



Impact of surgeon specialty on clinical outcomes following esophagectomy for cancer

Arjun Verma¹ · Joseph Hadaya^{1,2} · Elsa Kronen¹ · Sara Sakowitz¹ · Nikhil Chervu^{1,2} · Syed Shahyan Bakhtiyar^{1,3,4} · Peyman Benharash^{1,4}

Received: 18 May 2023 / Accepted: 12 August 2023 / Published online: 7 September 2023
© The Author(s) 2023

Abstract

Background The impact of surgeon and hospital operative volume on esophagectomy outcomes is well-described; however, studies examining the influence of surgeon specialty remain limited. Therefore, we evaluated the impact of surgeon specialty on short-term outcomes following esophagectomy for cancer.

Methods The 2016–2019 American College of Surgeons National Surgical Quality Improvement Project (ACS NSQIP) was queried to identify all patients undergoing esophagectomy for esophageal cancer. Surgeon specialty was categorized as general (GS) or thoracic (TS). Entropy balancing was used to generate sample weights that adjust for baseline differences between GS and TS patients. Weights were subsequently applied to multivariable linear and logistic regressions, which were used to evaluate the independent association of surgeon specialty with 30-day mortality, complications, and postoperative length of stay.

Results Of 2657 esophagectomies included for analysis, 54.1% were performed by TS. Both groups had similar distributions of age, sex, and body mass index. TS patients more frequently underwent transthoracic esophagectomy, while GS patients more commonly received minimally invasive surgery. After adjustment, surgeon specialty was not associated with altered odds of 30-day mortality (adjusted odds ratio [AOR] 1.10 $p=0.73$) or anastomotic leak (AOR 0.87, $p=0.33$). However, TS patients exhibited a 40-min reduction in operative duration and faced greater odds of perioperative transfusion, relative to GS.

Conclusion Among ACS NSQIP participating centers, surgeon specialty influenced operative duration and blood product utilization, but not mortality and anastomotic leak. Our results support the relative safety of esophagectomy performed by select GS and TS.

Keywords Esophagectomy · Esophageal cancer · Surgeon specialty · ACS NSQIP · Clinical outcomes

Presented at the 18th Annual Academic Surgical Congress in Houston, Texas, February 7–9, 2023.

✉ Peyman Benharash
PBenharash@mednet.ucla.edu

¹ Cardiovascular Outcomes Research Laboratories (CORELAB), University of California, Los Angeles, Los Angeles, CA, USA

² Department of Surgery, University of California, Los Angeles, Los Angeles, CA, USA

³ Department of Surgery, University of Colorado Anschutz Medical Center, Aurora, CO, USA

⁴ Division of Cardiac Surgery, Department of Surgery, University of California, Los Angeles, Los Angeles, CA, USA

Despite incremental refinements in patient selection, surgical technique, and perioperative management, esophagectomy remains a complex operation that is associated with major morbidity in approximately 17% of patients [1]. Patient characteristics linked to mortality and complications have been extensively delineated; however, recent investigations have focused on potentially modifiable factors related to surgical expertise [2–4]. Importantly, a large body of literature has demonstrated case volume to be an acceptable marker of quality, with lower rates of mortality and complications at centers performing a high volume of complex procedures [5, 6].

A less commonly explored facet of expertise is specialized surgical training [7–9]. While it is generally thought that additional training results in superior outcomes, pragmatic issues with access, insurance coverage, and surgeon

availability often preclude the performance of many complex operations exclusively by specialty trained surgeons. In fact, a study by Khoushhal and colleagues demonstrated that over 70% of esophageal resections are performed by general surgeons, with superior outcomes for patients treated by thoracic surgeons [10]. However, the authors examined a dated patient population that may no longer reflect the landscape of esophagectomies in the current era. Contemporary studies examining the pragmatic influence of specialized thoracic surgery training on esophagectomy outcomes are also limited by lack of adjustment for relevant covariates and use of non-robust statistical techniques [10–12].

Therefore, the present study analyzed a large cohort of patients undergoing esophagectomy for cancer and used robust statistical methods to evaluate the association of surgeon specialty with mortality, complications, and postoperative length of stay. We hypothesized similar outcomes between patients managed by thoracic and general surgeons, but significantly different distribution of operative approach.

