Historically, care for adult spinal deformity (ASD) focused on supportive measures with few surgical options that were often deemed high risk. Improvements in anesthesia and critical care, surgical techniques, and instrumentation have led to remarkable advances in ASD care over the last few decades. The population seeking ASD treatment continues to expand, as life expectancies increase and the desire to stay active into later life remains a priority.

Although care for ASD has evolved from supportive to
Section 1: History of ASD Treatment

Although the treatment of spinal deformity through nonoperative methods such as traction, external bracing, and casting has been utilized for many centuries, the true beginning of operative treatment dates back to the early 20th century. In 1911, Russell Hibbs introduced the concept of osseous fusion of thoracolumbar scoliosis, and his landmark publication in 1924 reported on this method of surgical treatment of 59 scoliosis patients.\textsuperscript{22} The method included exposure of the posterior elements over the area of deformity and partial removal of the facet joints, followed by decortication of the remaining posterior elements and placement of bone graft onto the decorticated surfaces for osseous union. The patient then was immobilized in a body cast, often kept non-weight bearing for several months postoperatively to limit spinal motion in order to optimize spinal fusion (Fig. 1). The goal was to maintain and not to correct the deformity, and complications, not surprisingly, were common. Amazingly, however, the basic tenets of performing and obtaining a posterior spinal fusion have continued to the present day, with major advances being made in the internal fixation applied simultaneously with the fusion procedure.

The start of spinal instrumentation to correct spinal deformities truly began with the revolutionary work of Paul Harrington. In the 1940s, the polio epidemic had left many unfortunate patients with debilitating spinal deformities and cardiopulmonary compromise who were not amenable to casting, bracing, or major fusion surgery treatment. Harrington initially tried to correct these types of scoliosis curves through the use of facet screws, which showed initial promise but poor long-term results.\textsuperscript{19} He then worked on developing stainless steel rods and hooks of sufficient strength to withstand the forces involved to both apply corrective destructive forces to the spine and support the loads when upright. This then afforded some correction of the deformity along with enough stabilization to avoid prolonged recumbency and shortened external immobilization usage and time. Initially, Harrington did not perform a fusion procedure, and the implants not surprisingly dislodged or broke routinely. Harrington then was convinced by John Moe, who worked in Minneapolis, to add a fusion to the Harrington instrumentation procedures, and the results were exceedingly better.\textsuperscript{45} However, over time, limitations to the single-rod/2-distraction-hook Harrington device became evident, including difficulty obtaining solid fusion when extending into the low lumbar spine, dislodgment of the distal hook with constructs extending to the sacrum, and the universal loss of lumbar lordosis (LL) with concave lumbar distraction. The consequences of this last limitation, really a result of a lack of sagittal plane analysis or understanding, remain a common indication for surgical revision for flat back conditions even in current practice (Fig. 2).\textsuperscript{37}

The next evolution of ASD treatment involved entering the age of segmental spinal instrumentation as initially espoused by Eduardo Luque. He developed Luque instrumentation that included placing bilateral sublaminar wires at each level, then fixing them to rods applied on each side of the posterior elements.\textsuperscript{41} This created a much more stable construct with the additional fixation points that usually obviated any postoperative immobilization. However, the passing of sublaminar wires, which rested on the dorsal dural surface, led to reports of neurological compromise that caused concern for many surgeons using this technique.\textsuperscript{52} Nevertheless, the beneficial concept of segmental instrumentation had begun and exists today. Surgeons also began combining the Harrington rod concept with the segmental Luque wires, which became referred to as the Harri-Luque technique, which entailed placing segmental sublaminar wires and wrapping those around the single Harrington rod.

Another key component to the early days of segmental spinal fixation for spinal deformity came through placement of spinal instrumentation via the anterior route. In the 1960s, Dwyer and colleagues reported using anterior vertebral body screws and plates on the convexity of scoliosis curves in the thoracolumbar and lumbar spine, then placing a threaded cable that was compressed to shorten the anterior column and correct the scoliosis curve.\textsuperscript{12} This
technique was modified and the cable replaced with a threaded rod by Klaus Zielke, and this device became very popular for anterior correction of scoliosis beginning in the 1970s until the turn of the century. Both of these early devices utilized small cables or rods and thus spinal stability, performed by an anterior discectomy and fusion that was performed along with the instrumentation, required postoperative bracing or casting. Another limitation was that the convex compression of the mid- and lower-lumbar spine was kyphogenic, which created iatrogenic flat back deformities similar to those produced by posterior Harrington distraction instrumentation.

