ORIGINAL ARTICLE

Developing basic robotic skills using virtual reality simulation and automated assessment tools: a multidisciplinary robotic virtual reality‑based curriculum using the Da Vinci Skills Simulator and tracking progress with the Intuitive Learning platform

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Abstract

This study sought to develop basic robotic surgical skills among surgical trainees across multiple specialties using a VR-based curriculum and provided objective, on-demand, automated assessments using the Intuitive Learning platform. This curriculum was developed using the Da Vinci Skills Simulator and included 24 exercises. A pre-test and post-test were required for completion of the curriculum. Scores>90 on individual exercises and the post-test were required for successful completion. The Intuitive learning platform provided automated performance metrics and tracked trainee progression. The curriculum was implemented and data collected over a 12-month period. 21 trainees completed the entire curriculum. Post-test scores were signifcantly higher than pre-test scores and trainees reported improvement in their robotic skills after curriculum completion. A comparison based on training level revealed that junior residents had signifcantly lower number of attempts per exercise, fewer penalties, and higher completion scores when compared to senior residents and fellows. Individual exercise analysis demonstrated that exercises, such as 'Three-Arm Relay' and 'Ring Rollercoaster', required the longest time and most attempts to achieve a passing score. The 'Energy Pedals' and 'Knot Tying' skills were the least-utilized skills addressed in the curriculum. Virtual reality-based curriculums using the Intuitive Learning platform can be standardized across multiple specialties allowing for the development of basic robotic skills, shared interdisciplinary surgical education, and provides powerful objective and automated performance metrics of trainees.

Keywords Robotic surgery · Surgical Education · Imulation · Virtual reality · Robotic Education

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Introduction

The adoption of robotic surgery across multiple specialties and it is now common occurrence at academic centers have led institutions to develop and incorporate their own formal robotic curriculums. These curriculums however are often institution- and specialty-specifc [\[1\]](#page-6-0). Expert consensus has provided recommendations that robotic surgery curriculum development ought to include a virtual reality (VR) portion as part of simulation training [[2\]](#page-6-1). Institutions that have developed their own curriculum have demonstrated improvement in robotic skills and increased trainee operative console time by performing virtual reality training in conjunction with synthetic exercises [\[3\]](#page-6-2). The Da Vinci Skills Simulator (DVSS) has demonstrated the highest face and content validity among robotic surgery VR simulators [\[4](#page-6-3)]. Other studies have demonstrated that VR exercises on the DVSS require a score>90% to reach a standardized expert-level score [[5\]](#page-6-4). A general surgery robotic curriculum that adopted the>90% standard for VR exercises as part of their program demonstrated improvement in robotic skills assessed through the GEARS score [\[6\]](#page-6-5).

Barriers to novice robotic surgeons have been identifed as lack of familiarity with the robotic platform/technology and lack of psychomotor skills [\[1\]](#page-6-0). Robotic simulation training can assist in improving these skills and increase surgeon efficiency $[1, 7]$ $[1, 7]$ $[1, 7]$ $[1, 7]$. VR training has demonstrated translatability to robotic operative skills. A meta-analysis looking at correlations between VR simulation training and skill acquisition identifed 5 out of 8 studies that demonstrated translation of skills from a VR platform to the operating room [[7\]](#page-6-6). Six out of eight of those studies were performed on the DVSS. VR exercises were variable (19 various exercises were identifed) as was skills assessment which occurred on both human and animal models and involved assessing metrics, such as OR time, estimated blood loss, RO-SCORE, GEARS assessment, or patient outcomes. Additionally, only one of the studies included trainees from multiple specialties while other looked at specialty-specifc trainees, medical students, or expert surgeons [[8–](#page-6-7)[11\]](#page-6-8). Additional studies have identifed needs for objective and automated measures that help demonstrate improvement in robotic skills [[12](#page-6-9)]. The variability in curricula development, cohorts, and assessment tools identifes a need for a standardized approach to VR simulation training with broad-based applicability, simple progress tracking, and automated assessment [[13\]](#page-6-10).