Methods

This was a retrospective cohort study of the 2016–2019 American College of Surgeons National Surgical Quality Improvement Program (ACS NSQIP) participant use files. The ACS NSQIP and the hospitals participating in the ACS NSQIP are the source of the data used herein; they have not verified and are not responsible for the statistical validity of the data analysis or the conclusions derived by the authors. Given the de-identified nature of the ACS NSQIP, this study was deemed exempt from full review by the Institutional Review Board at the University of California, Los Angeles.

All adults undergoing elective esophagectomy for cancer were identified using relevant *Current Procedural Terminology* codes [13]. Records with missing data for age, sex, race, elective/urgent/emergency status, and surgeon specialty were excluded (< 1%). Surgeon specialty was categorized into general (GS) and thoracic (TS). The ACS NSQIP defines surgeon specialty as the Division/Department of the primary surgeon [12]. It is important to note that this definition is broad and does not provide any information about training history, including type of residency (general surgery/integrated cardiothoracic) or fellowship (minimally invasive surgery, surgical oncology, hepato–pancreato–biliary). Given that only the primary surgeon's specialty is recorded, jointly performed cases could not be separately analyzed.

Demographic and clinical variables were defined using ACS NSQIP-provided data elements and included age, female sex, body mass index, diabetes, hypertension, smoking status, chronic obstructive pulmonary disease (COPD), chronic steroid use, weight loss, pre-existing bleeding disorder, functional status, and American Society

of Anesthesiologists (ASA) Physical Status Classification System [14]. Operation type was stratified into transhiatal and transthoracic, while surgical approach was categorized into open and minimally invasive (laparoscopic, thoracoscopic, and/or robotic assisted). Anastomotic leak, pneumonia, positive margins, and intra/postoperative blood transfusion as well as cardiac (myocardial infarction, cardiac arrest), thromboembolic (deep vein thrombosis and pulmonary embolism), and infectious (tissue/organ infection, pneumonia, urinary tract infection, sepsis, and septic shock) complications were ascertained. The primary endpoint was 30-day mortality, while operative duration, complications, and postoperative length of stay (LOS) were secondarily assessed.

Categorical variables are reported as percentages (%), and continuous variables are reported as medians with interquartile range (IQR). The Pearson's chi-squared and Mann–Whitney *U* tests were used for unadjusted comparisons. We used entropy balancing as the first-line statistical approach to mitigate the influence of significant intergroup differences. Briefly, this reweighting method provides a balanced distribution of covariates and has been shown to be superior to propensity matching [15, 16]. Following application of entropy balancing-derived weights, multivariable logistic and linear regressions were developed to evaluate the association between surgeon specialty and outcomes of interest. As a sensitivity analysis, multivariable logistic and linear regression models were developed without entropy balancing to reassess the association of surgeon specialty with outcomes of interest. Variable selection was performed using elastic net regularization, which combines the Least Absolute Shrinkage and Selection Operator and Ridge regression penalties to reduce bias and increase generalizability [17]. Regression outputs are reported as adjusted odds ratios (AOR) or beta coefficients (β) with 95% confidence intervals (95% CI). Statistical significance was set at an α of 0.05. All statistical analysis was performed using Stata 16.1 (StataCorp, College Station, TX).

Results

Of 2657 esophageal resections included for analysis, 1437 (54.1%) were performed by TS. The proportion of patients managed by TS remained steady over the 4-year study period, at 54.2% in 2016 and 53.9% in 2019 (nptrend=0.79). Patients treated by GS and TS had similar distributions of age (GS: 44.8 vs TS: 44.5 years, $p=0.43$), female sex (17.6 vs 17.4%, $p=0.88$), and BMI (27.7 vs 27.6 kg/m², $p=0.39$). Moreover, both groups had comparable preoperative ASA Physical Status Classification, as shown in Table 1. The incidence of all studied comorbidities, including diabetes, hypertension, and COPD, were equivalent between cohorts,

Table 1 Comparison of baseline characteristics between patients of thoracic (TS) and general (GS) surgeons

