

Using the Breast Reconstruction Risk Assessment (BRA) Score: An Individualized Risk Calculator to Assist Expectation Management and Reconstructive Decision Making in the Mastectomy Patient

Alexei S. Mlodinow, Steven T. Lanier,
Robert D. Galiano, and John Y.S. Kim

Introduction: The Utility of Risk Calculators

Over 100,000 breast reconstructions are now performed annually in the United States alone [1]. The reconstructive surgeon has a variety of modalities to choose from, and there is a large body of literature addressing the risks and benefits of each [2–15]. These papers can present a daunting and sometimes conflicting array of risk factors for numerous complications, each meant to assist in incremental risk stratification. Risk calculators simplify this process by providing concrete estimates based on the *combined* characteristics of the *individual* who is undergoing surgery.

While many superb papers have set benchmarks and informed clinical practice, the majority provide population-based estimates of risk,

drawn from the average of the population studied. However, there are two pitfalls in attempting to apply these. First, risk of any given complication is often broadly distributed and skewed. Thus, the average may provide an overestimate for many, and a crucial underestimate for others. Second, the averages are often hard to reconcile into a reliable gestalt when there are multiple comorbidities or conflicting characteristics. As a result of these issues, surgery is, like many fields, moving away from high-level, population-based averages and the resultant uncertainty in their application, and towards data-driven, granular tactics to personalize the conversation [16–21].

The final benefit of risk calculators is their interactive nature. Whether online or on a mobile device, an increasing premium is put on the ability to engage patients in discussions about their health and grant them a degree of efficacy [22, 23]. This, in turn, supports expectation management, as the engaged patient is able to see in real time what her risks are given various situations or modalities. This multitude of benefits has led the Center for Medicare and Medicaid Services (CMS) to consider incentivizing patient-specific discussion of risk before every elective operation [24].

A.S. Mlodinow, B.A. • S.T. Lanier, M.D.
R.D. Galiano, M.D. • J.Y.S. Kim, M.D. (✉)
Division of Plastic Surgery, Feinberg School of
Medicine of Northwestern University,
675 N St Clair St #19-250, Chicago, IL 60611, USA
e-mail: steven.lanier@northwestern.edu; steven.lanier@northwestern.edu; steven.lanier@northwestern.edu

What Is the BRA Score?

The Breast Reconstruction Risk Assessment (BRA) Score is an easy-to-use and open-access risk calculator for reconstructive surgeons and their patients [25–29]. It is available online at www.BRAScore.org. More recently, it has been made available as a mobile phone app, for Android operating systems. The online and mobile platforms function similarly, accepting preoperative and treatment characteristics of a given patient, and returning predicted probabilities of each of five surgical complications, as well as reoperation and medical complications. These predicted probabilities differ by method of reconstruction, and are laid out as such.

Details of the methodology utilized to construct the BRA Score have been well described in the literature [25–29]. The calculator is based on data from high-quality, large-scale registries including the American College of Surgeons’ National Surgical Quality Improvement Program (ACS-NSQIP), the American Society of Plastic Surgeons’

Tracking Operations and Outcomes for Plastic Surgeons (ASPS TOPS), and the Mastectomy Reconstruction Outcomes Consortium (MROC). Logistic regression was used to assess for independent risk factors for each outcome of interest. The results of these regressions, specifically the constants and beta values, are transformed into predicted probabilities using a logit function [30, 31]. In order to make this analysis intuitive and clinically useful, the user interface simply takes characteristics of an individual and presents final results of this statistical prediction model. This process is depicted in Fig. 11.1.

A striking example of the utility of individualized risk calculators is seen in the broad and skewed distribution in predicted risk among the cohort used to develop the BRA Score. Figure 11.2 depicts the broad and skewed distribution of risk of surgical complications overall within the TOPS cohort. Figure 11.3 demonstrates that this holds across all complications, as the minimum and maximum predicted probabilities among this cohort widely differ for each complication.