The dawn of “modern” spinal instrumentation is attributed to Yves Cotrel and Jean Dubousset, who created the posterior instrumentation and also the correction philosophy behind segmental dual rod constructs initially using all hook implants. As first reported in 1988, Cotrel-Dubousset instrumentation revolutionized the treatment by allowing for increased spinal stability afforded by multiple hooks placed at strategic locations on both sides of the spine, connected by knurled rods placed bilaterally and cross-linked by devices for transverse traction. This stable construct obviated postoperative bracing, and the corrective maneuvers, including the rod rotation, afforded unparalleled deformity correction in children and adults and quickly became the standard for spinal deformity specialists around the world with this device or many other “clone” devices that mimicked this type of dual segmental instrumentation system. Ultimately, screws have slowly replaced hooks as the main implant due to their 3-column purchase of the vertebra, which allows segmental stability and correction ability far beyond what segmental hooks can produce. By 2000, segmental pedicle screw fixation had become the most commonly utilized construct for ASD surgery and remains so today.

Section 2: Current State of the Art for ASD Treatment and Remaining Challenges

Prevalence of ASD and Clinical Presentation

Many developed countries, including the United States, are experiencing an unprecedented shift toward an aging population. With an expanding elderly population, it will be necessary to increasingly address its medical needs. Although spinal deformity has impact across all ages, it disproportionately affects the elderly. Schwab and colleagues reported a 68% prevalence of scoliosis in volunteers older than 60 years.

Spinal deformity is a heterogeneous condition that can have varying impact depending on type and severity. While the finding of spinal deformity may be incidental, other cases may present with significant pain and disability. Two studies have shown that ASD can have debilitating impact on health that exceeds that of other chronic disease states, including heart disease, lung disease, and limited use of arms and legs.

Maximizing Nonoperative Treatments

In the absence of significant or progressive neurological deficit or rapidly worsening deformity, nonoperative treatment approaches should be maximized. Glassman and colleagues documented the substantial costs of nonoperative treatments but found no mean improvement in health status. Although other studies have also shown no mean improvement in health status with nonoperative treatments, there are subsets of patients that may benefit. Attempts to define which patients may benefit most from nonoperative treatment have provided only limited insight, and the longer-term durability of these treatments is unclear.
Selection and Counseling of Patients for Operative Treatment

A growing amount of literature supports the potential of surgical treatment for ASD to significantly improve pain and disability. However, these procedures are associated with high complication rates. Based on a risk-benefit assessment of ASD surgery with age stratification, Smith and colleagues noted that older patients had the worst pain and disability at baseline. At 2 years after surgery, the elderly, despite facing the greatest risk of complications, had a disproportionately greater improvement in disability and pain.

When contemplating surgical treatment for ASD, counseling should take into account individual patient expectations. An extensively fused spine may provide improvement in pain and disability but results in greater stiffness and may produce new limitations. In addition, not all patients can be expected to meet reported mean outcome improvements; instead, outcomes span a broad range.

Radiographic Assessment and Surgical Planning

Radiographic Measurements of Spinopelvic Alignment

Historically, assessment of ASD focused on the coronal plane, but the importance of the sagittal plane has been increasingly recognized. Glassman and colleagues were among the first to demonstrate the relationship between global sagittal alignment (GSA) and health-related quality of life. Subsequent studies have confirmed this relationship and defined the importance of pelvic morphology and alignment.

Global coronal alignment and GSA can be assessed based on standing full-length spine radiographs (Fig. 3A and B), with a broader assessment of global sagittal balance (SVA; Fig. 3B). Alternatively, thoracic spinopelvic inclination (Fig. 3B) or novel measures, such as the T1 pelvic angle, can be used to quantify GSA. Basic regional measures of sagittal alignment include thoracic kyphosis and LL (Fig. 3C).

