jacqueline M. Gough, William D. Bushnell

**Data analysis and interpretation:** Lee D. Kaiser, Allen S. Melemed, Alaknanda J. Preston, Hilary A. Chaudri Ross, Donna Niedzwiecki, Gwendolyn A. Fyfe, Jacqueline M. Gough, William D. Bushnell, Cynthia L. Stephens, M. Kelsey Mace, Jeffrey S. Abrams, Richard L. Schilsky  
**Manuscript writing:** Lee D. Kaiser, Allen S. Melemed, Alaknanda J. Preston, Hilary A. Chaudri Ross, Donna Niedzwiecki, Gwendolyn A.

Fyfe, Jacqueline M. Gough, William D. Bushnell, Cynthia L. Stephens, M. Kelsey Mace, Jeffrey S. Abrams, Richard L. Schilsky  
**Final approval of manuscript:** Lee D. Kaiser, Allen S. Melemed, Alaknanda J. Preston, Hilary A. Chaudri Ross, Donna Niedzwiecki, Gwendolyn A. Fyfe, Jacqueline M. Gough, William D. Bushnell, Cynthia L. Stephens, M. Kelsey Mace, Jeffrey S. Abrams, Richard L. Schilsky

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