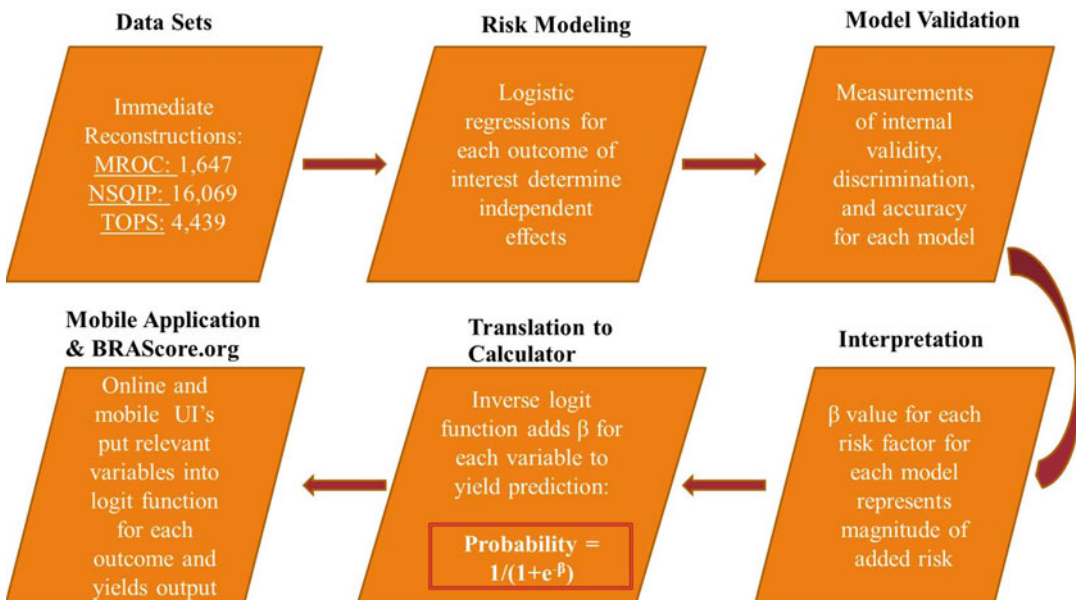


Fig. 11.1 BRA Score development methodology

Fig. 11.2 Histogram depicting distribution of predicted probabilities of surgical complications across the TOPS reconstruction cohort

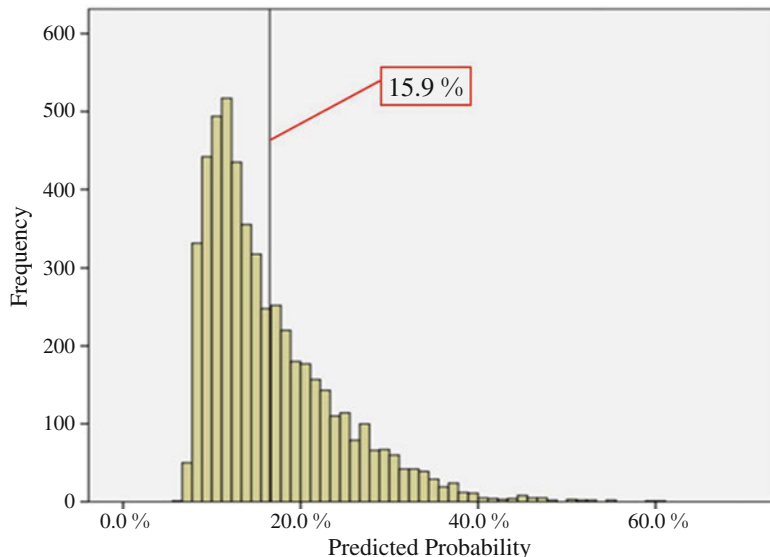


Fig. 11.3 Average incidence, minimum predicted probability, and maximum predicted probability of each complication examined within the TOPS cohort

Complication	Overall Incidence	Minimum Probability	Maximum Probability
Seroma	3.37%	1.21%	22.24%
SSI	3.96%	0.87%	29.89%
Dehiscence	6.13%	2.22%	50.19%
Flap Failure	7.00%	1.24%	50.57%
Explantation	3.70%	1.14%	52.08%
Reoperation	6.42%	1.79%	23.01%
Overall	15.92%	6.84%	62.50%

How Should the BRA Score Be Used?

The BRA Score was developed for use by reconstructive surgeons and their patients. It has potential utility in both surgical planning and informed consent. Seeing quantifiable risk estimates for different complications across various modalities can help the surgeon weigh them against the advantages of each modality. Similarly, walking a patient through this information can increase her involvement in and understanding of the surgical planning process. However, the BRA Score should *not* be used to determine surgical *candidacy* for any patient. It yields only one side of a two-sided equation and cannot replace the clinical judgment of the

reconstructive surgeon. Similarly, it cannot be the sole basis of the informed consent process, but helps facilitate it with accessible and consolidated risk information. It is important to note the limitations of data from which the BRA Score is derived, as well as the absence to date of a study examining the tool’s external validity.

Case-Based Examples of BRA Score Utilization

It is easiest to discuss the use and utility of the BRA Score with actual case-based examples. The examples that follow are two hypothetical patients undergoing mastectomy with immedi-

ate breast reconstruction. Let's look at these patients and use the BRA Score to quantify the difference in risk for these two women. For demonstration purposes, one case example will be assessed using the BRA Score website, while the second will be assessed using the BRA Score App.

Patient A is a 30-year-old woman who has chosen to undergo a prophylactic risk-reducing double mastectomy for her recently diagnosed BRCA carrier status. She is 5'6" tall and weighs 120 lbs. She does not smoke and has no comorbidities. This is the type of patient that is seen more and more often in clinical practice as we witness continuing improvements and the publicity in both genetic testing for and prophylactic treatment of high-risk mutations [32] www.BRAScore.org.