Evaluation of the key pelvic parameters, pelvic incidence (PI) and pelvic tilt (PT), adds context to the assessment of spinal alignment (Fig. 3D). PI is a morphological parameter that reflects the relationship between the sacrum and femoral heads and establishes the amount of LL needed by an individual. PT reflects the degree of pelvic retroversion, which is a compensatory measure for GSA. Although an important compensatory mechanism, excessive PT can be a source of pain and disability.

Based on correlations between radiographic alignment parameters and health-related quality of life measures, Schwab and colleagues developed the Scoliosis Research Society–Schwab classification for ASD (Fig. 4). Although this classification has recognized limitations, including its sole basis on radiographic assessment and its lack of accounting for age, it serves as a starting point and remains the most widely applied ASD classification.

Surgical Planning Software

Accurate radiographic assessment is important for evaluating ASD patients clinically and for surgical planning. Detailed radiographic measurements can be time consuming, prompting a growing interest in automation. For example, a new computer-assisted tool to measure spinopelvic parameters has been reported in which users outline basic spine structures. The software then automatically calculates spinopelvic parameters.

Surgical Techniques and Approaches

Current surgical techniques for ASD are heavily based on posterior instrumentation, interbody releases and fusions, and osteotomies (Fig. 5). Schwab and colleagues reported a comprehensive anatomical spinal osteotomy classification for thoracolumbar deformities. In addition, some surgeons also employ lateral and anterior disectomies to aid in deformity correction and arthrodesis.

Currently, surgeons use a number of techniques for pedicle screw placement, including freehand, fluoroscopy-assisted, navigation-assisted, and, at the leading edge of innovation, robot-assisted. Whether one technique is superior remains unclear.

Strategies to Reduce Complications and Improve Safety

Smith and colleagues reported a prospective assessment of complications among 346 surgically treated ASD patients with 2-year follow-up. Approximately 70% of patients experienced at least 1 complication, and 28% required at least 1 revision procedure. The most common complication categories included implant-related, radiographic, neurological, operative, cardiopulmonary, and infection. Efforts to better understand and reduce complications with ASD surgery are ongoing priorities.

Pseudarthrosis and Instrumentation Failure

Pseudarthrosis and instrumentation failure remain common indications for revision surgery. Based on a prospective series of ASD patients, the overall rod fracture (RF) rate was 9%. Among the patients treated with a pedicle subtraction osteotomy (PSO), the RF rate was 22%, with almost all occurring at the PSO site. Many of these RFs occurred earlier than fusion would be expected, suggesting that biomechanical compromise of the rods may have contributed to failure.

Tang and colleagues demonstrated that greater angular bending of rods, such as that occurring across a PSO, significantly reduced rod fatigue life. This finding, in combination with the high rates of RFs across PSOs, has led many surgeons to use additional rods to span osteotomy levels. Multiple rod configurations have been described (Fig. 6). Accessory rods are attached directly to primary rods with side-to-side connectors. Satellite rods attach independently to the vertebral levels adjacent to the PSO, thereby reducing the angular bend necessary in the primary rods and the rate of RF.

Strategies to reinforce implants with additional rods appear to be helpful; however, unless fusion occurs, additional metal may simply delay RF. Although costly and off-label for most spine applications, recombinant human BMP-2 does appear to be effective in promoting bone fusion in ASD surgery.

Proximal Junctional Kyphosis/Proximal Junctional Failure

Proximal junctional kyphosis (PJK) arguably remains...
FIG. 3. Illustrations of radiographic spinopelvic parameters. A: Diagram showing the measurement of global coronal alignment (−X). B: Diagrams showing 2 techniques for assessment of GSA, including SVA (+X, left) and T1 and T9 spinopelvic inclination (right). C: Illustrations of regional measures of thoracic kyphosis (+X, left), thoracolumbar sagittal angle (T10–L2 [+X], right), and LL (T12–S1 [−X], right). D: Pelvic radiographic parameters, including sacral slope (SS), PT, and PI. CSVL = central sacral vertical line; HRL = horizontal reference line; PL = plumb line; VRL = vertical reference line. Copyright Kenneth X. Probst. Published with permission from XavierStudio. Figure is available in color online only.
the greatest unsolved problem in ASD surgery and can require major revision surgery.\(^{30,58,74}\) Multiple recent reports have helped to further the understanding of PJK and provided steps to potentially reduce its occurrence. The Hart-International Spine Study Group (ISSG) PJK severity scale can help identify which PJK patients may need revision surgery.\(^{58}\)