Parameter	GS n = 1220	TS n = 1437	p value
Age (years, mean ± SD)	44.8 ± 9.3	44.5 ± 9.1	0.43
Female sex (%)	17.6	17.4	0.88
Body mass index (kg/m ² , mean ± SD)	27.7 ± 5.6	27.6 ± 5.9	0.39
Minimally invasive operation (%)	67.0	47.7	<0.001
Operation type (%)			<0.001
Transthoracic	64.7	89.8	
Transhiatal	35.3	10.2	
ASA class (%)			0.044
I	0.33	0.14	
II	17.8	14.1	
III	74.6	78.6	
IV	7.3	7.2	
Neoadjuvant therapy (%)			
Chemotherapy	68.9	69.0	0.96
Radiation	59.0	56.7	0.23
Clinical T stage (%)			0.055
T0	0.9	0.5	
T1	11.5	9.3	
T2	15.4	15.0	
T3	49.9	49.3	
T4	0.9	2.0	
Unknown	21.4	24.0	
Clinical N stage (%)			0.21
N0	35.4	30.4	
N1	28.0	29.0	
N2	9.1	8.5	
N3	1.0	1.3	
Unknown	26.6	30.8	
Clinical M stage (%)			0.71
M0/Mx	71.1	60.8	
M1	1.0	1.0	
Unknown	28.0	38.2	
Pathology (%)			<0.001
Adenocarcinoma	86.5	82.7	
Dysplasia	1.7	4.0	
Squamous cell carcinoma	8.8	10.8	
Other/unknown	3.0	2.6	
Comorbidities (%)			
Diabetes			0.059
None	82.6	79.3	
No Insulin	10.9	13.9	
Insulin	6.8	6.9	
Hypertension	48.8	48.4	0.86
History of smoking	23.0	27.6	0.008
Chronic obstructive pulmonary disease	7.8	8.0	0.84
Chronic steroid use	1.7	3.1	0.026

Table 1 (continued)

Parameter	GS n = 1220	TS n = 1437	p value
Preoperative weight loss	21.6	21.7	0.96
Metastatic disease	3.4	4.7	0.11
Bleeding disorder	4.0	3.8	0.73

SD standard deviation, ASA American Society of Anesthesiologists

with the notable exception of chronic steroid use, which was higher among TS patients (3.1 vs 1.7%, $p = 0.026$). Neoadjuvant chemotherapy and radiation rates were comparable between groups, as were clinical T, N, and M stage (Table 1). TS patients were more commonly diagnosed with squamous cell carcinoma, and less frequently adenocarcinoma. Of note, TS patients more frequently underwent transthoracic esophagectomy (89.8 vs 64.7%, $p < 0.001$), compared to GS. However, GS patients were more commonly managed using minimally invasive techniques (67.0 vs 47.7%, $p < 0.001$).

Upon unadjusted analysis, GS and TS patients faced similar rates of 30-day mortality (GS: 2.6 vs TS: 3.7%, $p = 0.12$). Moreover, the occurrence of postoperative pneumonia and anastomotic leak were comparable between groups, as were rates of cardiac, thromboembolic, and infectious complications (Table 2). Patients within the GS and TS cohorts had equivalent rates of residual tumor. TS patients more frequently required intra/postoperative blood transfusions (13.7 vs 8.9%, $p < 0.001$) but had shorter mean operative times compared to GS (345 vs 375 min, $p < 0.001$). Postoperative length of stay was equivalent between cohorts.

Application of entropy balancing resulted in comparable distribution of covariates between GS and TS patients (Fig. 1). After adjustment, surgeon specialty was not associated with altered odds of 30-day mortality (AOR 1.10, 95% CI 0.64–1.89) or anastomotic leak (AOR 0.87, 95% CI 0.66–1.15) as well as cardiac, thromboembolic and infectious complications (Table 2). Notably, TS patients had similar odds of developing pneumonia (AOR 0.83, 95% CI 0.64–1.09) and having positive margins (AOR 0.91, 95% CI 0.66–1.26) but faced a 44% increment in relative odds of intra/postoperative transfusion (Table 2). Moreover, thoracic surgical specialty was associated with a 40-min reduction in operative duration (95% CI – 51, – 28), with GS as reference. Surgeon specialty was not associated with postoperative LOS.

Following multivariable modeling without application of entropy balancing weights, surgeon specialty remained unassociated with 30-day mortality (AOR 1.21, 95% CI 0.74–1.98). Additional factors associated with mortality included increasing age (AOR 1.06/year, 95% CI 1.03–1.09) and ASA Class IV (AOR 3.86, 95% CI 1.29–11.47, ref Class II). The area under the receiver

Table 2 Unadjusted and risk-adjusted comparison of outcomes between thoracic (TS) and general (GS) surgeons