We start at the landing page in Fig. 11.4, which outlines some of the uses and limitations discussed above. We acknowledge understanding and click "Proceed."

The homepage in Fig. 11.5 presents us with the characteristics that are taken into account in the BRA Score statistical models. There are demographics, comorbidities, and treatment details to fill in. Once these are complete with the details for "Patient A," we can click the "Calculate Risk" button that appears, as in Fig. 11.6.

We see a risk profile that pops up for Patient A, shown in Fig. 11.7. In interpreting this, there are a few things to note, independent of the actual results. One is the superscript on various categories. These tell us which cohort the data is derived from. For example, the latest work with the Mastectomy Reconstruction Outcomes Consortium (MROC) [29] yielded sufficient statistical power only for an analysis of "overall" complications, but had more single stage cases than prior studies, allowing for inclusion of those patients. Thus, the single-stage modality, the newest addition to the BRA Score, has a result for only "overall" complications. Similarly, the studies from which each data point is

Breast Reconstruction Risk Assessment (BRA) Score

The BRA Score, an evidence-based risk calculator, is for information only. The tool is not to be used in place of diagnosis, treatment, or medical advice of any kind.

Patients using the BRA Score should not rely on the information provided for their own healthcare decisions. Nor should physicians using the BRA Score rely on the information provided to plan treatment.

Northwestern Feinberg School of Medicine makes no warranties, nor express or implied representations whatsoever, regarding the accuracy, completeness, timeliness, comparative or controversial nature, or usefulness of any information contained or referenced in the prediction tools. Northwestern Feinberg School of Medicine does not assume any risk whatsoever for your use of the BRA Score or the information contained herein. Evidence-based medicine is in a state of constant flux, and the tool may thus not fully represent the current state of information.

Use of the BRA Score does not constitute an express or implied physician-patient relationship. Northwestern Feinberg School of Medicine does not endorse or claim validity for the BRA Score found on this Web site. The activities and products of Northwestern Feinberg School of Medicine are not endorsed by our past, present, or future employers. Northwestern Feinberg School of Medicine keeps no record of users of the BRA Score, nor does it contact users for any reason.

You are hereby advised to consult with a physician or other professional healthcare provider prior to making any decisions, or undertaking any actions or not undertaking any actions related to any healthcare problem or issue you might have at any time, now or in the future. In using the BRA Score, you are in agreement that neither Northwestern Feinberg School of Medicine, nor any other party, is or will be liable or otherwise responsible for any decision made or any action taken or any action not taken due to your use of any information presented.

I have read and I accept these terms.

Proceed

Fig. 11.4 Landing page screenshot

Breast Reconstruction Risk Assessment (BRA) Score

To calculate the estimated risk for postoperative complications in a patient who underwent mastectomy with immediate tissue expander or autologous reconstruction, complete the following worksheet.

Some Models Abstracted from Participant Use Files of the Mastectomy Reconstruction Outcomes Consortium (MROC) database.
 Some Models Abstracted from Participant Use Files of the Tracking Operations and Outcomes for Plastic Surgeons (TOPS) database.
 Some Models Abstracted from Participant Use Files of the National Surgical Quality Improvement Program (NSQIP).

Height <input type="text"/> Weight <input type="text"/> Age <input type="text"/>	<input checked="" type="radio"/> in <input type="radio"/> m <input checked="" type="radio"/> lb <input type="radio"/> kg	Yes No <input type="radio"/> <input type="radio"/>	Bleeding Risks: Vitamin K Deficiency <input type="radio"/> <input type="radio"/> Thrombocytopenia <input type="radio"/> <input type="radio"/> Hemophilia <input type="radio"/> <input type="radio"/> Other Diagnosed Clotting Disorder <input type="radio"/> <input type="radio"/> Coumadin, NSAIDs, or Other Anti-Coagulant NOT Discontinued Prior to Surgery <input type="radio"/> <input type="radio"/> Chronic Aspirin Therapy <input type="radio"/> <input type="radio"/>	Yes No <input type="radio"/> <input type="radio"/>
Do you have high blood pressure or are you taking medications for high blood pressure? <input type="radio"/> <input type="radio"/> Have you been diagnosed with diabetes mellitus? <input type="radio"/> <input type="radio"/> Have you experienced difficult, painful, or labored breathing? <input type="radio"/> <input type="radio"/> <small>(only count if 30 days or fewer prior to procedure)</small> Have you undergone chemotherapy? <input type="radio"/> <input type="radio"/> <small>(only count if 30 days or fewer prior to procedure)</small>	American Society of Anesthesiologists (ASA) Physical Status Classification <input type="text" value="select"/> <small>What is this?</small>	Smoking Status <input type="text" value="Never"/>	Have you ever had a: Balloon Angioplasty <input type="radio"/> <input type="radio"/> Stent Placement <input type="radio"/> <input type="radio"/> Coronary Artery Bypass Graft <input type="radio"/> <input type="radio"/> Valve Replacement/Repair <input type="radio"/> <input type="radio"/> Implantation of Pacemaker/Defibrillator <input type="radio"/> <input type="radio"/> Other major cardiac surgery <input type="radio"/> <input type="radio"/>	Yes No <input type="radio"/> <input type="radio"/>
Are you having one or both breasts reconstructed? <input type="text" value="One"/>	Have you had, or do you predict having, radiation therapy? <input type="text" value="No"/>			