The Intuitive learning platform offers a new interface for all trainees and administrators to assign and track DVSS VR exercise progress [[14](#page-6-11)]. Furthermore, it collects automated performance metrics (APM) on each exercise performed. Analysis of APM provides information with regard to both trainee performance and individual exercise performance.

This includes exercise performance scores, time to exercise completion, attempts per exercise, economy of motion, penalty scores, and progression tracking. We hypothesized that trainees would show improvement in post-test scores after completion of the VR curriculum by demonstrating skill development and that performance would not difer signifcantly based on specialty but would difer based on PGY level. Additionally, we sought to utilize the automated performance metrics provided by the platform to assess areas for improvement in the curriculum and where to focus further skill progression.

Methods

Needs assessment

Our institution's multidisciplinary robotics committee met regularly in 2019 through 2020 to discuss ways to enhance trainees' preparation to participate in robotic surgery cases as a bedside assist and console surgeon. The committee performed an extensive literature review of other robotic training programs and performed a needs assessment of specialty-specific training concerns. Results from this process concluded that across all residency and fellowship training programs, attendance noticed a high variability of basic robotic skills among residents of all levels and new fellows. It was also noted that studies had been conducted which demonstrated benefts of VR-based training as part of formal robotic curriculums and showed that VR-based training can lead to skill acquisition $[3, 4, 6, 7, 15]$ $[3, 4, 6, 7, 15]$ $[3, 4, 6, 7, 15]$ $[3, 4, 6, 7, 15]$ $[3, 4, 6, 7, 15]$ $[3, 4, 6, 7, 15]$ $[3, 4, 6, 7, 15]$ $[3, 4, 6, 7, 15]$ $[3, 4, 6, 7, 15]$ $[3, 4, 6, 7, 15]$.

Curriculum development

The exercises for the curriculum were chosen from the list of exercises on the DVSS which are divided up into the following categories: camera control and clutching, endowrist manipulation, fourth arm integration, energy and dissection, and needle driving [[16](#page-6-13)]. The curriculum used this model to break up the exercises into seven distinct sessions and included 24 exercises (Fig. [1\)](#page-2-0). The exercises included were similar to those used in other curriculums as well as exercises included in fundamentals of robotic surgery (FRS), thus eliminating the variability seen in exercise selection from other studies which had a narrower focus in skill evaluation $[6, 8-11, 15]$ $[6, 8-11, 15]$ $[6, 8-11, 15]$ $[6, 8-11, 15]$ $[6, 8-11, 15]$ $[6, 8-11, 15]$ $[6, 8-11, 15]$. A score of > 90% on each exercise was set as the standard passing score as this was demonstrated by prior studies to be a score consistent with expert skill level $[5]$ $[5]$.

Fig. 1 Virtual reality-based robotic curriculum on the Da Vinci Skills Simulator

Fig. 2 Individual exercise performance tracker. This demonstrates a trainee's progress on the Three-Arm Relay 2 exercise. Each attempt can be accessed to look at specifc performance metrics Copyright Intuitive Learning

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Congratulations! You've done a great job minimizing penalties and streamlining your movements.

Learner assessment and tracking trainee progress

A pre-test and post-test were included in the curriculum to assess trainee improvement. Starting in February of 2020, all residents and fellows were enrolled in the VR curriculum. This included trainees from the following specialties: GYN, general surgery, urology, thoracic, hepatobiliary, colorectal, and ENT. Trainee progress was monitored using the Intuitive Learning site where they could track their APMs and observe their progress on demand. Monthly progress reports were generated from the APMs and distributed to all robotic committee members and program directors. (Sample exercise performance report demonstrated in Fig. [2](#page-2-1)).