Outcome	GS <i>n</i> = 1220	TS <i>n</i> = 1437	<i>p</i> value	AOR/ β	95% CI	<i>p</i> value
30-Day mortality (% , AOR)	2.6	3.7	0.12	1.10	0.64–1.89	0.73
Pneumonia (% , AOR)	12.9	13.6	0.60	0.83	0.64–1.09	0.19
Anastomotic leak (% , AOR)	13.3	12.5	0.53	0.87	0.66–1.15	0.33
Cardiac complication (% , AOR)	2.8	2.5	0.83	1.01	0.57–1.82	0.94
Thromboembolic complication (% , AOR)	3.9	4.1	0.82	0.93	0.59–1.48	0.77
Infectious complication (% , AOR)	26.7	27.0	0.87	0.84	0.69–1.03	0.099
Positive margins (% , AOR)	7.9	8.1	0.85	0.91	0.66–1.26	0.58
Intra/postoperative transfusion (% , AOR)	8.9	13.7	<0.001	1.44	1.05–1.96	<0.001
Operative duration (minutes, mean \pm SD, β)	375 \pm 136	345 \pm 124	<0.001	– 40	– 51, – 28	<0.001
Postoperative LOS (days, mean \pm SD, β)	11.3 \pm 8.5	11.6 \pm 8.7	0.32	– 0.5	– 1.4, 0.4	0.24

Risk-adjustment was performed using entropy balancing

LOS length of stay, CI confidence interval, SD standard deviation, AOR adjusted odds ratio, β β -coefficient

operating characteristic curve and reliability plot for this model are shown in Fig. 2. Furthermore, relative to GS, TS continued to display no association with the likelihood of anastomotic leak, pneumonia, and positive margins, as well as cardiac, thromboembolic, and infectious complications. However, patients managed by TS had greater odds of intra/postoperative transfusion (AOR 1.44, 95% CI 1.09–1.90) and faced shorter operation times, with an average reduction of 41 min (95% CI – 50, – 32).

Discussion

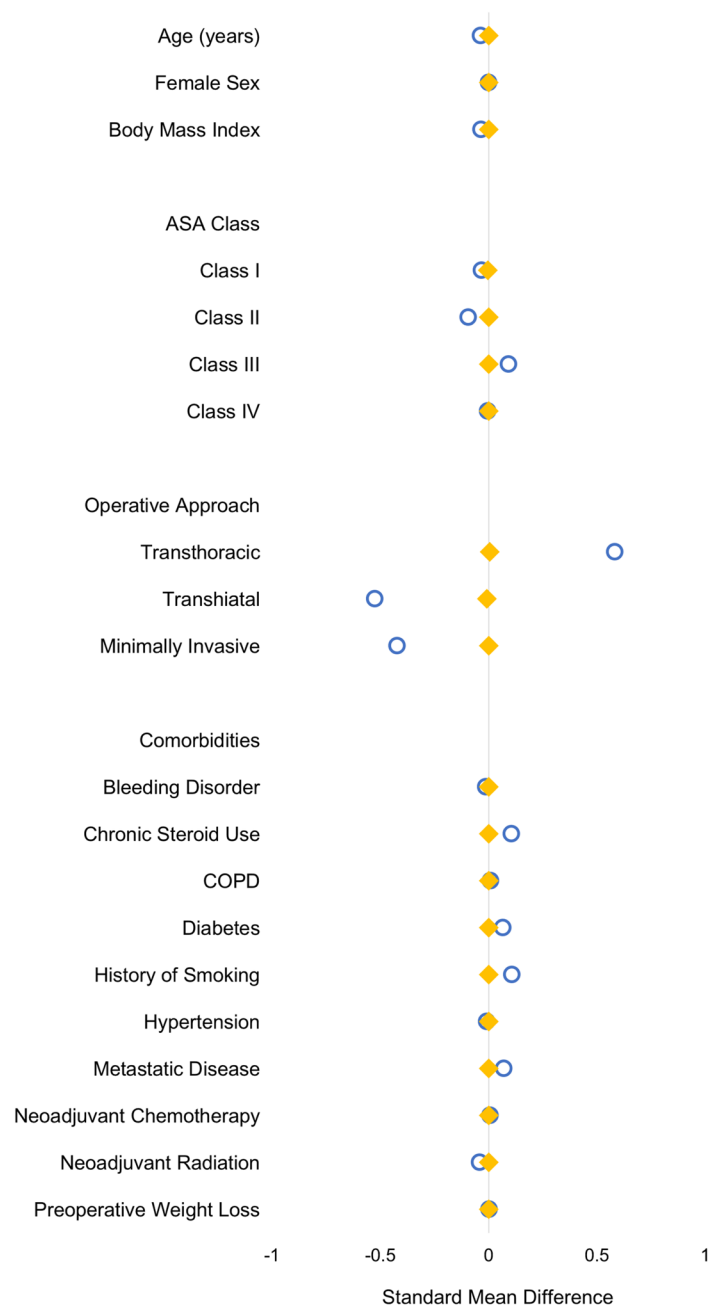
Esophagectomy for primary esophageal malignancy remains a complex operation requiring expertise in both thoracic and foregut surgery. In the present study, we assessed whether short-term clinical outcomes following esophagectomy were associated with surgeon specialty. Following adjustment for relevant confounders, we found no significant difference in 30-day mortality and most complications between general and thoracic surgeons. Of note, thoracic surgeons more commonly employed transthoracic approaches and had shorter operative times, while general surgeons more frequently used minimally invasive techniques and less often required intra/postoperative blood transfusion. Several of our findings warrant further discussion.