Fig. 11.5 Blank homepage

Breast Reconstruction Risk Assessment (BRA) Score

To calculate the estimated risk for postoperative complications in a patient who underwent mastectomy with immediate tissue expander or autologous reconstruction, complete the following worksheet.

Some Models Abstracted from Participant Use Files of the Mastectomy Reconstruction Outcomes Consortium (MROC) database.
 Some Models Abstracted from Participant Use Files of the Tracking Operations and Outcomes for Plastic Surgeons (TOPS) database.
 Some Models Abstracted from Participant Use Files of the National Surgical Quality Improvement Program (NSQIP).

Height <input type="text" value="66"/> Weight <input type="text" value="120"/> Age <input type="text" value="30"/>	<input checked="" type="radio"/> in <input type="radio"/> m <input checked="" type="radio"/> lb <input type="radio"/> kg	Yes No <input type="radio"/> <input type="radio"/>	Bleeding Risks: Vitamin K Deficiency <input type="radio"/> <input type="radio"/> Thrombocytopenia <input type="radio"/> <input type="radio"/> Hemophilia <input type="radio"/> <input type="radio"/> Other Diagnosed Clotting Disorder <input type="radio"/> <input type="radio"/> Coumadin, NSAIDs, or Other Anti-Coagulant NOT Discontinued Prior to Surgery <input type="radio"/> <input type="radio"/> Chronic Aspirin Therapy <input type="radio"/> <input type="radio"/>	Yes No <input type="radio"/> <input type="radio"/>
Do you have high blood pressure or are you taking medications for high blood pressure? <input type="radio"/> <input type="radio"/> Have you been diagnosed with diabetes mellitus? <input type="radio"/> <input type="radio"/> Have you experienced difficult, painful, or labored breathing? <input type="radio"/> <input type="radio"/> <small>(only count if 30 days or fewer prior to procedure)</small> Have you undergone chemotherapy? <input type="radio"/> <input type="radio"/> <small>(only count if 30 days or fewer prior to procedure)</small>	American Society of Anesthesiologists (ASA) Physical Status Classification <input type="text" value="1"/> <small>What is this?</small>	Smoking Status <input type="text" value="Never"/>	Have you ever had a: Balloon Angioplasty <input type="radio"/> <input type="radio"/> Stent Placement <input type="radio"/> <input type="radio"/> Coronary Artery Bypass Graft <input type="radio"/> <input type="radio"/> Valve Replacement/Repair <input type="radio"/> <input type="radio"/> Implantation of Pacemaker/Defibrillator <input type="radio"/> <input type="radio"/> Other major cardiac surgery <input type="radio"/> <input type="radio"/>	Yes No <input type="radio"/> <input type="radio"/>
Are you having one or both breasts reconstructed? <input type="text" value="Both"/>	Have you had, or do you predict having, radiation therapy? <input type="text" value="No"/>			

Fig. 11.6 Completed questions for "Patient A"

Estimated Risk of Complication:

Outcome	Reconstructive Modality				
	Tissue Expander	Pedidled Abdominal (TRAM) Flap	Latissimus Flap	Microvascular Reconstruction	Single-Stage Implant
Overall Complications	7.61% ¹ - 7.63% ²	17.78% ¹ - 22.55% ²	12.17% ¹ - 28.37% ²	12.93% ¹ - 22.78% ²	16.52% ²
Overall Medical Complications³	1.08%	3.98%	1.49%	8.15%	
Overall Surgical Complications¹	7.61%	17.78%	12.17%	12.93%	
Surgical Site Infection ³	1.54%	2.50%	1.14%	2.59%	
Seroma ¹	1.10%	1.93%	3.55%	1.66%	
Dehiscence ¹	2.63%	9.77%	3.61%	4.46%	
Flap Loss (Partial or Total) ¹	n/a	4.42%	1.20%	4.27%	
Explantation ¹	1.42%	n/a	n/a	n/a	
30-Day Reoperation¹	2.70%	4.39%	1.98%	4.84%	

¹ Abstracted from TOPS data
² Abstracted from MROC data
³ Abstracted from NSQIP data

Fig. 11.7 Complication predictions for “Patient A” stratified by reconstructive technique

estimated vary in the exact definitions of the input and their weighting in the regressions. For example, those with granular familiarity with the ACS-NSQIP database know that it lacks thorough radiotherapy information [33]. Thus, the information that we input regarding radiotherapy is not factored into estimates based on NSQIP data, but is used for those derived from MROC data.