Data collection and curriculum evaluation

The Intuitive Learning platform was monitored routinely to track trainee progress and generate a monthly report to the trainees program directors. Exercise completion and APMs were recorded on a spreadsheet. Pre- and post-test scores were tracked. The DVSS was queried for all exercise data from the 12-month period of Feb 2020–Feb 2021. This provided data on every exercise performed by every trainee on the simulator in that time period. A *T* test was performed comparing all pre-test and post-test scores. Simulator data were analyzed to determine individual exercise performance. An analysis was performed to assess for diferences based on specialty and PGY level by evaluating the following metrics: completion scores, attempts per exercise, time on completed exercises, and penalty scores. Trainees that completed the

Table 1 Pre-test and post-test comparison

Exercise	Pre-test average	Post-test average	Percent Increase	P value	
Ring Rollercoaster II	33.42	93.61	$+180.10\%$	< 0.01	
Three-Arm Relay III	33.93	93.12	$+174.45%$	< 0.01	
Anterior Needle Drive ATW	48.4	92.82	$+91.78$	< 0.01	

Table 2 Exercise metrics categorized based on skill session

curriculum or completed $> 50\%$ of the curriculum were asked to fll out a curriculum evaluation survey.

Results

From Feb 2020–Feb 2021, 73 trainees were enrolled in the curriculum with 53 active users at time of data analysis. 21 Trainees completed the entire curriculum (6 General Surgery, 6 Urology, 5 GYN, 2 HPB, 1 Colorectal, 1 Thoracic). 23 Trainees had partially completed the curriculum (>30% of exercises completed). Curriculum exercises were attempted 7450 times. The majority of trainees who completed the curriculum required on average 8 weeks for completion. Trainees spent a total of 416 h and 31 min on the curriculum. The average time for trainees to complete the curriculum was 7 h and 19 min. Analysis of pre-test and post-test scores showed signifcant improvement across all three exercises: Ring Rollercoaster $II + 180.1\%$, Three-Arm Relay III + 174.45%, Anterior Needle drive $ATW + 91.78%$ (Table [1\)](#page-3-0).

23 Trainees responded to our curriculum evaluation survey. 99% of trainees agree that the VR curriculum improved their robotic skills. 71.5% of trainees believe that completing the VR curriculum has granted them more console time in the operating room. The majority of trainees found the ability to track their progress using the automated platform helpful. Three-Arm Relay and suturing exercises were deemed most useful by trainees. Ring Rollercoaster exercises were deemed less useful or repetitive by trainees.

Analysis of variance (ANOVA) comparing specialties: General Surgery, GYN, and Urology showed no statistical diference in terms of completion scores, completion time (s), and penalty score. Attempts per exercise were noted to be signifcantly higher in general surgery than other specialties. ANOVA comparison based on level of training demonstrated that junior residents (PGY1-3) had signifcantly lower number of attempts per exercise, fewer penalties, and higher completion scores when compared to senior residents and fellows (Table [2](#page-3-1)).

Individual exercise data analysis provided the following metrics: average time spent per attempt, average number of attempts needed to achieve a passing score $(>90\%)$, average amount of time investment needed to achieve a passing score, and average penalty score (Table [3\)](#page-4-0). Exercises, such as Three-Arm Relay II and Ring Rollercoaster II, required the largest time investment to achieve a passing score (53 min 21 s, 50 min 36 s) whereas Clutch and Energy Pedals II required the shortest time investment (1 min 10 s, 4 min 42 s). Comparing exercise categories revealed that the Ring Rollercoaster exercises require signifcantly more attempts, more average attempts to achieve a passing score, and more penalties than the Energy Pedal Selection exercises (Table [4](#page-4-1)). When broken down based on exercise category, the majority of time on the curriculum was occupied by endowrist exercises (38.9%) followed by needle driving (25.8%), retraction arm (24.4%), camera control (4.2%), energy pedals/ dissection (4.1%), and finally, knot tying $(2.7%)$ (Fig. [3\)](#page-4-2).