In the United States, esophagectomy is performed by thoracic and general surgeons, with practice patterns varying across regions, healthcare networks, and institutions. Thoracic surgeons most commonly receive dedicated training in the management of esophageal cancer through cardiothoracic surgery fellowships, while general surgeons can obtain greater expertise in esophageal malignancies through surgical oncology or minimally invasive surgery programs.

Congruent with prior reports, we found that general and thoracic surgeons had equivalent rates of mortality and most complications [11, 12, 18]. This observation is likely related to appropriate case selection by surgeons in both specialties. Indeed, our sample represents cases performed at ACS NSQIP-participating hospitals, which may have general surgeons that are more experienced compared to those at non-NSQIP participating facilities [19]. Similarly, given that the majority of deaths following major operations occur in the postoperative phase, it is plausible that institution-specific care pathways allow for improved care and lower failure-to-rescue rates, thereby mitigating the influence of surgeon specialty on short-term outcomes [6, 11, 20–22]. Importantly, we could not surmise whether the general surgeons in our study had specialized training (e.g., surgical oncology or minimally invasive surgery). In addition, we were unable to evaluate the influence of surgeon specialty on overall and tumor-free survival. As such, further study with granular, longitudinal data is required to further verify the safety of select general surgeons performing esophagectomy.

As expected, thoracic surgeons more commonly performed transthoracic esophagectomies, relative to general surgeons. The increased utilization of Ivor-Lewis and McKeown esophagectomy by thoracic surgeons likely reflects greater familiarity and training in chest surgery. Of note, most contemporary studies have reported comparable outcomes between transhiatal and transthoracic esophagectomy, leaving the choice of surgical approach highly dependent on surgeon, institution, patient, and tumor characteristics [23–25]. Efforts to identify the most appropriate surgical and medical care for each patient, such as multidisciplinary tumor boards, should be pursued at hospitals which have both general and thoracic surgeons performing esophagectomy.

Fig. 1 Distribution of patient and operative characteristics before and after entropy balancing. Blue represents pre-balancing and yellow represents post-balancing (Color figure online)



Consistent with a prior report by Hsu et al., we found that operative duration was shorter among TS patients [12]. This observation is most attributable to inherent differences in practice settings of thoracic and general surgeons, wherein thoracic surgeons may have relatively greater esophagectomy volume than their general surgery counterparts. This hypothesis could not be tested within the ACS NSQIP due to the lack of surgeon identifiers. Similarly, altered transfusion rates between cohorts may reflect variations in blood product utilization practices acquired through different training settings or the presence of department/division specific transfusion protocols. In

an analysis of over 7000 patients undergoing esophagectomy, Towe et al. found significant variation in transfusion practices across centers in the United States and attributed their findings to the presence of standardized protocols, surgeon-specific training histories, and center-level differences in operative volume [26]. Several studies have emphasized the relevance of surgeon and hospital volume on patient outcomes [5, 6, 11, 20–22]. For instance, Munasinghe et al. highlighted the clinical and financial benefits of centralizing esophagectomy care in the United States [27]. However, centralization may have significant detrimental effects, including reduced access to care and