We can see from the probabilistic estimates in Fig. 11.7 that Patient A is a fairly low-risk patient across the board, as expected. Though we can intuit that she has a “low” risk of complications relative to published means, it is beneficial to have numerical estimates, particularly in this increasingly common patient with little outcomes data available because of the rarity of her situa-

tion prior to the era of testing and prophylactic double mastectomy.

Patient B is a 65 year-old woman undergoing unilateral mastectomy for a newly-diagnosed invasive ductal carcinoma and wants to minimize added procedures including those to the contralateral breast. She is 5’6” tall and weighs 170 lbs. She smokes, but has agreed to quit 30 days prior to the procedure. She also has diabetes and hypertension. She has been deemed American Society of Anesthesiologists (ASA) class II due to the burden of her comorbidities.

The app is freely available in the Google Play and Apple Apps store for Android, respectively. We download and open the app to arrive at the screen depicted in Fig. 11.8. Information within

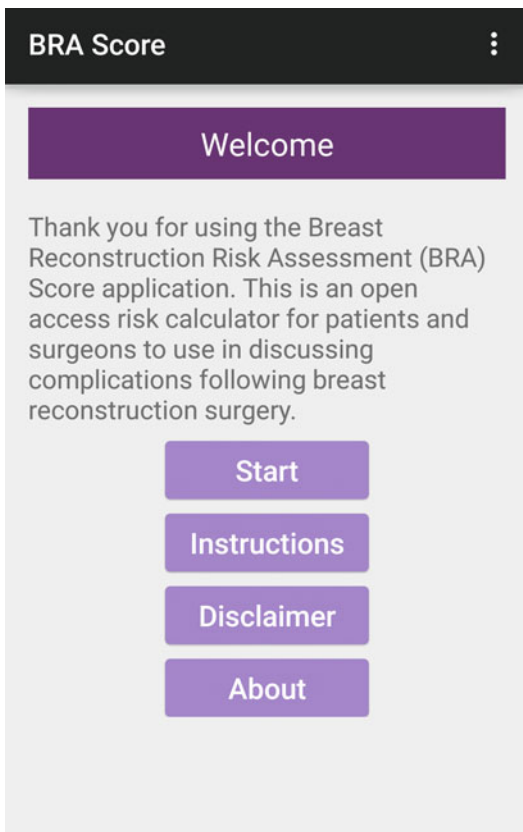


Fig. 11.8 Home screen of BRA Score mobile application

the “Instructions,” “About Us,” and “Disclaimer” options are largely covered above, so we will proceed to press “Start.”

The app walks us through several questions, capturing the same information that is captured by the online interface in Fig. 11.9. After answering the last question and pressing “Next,” a review screen is offered to ensure that all questions were answered correctly and giving us the opportunity to change answers as appropriate, as shown in Fig. 11.10. When all characteristics are correctly entered, pressing “Results” takes us to the output.

The BRA Score app output for Patient B is depicted in Fig. 11.11. As expected, we see significantly higher risks across all categories than we did for Patient A. The default modality displayed on the results screen in the app is staged expander-implant reconstruction. However, we can also view predicted risks for autologous reconstructions. When selecting “Latissimus Flap,” for example, the results array changes to reflect the predicted probabilities for the relevant surgical technique, as shown in Fig. 11.12. Again, more specific numerical estimates of risk in this context allow for better cross-technique