Bony fracture at the proximal junction is a common mechanism of failure that is likely related to bone density. Few studies have directly addressed the relationship between bone density and junctional failure. Yagi and colleagues reported on the effectiveness of teriparatide as a protective treatment for junctional fracture following ASD surgery in women with osteoporosis or osteopenia.\(^{91}\)

Although their clinical effectiveness remains under investigation, junctional tethers are an emerging technique with potential to reduce PJK risk (Fig. 7). A finite element analysis by Bess and colleagues suggested that tethers are effective in dissipating the forces at the uppermost instrumented vertebra (UIV),\(^{3}\) and recent case series support their clinical effectiveness in reducing PJK.\(^{7,8}\)

The magnitude and location of correction of LL also appear to be important factors in PJK development. It is important to apply age-adjusted alignment objectives when planning ASD surgery to reduce the risk of over-correction of LL, which may produce excessive compensatory junctional kyphosis.\(^{36,62}\) Although historically L3 has been the most common level for lordosis restoration via PSO, emerging evidence suggests that restoring lordosis in a more physiological location (i.e., L4–S1) may be protective against PJK.\(^{35}\)

Orientation of the UIV and terminal rod contouring also appear to be important factors in PJK development. Lafage and colleagues reported significant differences in UIV angulation between patients who did and did not develop PJK.\(^{34}\) Their findings reinforce the importance of preoperative planning, careful UIV selection, and proper rod contouring to reduce PJK.

Wound Infection

Wound infection after ASD surgery is a potentially serious complication that may necessitate reoperation and prolonged antibiotic treatment and can increase the risk of pseudarthrosis. Although off-label, application of vancomycin powder directly into the wound following ASD surgery has been used by some surgeons as a means of reducing postoperative wound infections. Several studies suggest its potential effectiveness; however, additional higher-level evidence is warranted.\(^{87,94}\)

Excessive Blood Loss

Although an effective anesthesia team can readily replace blood, significant blood loss can lead to complications. Recent studies have suggested that antifibrinolytics have the potential to reduce intraoperative and postoperative blood loss.\(^{10}\) The most commonly studied of these is tranexamic acid (TXA), a synthetic lysine analog that inhibits fibrinolysis.\(^{10}\) Optimal dosing of TXA remains unclear, and contraindications and relative contraindications should be assessed, including history of deep venous thrombosis, pulmonary embolism, stroke, myocardial infarction, and cardiac stenting.

Rotational thromboelastometry (ROTEM) is a functional viscoelastic assay for real-time assessment of coagulation abnormalities.\(^{48}\) Intraoperative use of ROTEM can facilitate standardization of transfusion practices and enable early identification and treatment of hypofibrinogenemia. Naik and colleagues recently reported its application to major spine surgery and found that its use resulted in decreased blood loss, reduced transfusion requirements, and lower cost.\(^{48}\)

Neurological Deficits

Neurological deficits are among the most potentially impactful of complications associated with ASD surgery. To better define the incidences and severities of new neurological deficits in surgically treated ASD patients (75% having a 3-column osteotomy), Lenke and colleagues prospectively assessed neurological outcomes using the American Spinal Injury Association lower extremity motor score (LEMS).\(^{39}\) They reported a decline in LEMS in 22.18% of patients at the time of hospital discharge, compared with 12.78% of patients who showed an improvement. At 6-month follow-up, 10.82% of patients had an overall decline in LEMS compared with preoperative scores, and 20.52% and 68.66% had improvement and maintenance of scores, respectively. These data provide a basis for surgical planning, counseling, and efforts to prevent or treat these events.