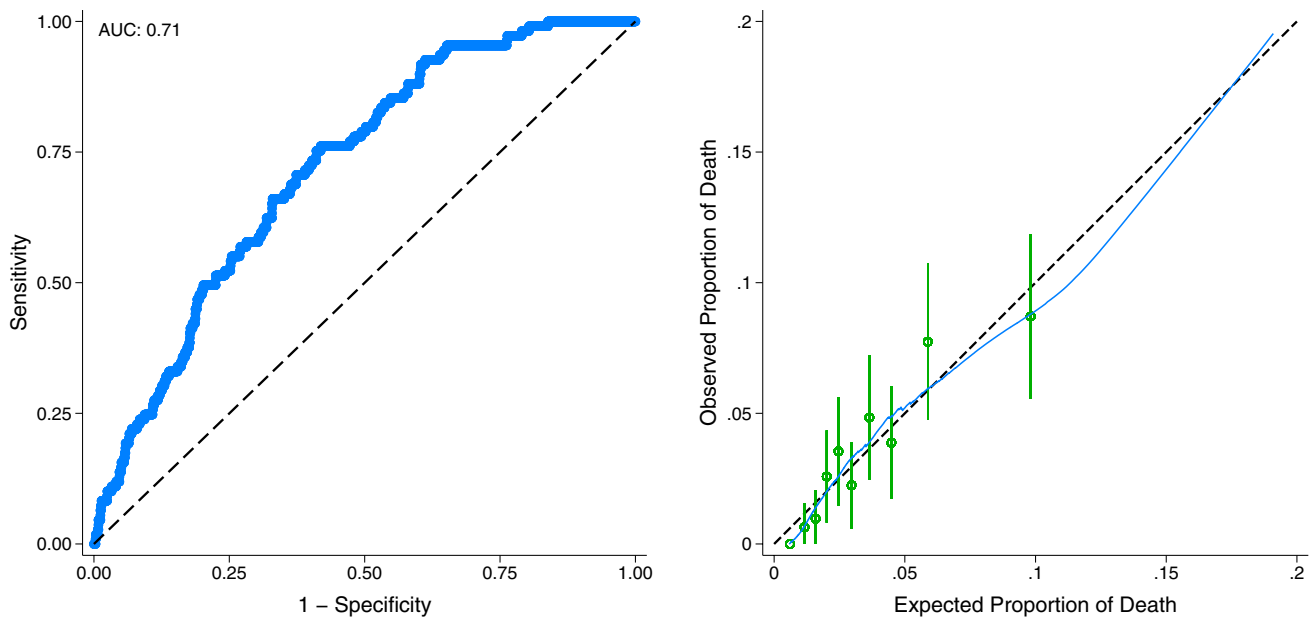


Fig. 2 Area under the receiver operating characteristic curve and reliability plot of the multivariable model to predict 30-day mortality

longer intervals between diagnosis and surgery for socio-economically disadvantaged patients [23, 28, 29]. While our results may not be generalizable to non-NSQIP-participating centers, they suggest the relative safety of esophageal resections performed by adequately trained surgeons in both specialties. By increasing the pool of surgeons performing this operation, there will undoubtedly be marked increases in access to care for underserved communities.

The present work has several important limitations inherent to its retrospective design. Of note, the ACS NSQIP is derived from patient data collected at select, high volume, teaching hospitals. Therefore, our results are not generalizable to all centers in the country, where surgeon-specific differences in training, operative experience, and outcomes may exist. Additionally, granular information about training history, including completion of an integrated cardiothoracic surgery, surgical oncology or minimally invasive surgery program, is not available. Certain clinical characteristics were not available for analysis, including location of the tumor, type of transthoracic esophagectomy (Ivor Lewis/McKeown), and route of alimentary tract reconstruction. Finally, the ACS NSQIP does not record long-term patient outcomes, and thus, we were unable to study the influence of surgeon specialty on oncologic outcomes and long-term survival.

In summary, the present study analyzed a large sample of patients undergoing esophagectomy for cancer and found that surgeon specialty was not associated with 30-day mortality or most complications. Our results support the relative safety of esophagectomy performed by select general and thoracic surgeons and demonstrate the

relevance of surgeon-specific analysis to improve quality of care.

Acknowledgements None.

Declarations

Disclosures Authors Arjun Verma, Joseph Hadaya, Elsa Kronen, Sara Sakowitz, Nikhil Chervu, Syed Shahyan Bakhtiyar and Peyman Benharash have no conflicts of interest or financial ties to disclose.

Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons licence and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit <http://creativecommons.org/licenses/by/4.0/>.

