Postoperative complications of endovascular blunt thoracic aortic injury repair

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ABSTRACT

Background Thoracic endovascular aortic repair (TEVAR) has become the standard of care for thoracic aortic aneurysms and increasingly for blunt thoracic aortic injury (BTAI). Postoperative complications, including spinal cord ischemia and paraplegia, have been shown to be less common with elective TEVAR than with open thoracic or thoracoabdominal repair. Although small cohort studies exist, the postoperative complications of endovascular repair of traumatic aortic injury have not been described through large data set analysis.

Methods A retrospective cohort analysis was performed of the American College of Surgeons Trauma Quality Improvement Program registry spanning from 2007 to 2017. All patients with BTAI who underwent TEVAR, as indicated by the Abbreviated Injury Scale or the International Classification of Diseases (ICD-9 or ICD-10), were included. Categorical data were presented as proportions and continuous data as mean and SD. OR was calculated for each postoperative complication.

Results 2990 patients were identified as having undergone TEVAR for BTAI. The postoperative incidence of stroke was 2.8% (83), and 4.7% (140) of patients suffered acute kidney injury or renal failure. The incidence of spinal cord ischemia was 1.9% (58), whereas 0.2% (7) of patients suffered complete paraplegia. Renal events and stroke were found to occur significantly more frequently in those undergoing TEVAR (OR 1.758, 95% CI 1.449–2.134 and OR 2.489, 1.917–3.232, respectively). Notably, there was no difference between TEVAR and non-operative BTAI incidences of spinal cord ischemia or paraplegia (OR 1.061, 0.799–1.409 and OR 1.698, 0.728–3.961, respectively).

Discussion Postoperative intensive care unit care of patients after BTAI has historically focused on awareness of spinal cord ischemia. Our analysis suggests that after endovascular repair of blunt aortic trauma, care should involve vigilance primarily against postoperative cerebrovascular and renal events. Further study is warranted to develop guidelines for the intensivist managing patients after TEVAR for BTAI.

Level of evidence Level III.

INTRODUCTION

Blunt thoracic aortic injury (BTAI) is a rare, although potentially catastrophic, injury which occurs in <0.5% of trauma patients reaching the hospital.1 Historically, aortography has been considered the diagnostic standard, although transesophageal echo and CT have been used as these technologies appeared. Management had, until recent decades, relied on an open approach that was associated with high rates of mortality and paraplegia.2 The diagnosis and management of thoracic aortic injury have been revolutionized by the ready availability of CT arteriography and thoracic endovascular aortic repair (TEVAR).3 4 TEVAR, most frequently used for repair of thoracic aortic aneurysm, is not free of complications. Initially, these consisted primarily of device-related problems; as technology has been refined, these issues have become more uncommon.1 A persistent concern has been spinal cord ischemia (SCI) and consequent neurological morbidity including paraplegia. Although this is common to both open and endovascular repair, the mechanisms responsible are different: open repair involves prolonged aortic clamping and intraoperative lack of spinal cord perfusion, whereas TEVAR involves permanent coverage of the vessels perfusing the spinal cord. These include the segmental medullary arteries, including the artery of Adamkiewicz, as well as the anterior spinal artery arising from the vertebral artery.

The latter is of theoretic relevance to trauma TEVAR in particular; the most common location of BTAI is at the ligamentum arteriosum, and repair frequently entails coverage of the origin of the left subclavian artery. Perfusion of the upper extremity relies on retrograde flow from the contralateral to the ipsilateral vertebral artery, reducing perfusion pressure of the anterior spinal artery that lies between and is fed by both. Regardless, initial studies indicated a reduced incidence of SCI with endovascular repair compared with open.5

The use of TEVAR has increased dramatically during the last decade, and its proliferation may be due to a lowered threshold for treatment of BTAI as a result of the perceived reduced morbidity of repair.6 The actual incidence and type of complication associated with TEVAR for BTAI remain unclear; although small cohort studies exist, large data set analysis has not as yet been performed.7–11 The aim of this study is to use a large national data set to delineate the modern morbidity of TEVAR in the setting of BTAI and the associated outcomes.
clinical information from over 850 participating hospitals. All participating hospitals are designated trauma centers, with most being level I or II. The data set includes demographic characteristics; clinical variables including vital signs; injury organ, region, type, and severity; therapeutic type and timing; and complications during hospitalization. Database access is granted by the ACS for selected research projects and for a fee. The stated purpose of the TQIP registry is to enable real-time data analysis and identification of areas for improvement of trauma care.