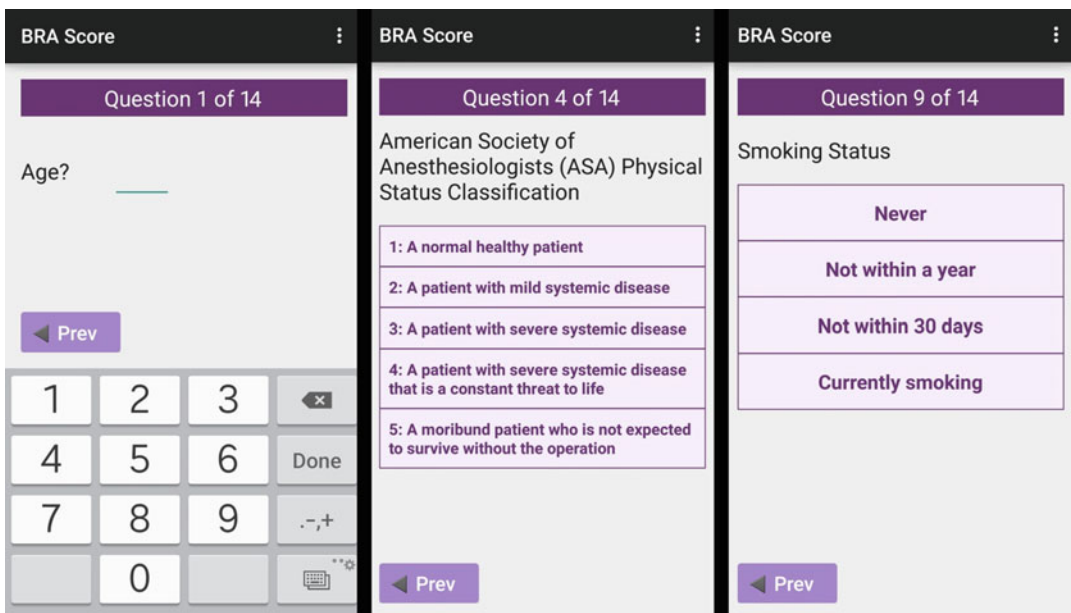


Fig. 11.9 Sample question screens in mobile application

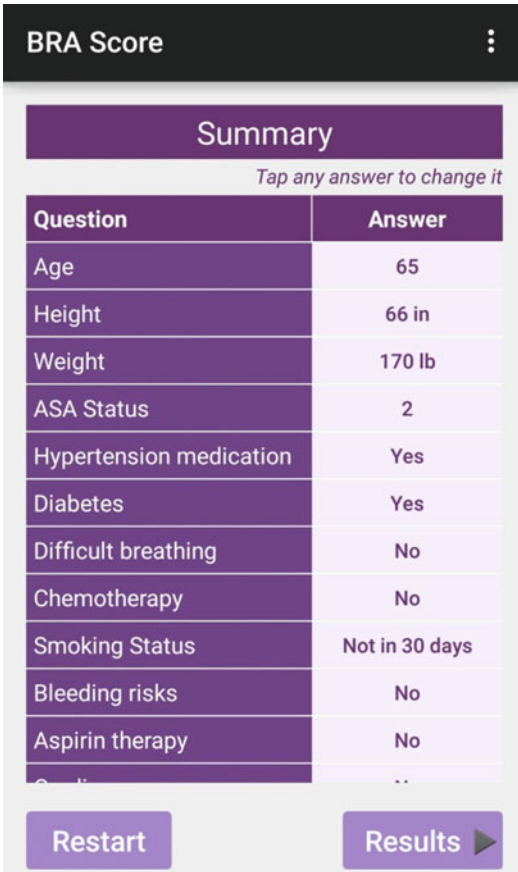


Fig. 11.10 Information review screen

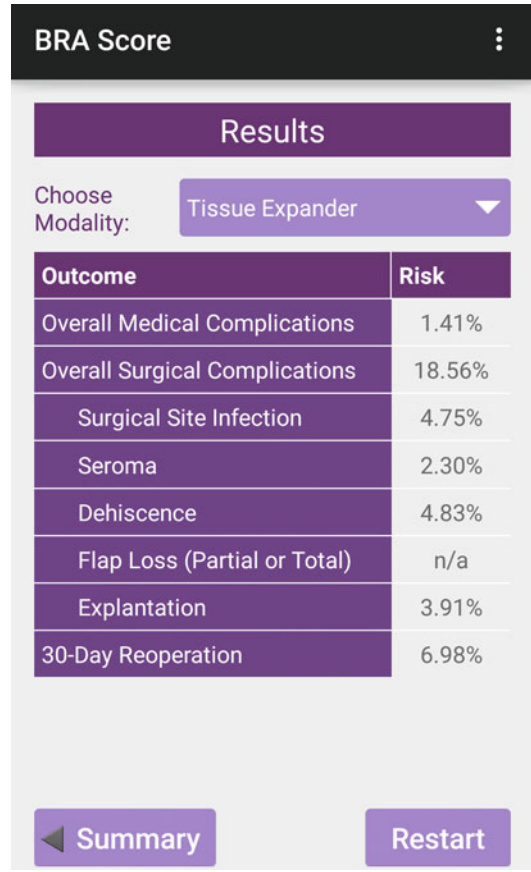


Fig. 11.11 Complication predictions for “Patient B” using tissue expander reconstruction

comparisons and expectation management. One notable limitation to the former use in this context is the fact that the data from which the risk models were derived code using Current Procedural Terminology (CPT) codes, which preclude differentiation between microvascular techniques.

Summary

The Breast Reconstruction Risk Assessment (BRA) Score is an evidence-based tool that provides individualized estimates of postoperative complication risk in immediate breast

reconstruction. It is available as both online (www.BRAScore.org) and mobile (Android) platforms for free and easy access to reconstructive surgeons and their patients. Taken with appropriate clinical judgment, patient selection, and informed consent procedures, the BRA Score can be a useful part of surgical decision-making and expectation management. Limitations to both formulation and use of the BRA Score should be kept in mind when using it. A follow-up prospective study of both predictive accuracy and patient satisfaction is warranted.

