

# Sampling Error Can Significantly Affect Measured Hospital Financial Performance of Surgeons and Resulting Operating Room Time Allocation

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## Sampling Error in Measured Hospital Financial Performance of Surgeons and Resulting Operating Room Time Allocation

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## Abstract

Hospitals with limited operating room (OR) hours, those with intensive care unit or ward beds that are always full, or those that have no incremental revenue for many patients need to choose which surgeons get the resources. Although such decisions are based on internal financial reports, whether the reports are statistically valid is not known. Random error may affect surgeons' measured financial performance and, thus, what cases the anesthesiologists get to do and which patients get to receive care. We tested whether one fiscal year of surgeon-specific financial data is sufficient for accurate financial accounting. We obtained accounting data for all outpatient or same-day-admit surgery cases during one fiscal year at an academic medical center. Linear programming was used to find the mix of surgeons' OR time allocations that would maximize the contribution margin or minimize variable costs. Confidence intervals were calculated on these end points by using Fieller's theorem and Monte-Carlo simulation. The 95% confidence intervals for increases in contribution margins or reductions in variable costs were 4.3% to 10.8% and 6.0% to 8.9%, respectively. As many as 22% of surgeons would have had OR time reduced because of sampling error. We recommend that

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Accurately determining important not only for the hours of OR time, as compared allocated less. Unless a hospital may exacerbate its underlying financial problems. Then there are declines in services, reductions in the purchasing of new capital equipment, and reductions in anesthesiologists' revenues. A spiraling vicious cycle can ensure more cuts, further reducing the hospital's capability to provide sufficient services to generate the contribution margin needed to cover its fixed costs. It is important for all concerned that OR allocations be performed correctly and accurately.

We obtained hospital accounting data for the study. The population was all patients undergoing outpatient or same-day-admit surgery during the 2000 fiscal year at a large academic multiple-specialty hospital in the southeastern United States. The data were extracted from the hospital's activity-based costing system (Transition 1™; Eclipsys Corp., Delray Beach, FL). Calculations were performed with Year 2000 US dollars.

Overall variable costs, revenue, hours of OR time, hours of regular ward time, and hours of intensive care unit time were calculated for each physician. We limited the analysis to the 98 physicians at the hospital who performed at least 15 cases during the study year. This method limited consideration to surgeons (versus, for example, an occasional bone marrow donation performed by a hematologist). There were 9,184 cases, 28,290 h of OR time, US\$44.3 million of variable costs, and US\$40.6 million of contribution margin.

We used the Solver linear programming <sup>(4)</sup> routine in Microsoft Excel™ (Microsoft Corp., Redmond, WA) to find the mix of surgeons' OR time allocations to maximize the contribution margin or minimize variable costs. We included the following constraints on the availability of resources.

First, we assumed that each surgeon could expand his or her use of OR time by as much as one-quarter of the number of OR hours that he or she used during the past fiscal year. Second, we assumed that the OR time for a surgeon could be cut by as much as one-quarter. The surgeons at the hospital under study have privileges at only one hospital. Therefore, a maximum reduction of 25% was the lowest practical limit. Third, we specified that the total OR time used could not change. We thus kept the same OR utilization. Fourth, we added constraints specifying that nursing ward and intensive care use could not exceed that of the last year.

We used the sensitivity contribution margin per OR hour for the surgeon to have gotten

Statistical Power

We used Fieller’s theorem to calculate the contribution margin per OR hour. The time (5). Each surgeon v

We calculated confidence intervals using a Monte-Carlo simulation. A random number generator from each surgeon’s data was used in the programming described above. The hospital contribution margin per OR hour was calculated in the process was repeated 49

A histogram was drawn of the contribution margin. The results were then used to get 80%, 90%, and 95% confidence intervals

Next, we calculated the sensitivity of the contribution margin per OR hour to changes in the original linear programming and for whom sampling error may have been the cause. Specifically, the sensitivity analysis described in the preceding section gave the largest increase that each surgeon’s contribution margin could take on without affecting the original linear programming solution (4). We compared these values with the differences between (a) the 80%, 90%, or 95% upper confidence bounds of each surgeon’s contribution margin per OR hour from his or her *a posteriori* probability distribution and (b) his or her point estimate of the contribution margin per OR hour.

Using the method of the preceding paragraph, we divided the surgeons into two groups. One group was those for whom sampling error may have led to at least part of his or her cut in OR time. The other group was those for whom this was unlikely. We knew the numbers of cases performed by each surgeon during the 1-yr data period. We compared the numbers of cases performed during the year by surgeons in each of the two groups by using the Mann-Whitney *U*-test (SYSTAT 10.0; SPSS, Inc., Chicago, IL).

Statistical Power Analysis Simulations for Variable Costs

We used Monte-Carlo simulation to calculate confidence intervals on the expected reductions in hospital variable costs. The method we used was just as described previously for contribution margin, except that the linear programming aimed to minimize variable costs rather than maximize contribution margin.

Confidence intervals for the median pairwise differences in each surgeon’s coefficients of variation of contribution margin versus variable costs were calculated with the Hodges-Lehmann method (StatXact-4; Cytel Software Corp., Cambridge, MA).

Results

Figure 1 shows the effect of sampling error in contribution margin per OR hour on the expected increases in contribution margin from changing OR allocations. The 80%, 90%, and 95% confidence intervals for the expected increases in contribution margins were 5.4%–9.7%, 4.8%–10.3%, and 4.3%–10.8%, respectively.

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use” in each surgeon’s contribution margin have been larger for

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gin by use of Monte-Carlo simulation (random-number generator). The linear increase in contribution margin per hour was drawn. The

in hospital contribution margin values were calculated

original linear

**Figure 1:**

Histogram of achievable increases in hospital contribution margins by appropriately allocating operating room time to surgeons. We made the histogram by using 1 yr of hospital financial data.