**TEVAR overview**

TEVAR is typically performed in a hybrid operating room with fixed-imaging capability. On occasion, if circumstances require, the repair is performed in a non-hybrid operating room with a portable fluoroscopy unit. This standard has not changed during the study interval. In most institutions, TEVAR is performed by vascular surgeons; it requires both endovascular skill and an ability to perform open vascular surgery if necessary. This is usually done by vascular surgery on consultation by the primary trauma team. At certain trauma specialty centers, such as ours, trauma TEVAR is performed by surgeons with dual training in trauma and vascular surgery whose practice focuses on vascular and endovascular trauma surgery.

**Data extraction**

Patients who sustained a BTAI were identified using Abbreviated Injury Scale (AIS) codes (4202XXX) and International Classification of Diseases (ICD-9) codes (901). Of those identified as having sustained a BTAI, patients who underwent TEVAR were identified using ICD-9 code 93.73 and ICD-10 code 02VW3DZ. All patients who met these criteria were included. Region-specific AIS scores were not used as inclusion criteria.

Data extracted from the database included demographics, vitals, injury pattern, Injury Severity Score (ISS), complications, and mortality.

**Analysis**

Data queried from TQIP were stored locally and analyzed using IBM SPSS Statistics V.26.0 (SPSS, Chicago, IL). Categorical data were presented as proportions and continuous data as mean and SD. An OR with 95% CI was calculated for each complication.

**RESULTS**

**Demography, injury pattern, and hemodynamic data**

There were 2990 patients identified as having undergone TEVAR for BTAI. The mean time to TEVAR was 1.88 days (±4.3), with 2546 (85.2%) procedures being performed within 2 days of hospital presentation. Of the patients, 2220 (74.0%) were male, with an average age of 42.5 years (±18.8). The mechanism of injury was motor vehicle collision in 2078 (69.5%) of the reported cases. The mean systolic blood pressure (SBP) on arrival was reported for 2110 patients, with a mean of 122 mm Hg (±29.5); 266 (12.6%) patients presented with SBP <90 mm Hg. ISS was reported for 2566 patients, with a mean value of 34.7 (±12.5), with 2477 (96.5%) having an ISS >16. Of the patients, 2537 (84.8%) required intensive care unit (ICU) admission. Demographic and injury data are summarized in table 1.

**Complications and outcomes**

The postoperative complications with the highest incidence were acute kidney injury (AKI)/acute renal failure (ARF) and stroke with 140 (4.7%) and 83 (2.8%) cases, respectively. Notably, 33 of the 83 (39.8%) patients who suffered stroke had an associated Blunt Cerebrovascular Injury (BCVI). These were followed by SCI (58, 1.9%), surgical site infection (56, 1.8%), and unplanned return to the operating room (47, 1.6%). Myocardial infarction (MI) occurred in 16 (0.5%) of these patients. Notably, only 7 (0.2%) patients suffered paraplegia. A full list of complications is presented in table 2.

To assess the management of SCI and paraplegia, data on carotid subclavian bypass and lumbar drain placement were abstracted from TQIP. Of the patients with TEVAR, 80 (2.7%) underwent carotid subclavian bypass and 49 (1.6%) underwent lumbar drain placement. Of the carotid subclavian bypasses performed, 61 (76.3%) were performed the same day as TEVAR. Seventeen (34.7%) lumbar drains were performed simultaneously with TEVAR.

When compared with BTAI patients who did not undergo TEVAR, several complications were found to occur more frequently in the TEVAR group, including AKI/ARF (1.758, 1.449–2.134), stroke (2.489, 1.917–3.232), unplanned return to the operating room (1.578, 1.139–1.186), and coma (2.605, 1.061–6.395). Notably, there was no difference between TEVAR and non-operative BTAI incidences of SCI (1.061, 0.799–1.409), paraplegia (1.698, 0.728–3.961), and MI (1.541, 0.885–2.683). Table 3 presents the OR for all complications examined.