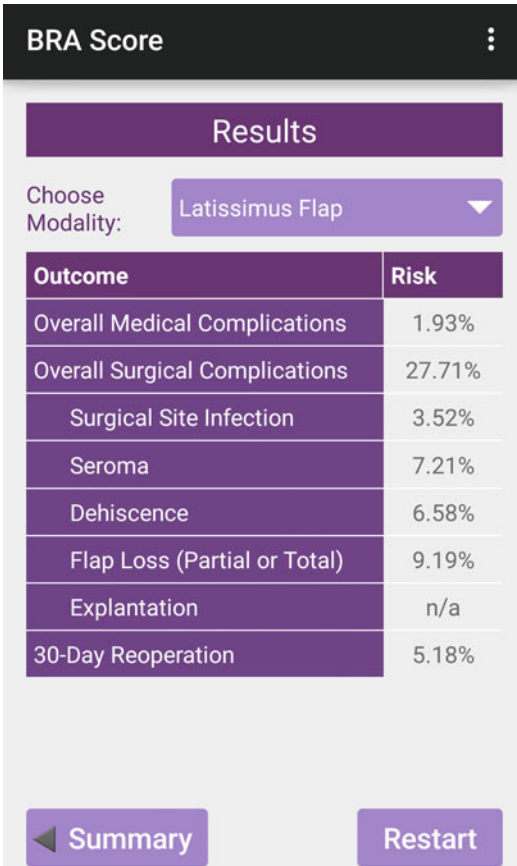


Fig. 11.12 Complication predictions for “Patient B” using latissimus flap reconstruction

References

- American Society of Plastic Surgeons. Plastic surgery procedural statistics. Arlington Heights, IL: American Society of Plastic Surgeons; 2011. <http://www.plasticsurgery.org/news/plastic-surgery-statistics/2014-statistics.html>. Accessed 18 Oct 2015.
- Cordeiro PG, McCarthy CM. A single surgeon’s 12-year experience with tissue expander/implant breast reconstruction: part I. A prospective analysis of early complications. *Plast Reconstr Surg.* 2006;118:825–31.
- Garvey PB, Villa MT, Rozanski AT, et al. The advantages of free abdominal-based flaps over implants for breast reconstruction in obese patients. *Plast Reconstr Surg.* 2012;130:991–1000.
- Lin KY, Johns FR, Gibson J, et al. An outcome study of breast reconstruction: presurgical identification of risk factors for complications. *Ann Surg Oncol.* 2001;8:586–91.
- Losken A, Carlson GW, Schoemann MB, et al. Factors that influence the completion of breast reconstruction. *Ann Plast Surg.* 2004;52:258–61. discussion 262.
- Nahabedian MY, Momen B, Galdino G, et al. Breast reconstruction with the free TRAM or DIEP flap: patient selection, choice of flap, and outcome. *Plast Reconstr Surg.* 2002;110:466–75. discussion 476–477.
- Padubidri AN, Yetman R, Browne E, et al. Complications of postmastectomy breast reconstructions in smokers, ex-smokers, and nonsmokers. *Plast Reconstr Surg.* 2001;107:342–9. discussion 350–351.
- Petersen A, Eftekhari AL, Damsgaard TE. Immediate breast reconstruction: a retrospective study with emphasis on complications and risk factors. *J Plast Surg Hand Surg.* 2012;46:344–8.
- Woerdeman LA, Hage JJ, Hofland MM, et al. A prospective assessment of surgical risk factors in 400 cases of skin-sparing mastectomy and immediate breast reconstruction with implants to establish selection criteria. *Plast Reconstr Surg.* 2007;119:455–63.
- McCarthy CM, Mehrara BJ, Riedel E, et al. Predicting complications following expander/implant breast reconstruction: an outcomes analysis based on preoperative clinical risk. *Plast Reconstr Surg.* 2008;121:1886–92.
- Khavanin N, Fine NA, Bethke KP, et al. Tumescent technique does not increase the risk of complication following mastectomy with immediate reconstruction. *Ann Surg Oncol.* 2014;21:384–8.
- Gart MS, Smetona JT, Hanwright PJ, et al. Autologous options for postmastectomy breast reconstruction: a comparison of outcomes based on the American College of Surgeons National Surgical Quality Improvement Program. *J Am Coll Surg.* 2013;216:229–38.
- Mioton LM, Smetona JT, Hanwright PJ, et al. Comparing thirty-day outcomes in prosthetic and autologous breast reconstruction: a multivariate analysis of 13,082 patients? *J Plast Reconstr Aesthet Surg.* 2013;66:917–25.
- Mlodinow AS, Ver Halen JP, Lim S, et al. Predictors of readmission after breast reconstruction: a multi-institutional analysis of 5012 patients. *Ann Plast Surg.* 2013;71:335–41.
- Hanwright PJ, Davila AA, Hirsch EM, et al. The differential effect of BMI on prosthetic versus autogenous breast reconstruction: a multivariate analysis of 12,986 patients. *Breast.* 2013;22:938–45.
- Cohen ME, Bilimoria KY, Ko CY, et al. Development of an American College of Surgeons National Surgery Quality Improvement Program: morbidity and mortality risk calculator for colorectal surgery. *J Am Coll Surg.* 2009;208:1009–16.
- Bilimoria KY, Liu Y, Paruch JL, et al. Development and evaluation of the universal ACS NSQIP surgical risk calculator: a decision aid and informed consent tool for patients and surgeons. *J Am Coll Surg.* 2013;217:833–42.e1–e3.
- Pannucci CJ, Barta RJ, Portschy PR, et al. Assessment of postoperative venous thromboembolism risk in plastic surgery patients using the 2005 and 2010 Caprini Risk score. *Plast Reconstr Surg.* 2012;130:343–53.