The upper 80%, 90%, and 95% confidence bounds on the percentages of surgeons for whom sampling error may have led to reductions in OR time were 12%, 18%, and 22%, respectively ([Fig. 2](#)). Those 22% of surgeons had a relatively small volume of cases during the year. The other 78% of surgeons had a mean volume of  $66 \pm 70$  cases

**Figure 2:**

Percentages of surgeons for whom sampling error may have led to reductions in OR time. First, we applied the 95% confidence bound for each surgeon's expected OR time. For example,  $\alpha = 0.05$  percentiles are the 95th percentiles of the programming to find the Linear programming "allowable increase" in the surgeon's contribution margin. We then determined the upper confidence bound for each surgeon's expected OR time. These percentages indicate the proportion of surgeons for whom the expected increase in contribution margin is greater than the upper confidence bound.

**Figure 3** shows the effect of sampling error on uncertainty in expected reductions in variable costs from changes in OR time allocation. The effect of sampling error on uncertainty in expected reductions in variable costs was less than the effect of sampling error on uncertainty in the expected increases in contribution margin. Each surgeon's coefficient of variation of contribution margin was, on average, higher than his or her coefficient of variation of variable costs. The median difference was 61% (95% confidence interval, 52%–72%;  $n = 98$  surgeons).

**Figure 3:**

Histogram of achievable reductions in hospital variable costs by appropriately allocating operating room time to surgeons. We made the histogram by using 1 yr of hospital financial data.

The effect of sampling error on uncertainty in expected reductions in variable costs was less than the effect of sampling error on uncertainty in the expected increases in contribution margin. Each surgeon's coefficient of variation of contribution margin was, on average, higher than his or her coefficient of variation of variable costs. The median difference was 61% (95% confidence interval, 52%–72%;  $n = 98$  surgeons).

## Discussion

Surgeon's effect on hospital financial performance can be measured by using variable costs per OR hour or contribution margin per OR hour<sup>(1–3)</sup>. Our results show that one year of financial data may not be adequate for making surgeon-specific OR management decisions on the basis of these metrics.

For example, at the hospital studied, allocating OR time on the basis of contribution margin per OR hour would probably increase the overall hospital contribution margin ([Fig. 1](#)). However, the range of the increase in contribution margin was relatively large, indicating that the actual effect on hospital performance can be difficult to determine with the available data. The 95% confidence interval was 4.3% to 10.8%. This range, of approximately 6.6%, translates to approximately US\$2.7 million. A potential increase in contribution margin of 4.3% may be too small in practice to be worth the political cost of changing OR allocations. A 10.8% increase is larger and so may be seen as sufficient. We doubt that there are clear cut-points for what percentage change in overall hospital contribution margin would be "worthwhile."

At the hospital studied, the surgeons who may have been affected by sampling error performed a mean  $\pm$  sd of  $66 \pm 70$  cases during the year, or 1.3 cases per week. Some surgical facilities have a few surgeons on staff, each of whom performs an average of two or more cases per week. Our results suggest that one year of financial data would be adequate for OR management decision making at such unusual facilities. However, most facilities have more than one-quarter of their surgeons on staff who operate infrequently, averaging fewer than one case per week. When OR allocation decisions involve trade-offs among many surgeons, the small-

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volume surgeons cannot be excluded from the decisions because this would essentially mean excluding them from access to OR time.

We make the following recommendation. When OR allocation or hospital policy decision making will be made with one year of surgeon-specific financial data, and some surgeons performed fewer than an average of two cases per week, give confidence intervals along with the point estimates in hospital reports. Our Methods section shows how to do this. Currently, our work is in progress. Currently does this decisional planning.

Although one fiscal year is more than one year, practice change. In that such various sources of error. We intend managerial accounting

Hospitals with fixed and such as the allocation of per OR hour were less than interval for the reduction than the width of 6.6% per OR hour, one year of financial calculations of confidence

### Comparison to Real

Much more data are needed. Several years of data may hospitals create reports that these results are misleading

### Limitations

We performed the analyses using surgeon-specific hospital accounting data. However, additional *a priori* knowledge may be available about a surgeon’s financial performance that could be used to make confidence intervals narrower. For example, specialty-specific national averages may be useful. Alternatively, data from one large-volume surgeon of a specialty could be extrapolated to provide insight into the financial performance of a small-volume surgeon of the same specialty. These so-called Bayesian methods could be studied in the future.

Our work applies to hospitals with limited hours of OR time available for elective cases. An example of this is a hospital at which a surgeon allocated eight hours of block time on Wednesdays can book only eight hours of elective cases that day. At some other hospitals, the surgeons and patients can schedule their elective cases on whatever future workday they choose <sup>(7–9)</sup>. Then our results would not apply. The linear programming method that we used assumes that there are fixed hours of OR time.

Our results also do not apply to hospitals that perform all elective cases within a “reasonable” (not decided by the surgeon) number of days <sup>(6,10)</sup>. At such hospitals, the objectives in OR management are to maximize OR efficiency, maximize staff productivity, and minimize staffing costs. In such circumstances, comparing surgeons’ financial performance is unlikely to change OR managers’ decision making.

### Conclusions

OR managers can use hospital accounting data for management decision making. The data can also be used to allocate OR block time <sup>(1,2)</sup>. Still, even when a full fiscal year of data is available, sampling error can significantly affect measured hospital financial performance of surgeons. This depends on how often the surgeon operates at the hospital. Calculation of confidence intervals for key financial variables is appropriate for management decision making.

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