Table 3 ANOVA comparison based on training level

Metric	PGY 1–3 (Avg) $(N=9)$	PGY 4–5 (Avg) $(N=3)$	Fellows (Avg) $(N=5)$	P -value		
Completion score	95.89	94.40	94.55	<0.05		
Attempts	5.88	7.39	15.89	< 0.01		
Completion time (s)	119.89	119.79	123.91	0.8029		
Penalty score	2.94	3.43	4.13	< 0.01		

Terms defined as the following: Completion score: passing score achieved > 90. Attempts: attempts performed to achieve a passing score on each exercise. Completion Time: time spent on the individual exercise that achieved a passing score. Penalty Score: the penalty deductions incurred per attempt

Table 4 Comparison of Ring Rollercoaster and Energy Pedal exercises based on recorded metrics

Percent of Time Spent on Each Exercise

Discussion

Implementation of a robust VR-based robotic curriculum is feasible across multiple surgical specialties and can develop basic robotic skills. The Intuitive Learning platform makes curriculum design, assigning exercises, and tracking trainees' progress incredibly easy. The automated performance metrics recorded by the DVSS provide an objective assessment tool and on-demand progression tracking for both trainees and instructors. Automated objective assessment data can greatly reduce the burden required by instructors to evaluate skill progression in trainees and streamline the learning process. This was the frst study performed that used these data to not only compare the performance of

Fig. 3 Distribution of time spent on each individual exercise

specifc trainee groups but also compare the metrics of individual exercises.

The curriculum was designed based on the principle of deliberate practice with repetition overtime to build skill performance and prevent skill degradation. Pre-test and post-test analysis demonstrates statistically signifcant improvement in VR performance which coincides with trainees overall perception of improved robotic skills. Trainees also reported that their console time in live OR settings increased after curriculum completion. This suggests that VR simulation serves a valuable role in developing basic robotic skills and upon completion, trainees can expect to get a better quality experience in the live OR settings. While the curriculum completion included members from 6 out the 7 specialties engaged in robotics at our institution, only 21 current trainees out of 53 completed the curriculum in its entirety. This lower attrition rate may be due to several factors including not making the curriculum obligatory, lack of interest among certain trainees, and signifcant time investment required for completion. Earlier survey data gathered revealed that the majority of trainees thought the time investment was the largest barrier to completion.

The differences seen in the ANOVA data were not expected. The higher number of attempts on exercises taken by General Surgery compared to GYN and Urology may have refected that robotic general surgery was a newer service line with general surgery residents having less clinical experience relative to the other divisions. Even more interesting was the comparison based on training level. Junior residents (PGY1–3) took fewer attempts, incurred fewer penalties, and had higher completion scores compared to senior residents (PGY 4–5) and fellows. The small sample size of the analyzed groups may have contributed to this fnding. However, it can also be theorized that more senior-level trainees already have some prior operative robotic experience and were attempting to translate what skills they have acquired to the simulator. Naive robotic trainees may not require an adjustment period and thus be able to complete the exercises in a more efficient fashion.

Analyzing individual exercise metrics revealed that trainees spent a large amount of time performing endowrist exercises (Ring Rollercoaster, Sea Spikes, etc.) and a minimal amount of time on exercises involving the energy pedals and knot tying. The time investment placed in the Ring Rollercoaster exercises correlates with survey data that trainees found these exercises most repetitive. Unlike traditional open surgical instruments or straight stick laparoscopic instruments, learning to manipulate wrist action is novel to robotic surgical instruments with no analogy to apply from prior clinical training. The working feld of view for robotics can be a very tight space if the economy of motion provided by wristed instruments is underutilized.

Without understanding the dynamic application of wristed motion these exercises may have required more repetitions and longer times to achieve a 90% score. This observation led us to create video demonstrations of "tips and tricks" for each exercise to shorten the trainees learning curve. The data generated will help us evolve our curriculum to better serve the needs of surgical trainees. Conversely, we can look to add more exercises that involve knot tying or energy pedals to improve the distribution of these skills in the curriculum.