Evolving Role of Minimally Invasive Approaches

Current Applications and Algorithms

There is growing interest in spinal minimally invasive surgery (MIS) techniques for ASD with the goal of reducing morbidity, complications, and recovery time.\(^{51,91}\) Two basic MIS approaches have been most commonly reported.\(^{51,91}\) The circumferential MIS technique includes a lateral approach for discectomies, followed by posterior percu-
Simultaneous instrumentation. In contrast, the hybrid approach combines lateral discectomies with a traditional posterior open approach for osteotomies and instrumented fusion.

As a means of addressing sagittal malalignment through a minimally invasive lateral approach, the anterior column release has been introduced in which the anterior longitudinal ligament is released at an open disc space level. In addition, Wang and Bordon have described an MIS PSO technique in which the procedure is performed using MIS techniques except for the spinal levels immediately adjacent to the PSO.

Patient selection for MIS ASD treatment remains a challenge. The MIS deformity (MISDEF) surgery algorithm was created to provide a framework for decision making. Based on preoperative radiographic parameters, this algorithm leads to one of 3 general plans that range from MIS direct or indirect decompression to open deformity surgery with osteotomies.

![Image](image-url)
Complications and Outcomes Assessments

As MIS approaches are applied to ASD, the associated limitations and complications have become increasingly clear. Some complications are similar to those of open procedures, including PJK and pseudarthrosis. Other complications directly relate to the MIS lateral approach, including neurological injuries, abdominal wall paresis, bowel perforation, lateral incisional hernia, and graft subsidence.

Few reports have provided assessment of clinical outcomes for MIS ASD treatment, and those available are limited by a number of factors, including inadequate follow-up length and rates, retrospective design, lack of objective outcomes measures, and lack of an appropriate comparison group. Further study is needed to explore radiographic and clinical outcomes for MIS ASD treatment.

Patient-Reported Outcomes Measures

Patient-reported outcomes measures (PROMs) can be used to assess disease impact and treatment effectiveness and can be divided into those that are general health measures and those that are disease specific. General health measures, including the SF-36 and the EQ5D, can be used to assess disease impact and enable comparisons across other disease states. Disease-specific outcomes measures commonly applied to ASD include the Scoliosis Research Society questionnaires and the Oswestry Disability Index.

The National Institutes of Health developed the Patient Reported Outcomes Measurement Information System (PROMIS) as a means of unifying clinical outcomes-based research. The goal of PROMIS is to utilize a large bank of questions that could apply to all disease states in order to serve as a single standard PROM. PROMIS questions address 3 health categories (physical, mental, and social health) and a global health category. The PROMIS questionnaire can be administered in static form or using computer adaptive testing (CAT). With CAT, how an individual respondent answers a question determines which questions follow and may significantly reduce the number of subsequent irrelevant questions. Although few studies have explored the use of PROMIS in spine surgery, those available are supportive of its validity and responsiveness.

Current Challenges

Interest in ASD treatment has rapidly expanded over the last couple of decades and considerable advances have been made, but many challenges remain. As the demographic in many developed countries shifts to an older population, the numbers of elderly seeking care for ASD will continue to expand. Despite often being among the most impacted by their ASD, these patients tend to have greater comorbidities and overall frailty, adding to the already complex decisions surrounding risk-benefit assessments of surgery, patient optimization, and challenges of what the current state of the art can reasonably offer.

It is unlikely that ASD surgeries will ever be free from risk. However, there is a need to reduce the current rates of complications and reoperation rates for ASD surgery, which have been reported as 70% and 28%, respectively, at the 2-year follow-up. Although considerable advances continue to be made, improving the safety and durability of ASD surgery must remain a critical focus.

ASD surgeries are among the most costly of spine surgeries, and demonstrating the cost-effectiveness of these procedures remains a challenge. Although substantial resources are consumed upfront with ASD surgery, the potential for benefits to be extrapolated over many years may demonstrate cost-effectiveness. However, high reoperation rates can erode the cost-effectiveness of these procedures. Further research is needed to better understand the costs of ASD surgery and how to maximize durability.