References

1. Low DE, Kuppusamy MK, Alderson D, Ceconello I, Chang AC, Darling G, Davies A, D'Journo XB, Gisbertz SS, Griffin SM, Hardwick R, Hoelscher A, Hofstetter W, Jobe B, Kitagawa Y, Law S, Mariette C, Maynard N, Morse CR, Nafteux P, Pera M, Pramesh CS, Puig S, Reynolds JV, Schroeder W, Smithers M, Wijnhoven BPL (2019) Benchmarking complications associated with esophagectomy. *Ann Surg* 269:291. <https://doi.org/10.1097/SLA.0000000000002611>

2. Zingg U, Smithers BM, Gotley DC, Smith G, Aly A, Clough A, Esterman AJ, Jamieson GG, Watson DI (2011) Factors associated with postoperative pulmonary morbidity after esophagectomy for cancer. *Ann Surg Oncol* 18:1460–1468. <https://doi.org/10.1245/s10434-010-1474-5>
3. Hagens ERC, Reijntjes MA, Anderegg MCJ, Eshuis WJ, van Berge Henegouwen MI, Gisbertz SS (2021) Risk factors and consequences of anastomotic leakage after esophagectomy for cancer. *Ann Thorac Surg* 112:255–263. <https://doi.org/10.1016/j.athoracsur.2020.08.022>
4. Hall BR, Flores LE, Parshall ZS, Shostrom VK, Are C, Reames BN (2019) Risk factors for anastomotic leak after esophagectomy for cancer: a NSQIP procedure-targeted analysis. *J Surg Oncol* 120:661–669. <https://doi.org/10.1002/jso.25613>
5. Chang AC, Birkmeyer JD (2006) The volume–performance relationship in esophagectomy. *Thorac Cardiovasc Surg* 16:87–94. <https://doi.org/10.1016/j.thorsurg.2006.01.008>
6. Gandjian M, Williamson C, Sanaiha Y, Hadaya J, Tran Z, Kim ST, Revels S, Benharash P (2022) Continued relevance of minimum volume standards for elective esophagectomy: a national perspective. *Ann Thorac Surg* 114:426–433. <https://doi.org/10.1016/j.athoracsur.2021.07.061>
7. von Meyenfeldt EM, Gooiker GA, van Gijn W, Post PN, van de Velde CJH, Tollenaar RAEM, Klomp HM, Wouters MWJM (2012) The relationship between volume or surgeon specialty and outcome in the surgical treatment of lung cancer: a systematic review and meta-analysis. *J Thorac Oncol* 7:1170–1178. <https://doi.org/10.1097/JTO.0b013e318257cc45>
8. Tu JV, Austin PC, Johnston KW (2001) The influence of surgical specialty training on the outcomes of elective abdominal aortic aneurysm surgery. *J Vasc Surg* 33:447–452. <https://doi.org/10.1067/mva.2001.113487>
9. Osagiede O, Haehn DA, Spaulding AC, Otto N, Cochuyt JJ, Lemini R, Merchea A, Kelley S, Colibaseanu DT (2021) Influence of surgeon specialty and volume on the utilization of minimally invasive surgery and outcomes for colorectal cancer: a retrospective review. *Surg Endosc* 35:5480–5488. <https://doi.org/10.1007/s00464-020-08039-9>
10. Khoushhal Z, Canner J, Schneider E, Stem M, Haut E, Mungo B, Lidor A, Molena D (2016) Influence of specialty training and trainee involvement on perioperative outcomes of esophagectomy. *Ann Thorac Surg* 102:1829–1836. <https://doi.org/10.1016/j.athoracsur.2016.06.025>
11. Smith BR, Hinojosa MW, Reavis KM, Nguyen NT (2008) Outcomes of esophagectomy according to surgeon’s training: general vs thoracic. *J Gastrointest Surg* 12:1907–1911. <https://doi.org/10.1007/s11605-008-0664-y>
12. Hsu DS, Ely S, Gologorsky RC, Rothenberg KA, Banks KC, Dominguez DA, Chang C-K, Velotta JB (2021) Comparable esophagectomy outcomes by surgeon specialty: a NSQIP analysis. *Am Surg*. <https://doi.org/10.1177/00031348211065117>
13. Chang AC, Ji H, Birkmeyer NJ, Orringer MB, Birkmeyer JD (2008) Outcomes after transhiatal and transthoracic esophagectomy for cancer. *Ann Thorac Surg* 85:424–429. <https://doi.org/10.1016/j.athoracsur.2007.10.007>
14. American College of Surgeons (2023) ACS NSQIP participant use data file. <https://www.facs.org/quality-programs/data-and-registries/acs-nsqip/participant-use-data-file/>. Accessed 4 Feb 2023