| Table 1 Patient demographics |
|-----------------------------|
| Parameter               | Mean or proportion |
| Demographics             |                   |
| Male, n (%)             | 2220 (74.0)       |
| Age, mean (SD)          | 42.5 (18.8)       |
| Race, n (%)             |                   |
| Caucasian               | 2058 (68.8)       |
| African American        | 445 (14.9)        |
| Asian                   | 42 (1.4)          |
| Other                   | 445 (14.9)        |
| Mechanism, n (%)        |                   |
| MVC                     | 2078 (69.5)       |
| MCC                     | 343 (11.5)        |
| Pedestrian struck       | 255 (8.6)         |
| Fall                    | 194 (6.5)         |
| Other                   | 120 (4.0)         |
| Injury data             |                   |
| ISS, mean (SD)          | 34.7 (12.5)       |
| ISS >16, n (%)          | 2477 (96.5)       |
| Admission physiology    |                   |
| HR, mean (SD)           | 102 (24.3)        |
| RR, mean (SD)           | 21 (6.7)          |
| Temperature (°C), mean (SD) | 36 (2.1)       |
| GCS, mean (SD)          | 11.2 (5.1)        |
| SBP (mm Hg), mean (SD)  | 122 (29.5)        |
| SBP <90 (mm Hg), n (%)  | 266 (12.6)        |
| Other                   |                   |
| Hospital LOS, n (SD)    | 18.9 (17.9)       |
| ICU LOS, n (SD)         | 12.2 (11.7)       |
| ICU admission, n (%)    | 2537 (84.8)       |

GCS, Glasgow Coma Scale; HR, heart rate; ICU, intensive care unit; ISS, Injury Severity Score; LOS, length of stay; MCC, Motor Cycle Collision; MVC, motor vehicle collision; RR, respiratory rate.
However, this devastating complication persists and paraplegia rates of 3% to 9% in those undergoing open repair, with previous large studies reporting evidence of SCI and paraplegia as compared with patients who underwent TEVAR were not vigilance primarily against postoperative cerebrovascular and renal events. Interestingly, patients undergoing TEVAR were not substantial efforts are made to prevent it. The data presented here suggest that after TEVAR for BTAI, care should involve prioritization against postoperative cerebrovascular and renal events. Interestingly, patients undergoing TEVAR were not demonstrated to be at increased risk of SCI or paraplegia when compared with all patients diagnosed with BTAI, suggesting that their incidence may reflect the injury itself, rather than its repair.

This finding may be a reflection of improved procedural technique as well as postoperative diligence on the part of the surgeon and critical care provider. Preventive carotid subclavian bypass or lumbar drain placement may also play a role in the reduced rate of SCI and paraplegia, as reflected by the frequency with which these procedures were performed on the same day as the index operation.

Given its large sample size, TQIP enables robust evaluation of infrequent events. Our analysis confirmed the rarity of postoperative SCI and paraplegia. Previous studies evaluating TEVAR for BTAI used data sets an order of magnitude smaller than TQIP and have over-represented the true incidence. TQIP’s sheer size allows an assessment of the current morbidity of TEVAR in the setting of BTAI that is arguably the most accurate to date.

Our data suggest room for improvement in the rates of postoperative AKI and neurological adverse events, but this will require collaboration between the surgeon and the critical care provider.

Intraoperatively, surgeons must maintain strict wire discipline near the great vessels and be mindful of contrast load during trauma TEVAR. Consideration should be given to heparinization and its appropriateness given the patient’s full injury profile. Critical care providers who manage these patients postoperatively must be aware of these potential complications and the intraoperative and postoperative factors that may contribute to their development. Improvement in the incidence of these complications has potential for substantial benefit, given the known increase in morbidity and mortality associated with these conditions.

Evidence suggests that, in the absence of effective treatment of renal injury, an emphasis on early recognition and management of renal injury is the optimal approach to this problem. Frequently, a failure to recognize AKI commonly results in a delay of care. We hope that the data presented here bring attention to the importance of vigilance against incipient AKI and early intervention in patients who undergo TEVAR for trauma. Several risk scores and high-prediction models can aid in identifying patients who are most at risk. Some of these scores are targeted for patients who have undergone surgery or been exposed to large amounts of contrast, but none specific to trauma patients. Early nephrology consult has also been demonstrated to be helpful in preventing and managing AKI and ARF, particularly in the ICU setting. A collaborative team may be especially useful in the context of a patient with complex, multiple injuries.

This study offers important insight into the morbidities of TEVAR for BTAI and differences from elective aneurysm repair. It is important to note the inherent limitations of this retrospective study, including the potential for selection bias and the reliance on data accuracy. Although the TQIP database is a prospective study, including the potential for selection bias and the inherent risk of missing and miscoded data when they are exposed, large amounts of contrast, but none specific to trauma patients. Early nephrology consult has also been demonstrated to be helpful in preventing and managing AKI and ARF, particularly in the ICU setting. A collaborative team may be especially useful in the context of a patient with complex, multiple injuries.

CONCLUSIONS

Our data suggest that the highly morbid postoperative complications associated with endovascular thoracic aortic aneurysm repair—SCI and paraplegia—are less prevalent when TEVAR is not required. The data presented here offer an opportunity for further study and improving outcomes for patients undergoing trauma TEVAR.