There remains considerable variability across multiple aspects of ASD surgery. Although patients on average demonstrate significant improvement in pain and disabil-
ity with surgery, the spectrum of outcomes is broad and it can be difficult to predict which patients may benefit most from surgery. Overall complication rates have been documented for ASD surgery, but the risk of complications and their potential impact remain difficult to predict for an individual patient. The costs associated with ASD surgery are substantial and can be variable and difficult to predict. The ability to address the many marked variabilities associated with ASD surgery is a significant challenge.

Section 3: The Future of ASD Treatment: Improving Predictability, Safety, and Sustainability

The Future Role of Surgery for ASD

Role of Multidisciplinary Panels and Payers in Controlling Access to Surgical Care

Annual healthcare spending in the United States currently consumes 17.9% of gross domestic product and is expected to reach $5.7 trillion by 2026. There will no doubt be continued intense downward pressure on healthcare spending well into the future. A burgeoning elderly population, coupled with increasing utilization and high costs of surgical treatment for ASD, may create an environment ripe for limiting access to care.

Broader utilization of bundled payment and population health programs tend to favor what are perceived as less costly nonoperative treatments despite limited evidence of the benefit in patients who are surgical candidates. Although multidisciplinary panels may be a means of reducing complication risk, such panels could easily be used to limit care to those who may stand to benefit the most, especially at centers incentivized with bundled payment or population health contracts. It is important for those who provide care to ASD patients to ensure their future access to surgical options.

Are More Effective Nonoperative Treatments on the Horizon?

While it is possible that future advances in nonoperative...
tive care for ASD could markedly reduce the need for surgical treatment, such a development is unlikely in the near term. In addition, the symptoms and disability directly related to global and regional spinal malalignment could be challenging to effectively treat nonoperatively. However, a variety of treatment approaches could have at least theoretical benefit to ASD patients with primary complaints of back or leg pain. For example, with continued advances in the understanding of central pain control, it is conceivable that some combination of cortical, spinal, and peripheral stimulation could sufficiently reduce symptoms for a subset of ASD patients.21,23,29

Robotics and Navigation
What Are the Limits to What Robots Can Do?

The application of robots to spine surgery has been heavily driven by the dependence of MIS surgeons on navigation techniques and a desire to reduce radiation exposure and increase precision. Early applications of robotics to spine surgery have predominantly focused on placement of pedicle screws, and for this task robots appear to have an acceptable level of accuracy on a consistent basis.43 Currently, robots are confined to aiding in establishing a trajectory based on navigation, with actual pedicle screw placement left to the surgeon.

Robots have the potential for much more. Madhavan and colleagues envision a semiautomated device with integrated scanners and surgical arms or even a fully operational humanoid machine, but readily acknowledge that these remain fantasies at present.42 They note that more likely near-term advances will take the form of semiautonomous machines attached to the operative table and having robotic arms that can place percutaneous screw-and-rod systems. The surgeon may be equipped with a headset and visor to enable an augmented reality overlay and the ability to alter and/or command the robotic arms through voice commands or sensor gloves.42 In addition, MRI-based navigation could enable robot assistance with disc work and tumor resection and provide safer cues for robot assistance with osteotomies and bony decompression.50

Role of the Surgeon in the Age of the Robot

Will the march toward robotics obviate the need for surgeons? Although much of spine surgery is complex carpentry, the materials are highly heterogeneous and the consequences high. Robotic applications to spine surgery should be viewed as tools that the surgeon may use to potentially augment the safety of procedures, especially for minimally invasive approaches and for patients with challenging anatomy. For the foreseeable future and likely generations to come, the role of and need for the surgeon appear to be secure.