Conclusion

A standardized multidisciplinary VR robotic curriculum is feasible and helps develop basic robotic skills. Intuitive Learning offers a powerful tool for tracking trainee progress, assessing individual exercise metrics, and allowing surgical educators to make adjustments to robotic training curriculums based on data.

Limitations

This study has several limitations. First, this curriculum is not validated to demonstrate improved robotic skills in the operating room or correlated with patient outcomes. While other studies have shown skill improvement with their robotic curriculums, none have done so with a purely VR-based curriculum. Our improved post-test scores and survey data provide a perception of improved skills. Next, our comparative analysis based on specialties and training level had small sample sizes. The diferences seen among the groups may be due to outliers and more subjects will be required to confrm these diferences. Finally, this study was performed at a single academic center and thus may not be generalizable; however, the improved scores and perceptions of improvement correlate with similar studies.

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Declarations

Conflict of interest Author Augustus Gleason, Autho Elliot Servais, Autho Syed Quadri, Author Marc Manganiello, Author Yee Lee Cheah, Author Caroline J Simon, Author Elizabeth Preston, Author

Alexis Graham-Stephenson, Author Valena Wright declare that they have no confict of interest.

Informed consent All procedures followed were in accordance with the ethical standards of the responsible committee on human experimentation (institutional and national) and with the Helsinki Declaration of 1975, as revised in 2000. Informed consent was obtained from all trainees for being included in the study.