### DISCUSSION

Postoperative ICU care of patients who have undergone TEVAR for BTAI has historically focused on awareness of SCI to prevent paraplegia. The advent of TEVAR itself has reduced the incidence of SCI and paraplegia as compared with patients who underwent open repair, with previous large studies reporting paraplegia rates of 3% to 9% in those undergoing open repair. However, this devastating complication persists and substantial efforts are made to prevent it. The data presented here suggest that after TEVAR for BTAI, care should involve vigilance primarily against postoperative cerebrovascular and renal events. Interestingly, patients undergoing TEVAR were not found to be at increased risk of SCI or paraplegia when compared with all patients diagnosed with BTAI, suggesting that their incidence may reflect the injury itself, rather than its repair.

This finding may be a reflection of improved procedural technique as well as postoperative diligence on the part of the surgeon and critical care provider. Preventive carotid subclavian bypass or lumbar drain placement may also play a role in the reduced rate of SCI and paraplegia, as reflected by the frequency with which these procedures were performed on the same day as the index operation.

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This study offers important insight into the morbidities of TEVAR for BTAI and differences from elective aneurysm repair. It is important to note the inherent limitations of this retrospective study, including the potential for selection bias and the reliance on data accuracy. Although the TQIP database is a high-quality information archive maintained by the ACS, there is the inherent risk of missing and miscoded data when they are entered by innumerable institutions and their staff. Furthermore, the relative lack of granularity that comes with a database of this size can limit more indepth evaluation.

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**Table 2** Incidence of complications in patients undergoing thoracic endovascular aortic repair after blunt thoracic aortic injury

| Complication                                      | n (%)   |
|---------------------------------------------------|---------|
| Acute kidney injury/acute renal failure           | 140 (4.7) |
| Stroke                                            | 83 (2.8) |
| Spinal cord ischemia                              | 58 (1.9) |
| Surgical site infection                           | 56 (1.8) |
| Unplanned return to the operating room            | 47 (1.6) |
| Bleeding                                          | 44 (1.5) |
| Extremity compartment syndrome                     | 21 (0.7) |
| Open aortic repair                                 | 21 (0.7) |
| Myocardial infarction                              | 16 (0.5) |
| Paraplegia                                        | 7 (0.2)  |
| Coma                                              | 7 (0.2)  |
| Extremity ischemia                                | 2 (0.1)  |
| Wound disruption                                  | 2 (0.1)  |

Of the patients, 2867 (95.9%) survived to discharge; 1058 (35.4%) patients went home from the hospital and 1433 (47.9%) patients were transferred to inpatient rehabilitation. Disposition information for the remainder of the patients was not recorded. Of the 123 (4.1%) mortalities, care was withdrawn for 53 (43.1%) patients.

**Table 3** OR of complications in patients undergoing thoracic endovascular aortic repair after blunt thoracic aortic injury

| Complication                                      | OR (95% CI)     |
|---------------------------------------------------|-----------------|
| Acute kidney injury/acute renal failure           | 1.758 (1.449 to 2.134) |
| Stroke                                            | 2.489 (1.917 to 3.232) |
| Spinal cord ischemia                              | 1.061 (0.799 to 1.409) |
| Surgical site infection                           | 2.821 (2.042 to 3.898) |
| Unplanned return to the operating room            | 1.578 (1.139 to 2.186) |
| Bleeding                                          | 1.634 (1.165 to 2.291) |
| Extremity compartment syndrome                     | 2.026 (1.228 to 3.342) |
| Open aortic repair                                 | 2.352 (0.226 to 0.549) |
| Myocardial infarction                              | 1.541 (0.885 to 2.683) |
| Paraplegia                                        | 1.698 (0.728 to 3.961) |
| Coma                                              | 2.605 (1.061 to 6.395) |
| Extremity ischemia                                | 1.001 (1.000 to 1.002) |
| Wound disruption                                  | 0.587 (0.137 to 2.519) |
performed for blunt aortic trauma. Perioperative vigilance may be more effectively focused on prevention of cerebrovascular events and renal complication, both of which had significant incidence in this patient group. Further study is warranted to develop guidelines for the intensivist managing patients after TEVAR for BTAI.

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Competing interests None declared.

Patient consent for publication Not required.

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Provenance and peer review Not commissioned; externally peer reviewed.

Data availability statement Data are available in a public, open access registry, via the American College of Surgeons Trauma Quality Improvement Program (ACS-TQIP) database.

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