Advances to Further Reduce Complications

Complication rates remain high in ASD surgery. RF is the most common instrumentation failure. Although advances are being made through various multirod configurations,7 it remains unclear whether additional rods may simply delay RF. Improved means of rod contouring are needed, and the recent introduction of preplanned machine-bent rods may improve fatigue life, thereby extending the time for arthrodesis to occur.84 In addition, preplanned rods may facilitate achievement of desired spinal alignment which may also enhance fatigue life. Advances are also needed in osteobiologics and other grafting materials in order to improve fusion rates. Cell-based technologies, such as mesenchymal stem cells, with novel carrier materials may enable enhanced bone formation and fusion rates.24 Novel osteobiologics and enhancers of BMP-2 may also provide opportunities for increased fusion rates.24,28

Development of clinically significant PJK is likely multifactorial and may never be completely eliminated. Preplanned machine-bent rods may reduce junctional failures by helping to ensure that desired alignment corrections are achieved, including overall magnitudes of thoracic and lumbar curves, location of LL restoration (e.g., in the lower lumbar levels), and appropriate contouring of the proximal end of the rod.34,35,84 An overall better definition of individualized alignment objectives, beyond simple age-adjusted objectives, could markedly reduce PJK.32,36 In the future, more aggressive attention to bone optimization may also reduce junctional fractures.93 Ongoing advances in junctional tethers may also provide another approach to reduce PJK.7

Ongoing Evolution of Methodologies in Risk Stratification

Tools for risk stratification, including age, American Society of Anesthesiologists class, Charlson Comorbidity Index, and subjective consensus opinion, have been historically crude and used as a means of limiting surgery to low-risk ASD patients. Although complications may be decreased by operating on more robust patients,71 more disabled patients often benefit the most from surgery.57,63,80 From a population standpoint, the greatest health improvement may come through optimization of care for the more disabled and frail patients, rather than simply confining care to low-risk groups. Recent data-intensive analyses have provided objective measures of procedure invasive-ness and risk, as well as a standardized ASD frailty index, as steps toward an ongoing process to enable more meaningful risk stratification and preoperative optimization.44

Predictive Analytics, Machine Learning, and Individualized Medicine

As the availability of healthcare data is rapidly expanding and techniques for big data analysis are advancing, powerful machine learning techniques have been applied to reveal clinically useful information buried within vast amounts of data (Figs. 8 and 9). These techniques are only beginning to be applied to spine care. In the near future, predictive analytics has the potential to markedly reduce the uncertainties for all stakeholders in ASD care and revolutionize the overall treatment approach. Predictive models may facilitate surgeon decision making regarding operative versus nonoperative treatment and enable customized surgical planning to enhance durability and patient outcomes.1 Payers and hospitals may benefit from enhanced prediction of treatment costs and ability to predict catastrophic cost outliers (C.P. Ames et al., unpublished data, 2018).

Preoperative patient counseling may include individu-
alized assessments of complication, reoperation, and read-
mission risks with surgery, as well as individualized predic-
tions of outcomes metrics, patient-specific goals, and over-
all satisfaction. Early work through the ISSG has suggested
that assessment of patient-specific goals through a patient-
generated index has greater responsiveness to treatment
than standard PROMs.6 In addition, early ISSG–European
Spine Study Group collaborative efforts have provided a
glimpse of this ASD information revolution, including an
online point-of-care risk outcomes calculator (Fig. 10) (C.P.
Ames et al., unpublished data, 2018; and F. Pellisé et al.,
unpublished data, 2018).49,59,64–66

FIG. 8. Phylogenic dendrogram from application of unsupervised hierarchical clustering to 570 ASD patients treated surgically.
Using an artificial intelligence–based clustering technique without a priori assumptions resulted in the definition of 3 distinct
clusters of patient types. Each circle represents a different patient. Colors represent different patient clusters. Figure created using
R programming language (https://www.r-project.org). Reproduced with permission from Ames CP, Smith JS, Pellisé F, Kelly M,
Advances in ASD Classification

Historically, ASD has been classified based primarily on descriptive statistics and simplistic correlation-based systems, but recent work suggests that there are many other impactful preoperative data points. However, the ability to segregate patient patterns manually based on hundreds of data points is beyond practical application for surgeons. Artificial intelligence–based unsupervised hierarchical clustering has recently been applied to a large ASD cohort to identify key patient type clusters and surgical treatment strategy clusters. The intersection of these patient-based and surgery-based clusters, with overlay of complication...
rates, has produced a novel ASD classification that may facilitate treatment optimization of outcomes by identifying which treatment patterns yield optimal improvement with lowest risk.

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