References

- 1. Chen R, Armijo PR, Krause C, Siu KC, SAGES Robotic Task Force, Oleynikov D (2020) A comprehensive review of robotic surgery curriculum and training for residents, fellows, and postgraduate surgical education. Surg Endosc 34(1):361–367. [https://](https://doi.org/10.1007/s00464-019-06775-1) doi.org/10.1007/s00464-019-06775-1
- 2. Ahmed K, Khan R, Mottrie A, Lovegrove C, Abaza R, Ahlawat R, Ahlering T, Ahlgren G, Artibani W, Barret E, Cathelineau X, Challacombe B, Coloby P, Khan MS, Hubert J, Michel MS, Montorsi F, Murphy D, Palou J, Patel V, Piechaud PT, Van Poppel H, Rischmann P, Sanchez-Salas R, Siemer S, Stoeckle M, Stolzenburg JU, Terrier JE, Thüroff JW, Vaessen C, Van Der Poel HG, Van Cleynenbreugel B, Volpe A, Wagner C, Wiklund P, Wilson T, Wirth M, Witt J, Dasgupta P (2015) Development of a standardised training curriculum for robotic surgery: a consensus statement from an international multidisciplinary group of experts. BJU Int 116(1):93–101. <https://doi.org/10.1111/bju.12974>(**Epub 2015 Mar 23**)
- 3. Knab LM, Zenati MS, Khodakov A, Rice M, Al-Abbas A, Bartlett DL, Zureikat AH, Zeh HJ, Hogg ME (2018) Evolution of a novel robotic training curriculum in a complex general surgical oncology fellowship. Ann Surg Oncol 25(12):3445–3452. [https://doi.](https://doi.org/10.1245/s10434-018-6686-0) [org/10.1245/s10434-018-6686-0](https://doi.org/10.1245/s10434-018-6686-0) (**Epub 2018 Aug 2. Erratum in: Ann Surg Oncol. 2019 Dec;26(Suppl 3):879**)
- 4. Hertz AM, George EI, Vaccaro CM, Brand TC (2018) Head-tohead comparison of three virtual-reality robotic surgery simulators. JSLS. 22(1):e2017.00081. [https://doi.org/10.4293/JSLS.](https://doi.org/10.4293/JSLS.2017.00081) [2017.00081](https://doi.org/10.4293/JSLS.2017.00081)
- 5. Brinkman WM, Luursema JM, Kengen B, Schout BM, Witjes JA, Bekkers RL (2013) da Vinci skills simulator for assessing learning curve and criterion-based training of robotic basic skills. Urology 81(3):562–566. [https://doi.org/10.1016/j.urology.2012.](https://doi.org/10.1016/j.urology.2012.10.020) [10.020](https://doi.org/10.1016/j.urology.2012.10.020) (**Epub 2013 Jan 4**)
- 6. Moit H, Dwyer A, De Sutter M, Heinzel S, Crawford D (2019) A standardized robotic training curriculum in a general surgery program. JSLS. 23(4):e2019.00045. [https://doi.org/10.4293/JSLS.](https://doi.org/10.4293/JSLS.2019.00045) [2019.00045](https://doi.org/10.4293/JSLS.2019.00045)
- 7. Finnegan KT, Meraney AM, Staf I, Shichman SJ (2012) da Vinci skills simulator construct validation study: correlation of prior robotic experience with overall score and time score simulator performance. Urology 80:330–336
- 8. Schmidt MW, Köppinger KF, Fan C, Kowalewski KF, Schmidt LP, Vey J, Proctor T, Probst P, Bintintan VV, Müller-Stich BP, Nickel F (2021) Virtual reality simulation in robot-assisted surgery: meta-analysis of skill transfer and predictability of skill. BJS Open. 5(2):zraa066.<https://doi.org/10.1093/bjsopen/zraa066>
- 9. Gerull W, Zihni A, Awad M (2020) Operative performance outcomes of a simulator-based robotic surgical skills curriculum. Surg Endosc 34(10):4543–4548. [https://doi.org/10.1007/s00464-](https://doi.org/10.1007/s00464-019-07243-6) [019-07243-6](https://doi.org/10.1007/s00464-019-07243-6) (**Epub 2019 Nov 15**)
- 10. Vargas MV, Moawad G, Denny K, Happ L, Misa NY, Margulies S et al (2017) Transferability of virtual reality, simulation-based, robotic suturing skills to a live porcine model in novice surgeons: a single-blind randomized controlled trial. J Minim Invasive Gynecol 24:420–425
- 11. Aghazadeh MA, Mercado MA, Pan MM, Miles BJ, Goh AC (2016) Performance of robotic simulated skills tasks is positively associated with clinical robotic surgical performance. BJU Int 118:475–481
- 12. Hung AJ, Shah SH, Dalag L, Shin D, Gill IS (2015) Development and validation of a novel robotic procedure specifc simulation platform: partial nephrectomy. J Urol 194:520–526
- Childs BS, Manganiello MD, Korets R (2019) Novel education and simulation tools in urologic training. Curr Urol Rep 20(12):81.<https://doi.org/10.1007/s11934-019-0947-8>
- 14. Intuitive Learning. Hospital Learning Management. Learning. intuitive.com. Copyright Ⓒ 2021 Intuitive Surgical, Inc. All rights reserved. Accessed 12 May 2021
- 15. Satava RM, Stefanidis D, Levy JS, Smith R, Martin JR, Monfared S, Timsina LR, Darzi AW, Moglia A, Brand TC, Dorin RP, Dumon KR, Francone TD, Georgiou E, Goh AC, Marcet JE, Martino MA, Sudan R, Vale J, Gallagher AG (2020) Proving the Efectiveness of the Fundamentals of Robotic Surgery (FRS) skills curriculum: a single-blinded, multispecialty, multi-institutional randomized control trial. Ann Surg 272(2):384–392. [https://doi.](https://doi.org/10.1097/SLA.0000000000003220) [org/10.1097/SLA.0000000000003220](https://doi.org/10.1097/SLA.0000000000003220)
- 16. "Comprehensive Exercises". Skills Simulator. Copyright © 2021 Intuitive Surgical, Inc. All rights reserved. [www.davincisurgeryc](http://www.davincisurgerycommunity.com/Systems_I_A/Skills_Simulator) [ommunity.com/Systems_I_A/Skills_Simulator.](http://www.davincisurgerycommunity.com/Systems_I_A/Skills_Simulator) Accessed 12 May 2021

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