15. Parish WJ, Keyes V, Beadles C, Kandilov A (2018) Using entropy balancing to strengthen an observational cohort study design: lessons learned from an evaluation of a complex multi-state federal demonstration. *Health Serv Outcomes Res Method* 18:17–46. <https://doi.org/10.1007/s10742-017-0174-z>
16. Zhao Q, Percival D (2017) Entropy balancing is doubly robust. *J Causal Inference*. <https://doi.org/10.1515/jci-2016-0010>
17. Zou H, Hastie T (2005) Regularization and variable selection via the elastic net. *J R Stat Soc B* 67:301–320. <https://doi.org/10.1111/j.1467-9868.2005.00503.x>
18. Ely S, Rothenberg KA, Gologorsky RC, Dominguez DA, Chang CK, Velotta JB (2019) Differences in NSQIP esophagectomy outcomes by surgeon specialty. *J Am Coll Surg* 229:S276. <https://doi.org/10.1016/j.jamcollsurg.2019.08.606>
19. Sheils CR, Dahlke AR, Yang A, Bilimoria K (2016) Are NSQIP hospitals unique? A description of hospitals participating in ACS NSQIP. Academic Surgical Congress Abstracts Archive
20. Abdelsattar ZM, Habermann E, Borah BJ, Moriarty JP, Rojas RL, Blackmon SH (2020) Understanding failure to rescue after esophagectomy in the United States. *Ann Thorac Surg* 109:865–871. <https://doi.org/10.1016/j.athoracsur.2019.09.044>
21. Arlow RL, Moore DF, Chen C, Langenfeld J, August DA (2014) Outcome–volume relationships and transhiatal esophagectomy: minimizing failure to rescue. *Ann Surg Innov Res* 8:9. <https://doi.org/10.1186/s13022-014-0009-3>
22. Ghaferi AA, Birkmeyer JD, Dimick JB (2011) Hospital volume and failure to rescue with high-risk surgery. *Med Care* 49:1076–1081
23. Schlottmann F, Strassle PD, Patti MG (2017) Transhiatal vs. transthoracic esophagectomy: a NSQIP analysis of postoperative outcomes and risk factors for morbidity. *J Gastrointest Surg* 21:1757–1763. <https://doi.org/10.1007/s11605-017-3572-1>
24. Junttila A, Helminen O, Helmiö M, Huhta H, Kallio R, Koivukangas V, Kokkola A, Laine S, Lietzen E, Meriläinen S, Pohjanen V-M, Rantanen T, Ristimäki A, Räsänen JV, Saarnio J, Sihvo E, Toikkanen V, Tyrväinen T, Valtola A, Kauppila JH, The FINEGO Group (2022) Long-term survival after transhiatal versus transthoracic esophagectomy: a population-based nationwide study in Finland. *Ann Surg Oncol* 29:8158–8167. <https://doi.org/10.1245/s10434-022-12349-8>
25. Soltani E, Mahmoodzadeh H, Jabbari Nooghabi A, Jabbari Nooghabi M, Ravankhah Moghaddam K, Hassanzadeh Haddad E (2022) Transhiatal versus transthoracic esophagectomy for esophageal SCC: outcomes and complications. *J Cardiothorac Surg* 17:150. <https://doi.org/10.1186/s13019-022-01912-9>
26. Towe CW, Gulack BC, Kim S, Ho VP, Perry Y, Donahue JM, Linden PA (2018) Restrictive transfusion practices after esophagectomy are associated with improved outcome: a review of the society of thoracic surgeons general thoracic database. *Ann Surg* 267:886. <https://doi.org/10.1097/SLA.0000000000002231>
27. Munasinghe A, Markar SR, Mamidanna R, Darzi AW, Faiz OD, Hanna GB, Low DE (2015) Is it time to centralize high-risk cancer care in the United States? comparison of outcomes of esophagectomy between England and the United States. *Ann Surg* 262:79. <https://doi.org/10.1097/SLA.0000000000000805>
28. Chang AC (2018) Centralizing esophagectomy to improve outcomes and enhance clinical research: invited expert review. *Ann Thorac Surg* 106:916–923. <https://doi.org/10.1016/j.athoracsur.2018.04.004>
29. Stitzenberg KB, Sigurdson ER, Egleston BL, Starkey RB, Meropol NJ (2009) Centralization of cancer surgery: implications for patient access to optimal care. *J Clin Oncol* 27:4671–4678. <https://doi.org/10.1200/JCO.2008.20.1715>

Publisher's Note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.