19. Wilson PW, Castelli WP, Kannel WB. Coronary risk prediction in adults (the Framingham Heart Study). *Am J Cardiol.* 1987;59:91–4.
20. Antman EM, Cohen M, Bernink PJ, et al. The TIMI Risk Score for unstable angina/non-ST elevation MI: a method for prognostication and therapeutic decision making. *JAMA.* 2000;284:835–42.
21. Menke H, John KD, Klein A, et al. Preoperative risk assessment with the ASA classification. A prospective study of morbidity and mortality in various ASA classes in 2,937 patients in general surgery. *Chirurg.* 1992;63:1029–34.
22. Knops AM, Legemate DA, Goossens A, et al. Decision aids for patients facing a surgical treatment decision: a systematic review and meta-analysis. *Ann Surg.* 2013;257:860–6.
23. Schenker Y, Fernandez A, Sudore R, et al. Interventions to improve patient comprehension in informed consent for medical and surgical procedures: a systematic review. *Med Decis Making.* 2011;31:151–73.
24. National Quality Forum. Measure application partnership pre-rule making report 2013. http://www.quality-forum.org/Setting_Priorities/Partnership/2013_Pre-Rulemaking_Final_Report.aspx. Accessed 20 Sept 2015.
25. Kim JY, Khavanin N, Jordan SW, et al. Individualized risk of surgical site infection: an application of the Breast Reconstruction Risk Assessment Score. *Plast Reconstr Surg.* 2014;134:351–62.
26. Mlodinow AS, Kim JY, Khavanin N, Hume KM, Simmons CJ, Murphy Jr RX, Weiss MJ, Gutowski KA. Individualized risk of surgical complications: an application of the Breast Reconstruction Risk Assessment (BRA) Score. *Plast Reconstr Surg.* 2014;134(4 Suppl 1):77–8.
27. Kim JY, Mlodinow A, Khavanin N, et al. Abstract 31: development of a Breast Reconstruction Risk Assessment (BRA) Score: an individualized risk calculator for complications using the NSQIP and TOPS databases. *Plast Reconstr Surg.* 2014;133(4 Suppl):997.
28. Kim JY, Mlodinow AS, Khavanin N, Hume KM, Simmons CJ, Weiss MJ, Murphy Jr RX, Gutowski KA. Individualized risk of surgical complications: an application of the breast reconstruction risk assessment score. *Plast Reconstr Surg Glob Open.* 2015;3(5), e405.
29. American College of Surgeons. Risk calculator for surgical complications: analysis of the MROC data American College of Surgeons (ACS) clinical congress 2015: presented October 6, 2015. Chicago, IL: American College of Surgeons; 2015.
30. Steyerberg EW, Harrell Jr FE, Borsboom GJ, et al. Internal validation of predictive models: efficiency of some procedures for logistic regression analysis. *J Clin Epidemiol.* 2001;54:774–81.
31. Harrell Jr FE, Lee KL, Mark DB. Multivariable prognostic models: issues in developing models, evaluating assumptions and adequacy, and measuring and reducing errors. *Stat Med.* 1996;15:361–87.
32. Albornoz CR, Bach PB, Mehrara BJ, et al. A paradigm shift in U.S. breast reconstruction: increasing implant rates. *Plast Reconstr Surg.* 2013;131:15–23.
33. American College of Surgeons National Surgical Quality Improvement Program. User guide for the 2011 participant use data file. Chicago, IL: American College of Surgeons; 2011. http://site.acsnsqip.org/wp-content/uploads/2012/03/2011-User-Guide_Final.pdf. Accessed 29 Sept 2015.